# COMPARATIVE STUDY OF POPULATION ANALYSIS WITH QUASI-ATOMIC ORBITALS 

# COMPARATIVE STUDY OF POPULATION ANALYSIS WITH QUASI-ATOMIC ORBITALS 

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MASTER OF SCIENCE (2019)

# McMaster University Chemistry Department 

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# Comparative Study of Population Analysis Methods With Quasi AtomicOrbitals 

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#### Abstract

Atom is not an observable of the molecular wavefunction, in quantum chemistry there are myriad ways of defining an atom in a molecule. Partitioning a molecule's electrons between its atomic constituents (population analysis) remains a challenge.

A popular approach is based on Mulliken's overlap-based population analysis, which exploits the fact that molecular orbitals can be expressed as linear combinations of user-defined functions: atomic orbitals. In turn, this creates a dependency on the selection of the predetermined atomic orbitals that are used to expand the molecular orbitals. Chemically intuitive atomic orbitals like Minimal Atomic Orbitals (minAO) produces chemically intuitive atomic charges but a nonaccurate wave function. Accurate wave functions can be obtained from large atomic basis sets like def2-QZVPd at the cost of chemically unintuitive atomic charges. With this problem in sight, Quasi-Atomic Orbitals (QAO) are constructed from the accurate wave function to resemble the minAO and maximally span the molecular orbital space. The key idea is Mulliken population analysis can be carried out for wave functions with the chemical intuitive power of minAO, without sacrificing the wave function's accuracy by using QAO. To ensure that overlaps of QAO are divided between different atoms without bias. Zero-Bond Dipole (ZBD) orthogonalization is proposed as a novel way to orthogonalize QAO.


Common population analysis from literature: Charge Model 5 (CM5), QH, Hu-Lu-Yang (ESP), Mulliken, NPA atomic charges will be compared to QAO (Mulliken with QAO) and ZBDQAO (Mulliken after ZBD orthogonalization of QAO) and tested for mathematical accuracy and expected chemical trends.

## Acknowledgments

I would like to express my deepest regards for Prof. Ayers. Anyone working with him is blessed with an environment encouraging self-improvement. I feel grateful to have supportive lab mates. Thank you, Jen, for helping me build and structure the Vetee database code and naming it with the initials of "database" in Turkish (for of course "veritabani" is too long for a name). It has not been easy to code, and I appreciate your contribution and listening me at tea breaks or code reviews. I would like to thank David for writing Quasi-Atomic Orbital code, explaining the theory and helping me use his code. Thank you, Xiao and Will, for helping me with the math and the coding hell of Zero-Bond Dipole code. Also, Israel has been a great non-wavering support for me in this journey as well as my parents. I would like to express my deepest gratitude for my friends who where here to morally support me Ayşegül and Melih, and my friends who are in Turkey namely Idil, Neşe and Deniz.

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## Acronyms

CM5 : Charge Model 5 Population Analysis
QH : Original Hirshfeld Population Analysis
MBS : Mulliken with Minimal Basis Projection
NPA : Natural Population Analysis
AO : Atomic Orbitals
minAO : Minimal Atomic Orbitals
MO : Molecular Orbitals
oMO : Occupied Moleculart Oribtals
vMO : Virtual (Unoccupied) Molecular Orbitals
QAO : Quasi-Atomic Orbitals
ZBD : Zero- Bond Dipole (orthogonalization)
ZBD-QAO : Zero-Bond Dipole orthogonalized Quasi-Atomic Orbitals
Q1: Quasi-Atomic Orbital QUAMBO
Q2 : Quasi-Atomic Orbital QUAO
Q3 : Quasi-Atomic Orbital IAO
Z-Q1 : Zero -Bond Dipole orthogonalized QUAMBO
Z-Q2 : Zero -Bond Dipole orthogonalized QUAO
Z-Q3 : Zero -Bond Dipole orthogonalized IAO

## Chapter 1

## 1 Introduction

### 1.1 Background

The periodic table of the elements lies at the heart of chemistry, based on the precept that molecules are built from atoms in this table. For example, in the Lewis model, lines between two atoms symbolize the sharing of two electrons, and the number of lines corresponds to bond order. ${ }^{1}$ As straightforward as it is to think about atoms as the building blocks of molecules in chemistry, in quantum mechanics there is no strict definition for the atom within a system containing multiple atoms. ${ }^{2,3}$ One of the many postulates of quantum mechanics is that a wave function contains all the information about a molecular system. ${ }^{4}$ It is accepted that for every physical observable there is a Hermitian operator, and that the possible values of the measured property are the eigenvalues of that operator. For example, the energy, $E$, is the eigenvalue of the Hamiltonian operator, $\hat{H}$, and the wavefunction, $\Psi$, is its eigenvector. This relationship is encapsulated in the timeindependent Schrödinger equation,

$$
\begin{equation*}
\hat{H} \Psi\left(\mathbf{R}_{1}, \mathbf{R}_{2}, \ldots, \mathbf{R}_{P}, \mathbf{r}_{1}, \mathbf{r}_{2}, \ldots, \mathbf{r}_{N}\right)=E \Psi\left(\mathbf{R}_{1}, \mathbf{R}_{2}, \ldots, \mathbf{R}_{P}, \mathbf{r}_{1}, \mathbf{r}_{2}, \ldots, \mathbf{r}_{N}\right) \tag{1}
\end{equation*}
$$

where $\mathbf{R}_{1}, \mathbf{R}_{2}, \ldots, \mathbf{R}_{P}$ denote the locations of the atomic nuclei and $\mathbf{r}_{1}, \mathbf{r}_{2}, \ldots, \mathbf{r}_{N}$ denote the positions of the electrons. Solving the Schrödinger equation is intractable for systems with more
than two particles, which motivates approximations that simplify the solution, e.g., the BornOppenheimer approximation, ${ }^{5}$ which allows the molecular wavefunction to be approximated as the product of nuclear and electronic pieces. In this thesis we will consider the nuclei to be fixed (thereby ignoring nuclear quantum effects) and treat only the electronic Schrödinger equation. Even determining the electronic wave function is challenging and so, in this thesis, only two methods of approximation will be used; Hartree-Fock ${ }^{4,6}$ (HF) and density-functional theory ${ }^{7-9}$ (DFT). In both models, the electronic wavefunction is approximated as an anti-symmetrized product of molecular orbitals (i.e., a single Slater determinant). We will use atom-centered Gaussian basis sets, so each molecular orbital is expressed as a linear combination of atomcentered Gaussian basis functions. The approximations we are making are common among chemists, and we made them for computational expedience, as our primary focus is not obtaining accurate electronic wavefunctions for molecules, but assessing different ways of defining atoms in a molecule.

Most methods for partitioning molecules into atoms fall into two main families. In the first family, pioneered by Hirshfeld and Bader, ${ }^{10-12}$ the molecule's electron density is divided into atomic contributions. The atomic densities are then used to define atomic properties, including the number of electrons (by integrating the atomic density), multipole moments, etc.. In this thesis, we will consider only Hirshfeld's original definition (referred to as QH ), ${ }^{13}$ and one revision thereof that is built into the Gaussian program ${ }^{14}$ (CM5 short for Charge-Model 5). ${ }^{15}$ Hirshfeld partitioning is based on the idea that the utility of the periodic table is maximized if the atoms in a molecule resemble the isolated items atoms in the periodic table to the maximum possible extent. If one defines the density of the atoms-in-a-molecule so that their divergence from the isolated atoms in the periodic table is minimized, then the Hirshfeld partitioning results. ${ }^{3,16-20}$ (Many possible
definitions of divergence are possible, but it's traditional to use information theory because the electron density is a probability distribution function. ${ }^{3,16}$ The Hirshfeld partitioning is not obviously appropriate for charged molecules or for ionic bonding (where forcing atoms in an ionic molecule to resemble neutral atoms is chemically misinformed), which has led to the development of many other Hirshfeld-based schemes, which we will not consider in this thesis. ${ }^{21-23}$ We will, however, consider the Charge Model 5 (CM5) revision of Hirshfeld. CM5 charges are an empirical revision of Hirshfeld charges designed to give good dipole moments. The basic idea is to revise the Hirshfeld charge of an atom, $A$, based on nearby atoms, $B$, where the definition of "nearby" is determined by the empirical exponentially-decaying bond-length bond-order relationship proposed by Pauling. Specifically, the CM5 atomic charges are defined as:

$$
\begin{equation*}
q_{\mathrm{A}}^{(\mathrm{CM5})}=q_{\mathrm{A}}^{\text {Hirsheld }}+\sum_{\substack{B=1 \\ B \neq A}}^{N_{\text {aoms }}} T_{Z_{\mathrm{A}} Z_{\mathrm{B}}} e^{-\alpha\left(\left(\mathbf{R}_{\mathrm{A}}-\mathbf{R}_{\mathrm{B}} \mid-\left(r_{\mathrm{A}}^{\text {cov }}+\mathrm{r}_{\mathrm{B}}^{\mathrm{cov}}\right)\right)\right.} \tag{2}
\end{equation*}
$$

where $T_{Z_{\mathrm{A}} Z_{\mathrm{B}}}$ is an antisymmetric matrix (otherwise charge would not be conserved) based on the atom types (e.g., the atomic numbers of atoms $A$ and $B$ ). For element-pairs that occur frequently in the training set $(\mathrm{CH}, \mathrm{NH}, \mathrm{OH}, \mathrm{CN}, \mathrm{CO}, \mathrm{NO})$, there is a specific value of $T_{Z_{\mathrm{A}} Z_{\mathrm{B}}}$; for other elements for which there is adequate data, one chooses to define only atomic parameters $T_{Z_{\mathrm{A}} Z_{\mathrm{B}}}=t_{Z_{A}}-t_{Z_{\mathrm{B}}}$; otherwise one takes the value of $t_{Z_{A}}$ from the top parameterized element in a column of the periodic table and multiplies it by a diminishing factor, $C$, for each row of the periodic table one descends before one reaches the element of interest. Clearly this approach is limited by its empirical fitting and, moreover, by the assumption that the Hirshfeld atomic charges can be improved using only local changes (which is not true for zwitterions or ion pairs). It is also true
that, unlike most population analysis methods, CM5 defines only atomic charges, and not atomic properties more generally.

The approach to partitioning molecules into atomic contributions is based on orbitals or, more generally, reduced density matrices. This strategy was pioneered by Mulliken in the formative years of quantum chemistry. ${ }^{24}$ The molecular orbitals that enter into the single Slater determinant approximation for the electronic wavefunction are typically expanded in terms of atom-centered basis functions. Intuitively, these basis functions represent the atomic orbitals that constructively and deconstructively interfere to form bonding and antibonding molecular orbitals, respectively. Thus, molecular orbitals can be mathematically expressed as a linear combination of atomic orbitals, ${ }^{25}$

$$
\begin{equation*}
\left|\mathrm{MO}_{i}\right\rangle=\sum_{i} C_{i l}\left|\mathrm{AO}_{l}\right\rangle \tag{3}
\end{equation*}
$$

This expansion is exact if all possible atomic orbitals (including the continuum) were used, but always approximate in practice. It can be quite accurate, however, when large atomic basis sets are used.

Molecular orbitals can be further classified as occupied molecular orbitals (oMO), including both core (cMO) and valence-occupied (voMO) molecular orbitals. Unoccupied, or virtual, molecular orbitals (vMO) can be similarly decomposed into two groups, the valence virtual (vvMO) and external virtual (exMO) molecular orbitals. The relativistic contraction of cMOs is, of course, important for the chemical and physical properties of molecuels containing heavy elements. ${ }^{26}$ To overcome this issue, pseudopotential basis sets have been developed to include relativistic effects, and we will use pseudopotentials for elements beyond Kr in our calculations. ${ }^{27}$ Our chemical intuition is based on the idea that cMO and exMO have little qualitative chemical
effect, though these MOs can be quantitatively important. Conversely, the valence occupied and virtual MOs (the voMO and vvMO) are very important for bonding in chemistry.

While the number of oMO is determined by the number of electrons in a molecule, the number of vMO changes with the choice of atomic basis set. Increasing the number of basis functions increases the mathematical accuracy of the molecule's wavefunction and properties, and also increase the number of vMOs. However, the high-energy vMOs are difficult to interpret and, indeed, are usually considered merely mathematical artifacts required by the approach by the complete basis set limit. Indeed, some atomic basis functions are added without any consideration for chemical interpretation. For example, diffuse functions are added to treat the long-range portions of molecular orbitals, which is especially important for electronic excited states and anions, where the probability of observing an electron far from the molecule is relatively large. Polarization functions are added to model the way atomic orbitals deform in the presence of other atoms and/or external electric fields. The "deformed" polarized atomic orbitals can lead to chemically unintuitive atomic charges. ${ }^{28}$

### 1.2 Mullliken and Löwdin Population Analysis

The main focus of this thesis is Mulliken's (overlap) population analysis, which is an orbital based approach to directly distribute molecular electronic charge to an atom pair. ${ }^{29}$ Assuming that molecular orbitals are normalized, the total number of electrons in a system can be written as the sum of the overlap of each oMO with itself, multiplied by the occupation numbers.

$$
\begin{equation*}
N=\sum_{i} n_{i}\left\langle\mathrm{MO}_{i} \mid \mathrm{MO}_{i}\right\rangle \tag{4}
\end{equation*}
$$

Where $N$ is the total number of electrons in the molecule, $n_{i}$ is the number of electrons (occupation number) of the molecular orbital $\left|\mathrm{MO}_{i}\right\rangle$. Notice that this equation is valid even for exact calculations, where the occupation numbers are not just zero and one (as they are for a single Slater determinant). Expanding the MOs in terms of AOs using equation (3),

$$
\begin{align*}
N & =\sum_{i} n_{i} \sum_{l k} C_{i l} C_{i k}^{\dagger}\left\langle\mathrm{AO}_{k} \mid \mathrm{AO}_{l}\right\rangle \\
& =\sum_{l k}\left\langle\mathrm{AO}_{k} \mid \mathrm{AO}_{l}\right\rangle \sum_{i} C_{i l} n_{i} C_{i k}^{\dagger}  \tag{5}\\
& =\sum_{l k} N_{l k}
\end{align*}
$$

Therefore, the total number of electrons in the molecule can decomposed into its contribution from different atomic basis functions. The AO decomposition can be re-expressed as an atom-based composition as long as the number of electrons associated with each atom $N_{A}$ sums up to the total number of electrons in the molecule,

$$
\begin{equation*}
N=\sum_{A} N_{A} \tag{6}
\end{equation*}
$$

Electrons of atom $A$ can be further decomposed into mono and di-atomic terms

$$
\begin{equation*}
N_{A}=\sum_{k, l \in A} N_{l k}^{A A}+\sum_{\substack{k \in A \\ l \in B \\ A \neq B}} N_{l k}^{A B}=\sum_{\substack{k \in A \\ l \in B}} N_{l k}^{A B} \tag{7}
\end{equation*}
$$

where atomic basis functions $k$ and $l$ either belong to the same atom $A$ or different atoms $A$ and $B$. Notice that the Mulliken partitioning makes the ad hoc assumption that the diatomic terms in Eq. (7), $N^{A \neq B}$, are divided equally between the contributing atoms. Different orbital-based partitioning methods differ based on (a) the choice of atomic basis functions and (b) how they deal with the diatomic terms in Eq. (7). These two decisions are not unrelated. In typical Mulliken analysis, the nonorthogonal atom-centered basis functions are used as atomic orbitals in Eq. (5);
this is done even though these atomic basis functions may not resemble the atomic orbitals and, indeed, even though the atomic basis functions may have significant amplitude on atoms that are far from the atom on which they are centered. This delocalization is especially acute for diffuse basis functions. This motivates the strategy of using Löwdin, or symmetric, orthogonalization to define a new set of atomic basis functions before performing the partitioning.

We will denote transformed orbitals with a tilde, so the old and new (orthogonalized) orbitals are denoted as $\left|\mathrm{AO}_{k}\right\rangle$ and $\left|\mathrm{AO}_{k}\right\rangle$, respectively. The new orbitals will be orthogonalized,

$$
\begin{equation*}
\left\langle\mathrm{AO}_{l}^{A} \mid \mathrm{AO}_{k}^{B}\right\rangle=\delta_{A B} \delta_{l k} \tag{8}
\end{equation*}
$$

subject to the constraint that the new basis set is as close to the old basis set as possible (in the L2norm). This Löwdin orthogonalized orbitals are then computed as

$$
\begin{equation*}
\left|\mathrm{AO}_{l}\right\rangle=\sum_{k} S_{l k}^{-1 / 2}\left|\mathrm{AO}_{k}\right\rangle \tag{9}
\end{equation*}
$$

Projection onto the subspace of orbitals associated with atom $A$ is then defined in the usual way,

$$
\begin{equation*}
\hat{p}_{A}=\sum_{l \in A}\left|\mathrm{AO}_{l}\right\rangle\left\langle\mathrm{AO}_{l}\right|=\sum_{l \in A} \sum_{k, m}\left|\mathrm{AO}_{m}\right\rangle S_{m l}^{-1 / 2} S_{l k}^{-1 / 2}\left\langle\mathrm{AO}_{k}\right| \tag{10}
\end{equation*}
$$

The advantage of using Löwdin-orthogonalized AOs from Eq. (9): there are no longer any contributions at all from the di-atomic terms, so

$$
\begin{equation*}
N_{A}=\sum_{l \in A} N_{l l}^{A A} \tag{11}
\end{equation*}
$$

Therefore, the problem of dividing di-atomic contributions between atoms has been removed. However, notice from Eq. (11) that the AOs assigned to atom $A$ have contributions from all of the
other atoms in the molecule. The Löwdin-orthogonalized AOs are, therefore, not highly localized on the atoms either. In the next two sections we will discuss other ways of defining effective atomic orbitals and dividing the di-atomic contributions between atoms.

### 1.3 Mulliken with Quasi-Atomic Orbitals

The aforementioned problems with Mulliken and Löwdin population analysis are not present if only the core and valence atomic orbitals-that is, functions from a minimal atomic basis set-are used. This motivates various techniques that are construct an appropriate atomic-orbital basis set. Two of the more popular options are natural population analysis (NPA) and the minimal basis set Mulliken analysis (MBS).

In NPA, one expands the occupied molecular orbitals (equivalently, the one-electron density matrix) using the atomic orbitals of the isolated neutral atoms,

$$
\begin{equation*}
w_{k l}^{A B}=\sum_{k, l, A, B} \int\left\langle\operatorname{isoAO}_{k}^{A}\right| \gamma\left(\mathbf{r}, \mathbf{r}^{\prime}\right)\left|\operatorname{isoAO}_{l}^{B}\right\rangle \tag{12}
\end{equation*}
$$

One then uses these weights to perform an occupation-weighted version of the Löwdin orthogonalization, i.e., one chooses the orthogonal AOs that it is as close as possible to the isolated AO basis in a weighted sense,

$$
\begin{equation*}
\left.\underset{\text { transformations }}{\min } \sum_{A k} w_{k k}^{A A}\langle | \operatorname{isoAO}_{k}^{A}-\left.\mathrm{AO}_{k}^{A}\right|^{2}\right\rangle \tag{13}
\end{equation*}
$$

This is only the essence of the NPA algorithm, which is a complicated method requiring orthogonalization wherein various orbital sets (core, Rydberg, valence, etc.) are orthogonalized separately. However, this reveals that NPA is, in essence, a cleverly-weighted Löwdin partitioning. NPA is therefore more robust than the standard (unweighted) Löwdin partitioning, but can have
problems when the isolated AO basis sets are unbalanced (e.g., if different basis sets are used for different atoms) or, more generally, when an isolated AO that should not have a large weight acquires an anomalously high weight via Eq. (12).

In MBS, the occupied molecular orbitals (equivalently, the one-electron reduced density matrix) are expanded in a minimal basis set, which is traditionally chosen to be the STO-3G* basis. The minimal basis set is then Lowdin orthogonalized. The resulting molecular orbitals are no longer normalized because the accurate molecular orbitals cannot be fully represented with a minimal basis set, so a normalization correction is required. The resulting scheme is not easily represented purely as an effective atomic orbital basis, but the key idea is that the wavefunction is expanded in terms of the Löwdin-orthogonalized minimal atomic orbital basis set. This clearly fails when the wavefunction has features that cannot be adequately represented with the minimal atomic basis set selected, as can be the case for highly-correlated systems, and states (e.g., excited states and anions) with diffuse electrons.

MBS can be improved by selecting an minimal atomic orbital basis set that is adapted to the system of interest in such a way that accuracy is not compromised. This is the strategy used in quasi-atomic orbital (QAO) methods. Unlike the Mulliken, Löwdin, and MBS approaches, but similar to NPA, the AOs are determined by the molecular orbitals, and are thereby adapted to the system. Unlike NPA and perhaps similar to Hirshfeld analysis, an auxiliary minimal basis set of accurate AOs are used so that chemists' intuition about the AOs that are used to construct MOs are retained. (Unfortunately, also similar to Hirshfeld analysis, only neutral AOs are used, so these methods are less obviously appropriate for charged molecules and ionic bonding.)

We consider three different types of QAO: QUAMBO, QUAO and IAO. All three of these methods start with a reference minimal basis set of accurate atomic orbitals called minAOs. The
goal is to find a set of quasi-atomic orbitals that (a) is as close to the minAOs as possible and (b) can exactly reconstruct the occupied molecular orbitals. Mathematically, this means that the quasiatomic orbitals are a linear combination of the molecular orbitals and a subset of the virtual molecular orbitals called the valence virtual molecular orbitals,

$$
\begin{equation*}
\left|\mathrm{QAO}_{k}\right\rangle=\sum_{i=1}^{N_{\text {ocerpicd }}} x_{k i}\left|\mathrm{oMO}_{i}\right\rangle+\sum_{a=N_{\text {occupicd }+1}}^{N_{\text {minaso }}} x_{k a}\left|\mathrm{vvMO}_{a}\right\rangle \tag{14}
\end{equation*}
$$

We have chosen the number of vvMOs plus the number of oMOs and the number of QAOs to both equal the number of minAOs, ${ }^{30}$ but there are times when including fewer, or more, vvMOs is helpful.

Finding the QAOs that resemble the minAOs most strongly amounts to choosing the best possible vvMOs, which means that one wishes to find the vvMOs that have the highest overlap with the minAOs. (These are the vMOs that have the greatest contributions from the minAOs. Consequently, they define the QAOs that have the greatest overlap with the minAOs.) In QUAMBO, the optimal set of vvMOs are those that maximize, ${ }^{3132}$

$$
\begin{equation*}
\max _{\mathrm{vvMOs}} \sum_{a=N_{\text {ocupuided }}+1}^{N_{\text {minao }}} \sum_{k=1}^{N_{\text {minao }}}\left\langle\mathrm{vvMO}_{a} \mid \min \mathrm{AO}_{k}\right\rangle\left\langle\min \mathrm{AO}_{k} \mid \mathrm{vvMO}_{a}\right\rangle \tag{15}
\end{equation*}
$$

The vvMOs are therefore given by the left singular vectors corresponding to the $N_{\min A O s}-N_{\text {occupied }}$ largest singular values of the overlap matrix between the virtual molecular orbitals and the minAOs, $\left\langle\mathrm{vMO}_{a} \mid \operatorname{minAO}{ }_{k}\right\rangle \cdot{ }^{33,34}$ When singular vectors with large singular values are thus discarded, it is reasonable to increase the space of vvMOs to include them. Similarly, in the (less likely) case where singular vectors with tiny singular values are thus included, it is reasonable to decrease the
space of vvMOs. In cases where the occupied MOs cannot be well-represented with the minAO basis set, it is reasonable to increase the minAO basis.

Eq. (15) resembles a projection of the vvMOs onto the space of minAOs, but because the minAOs are not orthonormal it is not a true projection operator. In quasi-atomic orbitals (QUAO), ${ }^{35}$ one tries to find QAOs that (a) maximally resemble the Löwdin-orthogonalized minAOs and (b) span the space of occupied molecular orbitals. Equation (15) is obtained again but because orthogonalized minAOs are used instead of the original minAOs,

$$
\left.\begin{array}{rl}
\left|\min \mathrm{AO}_{k}\right\rangle= & \sum_{l=1}^{N_{\text {minao }}}\left(S_{k l}^{\operatorname{minAO}}\right)^{-1 / 2}\left|\operatorname{minAO}_{l}\right\rangle \\
S_{k l}^{\operatorname{minAO}}= & \left\langle\operatorname{minAO}_{k}\right| \operatorname{minAO}  \tag{16}\\
l
\end{array}\right\rangle
$$

As before, the QUAO vvMOs are obtained by performing a singular value decomposition on the overlap matrix between the virtual MOs and the orthogonalized minAOs, $\left\langle\mathrm{vMO}_{a} \mid \operatorname{minAO}_{k}\right\rangle$.

Once the vvMOs have been determined using either the QUAMBO or QUAO procedure, the QAOs are obtained by projecting the minAOs onto the basis of occupied molecular orbitals and valence virtual molecular orbitals,

$$
\begin{equation*}
\left|\mathrm{QAO}_{k}\right\rangle=\sum_{i=1}^{N_{\text {occ }}}\left|\mathrm{oMO}_{i}\right\rangle\left\langle\mathrm{oMO}_{i} \mid \operatorname{minAO}_{k}\right\rangle+\sum_{a=1}^{N_{\text {vMos }}}\left|\mathrm{vvMO}_{a}\right\rangle\left\langle\mathrm{vvMO}_{a} \mid \operatorname{minAO}_{k}\right\rangle \tag{17}
\end{equation*}
$$

Intrinsic atomic orbitals (IAOs) were proposed by Knizia based on similar intuition, but without specifically optimizing an objective function as in the case of QUAMBO and QUAO. ${ }^{36}$ While QUAMBO and QUAO focus on the vMOs, in IAO the focus is on the oMOs. Like MBS, in IAO a key step is to project the occupied molecular orbitals onto the minAO basis, though in

IAO the accurate atomic orbitals are used for the minAO basis. Knizia calls the oMOs projected onto the minAOs depolarized,

$$
\begin{align*}
\left|\operatorname{doMOs}_{k}\right\rangle & =\sum_{l, m=1}^{N_{\text {minaO }}}\left|\operatorname{minAO}_{l}\right\rangle\left(S_{l m}^{\operatorname{minAO}}\right)^{-1}\left\langle\min \mathrm{AO}_{m} \mid \mathrm{oMO}_{k}\right\rangle  \tag{18}\\
S_{l m}^{\operatorname{minAO}} & =\left\langle\operatorname{minAO}_{l} \mid \operatorname{minAO}_{m}\right\rangle
\end{align*}
$$

The doMOs are the portion of the oMOs that can be expressed in the minimal basis set, and we could analyze them directly (which would be similar to MBS) or project an accurate wavefunction onto this space and then analyze it (which inspires the IAO approach). The projection onto doMOs can be written as

$$
\begin{align*}
& \hat{P}_{\mathrm{doMO}}=\sum_{l, m=1}^{N_{\text {minao }}}\left|\mathrm{doMO}_{l}\right\rangle\left(S_{l m}^{\mathrm{doMO}}\right)^{-1}\left\langle\mathrm{doMO}_{m}\right|  \tag{19}\\
& S_{l m}^{\mathrm{doMO}}=\left\langle\mathrm{doMO}_{l} \mid \mathrm{doMO}_{m}\right\rangle
\end{align*}
$$

However, unlike MBS, the IAO method does not ignore the portion of the oMOs that cannot be expressed using the minAOs and, indeed, the IAOs span the space of oMOs. We mentioned earlier that the IAOs are occupied-orbital-centric, as opposed to the virtual-orbital-centric approach in QUAMBO and QUAO. One way this is achieved is by using the resolution of the identity instead. I.e., one uses identities like

$$
\begin{equation*}
\sum_{a=1}^{N_{\text {vMOs }}}\left|\mathrm{vMO}_{a}\right\rangle\left\langle\mathrm{vMO}_{a}\right| \approx 1-\sum_{i=1}^{N_{\text {oMOs }}}\left|\mathrm{oMO}_{i}\right\rangle\left\langle\mathrm{oMO}_{i}\right| \tag{20}
\end{equation*}
$$

which are exact only in the basis-set limit. With this background, IAOs are given by the following formula,

$$
\begin{equation*}
\left|\mathrm{IAO}_{k}\right\rangle=\left[\left(\sum_{i=1}^{N_{\text {oMos }}}\left|\mathrm{oMO}_{i}\right\rangle\left\langle\mathrm{oMO}_{i}\right|\right) \hat{P}_{\mathrm{doMO}}+\left(1-\sum_{i=1}^{N_{\text {onos }}}\left|\mathrm{oMO}_{i}\right\rangle\left\langle\mathrm{oMO}_{i}\right|\right)\left(1-\hat{P}_{\mathrm{doMO}}\right)\right]\left|\operatorname{minAO}_{k}\right\rangle \tag{21}
\end{equation*}
$$

The interpretation of this formula is that IAOs are obtained by
(a) projecting the minAOs onto the depolarized occupied MOs, and then the expansion of the minAOs in the doMO basis is projected onto the original occupied MOs.
(b) projecting the minAOs onto the depolarized virtual MOs (using the resolution of the identity), and then projecting the minAOs in the depolarized virtual basis onto the original virtual MOs (again using the resolution of the identity).

### 1.4 Zero-Bond Dipole Orthogonalization (ZBD)

After a set of AOs has been selected, population analysis can be performed either using the Löwdin approach or the Mulliken approach. If the Mulliken approach is chosen, then it is necessary to contemplate how the di-atomic contributions should be partitioned between their composing atoms. Most generally, one considers a weighted division of the di-atomic contributions,

$$
\begin{align*}
N & =\sum_{l k} N_{l k} \\
& =\sum_{A} \sum_{l k} w_{l k}^{A} N_{l k}  \tag{22}\\
& =\sum_{A} N_{A}
\end{align*}
$$

weight $w_{j k}^{A}$ of atomic basis functions $j$ and $k$ belonging to atom $A$ is normalized for every given atom in the molecule so that number of electrons $N_{A}$ belonging to atom $A$ can be written as

$$
\begin{equation*}
N_{A}=\sum_{l k} w_{l k}^{A} N_{l k} \tag{23}
\end{equation*}
$$

In traditional Mulliken population analysis $N_{j k}$ is split equally between the atoms that atomic basis $j$ and $k$ belong to. I.e.,

$$
w_{l k}^{A}\left\{\begin{array}{l}
l \in A \text { and } k \in A=1  \tag{24}\\
l \in A \text { and } k \notin A=0.5 \\
l \notin A \text { and } k \in A=0.5 \\
l \notin A \text { and } k \notin A=0
\end{array}\right.
$$

Which means that if $j$ and $k$ both are associated with atom $A$ the weight is equal to one and all the considered electrons belong to one atom; this corresponds to the atomic term, $N_{j k}^{A A}$, in equation (7). If either $j$ or $k$ basis functions belong to another atom $B \neq A$ then the weight is half, and atom $A$ only gets half of the electrons. The last case is where neither AO is associated with atom A, in which case this no contribution is made to this atom's population. These simple half-andhalf partitioning of the di-atomic populations ignores basic chemical concepts like the way electronegativity leads to polar covalent bonds and the fact that distant atoms do not bond (even if their diffuse functions overlap significantly).

There are many possible refinements to the conventional Mulliken partitioning of di-atomic contributions, but we focus on the zero-bond dipole (ZBD) method proposed by Laikov. ${ }^{37}$ The general framework is that one to transform the QAOs (whether QUAMBO, or QUAO, or IAO) into an orthogonal set of quasi-atomic orbitals, oQAOs, that are in some sense optimal. For example, most common orthogonalization methods can be expressed as the minimization of a quadratic functional,

$$
\begin{equation*}
f=\sum_{k, l} w_{k l}\left\langle\mathrm{QAO}_{k}-\mathrm{oQAO}_{k}\right| \hat{F}\left|\mathrm{QAO}_{l}-\mathrm{oQAO}_{l}\right\rangle \tag{25}
\end{equation*}
$$

For example, the Löwdin corresponds to $w_{k l}=\delta_{k l}$ and $\hat{F}=1 .{ }^{38}$ The zero-bond-dipole orthogonalization is not expressed exactly in this form (though it is inspired by such an objective function). The idea is that the problem of dividing atomic charges in Mulliken analysis is caused
by the fact the product of two $\mathrm{QAOs}, \mathrm{QAO}_{k}^{A}(\mathbf{r}) \cdot \mathrm{QAO}_{l}^{B}(\mathbf{r})$ is polarized along the bond, and therefore an equal division of this contribution between atoms $A$ and $B$ is ill-advised. This suggests orthogonalizing the orbitals in such a way that the orthogonal orbitals have zero dipole moment along the bond,

$$
\begin{equation*}
\mathbf{R}_{A B} \cdot\left\langle\mathrm{oQAO}_{k}^{A}\right| \mathbf{r}\left|\mathrm{oQAO}_{l}^{B}\right\rangle=0 \tag{26}
\end{equation*}
$$

where $\mathbf{R}_{A B}=\left(\mathbf{R}_{A}-\mathbf{R}_{B}\right) /\left[\left(\mathbf{R}_{A}-\mathbf{R}_{B}\right) \cdot\left(\mathbf{R}_{A}-\mathbf{R}_{B}\right)\right]$ is the (normalized) internuclear distance vector. The new orthogonal QAOs will be called ZBD-QAO and will satisfy, by construction,

$$
\begin{equation*}
\left\langle\mathrm{ZBD}^{\mathrm{QAO}}{ }_{k}^{A} \mid \mathrm{ZBD}-\mathrm{QAO}_{l}^{B}\right\rangle=\delta_{k l} \delta_{A B} \tag{27}
\end{equation*}
$$

The QAOs we have defined are already orthogonalized within an atom, but not between atoms. We start by performing a Löwdin orthogonalization of the QAOs. ZBD-QAOs can then be obtained as a unitary transformation of the Lowdin-orthogonalized QAOs,

$$
\begin{gather*}
\left|\mathrm{ZBD}-\mathrm{QAO}_{k}^{A}\right\rangle=\sum_{l, B} T_{k l}^{A B}\left|\mathrm{oQAO}_{l}^{B}\right\rangle  \tag{28}\\
T_{a b}^{A B}=\exp \left(\mathbf{L}-\mathbf{L}^{\dagger}\right) \tag{29}
\end{gather*}
$$

The lower triangular matrix $\mathbf{L}$ is chosen so that the dipole moment overlap, minimized over all diatomic terms, becomes as close to zero as possible

$$
\begin{equation*}
\mathbf{f}(\mathbf{L}) \equiv \sum_{\substack{A^{\prime} k^{\prime} B l^{\prime} l^{\prime} \\ A \neq B}} \mathbf{R}_{A B} \cdot\left[\exp \left(\mathbf{L}-\mathbf{L}^{\dagger}\right)\right]_{k k^{\prime}}^{A A^{\prime}}\left\langle\mathrm{QAO}_{k^{\prime}}^{A^{\prime}}\right| \mathbf{r}\left|\mathrm{QAO}_{l^{\prime}}^{B^{\prime}}\right\rangle\left[\exp \left(\mathbf{L}-\mathbf{L}^{\dagger}\right)\right]_{l^{\prime} l}^{B^{\prime} B}=0 \tag{30}
\end{equation*}
$$

This function is minimized using Scipy with the threshold for the function minimization set to $10^{-7}$. Equation (30) can be minimized directly but the efficiency can be improved by providing the Jacobian,

$$
\begin{equation*}
\left.\frac{\partial f_{A k ; B l}}{\partial \ell_{C m ; D n}}\right|_{\mathrm{L}=\mathbf{0}} \tag{31}
\end{equation*}
$$

The transformation matrix is antisymmetric, for each iteration during the optimization only lower triangular part is updated. The new transformation is constructed as the product of lower triangular matrix and transpose of itself.

$$
\begin{equation*}
\left[\mathbf{L}-\mathbf{L}^{\dagger}\right]=\ell_{\mu \nu}\left(\delta_{C m ; D n}-\delta_{C m ; D n}\right)=\ell_{\mu \nu}\left(\delta_{\mu \nu}-\delta_{\nu \mu}\right) \tag{32}
\end{equation*}
$$

to ensure lower triangular shape $\mu<v$.

$$
\begin{equation*}
\left.\frac{\partial f_{A k ; B l}}{\partial \ell_{C m ; D n}}\right|_{\mathbf{L}=\mathbf{0}} \equiv \mathbf{R}_{A B} \cdot\binom{+\delta_{C m ; A k}\left\langle\chi_{D n}^{(i)}\right| \mathbf{r}\left|\chi_{B l}^{(i)}\right\rangle-\delta_{A k ; D n}\left\langle\chi_{C m}^{(i)}\right| \mathbf{r}\left|\chi_{B l}^{(i)}\right\rangle}{+\delta_{C m ; B l}\left\langle\chi_{A k}^{(i)}\right| \mathbf{r}\left|\chi_{D n}^{(i)}\right\rangle-\delta_{B l ; D n}\left\langle\chi_{A k}^{(i)}\right| \mathbf{r}\left|\chi_{C m}^{(i)}\right\rangle} \tag{33}
\end{equation*}
$$

Jacobian in equation (33) is minimized alongside the objective function until converge criteria ( $10^{-}$ ${ }^{7}$ ) is reached. The target minAO orbitals are maximally resembled by defining an overlap between minAO and converged orthogonal orbitals.

$$
\begin{equation*}
S_{k l}^{A}=\left\langle\operatorname{minAO}_{k}^{A} \mid \mathrm{OQAO}_{l}^{A}\right\rangle \tag{34}
\end{equation*}
$$

By using polar decomposition ${ }^{1}$ converged orbitals are transformed into ZBD-QAO
${ }^{1}$ https://docs.scipy.org/doc/scipy-0.14.0/reference/generated/scipy.linalg.polar.html

$$
\begin{equation*}
\left|\mathrm{ZBD}^{2} \mathrm{QAO}_{k}^{A}\right\rangle=\sum_{A k ; A k^{\prime}} U_{k^{\prime}}^{A A^{\prime}}\left|\mathrm{OQAO}_{k^{\prime}}^{A}\right\rangle \tag{35}
\end{equation*}
$$

where the transformation matrix within a given atom is $U_{k k^{\prime}}^{A A^{\prime}}$

### 1.5 Conclusion

Three different QAO populations can be carried out by using QUAMBO, QUAO and IAO, these will be referred to as to Q1, Q2, and Q3 for the comparison of charges in chapter four for better table fitting. The reason why we are suggesting these QAO and ZBD-QAO instead of the canonical ones is:

1. Derived from the MO so expected to be less dependent to basis set
2. Easy to calculate
3. Qualitatively intuitive like minAO
4. Mulliken populations should improve with QAO
5. ZBD orthogonalization for chemical trends

## Chapter 2

## 2 Aim of the Study

### 2.1 Problems with Mulliken

Mulliken population ensures that partitioning of the electrons between two basis functions belonging to two different atoms is systematically solved. Even though Mulliken is mathematically unambiguous and elegant, dividing electrons equally between two different atoms has no base on chemical intuition. Using a minimal basis set gives good results with Mulliken, but as the basis set gets bigger atomic charges become unrealistic. This problem can be remedied by Löwdin by orthogonalization of orbitals to atoms. The downside of this technique is undesirable mixing of orbitals. During the orthogonalization procedure (the projection onto atomic space of atom $A$ ) occupied and virtual orbitals are mixed and this is expected in a molecular system. However, the
core electrons rarely contribute to bonding and Löwdin orthogonalization mixes core and valence spaces. Having higher core-valence coefficients in the overlap matrix can lead to chemically unintuitive atomic charges.

Mulliken's population may be systematic, but it fails to follow elementary chemical rules such as electronegativity, since the bond electrons are divided to atoms equally in equation (10). Even though the electrons are divided equally we still get chemically relevant results such as the chlorine of HCl is less negative than HF. But this trend is only insured by the overlap matrix, fluorine basis functions overlap more with hydrogens than chlorines. Many studies on concludes that Mulliken population depends heavily on the atomic orbitals chosen for the calculation. There are many options for choosing basis set for quantum mechanics calculations, considering that there is no computational limitation for the quality of the wavefunction bigger basis sets are preferred. On the other hand, if there are computational limitations (which is rarely the case) a minimal basis set is preferred. Mulliken can benefit from the chemically intuitive basis sets such as a minimal basis set at the cost of mathematical accuracy.

Table 2-1. Mulliken population for methane atomic charges ( C and H ) for different basis sets with varying number of total atomic functions (Nbasis) B3LYP/(STO-3G, Def2-SVPP, Def2-SVPD, Def2-TVPP, Def2-TVPD, Def2-QZVPP, Def2-QZVPD).

| $\mathrm{N}_{\text {basis }}$ | Basis set | C | H |
| :---: | :---: | :---: | :---: |
| 9 | STO-3G | -0.309 | 0.077 |
| 22 | Def2-SVPP | -0.443 | 0.111 |
| 52 | Def2-SVPD | 0.447 | -0.112 |
| 73 | Def2-TVPP | -0.382 | 0.096 |
| 87 | Def2-TVPD | -0.889 | 0.222 |
| 177 | Def2-QZVPP | -0.156 | 0.039 |
| 195 | Def2-QZVPD | -0.579 | 0.145 |

Different basis sets and resulting atomic charges for methane molecule is provided in Table 2-1. The variation between different basis set cannot be just attributed to the number of basis functions
but we can confidently say that Mulliken is a basis set dependent population. For Def2-SVPD diffuse basis set we see a negative hydrogen charge on methane, while the chemical expectation is that the hydrogen donates electrons to carbon which results in a positive atomic charge.

Populations that to make up for the chemical intuition with specialized series of orthogonalizations with separation of chemically relevant spaces already exists. ${ }^{39}$ NPA population, which will be compared to Mulliken in the later chapters, is very ambiguous and mathematically nonsensical. We propose a more elegant way of using non-canonical atomic orbitals that will be unique to the molecular wave function called Quasi-Atomic Orbital (QAO). These orbitals will be obtained by trying to resemble minimal atomic orbitals from the

### 2.2 Motivation

The aim of this work is twofold:

1. New orbital based population analysis QAO with Mulliken in comparison with the popular (CM5, QH, ESP, Mulliken, NPA) or referred to as "common population analysis" in this work. QAO populations will be assessed for mathematical and chemical traits and compared to common population analysis with a large database of molecules in chapter three.
2. New orthogonalization scheme for QAO orbitals. We expect QAO might fail to provide reliable chemical trends because they are non-orthogonal. ZBD orthogonalization is a more chemically intuitive way of orthogonalization than Löwdin. The resulting chemical trends with ZBD-QAO is expected to be more chemically intuitive than non-orthogonal QAO. Before the comparative assessment, ZBD-QAO charges will be tested with a small dataset from the reference ${ }^{37}$ then chemical trends performance of all 11 population analysis will be assessed in chapter 4. The structures of molecular interactions are provided in appendix B.

### 2.2.1. Chemical Database

Molecules and molecular interactions chosen for comparison consists of 1866 structures ranging from well-known to unusual, organic to metal clusters. Most of these structures have been reported by the literature and some of them were generated and optimized with the specifications given in section 2.3. The list of the datasets from literature and the a list of the chemical formulas are included in appendix A. Structure are ordered by ID used in Vetee, program written for handling population analysis data. It should be noted that ID's don't always represent the same structure or state; conformers and different charges states of a molecule is grouped in the same ID. Different states are distinguished by the job ID which is not provided in this work.

Before comparing populations, a set of realistic expectations of behavior should be provided since there is no experimental data to compare to. Therefore, there is not a way to deduct one method is strictly better than the other. Instead, what we can do is define properties that we expect to observe from populations and compare their performances. Desired traits can be divided into two main topics of chemical and mathematical assessment. While both traits are desired in any given partitioning method, the end goal is to define a method that is chemically reasonable and mathematically reliable.

### 2.2.2. Chemical Intuition

The goal of every population is to gain a better understanding of chemical system. Therefore, the atomic charges should match the experimentally observed chemical reactivity. In retrospect, this possibly makes this trait the most difficult to assess because there are no target values to compare to. Instead, a viable option is comparing the atomic charge differences in intermolecular and intramolecular system. Atomic charges are expected to be in a reasonable range. Universally accepted intermolecular theory of atoms can include electronegativity and radius size. For example, going down the periodic table for halogens we expect increase in radius size and decrease in electronegativity. A population analysis can fail to satisfy chemical expected intermolecular behavior if a fluorine is more positive than a chlorine atom. While ideally each molecule should be distinct, the atomic constituents should be transferrable to different chemical environments. Populations should be applicable to all atoms and should give reasonable atomic charges for different total molecular charges. Some of the populations that will be discussed later are optimized for neutral molecules, but it is crucial that any population should be able to describe charged structures. Atomic charges should also be correlated with the oxidation state of the atom. While oxidation states are integers, atomic populations should never be rounded to integers. Ideally,
we expect atomic charges lower than oxidation states. While there is not a definite answer to what an atoms atomic charge should be, for a ground state molecule it should not exceed valence capacity of an atom. For example, the atomic charge of a hydrogen atom of in an organic system should not be close to (or greater than) one. When the electronic structure is delocalized like in a benzene molecule, the atomic charge should be evenly spread out to atoms. Minor changes to molecular system should not result in drastic or unpredictable changes, instead it should be a systematic change in numerical values. Conformational, or rotations around the free bonds, effect on charge partitioning methods have been studied over two decades. ${ }^{40}$ Ideally, we expect small changes in the molecule to not greatly affect the atomic charges. Similarly, atomic charges of different conformations of a molecule should be similar and stable with rotations around bonds. The charges should be in accordance with the anionic and cationic makeup of the molecule such that the actives sites can be identified.

### 2.2.3. Mathematical Stability

Partitioning method should be bias-free and only dependent on the unique wavefunction of the molecule. Computational robustness is expected, as well as unique atomic charges. For canonical orbital based population methods (Mulliken, NPA, atomic basis functions are predetermined to reflect the chemists' expectations from orbitals. However, this expectation makes the atomic orbitals used to describe the molecular system not unique and open to bias resulting in basis set dependency. There are many different basis sets in literature and partitioning methods should be independent of this choice. Similarly, level of theory used to construct the wave function should not greatly affect the results.

### 2.3 Computational Details

Molecules from each dataset were selected to test the limitations of some common densitybased partitioning populations(Hirshfeld, Charge-model 5 or CM5), ${ }^{13,15}$ electrostatic potential fitting population (ESP) from Hu-Lu-Yang, ${ }^{41}$ and three widely available orbital-based population analysis: Mulliken (M), Minimal Basis Set (MBS), ${ }^{28}$ and Natural Population Analysis (NPA). ${ }^{42}$ These results are compared to three methods based on quasi-atomic orbitals (QUAMBO, QUAO, IAO) in both their Mulliken and Löwdin formulations, with and without ZBD orthogonalization.

Structures without coordinates were generated using PubChemPy ${ }^{43}$ package. These coordinates were optimized using Gaussian16 (version B.01) software package. ${ }^{14}$ (For datasets with optimized geometries, the optimization step was skipped and only the population analysis was carried out.) Geometry optimizations were performed with $\mathrm{HF}^{44}$, B3LYP ${ }^{45}$ and $\omega$ B97XD ${ }^{46}$ levels of theory and Def2-SVP basis set, ultrafine integration grids, very tight linear equation solutions for SCF procedure and very tight optimization criteria. After the convergence, using stable=opt keyword the geometry was confirmed to be the local minimum. All other options in the Gaussian program were set to their default values, except occasionally additional keywords were needed to obtain convergence. NPA, Hirshfeld, Mulliken, ESP atomic charge calculations were generated with same integral and SCF options using basis sets ${ }^{47,48}$ def2-SVPP, def2-SVPD, def2TZVPP, def2-TZVPD, def2-QZVPP basis sets were used; these basis sets use pseudopotentials to estimate relativistic effects for atoms beyond Krypton ( $\mathrm{Z}=36$ ). ${ }^{47,48}$ These property-optimized augmented basis sets were chosen because they cover the wide variety of atom types in our database

## Chapter 3

## 3 Comparison of Population Analysis

### 3.1 Method

Approximation of the wave function method (or referred to as the level of theory) effect on the atomic charges have been assessed in this section.


Figure 3-1. Scatter plot of atomic charges with three methods (B3LYP, HF, $\omega$ B97XD)/Def2-SVPP of common populations (CM5, Mulliken, NPA, QH, ESP) charges below negative three are omitted.

Atomic charge spread with three different level of theory for common population methods has been plotted Figure 3-1 as a stripplot ${ }^{2}$. This plot is a scatterplot where one variable is a category, in this case is the wave function method: B3LYP, HF, $\omega$ B97X. Some of the low-lying atomic charges have been omitted due to scaling issues and will be discussed later in Outlier Structures section. This graph gives a very rough look at atomic charge spread with different methods, HF method gives the highest spread out of all three. While the lower boundaries for all three levels of theory are similar (except for some outliers from Mulliken and ESP) the spread of the higher boundary is considerably more significant. Between B3LYP and HF, NPA charges above two can shift up to $\sim 0.5$. High positive charges can be dependent on the level of theory, especially for the NPA population. The same magnitude of method dependency can be observed with Mulliken as well for positive charges around positive one. We can tentatively say that ESP population is also level of theory dependent, but it is not very clear from this Figure 3-1. Hirshfeld flavors CM5 and QH seem to be the most stable population with changing level of theory and are the least spread out. These atomic charges tend to stay in the range of positive to negative one with CM5 being slightly more spread out than QH . The spread of atomic charges for each partitioning method can be further studied numerically in Figure 3-2. Each histogram is the distribution of $\left|q_{\max }-q_{\min }\right|$ where $\mathrm{q}_{\text {max }}$ and $\mathrm{q}_{\text {max }}$ are the maximum and minimum atomic charge of an atom for three methods: HF, B3LYP, and $\omega$ B97XD. All these graphs are skewed right histograms with greatest densities around zero and two to three minor peaks varying between 0.05 to 0.3 . Ideally, we should be looking for a shorter tail for a smaller range in atom charge difference with changing levels of

[^0]theory. CM5 and QH (almost identical in density) are still the least method dependent with sharp and the highest peak around zero compared to the other population methods. Also, these two graphs have the shortest tails not exceeding 0.5 and three minor peaks around $0.04,0.06$ and 0.11 . The major peak around zero is shorter and wider for the ESP method. The tail is extending almost to 0.8 pointing towards a much higher level of theory difference. The minor peaks from the Hirshfeld techniques, CM 5 and QH , are shifted by $0.02,0.18$ and 0.2 . If a method dependency occurs with Hirshfeld techniques, then this dependency may be higher with ESP. NPA is comparable but a bit worse than ESP in dependency; the major peak is lower in density and shifted slightly away from zero. Also, the densities of the minor peaks are less prominent. Since the minor peaks are common to all population analysis methods, their presence may be caused by the molecular structures. The Mulliken population analysis histogram has the widest peaks among all tested methods, and its highest density peak is not even close to zero, instead lying above 0.05 . There are only two minor peaks and they lie around 0.11 and 0.3 making them the highest out of all the considered methods. Although the tail of the graph is slightly above 0.5, looking at the frequency densities we can summarize that Mulliken is the most level of theory dependent population analysis technique. Out of all the flavors of QAO, IAO seems to be the least level of theory dependent with a shorter tail that is comparable to CM5 and QH methods.

The tails of CM5 and QH graphs are from dataset MB08 (ID 1354, 1402, 1273) and all different atoms ( $\mathrm{F}, \mathrm{C}$ and H respectively). Higher atomic charge differences between different methods cannot be attributed to an atom type with the MB08 dataset, but the dissociating bond effect on robustness of CM5 and QH should be be considered. Also, description of long distance interactions are very different with $\omega$ B97XD compared to HF. NPA tail (ID 1339, 1419, 1344) and ESP tail are both from the MB08 dataset (ID 1339, 1402, 1344) at the HF level. Unlike other
population analyses, the QUAO tail is mostly the X40 dataset (ID 1460 1460, 1326) for both HF and B3LYP. Molecule ID 1460 seems to be high in variance for carbon and bromine atoms with QUAO; bromine is the end of the tail with variance of one.


Figure 3-2 Distribution of max. min. atomic charge difference for three different levels of theory (B3LYP, HF, $\omega \mathrm{B} 97 \mathrm{XD}$ ) for CM5, QH, ESP, Mulliken, NPA, QUAMBO, QUAO, IAO populations. One unit on the y axis is a thousand atomic charges.

The spread for the level of theory dependency is further studied with the variance $\sigma^{2}$ which is a measure of how far each atomic population is from the mean for studied methods.

$$
\begin{align*}
\sigma_{A}^{2} & =\frac{\sum_{m \text { molecules atom } a \in m} \sum_{q=\{\mathrm{HF}, \mathrm{~B} 3 \mathrm{LYP}, \omega \mathrm{~B} 97 \mathrm{XD}\}}\left(x_{m a q}-\overline{x_{m a}}\right)^{2}}{n_{A}}  \tag{36}\\
\sigma^{2} & =\frac{\sum_{\text {all molecules } \mathrm{m}} n_{A} \sigma_{A}^{2}}{n_{\text {total number atoms in all molecules }}}
\end{align*}
$$

where average variance $\sigma^{2}$ is calculated as the variance of each atom as molecules for three different methods. Atomic charge $x_{m a q}$ and $\overline{x_{m a}}$ is the average of the atomic charge over all methods: HF, B3LYP, $\omega$ B97XD. To omit the effect of basis set dependency only population calculations carried out with one basis set Def2-SVPP is considered:

Table 3-1. Average and maximum variance of each population for same atom with three different methods (HF, B3LYP, $\omega$ B97XD) with one basis set Def2-SVPP.

|  | $\operatorname{Avg}(\sigma 2)$ | $\operatorname{Max}(\sigma 2)$ |
| :---: | :---: | :---: |
| CM5 | $7.00 \mathrm{E}-05$ | $6.90 \mathrm{E}-02$ |
| QH | $7.00 \mathrm{E}-05$ | $6.90 \mathrm{E}-02$ |
| ESP | $1.08 \mathrm{E}-03$ | $1.68 \mathrm{E}-01$ |
| Mulliken | $6.54 \mathrm{E}-03$ | $7.56 \mathrm{E}-02$ |
| NPA | $7.54 \mathrm{E}-04$ | $1.89 \mathrm{E}-01$ |
| QUAMBO | $7.80 \mathrm{E}-04$ | $9.29 \mathrm{E}-01$ |
| QUAO | $6.51 \mathrm{E}-04$ | $2.21 \mathrm{E}-01$ |
| IAO | $3.15 \mathrm{E}-04$ | $8.72 \mathrm{E}-02$ |

Average values of variance of each atom with different methods are presented in Table 3-1. On average Mulliken population analysis, followed by ESP and NPA, is the most method dependent population analysis. The least method dependent population is Hirshfeld flavors CM5 and QH followed by QAO flavors. The most method dependent QAO flavor is QUAMBO and the least dependent is IAO. In accordance with the previous findings, the HF method increase the variance
for all methods, if HF calculations are omitted all average variance values go down. Maximum values of the variance values are also provided in the second column of Table 3-1, while the highest average variance is seen for Mulliken the maximum variance is seen for QUAMBO. This is mainly because of some atom types are unstable with QUAMBO and QUAO. Maximum variance of IAO is less than other QAO flavors. It is interesting to observe that maximum variance of Mulliken is comparable to that of CM5 and QH. Meaning, this value is not an outlier (atoms from MB08 dataset), but Mulliken population has high variance for most atoms with different methods.

To summarize the findings of method dependency, with or without the mindless DFT benchmarking dataset MB08, is given by:

|  | CM5 | QH | ESP | Mulliken | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Method independence (with MB08) | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ |
| Method independence (without MB08) | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark *$ | $\checkmark *$ | $\checkmark$ |

Mulliken is the most method dependent population followed by ESP and NPA. Method dependency can be improved for ESP and NPA by taking out the MB08 dataset. This cannot be said for Mulliken, this population stays method dependent for all datasets. QUAMBO and QUAO in general improves the method dependency of Mulliken except for Br atoms.

### 3.2 Basis Set

In this section the effect of increasing the number of basis functions, or using a bigger basis set, on population analysis methods is studied.


Figure 3-3 Scatter plot of atomic charges with three different level of theory basis sets (Def2SVPP, Def2- TZVPP, Def2-QZVPP) for population analysis methods (CM5, Mulliken, NPA, QH, ESP) omitted atomic charges below negative three.

The most spread out atomic charges can be seen with Def2-SVPP basis set from Figure 3-3. Mulliken charges are considerably higher and the band structures seen with atomic charges above positive two for NPA with Def2-TZVPP and Def2-QZVPP basis sets are fuzzier for this basis set. Comparing these band like structures seen in higher charges for NPA with Figure 3-1, for basis set these band structures are more prominent. This can be attributed to NPA qualitatively being more basis dependent than method dependent. The preferable basis set in atomic charge quality framework is Def2-QVPP. Use of this basis set results in the least spread out atomic charges.

Furthermore, the benefit of increasing the number of basis functions is clear with the decreasing number of outlier atomic charges. Like the previously seen with method dependency, basis set dependency is the least for CM5 and QH.

Like level of theory dependence histograms in in Figure 3-2 basis set dependency can be assessed quantitatively Figure 3-4. A higher dependency (on average) can be observed with basis set compared to method. This can be proven by looking at the maximum tail of a histogram; for method dependency it is one (with QUAO) while in Figure 3-4 it is above two (with Mulliken). CM5 and QH graphs show a very narrow peak around 0.03 which makes them the most basis set stable two population methods. These methods also have the shortest tail extending to a smaller range of 0.44 . Opposite to this case, Mulliken and ESP are more basis set dependent than method. Both have wider peaks resulting in a more spread out distribution with the change of basis. Primary density peak of Mulliken is located below 0.1 , for basis set it is approximately located between 0 0.5 almost the five times more spread out than the former. Furthermore, both methods have longer tails extending past 1.75 and 2.0 respectively. Considering both the peak width and tail length we can summarize that Mulliken followed by ESP is the most basis set dependent population analysis methods. There is higher density at the tail ends for CM5, QH and QUAMBO. for basis sets than methods. The tails of the CM5 and QH like the method graphs, are composed of molecules from MB08 dataset (ID 1383, 1343, 1393) and all are oxygen type atoms. The longest tail seen for Mulliken consists of carbon atomic charges from zwitterionic molecules of JOC dataset (ID 812). The same molecule ID 812 seems to be a problematic molecule for population analysis methods because we can find it also at the end of ESP tail. Instead of the carbon atomic charges like Mulliken, ESP is unstable with nitrogen atoms. Molecular structures with greater basis set dependency for QUAMBO, QUAO and IAO are not the same. Starting with QUAMBO, the tail
is almost the same carbon atomic charges as Mulliken tail in a lower magnitude. QUAO has tail is mostly from Br charges intermolecular interaction structures of X40 dataset (ID 1460,1479,1466). Bromine atom disrupts QUAO computational robustness. Last QAO flavor IAO tail has molecules from (ID 1383, 1343, 1393) from MB08 mindless dataset and for only HF method and only for oxygen atoms. The same oxygen atomic charges also destabilize NPA method (ID 1343, 1383, 1303). From basis set dependency perspective QUAMBO and Mulliken, IAO and NPA have the same challenges. QUAO seems to be the worst out of all three at explaining halogen bonding.


Figure 3-4. Distribution of max. min. atomic charge difference for three different basis sets (Def2-SVPP, Def2TZVPP, Def2-QZVPP) for CM5, QH, ESP, Mulliken, NPA, QUAMBO, QUAO, IAO populations. One unit on the y axis is a thousand atomic charges.

Next, we will consider how basis set dependency by with looking at the average and maximum variance $\sigma^{2}$ for three different basis sets. Comparing this basis set table with the previous method variance in Table 3-1, higher numbers are observed. This means that all populations are more basis set dependent than method dependent.

Table 3-2. Average variance of each population for same atom with three different basis sets (Def2- SVPP, Def2- TZVPP, Def2-QZVPP) with B3LYP method.

|  | $\operatorname{Avg}(\sigma 2)$ | $\operatorname{Max}(\sigma 2)$ |
| :---: | :---: | :---: |
| CM5 | $6.37 \mathrm{E}-04$ | $6.42 \mathrm{E}-02$ |
| QH | $6.37 \mathrm{E}-04$ | $6.42 \mathrm{E}-02$ |
| ESP | $1.40 \mathrm{E}-03$ | $8.78 \mathrm{E}-01$ |
| Mulliken | $2.60 \mathrm{E}-03$ | $1.12 \mathrm{E}+00$ |
| NPA | $1.60 \mathrm{E}-03$ | $1.05 \mathrm{E}-01$ |
| QUAMBO | $2.08 \mathrm{E}-03$ | $9.29 \mathrm{E}-01$ |
| QUAO | $2.02 \mathrm{E}-03$ | $2.21 \mathrm{E}-01$ |
| IAO | $3.15 \mathrm{E}-04$ | $8.72 \mathrm{E}-02$ |

The highest value is seen with Mulliken population from Table 3-2 followed by NPA, ESP. The lowest average variance is with Hirshfeld CM5 and QH , so these are the least basis set dependent populations. QUAMBO and QUAO are only slightly less basis set dependent than Mulliken population. IAO is an improvement over Mulliken and other QAO flavors, there is a clear decline in maximum variance from Mulliken-QUAMBO-QUAO-IAO.

Using QAO as orbitals instead of canonical ones decreases basis set and method dependency for Mulliken population analysis. Dependency for QUAMBO, QUAO, and ESP can be decreased by omitting some datasets like MB08. Some atom types increase the dependency with QAO flavors so in the next section we will be talking about effect of atom type.

|  | CM5 | QH | ESP | Mulliken | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Basis set independence (with MB08) | $\checkmark$ | $\checkmark$ | $\times$ | $x$ | $\checkmark$ | $x$ | $x$ | $\checkmark$ |
| Basis set independence (without MB08) | $\checkmark$ | $\checkmark$ | $\checkmark$ | $x$ | $\checkmark$ | $\checkmark *$ | $\checkmark *$ | $\checkmark$ |

### 3.3 Atom Type

Atoms are the fundament of every population analysis, so any population analysis method should be applicable to all atom types. Atomic charges in the database (for total number of 143883 atoms) are pair plotted for clear visualization of correlation between different population analysis. Due to the number of studied methods we have split the pair plots into three sections; common-common, QAO-QAO and finally QAO-common correlation graphs. To start with, correlation of common studied population analysis methods is presented Figure 3-5. For each atom type a different marker is used and provided in the legend on the right side of the graph. It should be emphasized that charges that were omitted in previous graphs (extremely negative sodium charges) is shown in this graph. However, this is not applied in the next two correlation graphs (QAO-QAO and QAOcommon) since the outlier charges for QAO flavors are on the positive side it causes scaling issues. These omitted charges will be revisited in outlier charges section.


Figure 3-5 Correlation of atomic charges from different (CM5, Mulliken, NPA, QH, ESP) population analysis for B3LYP/Def2-SVPP separated by atom type.

The highest (almost linear) correlation is seen between CM5 and QH. This is to be expected because both are Hirshfeld population analysis flavors. From the scatter plot the most different charges seem to be for nitrogen atom. If this atom type is taken out of the database the regression line slope increases from 0.58 to 0.64 , hence increasing the correlation. Considering that database at hand has some charged species it is unusual to see atomic charges for different atom types are
all in a small range for these methods and should be studied with high expected charges. Oxygen charges, concealed by the nitrogen markers, are also slightly different QH charges are on average higher ( -0.08 ) than CM5 charges ( -0.42 ). Attributing this difference between two methods to atom types might be an oversimplification of the problem, since most datasets with nitrogen and oxygen have charged molecules. This behavior might be due to the existence of charged species especially considering both atom types are spread out for other methods. Nitrogen and oxygen charges for CM5 and QH will be further studied in the next sections.

The most notable difference in the correlation plots is for ESP with outlier Na charges from ID 46, which were omitted for other figures better scaling in most figures. Compared to other populations, not only ESP has the highest carbon charges (higher than positive two) but also it has the most spread out charges. Further investigation on atom type effect on population analysis is required. NPA seems to produce the highest range for atomic charges. NPA correlation graphs are the most unique out of all the others, there is a clear deviation form linear dependence with atom types silica, potassium, aluminum. Atomic charges of xenon extend to positive four, which for other populations extend up to positive two.

Localization of several atom types can be seen among most population analysis. An example is silica which is most delocalized with Mulliken ranging between approximately 0.5 to 1.5, while for others it is very localized to a 0.5 atomic charge range. A higher range is not necessarily a defect, but it requires closer inspection to the reason why.


Figure 3-6. Correlation of atomic charges between different QAO flavors (QUAMBO, QUAO, IAO) population analysis for B3LYP/Def2-SVPP separated by atom type.

Atomic charge difference between three types of QAO methods can be seen from Figure 3-
6. Bromine and carbon charges are the most prominently difference. The best regression line fit is for QUAMBO and QUAO, which seems to be unstable with bromine atoms ranging between $0-$ 2.5 and $0-1.1$ respectively. Bromine is not the only type of atomic charge to be localized with IAO, carbon charges also are in a smaller range. There are still omitted charges above sodium atom, these molecules will be discussed later. Furthermore, when compared to Figure 3-5 there are less data points. Chromium atoms are missing from the data and the reason should be investigated. Correlation graphs show clear localization of charges (except for the unstable atoms) such as xenon into three distinct categories. This should be further investigated if this pattern makes sense or not.


Figure 3-7. Correlation of atomic charges of QAO population methods (QUAMBO, QAO, IAO) with common population methods (CM5, QH, ESP, Mulliken, NPA) linear regression line equation and $\mathrm{R}^{2}$ values given on each graph. Data is filtered for B3LYP/Def2-SVPP.

QAO methods have a clear different slope for each common population methods. The highest QAO correlation is with NPA, signified by a highest regression line fit of $\sim 0.98$. The fit is improved by omitting outlier charges (bromine and sodium) from QAO calculations. For wellknown molecular structures QAO can be suggested instead of NPA populations. IAO is the QAO flavor that has the highest correlation with NPA population.


Figure 3-8 Spread of atomic charges categorized by atom type for common population methods (CM5, QH, ESP, Mulliken, NPA) with B3LYP/Def2-SVPP. Sodium outlier charges are omitted.

To be able to show atomic charge data categorized by atom type in Figure 3-8 Spread of atomic charges categorized by atom type for common population methods (CM5, QH, ESP, Mulliken, NPA) with B3LYP/Def2-SVPP. Sodium outlier charges are omitted., sodium charges had to be neglected because this is specific case, an "extreme" molecule so to say, which is considered a "breaking point" for some population analysis methods. These cases will be visited in later sections. From this graph it can be clearly seen that the variance for different atom types can be different for population analysis methods. NPA appears at the upper boundary for many atoms except for a few cases. Atomic charges of C, H, N, O, F, I with NPA is not the highest observed value. Granted, some of these are not chemically intuitive, such as carbon charges above two. The highest atomic charge boundary is seen with NPA for xenon atom, close to positive four (some extreme charges are still not shown). We can also see that the bromine charges go up to an unexpected positive
number. The close to one hydrogen charges should be studied as well, HF level of theory is expected to fail, but other methods should be giving a reasonable charge.


Figure 3-9. Spread of atomic charges categorized by atom type for QAO population methods with B3LYP/Def2-SVPP. Na outlier charges are omitted.

When the atomic charges for QAO methods are separated by atoms, we can see discrete levels of atomic charges like valence theory ${ }^{49,50}$ Like the case for common populations in Figure 3-9, QAO methods break with sodium charges that were omitted for scaling sake. The most spread out flavor seems to be QUAO. There are some chemically unintuitive charges, like the chlorine and bromine charge going up to three. For the lower limit QUAMBO gives lowest atomic charges, below negative two for carbon. This is lower than the common population analysis methods limit, but there are improvements such as IAO method being stable with carbon atom in acceptable charges range. Clear clustering of the charges can be seen for many atoms $(\mathrm{Mg}, \mathrm{Be}, \mathrm{Si}, \mathrm{Xe})$ unlike common population methods.

|  | CM5 | QH | ESP | Mulliken | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Atom type | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ |

### 3.4 Conformation



Figure 3-10. Structure of Arginine with indices of heavy atoms given in parenthesis ID 2.
Conformational stability is asses with amino acids. These molecules have similar backbones of amine, alpha carbon bonded to side chain specific for the amino acid and a carboxyl group. Four neutral amino acids: Alanine, Arginine, Aspartic Acid with 11, 58, 12, and 21 conformers are studied. Since Arginine has the highest number of conformations it will be the example for conformation assessment.

The variance of heavy atom indexed as in Figure 3-10 is given in Table 3-3. Overall, the conformer variance values are lower than the average variances seen for method and basis set. This might be because the populations are less dependent on conformational changes, but we cannot be certain until these assessments have the same sample size. CM5 and QH are the least conformation dependent population methods, rarely deviating from zero. ESP turns out to be the most conformation dependent method out of all studied population analysis. As the number of considered conformations increase, NPA and Mulliken atomic charges destabilize. For the amino acid with the least number of conformations Alanine, almost all population methods are stable except for ESP.

Table 3-3. Variances of heavy atom charges for 58 conformers of Arginine for common (CM5, QH, ESP, Mulliken, NPA) and QAO (QUAMBO, QUAO, IAO) populations with B3LYP/Def2-SVPP ID 2. For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases.

| Atom | CM5 | QH | ESP | M | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| N(1) | 0.00 | 0.00 | 0.01 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 |
| C (3) | 0.00 | 0.00 | 0.07 | 0.00 | 0.01 | 0.01 | 0.01 | 0.01 |
| C (5) | 0.00 | 0.00 | 0.07 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 |
| C (6) | 0.00 | 0.00 | 0.02 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 |
| C (9) | 0.01 | 0.00 | 0.05 | 0.01 | 0.04 | 0.04 | 0.03 | 0.03 |
| O (10) | 0.00 | 0.00 | 0.00 | 0.00 | 0.01 | 0.01 | 0.01 | 0.01 |
| C (13) | 0.01 | 0.00 | 0.04 | 0.00 | 0.01 | 0.01 | 0.01 | 0.01 |
| N(16) | 0.02 | 0.00 | 0.04 | 0.01 | 0.04 | 0.03 | 0.03 | 0.03 |
| C (18) | 0.00 | 0.00 | 0.02 | 0.00 | 0.01 | 0.00 | 0.00 | 0.00 |
| N(19) | 0.02 | 0.01 | 0.06 | 0.01 | 0.06 | 0.05 | 0.04 | 0.04 |
| N (20) | 0.01 | 0.00 | 0.03 | 0.01 | 0.02 | 0.02 | 0.02 | 0.02 |
| N (24) | 0.01 | 0.00 | 0.02 | 0.01 | 0.03 | 0.03 | 0.02 | 0.02 |
| C (25) | 0.00 | 0.00 | 0.04 | 0.01 | 0.02 | 0.03 | 0.03 | 0.02 |
| C (30) | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 |
| C (31) | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 |
| O (32) | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 |

Highest variance is seen for Alanine for two carbon atoms with index 3, 5, and 19. Since these atoms are not buried in the center of the molecule (index 19 is at the end of the molecule) a possible reason might be that ESP being not stable for carbon charges. Higher variance persists with ESP for Arginine and Aspartic Acid. For Arginine the highest variation is for carbon index 2 and like in Alanine's case this is the carbon between the amine and carbonyl group, referred to as the alpha carbon.

|  | CM5 | QH | ESP | Mulliken | NPA | QUAMBO | QUAO | IAO |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

Conformational stability

### 3.5 Outlier Structures

### 3.5.1. N-methyl-[2,2,2]-azabicyclooctane



Figure 3-11. Structure of N-methyl-[2,2,2]-azabicyclooctane given indices on the atoms ID 812

So far, we have seen some prominent molecules form the database that causes population analysis methods to behave computationally less robust. Molecule ID 812 from JOC ${ }^{51}(17-\mathrm{H}$ structure on reference) zwitterion dataset has proven to cause a high basis set dependency and it requires closer inspection. The atomic charges of the heavy atoms for this molecule can be seen in Figure 3-11. Design of this anion sheds some light on the data, Figure 19 in JOC ${ }^{51}$ and refers the unprotonated molecules (without hydrogen indexed 27) as the ligand. Positive to negative shift in atomic charge of neighboring atoms makes this molecule a strong nucleophile with a high dipole moment. As debated over by Weinstein, this is the proof of the non-classical cation due to the ionic carbon indexed two in Figure 3-3. Difference of atomic charge between neighboring carbon atoms causes the protonated structure enables stabilization through homoaromaticity ${ }^{52}$ creating a $\sigma$-delocalized carbocation. Electron delocalization between carbon indices $4,5,6,7,8$ is considered a chemically debatable in a neutral molecular environment.

Table 3-4. Heavy atomic (and hydrogen 27) charges and method/basis set variance in parenthesis for molecule ID 812 for common (CM5, QH, ESP, Mulliken, NPA) and QAO (QUAMBO, QUAO, IAO) populations. For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases.

| Atom | CM5 | QH | ESP | Mulliken | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathrm{N}(1)$ | $-0.23(0.01)$ | $0.10(0.01)$ | $-1.40(0.66)$ | $-0.32(0.53)$ | $-0.40(0.10)$ | $-0.17(0.00)$ | $-0.16(0.00)$ | $0.05(0.00)$ |
| $\mathrm{C}(2)$ | $0.00(0.00)$ | $0.02(0.00)$ | $-0.09(0.12)$ | $-0.20(0.82)$ | $-0.14(0.02)$ | $-0.02(0.01)$ | $-0.03(0.00)$ | $0.02(0.00)$ |
| $\mathrm{C}(3)$ | $-0.10(0.01)$ | $-0.04(0.01)$ | $0.87(0.14)$ | $0.21(0.17)$ | $-0.20(0.05)$ | $-0.36(0.00)$ | $-0.32(0.00)$ | $-0.25(0.00)$ |
| $\mathrm{C}(4)$ | $-0.10(0.01)$ | $-0.04(0.01)$ | $0.88(0.13)$ | $0.21(0.17)$ | $-0.20(0.05)$ | $-0.36(0.00)$ | $-0.32(0.00)$ | $-0.25(0.00)$ |
| $\mathrm{C}(5)$ | $-0.10(0.01)$ | $-0.04(0.01)$ | $0.87(0.13)$ | $0.21(0.17)$ | $-0.20(0.05)$ | $-0.36(0.00)$ | $-0.32(0.00)$ | $-0.25(0.00)$ |
| $\mathrm{C}(6)$ | $-0.18(0.01)$ | $-0.08(0.01)$ | $0.12(0.13)$ | $0.04(0.14)$ | $-0.40(0.03)$ | $-0.45(0.00)$ | $-0.40(0.00)$ | $-0.28(0.00)$ |
| $\mathrm{C}(7)$ | $-0.18(0.01)$ | $-0.08(0.01)$ | $0.09(0.16)$ | $0.04(0.14)$ | $-0.40(0.03)$ | $-0.45(0.00)$ | $-0.40(0.00)$ | $-0.28(0.00)$ |
| $\mathrm{C}(8)$ | $-0.18(0.01)$ | $-0.08(0.01)$ | $0.14(0.12)$ | $0.04(0.14)$ | $-0.40(0.03)$ | $-0.45(0.00)$ | $-0.40(0.00)$ | $-0.28(0.00)$ |
| $\mathrm{C}(9)$ | $-0.18(0.01)$ | $-0.08(0.01)$ | $0.95(0.42)$ | $0.03(0.32)$ | $-0.40(0.06)$ | $-0.61(0.00)$ | $-0.56(0.00)$ | $-0.41(0.00)$ |
| $\mathrm{C}(10)$ | $-0.05(0.01)$ | $-0.04(0.01)$ | $0.28(0.07)$ | $0.68(0.61)$ | $0.00(0.02)$ | $0.01(0.38)$ | $-0.01(0.00)$ | $0.00(0.00)$ |
| $\mathrm{C}(23)$ | $-0.22(0.01)$ | $-0.17(0.01)$ | $-0.57(0.04)$ | $-0.81(0.96)$ | $-0.27(0.03)$ | $-0.40(0.65)$ | $-0.36(0.00)$ | $-0.29(0.00)$ |
| $\mathrm{H}(27)$ | 0.11 | 0.06 | 0.24 | 0.01 | 0.2 | 0.26 | 0.24 | 0.15 |

Overall, the charges are mostly neutral except for a few outliers and high variances values cause by method and/or basis set dependency. The darkest colors (highest charges) are seen mostly for ESP and Mulliken, and the lightest color (lowest charges) with the first atom for ESP. The most negative charge Table 3-6 is a nitrogen indexed one, and the most positive is the carbon indexed nine with ESP.
$\mathbf{N}(\mathbf{1}):$ : The carbon indexed 9 will not be discussed because atomic charges are directly corelated with charge of this nitrogen. Nitrogen indexed one is bonded to four carbon atoms and expected to be on the positive side. However, there is a negative charge delocalized in the bicyclooctane so the charge should be less than a regular nitrogen bonded to four carbons. Greatest difference is seen with ESP, not only the charge is wrong sign, the variance is quite high as well. Only positive charge is seen with QH and IAO.
$\mathbf{C ( 3 - 5 )}$ : For negative $\mathrm{N}(1)$ charges the neighboring carbons (carbons with index $3,4,5,9$ ) are also positive (almost close to one with ESP). We expect electron delocalization in bicyclooctane, so
these carbons should be negatively charged. Mulliken and ESP fail in this regard, they also have a high variance, CM 5 and QH have the correct right sign but the values are too low to indicate a delocalization. NPA and QAO populations are reasonable, if not for NPA's high variance.

C (2) : Expected to be negative, CM5 and QH fail to satisfy this, while other populations are all negative. Mulliken and ESP continue to have a high variance and not considered stable.
$\mathbf{C}$ (23): In the reference this carbon atom is reported to be the negative probe of the molecule. Their findings are supported with ESP charges and this is the same case in Table 3-6. This atomic charge is negative for all populations, but too neutral for CM5 and QH populations.

H (27) : Reported as the acidic hydrogen, expected to have positive charge. All populations are positive, but QH and Mulliken charges are too neutral.

To conclude this outlier, the results of the assessment is presented in Table 2-1 IAO seems to be the best choice out of all populations. The presence of a large dipole moment and curried delocalization in the bicyclooctane cage results in ESP and Mulliken charges to be unreasonable. This is an example of neutral homoaromatic molecule where the scaling difference with CM5 can be seen clearly when the charges are compared to $\mathrm{QH} .{ }^{53}$

Table 3-5. Population recommendation for N-methyl-[2,2,2]-azabicyclooctane ID 812 summary with CM5, QH, ESP, Mulliken, NPA, QUAMBO, QUAO, IAO

|  | CM5 | QH | ESP | Mulliken | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| N (1) | $\mathbf{x}$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ |
| C (3-5) | $\mathbf{x}$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ |
| C (2) | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| C (23) | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| H (27) | $\checkmark$ | $\mathbf{x}$ | $\checkmark$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| Total | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark \checkmark$ |

### 3.5.2. Trifluorobromomethane



Figure 3-12. Structure of trifluorobromomethane $\left(\mathrm{F}_{3} \mathrm{CBr}\right)$ interaction with benzene $\left(\mathrm{C}_{6} \mathrm{H}_{6}\right)$ indices given on the atoms ID 1460.

The second outlier is from non-covalent halogenated compounds interaction dataset X 40 . The two interacting molecules are benzene and trifluorobromomethane ID 1460, labelled 29 in reference ${ }^{54}$ the structure of the interaction with atom indices are given in Figure 3-12. It has been noted that there is as slight variance for the atomic charges for the trifluorobromomethane. Charges and variances in parenthesis are given in Figure 3-12.

Table 3-6. Trifluorobromomethane atomic charges B3LYP/Def2-SVPP and method/basis set variance in parenthesis ID 1460. For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases

| Atom | CM5 | QH | ESP | Mulliken | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Br (13) | $0.01(0.00)$ | $-0.01(0.00)$ | $-0.13(0.00)$ | $-0.05(0.00)$ | $0.04(0.00)$ | $2.35(0.03)$ | $-0.34(0.09)$ | $-0.09(0.00)$ |
| C (14) | $0.35(0.00)$ | $0.31(0.00)$ | $0.47(0.01)$ | $0.46(0.02)$ | $1.03(0.01)$ | $0.13(0.03)$ | $0.37(0.09)$ | $0.84(0.00)$ |
| F (15) | $-0.12(0.00)$ | $-0.10(0.00)$ | $-0.13(0.00)$ | $-0.14(0.00)$ | $-0.36(0.00)$ | $-0.30(0.00)$ | $0.18(0.04)$ | $-0.25(0.00)$ |
| F (16) | $-0.12(0.00)$ | $-0.10(0.00)$ | $-0.13(0.00)$ | $-0.14(0.00)$ | $-0.36(0.00)$ | $-0.35(0.00)$ | $0.11(0.03)$ | $-0.25(0.00)$ |
| F (17) | $-0.12(0.00)$ | $-0.10(0.00)$ | $-0.13(0.00)$ | $-0.14(0.00)$ | $-0.36(0.00)$ | $-0.30(0.00)$ | $0.14(0.04)$ | $-0.25(0.00)$ |

$\operatorname{Br}(\mathbf{1})$ : Bromine is more electronegative than carbon, and less than fluorine. Therefore, we expect the charge of this atom to be more negative than carbon and more positive than fluorine atoms. CM5, QH, NPA, and QUAMBO populations all predict bromine as positively charged. QUAMBO
is the worst population for describing bromine charges and should not be used if the system has bromine atoms.
$\mathbf{C}(\mathbf{1 4 )}$ : Central carbon atom is expected to be positively charged. This is satisfied for all populations. NPA predicts this structure as a carbocation with the carbon charge above positive one.
$\mathbf{F}(\mathbf{1 5 - 1 7})$ : Fluorine is the most electronegative atom in the molecule. We expect it to be the lowest and a negative charge. QUAO charges are positive and the variances are slightly higher than zero. QUAO is the only population that fails.

One of the consistent atomic charge expectation failures for this molecule is seen for bromine atom. This atom has a very large size which can get the overlap coefficients higher than expected. Also, these atomic charges are from an intermolecular structure. The existence of highly delocalized electrons should be affecting the charges. General assessment breakdown is presented in Table 3-7. We advise ESP, Mulliken and IAO for compounds containing bromine atom.

Table 3-7. Population recommendation for trifluorobromomethane ID 1460 summary with CM5, QH, ESP, Mulliken, NPA, QUAMBO, QUAO, IAO

|  | CM5 | QH | ESP | Mulliken | NPA | QUAMBO | QUAO | IAO |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Br (1) | $\boldsymbol{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ |
| C (14) | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| F(15-17) | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\boldsymbol{x}$ | $\checkmark$ |
| Total | $\boldsymbol{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ |

### 3.5.3. 1,1,2-Trichlorotrifluoroethane



Figure 3-13. Structure of 1,1,2-Trichlorotrifluoroethane ( $\left.\mathrm{FCl}_{2} \mathrm{CCF}_{2} \mathrm{Cl}\right)$ ID 193.

We have seen that halogens can be positive from previous example ID 1460. The database is filtered for positive halogen charges several molecules from Mobley dataset stands out. The next example is neutral substituted ethane molecule.

Table 3-8. Atomic charges for 1,1,2-Trichlorotrifluoroethane with B3LYP/Def2-SVPP ID 193. For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases

| Atom | CM5 | QH | ESP | Mulliken | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathrm{Cl}(1)$ | -0.029 | -0.031 | 0.070 | -0.036 | 0.010 | -0.017 | -0.023 | -0.015 |
| $\mathrm{Cl}(2)$ | -0.029 | -0.031 | 0.070 | -0.036 | 0.010 | -0.017 | -0.023 | -0.013 |
| $\mathrm{Cl}(3)$ | -0.035 | -0.039 | 0.017 | -0.066 | -0.023 | -0.037 | -0.043 | -0.031 |
| $\mathrm{~F}(4)$ | -0.117 | -0.093 | 0.055 | -0.148 | -0.335 | -0.314 | -0.313 | -0.241 |
| $\mathrm{~F}(5)$ | -0.118 | -0.095 | -0.021 | -0.146 | -0.347 | -0.327 | -0.325 | -0.248 |
| $\mathrm{~F}(6)$ | -0.118 | -0.095 | -0.019 | -0.146 | -0.347 | -0.327 | -0.325 | -0.247 |
| $\mathrm{C}(7)$ | 0.184 | 0.162 | -0.240 | 0.174 | 0.292 | 0.331 | 0.343 | 0.260 |
| $\mathrm{C}(8)$ | 0.262 | 0.223 | 0.069 | 0.404 | 0.741 | 0.710 | 0.709 | 0.535 |

$\mathbf{C l}(1-3)$ : Chlorine should be negative in sign and lower than carbon, higher than the fluorine charges. ESP and NPA charges are positive unlike expected. For other populations all conditions are satisfied.
$\mathbf{F}(4-6)$ : Fluorine is the most electronegative element in this molecule. It is expected to be negative in sign and the lowest out of all the other atomic charges. ESP charge for fluorine index 4 is positive. The other populations are all negative. QH charges are too neutral.
$\mathbf{C}(\mathbf{7}, \mathbf{8})$ : Carbons should be positive and the highest atomic charges in the molecule. Only ESP for carbon index 7 negative, the other populations give positive charges. Carbon 8 has a higher number of fluorine substitutions so it should be more positive than carbon index 7 . There is not much difference between the two carbons for CM5 and QH so they are not recommended.

Overall, Hirshfeld flavors satisfy the right trend but the charges are overall too neutral. These populations are not advised for halogen atoms over QAO or Mulliken. QAO is an improvement over Mulliken because the fluorine charges are more negative.

Table 3-9. Population recommendation for 1,1,2-Trichlorotrifluoroethane ID 1460 summary with CM5, QH, ESP, Mulliken, NPA, QUAMBO, QUAO, IAO


### 3.5.4. Halotane



Figure 3-14. Structure of 2-bromo-2-chloro-1,1,1-trifluoroethane $\left(\mathrm{BrClHCCF}_{3}\right)$ ID 411.

The structure of 2-bromo-2-chloro-1,1,1-trifluoroethane is another molecule from Mobley dataset and the structure is given in Figure 3-14. In this example ethane is substituted with fluorines on one carbon, and one bromine and one chlorine on the other.

Table 3-10. Atomic charges for $\mathrm{BrClHCCF}_{3}$ with B3LYP/Def2-SVPP ID 411. For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases

| Atom | CM5 | QH | ESP | Mulliken | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathrm{Br}(1)$ | -0.007 | -0.021 | 0.108 | -0.010 | 0.071 | 0.013 | 0.003 | -0.089 |
| $\mathrm{Cl}(2)$ | -0.040 | -0.037 | 0.110 | -0.055 | 0.003 | 0.143 | 0.154 | -0.019 |
| $\mathrm{~F}(3)$ | -0.128 | -0.106 | -0.124 | -0.160 | -0.367 | -0.259 | -0.301 | -0.266 |
| $\mathrm{~F}(4)$ | -0.124 | -0.102 | -0.105 | -0.150 | -0.363 | -0.082 | -0.113 | -0.260 |
| $\mathrm{~F}(5)$ | -0.129 | -0.106 | -0.135 | -0.160 | -0.367 | -0.001 | -0.082 | -0.267 |
| $\mathrm{C}(6)$ | 0.338 | 0.286 | 0.532 | 0.555 | 1.151 | 0.534 | 0.428 | 0.804 |
| $\mathrm{C}(7)$ | -0.027 | 0.028 | -0.787 | -0.199 | -0.392 | -0.519 | -0.290 | -0.086 |
| $\mathrm{H}(8)$ | 0.116 | 0.057 | 0.400 | 0.179 | 0.264 | 0.169 | 0.201 | 0.183 |

$\operatorname{Br}(\mathbf{1})$ : Bromine is slightly more electronegative than carbon, so we expect the bromine charge to be lower than carbon and hydrogen Preferably, expected sign should be slightly negative. ESP, NPA, QUAMBO and QUAO charges are all positive.
$\mathbf{C l}(2)$ : Chlorine charges is expected to be definitely negative and lower than bromine charges. QH and IAO fail to distinguish between bromine and chlorine atoms. Populations with positive bromines also have positive chlorines. This might suggest that the reason behind these charges can be the same.
$\mathbf{F}(3-5)$ : As the most electronegative element in the molecule, is expected to be the lowest and negative charge. All populations satisfy these two criteria, but QUAMBO and QUAO populations are not recommended because of a significant charge variance for the chemically equivalent fluorine atoms.
$\mathbf{C}(6,7)$ : We expect the carbon atoms attached to halogens to be positively charged. This condition is satisfied with all populations for index 6 carbon. NPA charge is unreasonably positive, above positive one. We expect the carbon 7 to have lower charge than the one with three fluorine atoms attached. With ESP, NPA, QUAMBO and QUAO charges are too negative for carbon 7.

Some populations have difficulty differentiating between halogens. CM5 and Mulliken seems to be the most sensitive to halogen differences.

|  | CM5 | QH | ESP | Mulliken | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\operatorname{Br}(1)$ | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{\checkmark}$ |
| Cl (2) | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ |
| $\mathrm{F}(3-5)$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ |
| $\mathrm{C}(6,7)$ | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{\checkmark}$ |
| Total | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ |

### 3.5.5. Sodium cluster

Sodium charges that were omitted in most figures are from 13 sodium atoms arranged in a icosahedron cluster. This molecule is one of the "extreme" cases in the database to test the populations for Coulomb interaction dominant structures. ${ }^{55}$ The geometry optimized with Def2SVP in the neutral charges with a symmetry of $I_{h}$. After the optimization is confirmed as a stable minimum, a series of single point calculations have been carried out with -4 to +4 total charges.


Figure 3-15. $\mathrm{Na}_{13}$ icosahedron structure molecule ID 46

Molecular structure given in Figure 3-15 symmetry of the molecule charges can be classified as outer and central sodium atom charges. Central sodium charges are presented in Table 3-11 for different total molecular charge. the first noticeable trend is that QAO flavors are all close to positive six with ESP with -4 molecular charge.

Table 3-11. Atomic charges for central sodium atom (index 13) for range of total molecular charge -4 to +4 with common (CM5, QH, ESP, Mulliken, MBS, NPA) and QAO (QUAMBO, QUAO, IAO) populations B3LYP/Def2-SVPP ID 46. For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases

| Total Charge | CM5 | QH | ESP | Mulliken | MBS | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| -4 | 0.018 | 0.018 | 5.917 | -4.631 | -3.058 | 0.000 | 5.721 | 5.728 | 5.732 |
| -3 | 0.025 | 0.025 | 0.483 | -4.935 | -2.834 | 0.019 | 5.650 | 5.662 | 5.666 |
| -2 | 0.024 | 0.024 | -3.297 | -5.370 | -2.612 | -0.007 | 5.662 | 5.678 | 5.682 |
| -1 | 0.015 | 0.015 | -6.217 | -5.946 | -2.383 | -0.006 | 5.612 | 5.639 | 5.644 |
| 0 | -0.008 | -0.008 | -7.812 | -6.576 | -2.117 | -0.097 | 5.588 | 5.627 | 5.634 |
| 1 | -0.035 | -0.035 | -7.869 | -6.788 | -1.789 | -0.186 | 5.509 | 5.568 | 5.576 |
| 2 | -0.067 | -0.067 | -8.867 | -6.784 | -1.424 | -0.336 | 5.456 | 5.541 | 5.551 |
| 3 | -0.103 | -0.103 | -6.796 | -6.700 | -1.006 | -0.463 | 5.363 | 5.453 | 5.465 |
| 4 | -0.148 | -0.148 | -7.861 | -6.639 | -0.622 | -0.663 | 5.293 | 5.394 | 5.410 |

The solid crystal cluster of thirteen sodium atom charges have been explored in total molecular charge range of negative to positive four. Our expectation for sodium charges is to be stable and reasonably distributed. For all population analysis in question as the total charge increases the charge on central sodium atom decreases in charge for most methods, but the rate of decrease is different for some methods. This a clear example of ESP charges failing with buried atoms. Mulliken and ESP charges have the highest spread and most unintuitive atomic charges; charges around negative seven is a clear indication that these population methods are not stable. MBS performs better than Mulliken especially in higher total molecular charges. Still, both methods yield negative charges for a sodium atom.

Sodium cluster breaks QAO methods and the charges are the same with ZBD-QAO. It is also possible that there is a mistake in the code. If it is a constant error the charges can be low and robust.

|  | CM5 | QH | ESP | Mulliken | MBS | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Na13 | $\checkmark$ | $\checkmark$ | $\boldsymbol{x}$ | $\boldsymbol{x}$ | $\boldsymbol{x}$ | $\checkmark$ | $\boldsymbol{x}$ | $\boldsymbol{x}$ | $\boldsymbol{x}$ |

### 3.6 Correlation

To gain a broader understanding of how the atomic charges from each dataset resemble each other, this correlation is presented in Figure 3-16. Each value from the figure represents the coefficient of determination ( $\mathrm{R}^{2}$ ) that was calculated by comparing two different population methods for approximately 1 million data points. From the heatmap, the most correlated methods $\left(\mathrm{R}^{2} \approx 1\right)$ are QUAMBO and QUAO, whereas the least correlated methods $\left(R^{2} \approx 0.9\right)$ are IAO and CM5. Natural Population Analysis (NPA) results resemble those from Quasi-based populations (QUAMBO, QUAO, IAO). Mathematically speaking, the IAO method is derived differently from QUAMBO and QUAO, which may account for the lower correlation.


Figure 3-16. Heatmap of common (CM5, QH, ESP, Mulliken, NPA) and QAO (QUAMBO, QUAO, IAO) populations.

In the next we will be looking at ZBD orthogonalization. The correlation of QAO and ZBDQAO populations are given in Figure 3-17.


Figure 3-17. Heatmap of common QAO (QUAMBO, QUAO, IAO) and ZBD-QAO (ZBD-QUAMBO, ZBDQUAO, ZBD-IAO) populations.

Out of all the QAO populations IAO is resembles the ZBD-QAO the most. QUAMBO is the least correlated method to ZBD-QAO (specifically ZBD-IAO). Still, compared to the common populations in Figure 3-16 the scale of Figure 3-17 is significantly smaller.

In the next section we will be identifying small differences between QAO and ZBD-QAO after comparing ZBD-QAO numbers from the reference. This comparison will also extend to effect on chemical trends.

## Chapter 4

## 4 Zero-Bond Dipole effect on Chemical Trends

In this section atomic charges form different molecules will be compared using the population analysis after testing the Zero-Bond Dipole (ZBD) orthogonalization scheme. So far, we have compared population analysis numerically for stability, testing the similarities and outlier atomic charges. The focus of the previous sections has been solely on single molecule assessment. To have more rounded understating of the performance of studied methods, especially from a chemists' perspective, we will be comparing trends from multiple molecules. This is assessment will undoubtedly biased due to the limited number of molecules included in the database, which can be improved upon with additional data, but nevertheless essential with consideration of chemically well understood systems.

### 4.1 Zero-Bond Dipole Assessment

The dipole sensitive new orthogonalization ZBD will be applied to three different QAO flavors: QUAMBO, QUAO, and IAO (Q1, Q2, Q3). The total number of QAO based population is six with the addition of ZBD-QUAMBO, ZBD-QUAO, and ZBD-IAO (Z-Q1, Z-Q2, Z-Q3). In the reference Laikov ${ }^{37}$ utilizes a different QAO procedure which is closer to IAO. This might mean that the atomic charges should not vary greatly compared to IAO population. Each molecule in Table 4-1 has two rows; the first row is with the QAO populations and the second row is the ZBD orthogonalized version. Orb column is the index to QAO and ZBD that represent this indexing. The last column that is the reference values from Laikov's paper. ${ }^{37}$

Overall when we expect that the atomic charges from Q1, Q2, and Q3 to be comparable to Ref column. The most notable difference is for with higher atomic charges on right side of Table 4-1. There reference values are slightly higher for both the reference QAO and ZBD versions. This shows that reference QAO behaves differently for positive charges (at least). ZBD and QAO values should be assessed for higher atomic charged systems. The highest charges have been seen with QAO populations for xenon atoms in Figure 3-6.

Table 4-1. Comparison of bolded atomic charges with non-orthogonal quasi-atomic populations QAO and Zerobond orthogonalized versions (ZBD) to the reference values (Ref). For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases.

| Mol | Orb | Q1 | Q2 | Q3 | Ref | Mol | Orb | Q1 | Q2 | Q3 | Ref |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathrm{OH}_{2}$ | QAO | -0.94 | -0.91 | -0.9 | -0.93 | $\mathrm{BeH}_{2}$ | QAO | 0.82 | 0.82 | 0.84 | 0.29 |
|  | ZBD | -0.59 | -0.58 | -0.58 | -0.42 |  | ZBD | 0.84 | 0.84 | 0.87 | 0.47 |
| $\mathbf{O}_{2} \mathrm{H}_{2}$ | QAO | -0.5 | -0.48 | -0.48 | -0.44 | $\mathbf{A l H}_{3}$ | QAO | 0.29 | 0.29 | 0.29 | 0.74 |
|  | ZBD | -0.32 | -0.31 | -0.31 | $\underline{-0.22}$ |  | ZBD | 0.26 | 0.26 | 0.26 | $\underline{1.06}$ |
| $\mathrm{SiH}_{4}$ | QAO | 0.64 | 0.59 | 0.59 | $\underline{0.58}$ | $\mathbf{M g H} \mathbf{2}^{2}$ | QAO | 0.82 | 0.82 | 0.84 | $\underline{0.55}$ |
|  | ZBD | 0.91 | 0.89 | 0.89 | 1.1 |  | ZBD | 0.84 | 0.84 | 0.86 | $\underline{0.72}$ |
| $\mathbf{N H}_{3}$ | QAO | 0.64 | 0.59 | 0.59 | $\underline{0.58}$ | $\mathbf{P H}_{3}$ | QAO | -0.03 | -0.02 | -0.01 | -0.19 |
|  | ZBD | 0.91 | 0.89 | 0.89 | 1.1 |  | ZBD | 0.3 | 0.31 | 0.31 | $\underline{0.59}$ |
| CO | QAO | -0.48 | -0.41 | -0.41 | $\underline{-0.36}$ | $\mathrm{PF}_{6}{ }^{-}$ | QAO | 1.63 | 1.63 | 1.63 | $\underline{2.87}$ |
|  | ZBD | -0.22 | -0.2 | -0.2 | $\underline{-0.22}$ |  | ZBD | 1.51 | 1.51 | 1.51 | $\underline{2.7}$ |
| $\mathrm{CO}_{2}$ | QAO | -0.52 | -0.5 | -0.5 | $\underline{-0.52}$ | AsF $_{6}{ }^{-}$ | QAO | 1.19 | 1.74 | 1.74 | $\underline{2.78}$ |
|  | ZBD | -0.28 | -0.27 | -0.27 | -0.31 |  | ZBD | 1.44 | 1.46 | 1.48 | $\underline{2.57}$ |
| $\mathrm{H}_{2} \mathrm{CCH}_{2}$ | QAO | -0.49 | -0.43 | -0.43 | $\underline{-0.27}$ | AsF5 | QAO | 1.83 | 2.43 | 2.35 | 2.7 |
|  | ZBD | -0.17 | -0.16 | -0.15 | $\underline{-0.01}$ |  | ZBD | 1.85 | 1.88 | 1.93 | $\underline{2.53}$ |
| $\mathrm{H}_{3} \mathrm{CCH}_{3}$ | QAO | -0.15 | -0.15 | -0.15 | $\underline{-0.29}$ | $\mathrm{SO}_{2}$ | QAO | 1.59 | 1.56 | 1.57 | $\underline{1.57}$ |
|  | ZBD | -0.12 | -0.12 | -0.12 | $\underline{0.05}$ |  | ZBD | 1.44 | 1.43 | 1.44 | 1.67 |
| $\mathrm{CH}_{4}$ | QAO | -0.89 | -0.8 | -0.79 | $\underline{-0.54}$ | $\mathbf{P F} 5$ | QAO | 2.31 | 2.31 | 2.31 | $\underline{2.83}$ |
|  | ZBD | -0.38 | -0.35 | -0.35 | 0.1 |  | ZBD | 1.99 | 1.99 | 1.99 | $\underline{2.71}$ |
| NaH | QAO | 0.5 | 0.5 | 0.49 | $\underline{0.38}$ | $\mathrm{ClFO}_{3}$ | QAO | 2.41 | 2.44 | 2.46 | $\underline{2.83}$ |
|  | ZBD | 0.51 | 0.51 | 0.51 | 0.47 |  | ZBD | 2.59 | 2.61 | 2.62 | 2.98 |
| $\mathrm{BH}_{3}$ | QAO | 0.01 | 0.01 | 0.01 | $\underline{0.01}$ | $\mathrm{BrFO}_{3}$ | QAO | 2.82 | 2.56 | 2.8 | $\underline{2.79}$ |
|  | ZBD | 0.02 | 0.02 | 0.02 | 0.41 |  | ZBD | 2.45 | 2.44 | 2.57 | $\underline{2.92}$ |

### 4.2 Hydrocarbons

Hydrocarbons are among the most well know and studied chemical structures. ${ }^{56}$ The first trend presented Table 4-2 is for assessment of chain length effect with alkane structures.

Table 4-2. Bolded hydrogen atomic charges for hydrocarbons with B3LYP/Def2-SVPP. ID 221, 97, 209, 746, 572. Q1, Q2, Q3 are QUAMBO, QUAO, IAO and Zero-bond orthogonalized versions are prefixed with letter "Z". For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases.

| Molecule | CM 5 | QH | ESP | M | NPA | Q 1 | Q 2 | Q 3 | $\mathrm{Z}-\mathrm{Q} 1$ | $\mathrm{Z}-\mathrm{Q} 2$ | $\mathrm{Z}-\mathrm{Q} 3$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathbf{H}_{3} \mathrm{C}-\mathrm{CH}_{3}$ | 0.075 | 0.026 | -0.004 | 0.093 | 0.199 | 0.213 | 0.190 | 0.189 | 0.082 | 0.075 | 0.074 |
| $\mathrm{CH}_{3}-\mathrm{CH}_{2}-\mathrm{CH}_{3}$ | 0.074 | 0.024 | 0.052 | 0.087 | 0.198 | 0.208 | 0.184 | 0.183 | 0.077 | 0.070 | 0.069 |
| $\mathbf{C H}_{3}-\left(\mathrm{CH}_{2}\right)_{2}-\mathrm{CH}_{3}$ | 0.076 | 0.026 | 0.067 | 0.091 | 0.207 | 0.215 | 0.191 | 0.190 | 0.082 | 0.076 | 0.075 |
| $\mathbf{C H}_{3}-\left(\mathrm{CH}_{2}\right)_{3}-\mathrm{CH}_{3}$ | 0.075 | 0.025 | 0.039 | 0.086 | 0.199 | 0.208 | 0.185 | 0.184 | 0.077 | 0.070 | 0.069 |
| $\mathbf{C H}_{3}-\left(\mathrm{CH}_{2}\right)_{4}-\mathrm{CH}_{3}$ | 0.076 | 0.026 | 0.053 | 0.090 | 0.207 | 0.215 | 0.191 | 0.189 | 0.082 | 0.076 | 0.074 |

As the hydrocarbon chain grows down the Table 4-2 we expect the atomic charge on the hydrogen of the terminal carbon to be (a) impervious to drastic fluctuations (b) relatively neutral. Population analysis that fail to satisfy these conditions NPA and non-orthogonalized QAO flavors since these both produce higher than expected overall hydrogen charges. With ZBD orthogonalization atomic charges become more neutral, instead of NPA they resemble Mullliken. CM5 and QH hydrogen charges for different hydrocarbons are very neutral and constant with increasing number of carbons. The highest difference between two hydrogen charges are seen with ESP from methane to ethane. Considering that the carbon atom is more electronegative than the hydrogen, methane hydrogen with ESP being slightly negative is acceptable. When more carbons are added to the alkane chain, we see a slight fluctuation for atomic charges.

Table 4-3. Bolded hydrogen atomic charges for alkanes and alkenes with B3LYP/Def2-SVPP. ID Q1, Q2, Q3 are QUAMBO, QUAO, IAO and Zero-bond orthogonalized versions are prefixed with letter "Z". For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases.

| Molecule | CM 5 | QH | ESP | M | NPA | Q 1 | Q 2 | Q 3 | $\mathrm{Z}-\mathrm{Q} 1$ | Z-Q2 | Z-Q3 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathbf{H}_{3} \mathrm{C}-\mathrm{CH}_{3}$ | 0.075 | 0.026 | -0.003 | 0.093 | 0.199 | 0.213 | 0.190 | 0.119 | 0.082 | 0.075 | 0.074 |
| $\mathbf{H}_{2} \mathrm{C}=\mathrm{CH}_{2}$ | 0.088 | 0.037 | 0.139 | 0.103 | 0.190 | 0.236 | 0.208 | 0.131 | 0.082 | 0.073 | 0.072 |
| $\mathrm{CH}_{3}-\mathrm{CH}_{2}-\mathrm{CH}_{3}$ | 0.074 | 0.024 | 0.052 | 0.087 | 0.198 | 0.208 | 0.184 | 0.183 | 0.077 | 0.070 | 0.069 |
| $\mathrm{CH}_{2}={\mathrm{CH}-\mathrm{CH}_{3}}$ | 0.085 | 0.033 | 0.160 | 0.093 | 0.195 | 0.233 | 0.205 | 0.204 | 0.078 | 0.070 | 0.068 |
| $\mathbf{C H}_{3}-\mathrm{CH}_{2}-\mathrm{CH}_{2}-\mathrm{CH}_{3}$ | 0.076 | 0.026 | 0.067 | 0.091 | 0.207 | 0.215 | 0.191 | 0.190 | 0.082 | 0.076 | 0.075 |
| $\mathrm{CH}_{2}=\mathrm{CH}-\mathrm{CH}_{2}-\mathrm{CH}_{3}$ | 0.083 | 0.031 | 0.155 | 0.088 | 0.187 | 0.222 | 0.196 | 0.123 | 0.075 | 0.067 | 0.066 |
| $\mathrm{CH}_{2}=\mathrm{CH}-\mathrm{CH}=\mathrm{CH}_{2}$ | 0.089 | 0.038 | 0.152 | 0.101 | 0.198 | 0.242 | 0.213 | 0.212 | 0.089 | 0.080 | 0.079 |

To assess the atomic charge on hydrogen of the terminal vinylic carbon, structures from the previous table are presented followed by their double bonded versions. In the presence of a double bond we expect the hydrogen to be more positive. For ESP the atomic charge difference between the alkane and the akene is $\sim 0.1$ greatest, whereas for Hirshfeld populations CM5 and QH produce the difference is $\sim 0.01$ almost one tenth of ESP. While Mulliken, NPA and non-orthogonal QAO flavors have high overall charges for all hydrogens ZBD-QAO have Hirshfeld-like low charges. Propane and propene are slightly more positive than butane and butene trend is only present with IAO. CM5 is fitted for these neutral molecules and there is a clear pattern in stability of the atomic charges as the alkane compared to an alkene. This pattern is not seen in any of the orbital populations in the scope (Mulliken, NPA, QAO, ZBD-QAO). The last molecule in Table 4-3 is for comparison for growing the hydrocarbon chair, instead is to assess the effect of charge distribution; the butadiene should have resonance with a slightly lower hydrogen charge. This trend is not observed with any charge except slight with ESP population.

Table 4-4. Bolded hydrogen atomic charges ketones and aldehyde with B3LYP/Def2-SVPP. ID 681, 201, 200. Q1, Q2, Q3 are QUAMBO, QUAO, IAO and Zero-bond orthogonalized versions are prefixed with letter "Z". For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases.

| Molecule | CM 5 | QH | ESP | M | NPA | Q 1 | Q 2 | Q 3 | Z-Q1 | Z-Q2 | Z-Q3 |
| ---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathrm{CH}_{3}-(\mathrm{CH} 2)_{3}-\mathrm{HCO}$ | 0.077 | 0.027 | 0.068 | 0.093 | 0.208 | 0.217 | 0.193 | 0.191 | 0.086 | 0.080 | 0.078 |
| $\mathrm{CH}_{3}-(\mathrm{CH} 2)_{2}-\mathrm{CO}-\mathrm{CH}_{3}$ | 0.079 | 0.029 | 0.060 | 0.096 | 0.210 | 0.221 | 0.196 | 0.195 | 0.090 | 0.084 | 0.083 |
| $\mathrm{CH}_{3}-\mathrm{CH}_{2}-\mathrm{CO}-\mathrm{CH}_{2}-\mathrm{CH}_{3}$ | 0.077 | 0.027 | 0.048 | 0.089 | 0.207 | 0.214 | 0.192 | 0.190 | 0.085 | 0.080 | 0.078 |
| $\mathrm{CH}_{3}-\mathrm{CO}-(\mathrm{CH})_{2}-\mathrm{CH}_{3}$ | 0.094 | 0.040 | 0.122 | 0.112 | 0.227 | 0.254 | 0.225 | 0.224 | 0.112 | 0.104 | 0.103 |
| $\mathbf{H C O}-(\mathrm{CH})_{3}-\mathrm{CH}_{3}$ | 0.085 | 0.026 | -0.054 | 0.057 | 0.114 | 0.200 | 0.170 | 0.169 | 0.044 | 0.036 | 0.034 |

Effect of carbonyl distance to the hydrogen is presented in Table 4-4 with fixed hydrocarbon chain length. Starting with the furthest methyl hydrogen, carbonyl gets closer the methyl group until the hydrogen in question is from the aldehyde. As expected, hydrogen atomic charge is almost the
same as the ethane charge when the carbonyl group is the furthest. CM5 and QH charges are neutral and unchanging, there is no difference the hydrogens of methyl and aldehyde. We expect the hydrogen of alpha carbon (row four) to be the most positive, but this trend is barely noticeable with Hirshfeld populations. ESP charges are stable for the first three rows and highest for the alpha carbon. The only negative charge for hydrogens in this table is seen with ESP for the aldehyde hydrogen. For the same molecule, the charge separation of carbonyl group is the greatest (difference between atomic charge of oxygen and carbon is close to one) with ESP and NPA. While the negative charge is localized to electronegative atom oxygen with NPA, this charge is delocalized to the hydrogen with ESP, causing it to be negative. Like the previous tables, QAO methods resemble NPA charges while the ZBD-QAO resemble regular Mulliken.


### 4.3 Halogens

In this section we will be looking at small molecules with halogen bonding. Halogen compounds are regularly used in supramolecular and solvent chemistry and have been a challenge to describe with quantum mechanics. ${ }^{57,58}$ Most populations can fail to presented expected trends because of electronegativity difference, large multipole moments and "fuzzy" atoms. The latter is especially challenging for orbital based populations studied in this thesis.

Carbon Atomic Charges


Figure 4-1 Carbon and halogen atomic charges (y axis) plotted against chemical formula ( x axis) $\mathrm{X}_{\mathrm{n}} \mathrm{CH}_{(4-\mathrm{n})}$ where $\mathrm{n}=[0,4] \mathrm{X}=(\mathrm{F}, \mathrm{Cl}, \mathrm{Br})$ with common populations $(\mathrm{CM} 5, \mathrm{QH}, \mathrm{ESP}$, Mulliken, NPA).

The first trend we will be looking at is simple methane substitution case; for halogen atoms $\mathrm{F}, \mathrm{Cl}$, Br , I we will tests for (1) number of halogen substitution (2) different halogen effects. Both carbon and halogen charges shall be subject to assessment. To be able to see clear trends atomic charges results are presented in graphs Figure 3-1 where charges are split into two columns by atom type; on the left column carbon and on the right is the halogen atomic charges. Our first expectation is that a carbon atom substituted with four halogen atoms should be positively charged. However, carbon atomic charges on the left column (Figure 3-1 a, c, e, g) are not positive like we expected. Carbons for $\mathrm{CCl}_{4}(\mathrm{ESP}, \mathrm{NPA}), \mathrm{CBr}_{4}(\mathrm{ESP}, \mathrm{NPA}$, Mulliken $)$ and $\mathrm{CI}_{4}(\mathrm{ESP}, \mathrm{NPA}$, Mulliken, CM5) are all negative. QH and CM5 charges for carbon atom are the most positive, but neither halogen number effect nor halogen atom type effect is observed, the carbon atomic charge difference is too small. Another expected trend is that as more halogens are substituted to the central carbon atom, we expect carbon charges to increase. Down the periodic table, ESP is the first population to show the opposite trend (signified by a positive slope) with Cl substitutions (Figure 3-1 c); carbon charge for $\mathrm{Cl}_{3} \mathrm{CH}$ is smaller than $\mathrm{Cl}_{2} \mathrm{CH}_{2}$. Regarding bromine substitutions in Figure 3-1 b, positive slope increases with ESP while the expected result is a negative slope. For other populations still produce a positive slope. As we go down the periodic table, we expect atomic charges for halogens to decrease so that $\mathrm{I}>\mathrm{Br}>\mathrm{Cl}>\mathrm{F}$ (for same number of halogen substituents). Even though the difference between halogen charges are very small $\sim 0.01$ the trend is as expected with CM5 and QH while all the orbital based populations fail. We can summarize that Hirshfeld flavors (QH and CM5) are the most "reliable" population analysis method for halogen substitutions.


Figure 4-2. Carbon and halogen atomic charges (y axis) ploted for tetra-halogen structures $\mathrm{X}_{\mathrm{n}} \mathrm{CH}_{(4-\mathrm{n})}$ for $\mathrm{n}=[0,4] \mathrm{X}=(\mathrm{F}, \mathrm{Cl}, \mathrm{Br})$. Comparison of Q1, Q2, Q3 are QUAMBO, QUAO, IAO and Zero-bond orthogonalized versions (prefixed with letter "Z") with classical Mulliken population.

The same trend in Figure 3-1 is investigated with QAO and ZBD-QAO populations. We can see that neither QAO or ZBD-QAO fix the expectation of carbon atoms to be positively charged. Figure 4-2a fluorine substitution atomic charges for the central carbon is not improved with QUAMBO and QUAO flavors. For these methods, one improvement is that the central carbon of tetrafluoromethane has a higher positive charge. However, methane carbon is even more negative compared to Mulliken. ZBD orthogonalization lowers the tetrafluoromethane carbon atomic charge between Mulliken and QUAMBO/QUAO and increases the atomic charge of methane carbon to Mulliken level. There is a clear difference in the fluorine charges for different populations in Figure 4-2b. This time both QAO and ZBD-QAO populations offer better charges than Mulliken. Overall, ZBD fluorine charges are higher than QAO charges while both populations are not as negative as NPA in Figure 3-1b. A more significant difference can bee seen with chlorine charges than fluorine. Central carbon for chlorine substitutions is too negative with QUAMBO and QUAO. The curve in Mulliken atomic charges seen with this carbon is fixed with ZBDQUAMBO. For the chlorine charges both QAO and ZBD-QAO is higher than Mulliken, failing to satisfy the expectation that halogens should be negatively charged. Looking back at the first half of Figure 4-2, QUAMBO-QUAO populations and IAO-ZBD-QAO populations produced similar results. However, QUAMBO and QUAO start behaving unexpectedly for bromine. Carbon atomic charges drop to below negative one for bromoform $\left(\mathrm{Br}_{3} \mathrm{CH}\right)$ with these methods. IAO is not affected by this localization of charge on carbon instead of the bromines and the only population to yield positive charge for the carbon atom of bromoform. For all bromine substituted molecules ZBD orthogonalization corrects QUAMBO and QUAO charges to Mulliken level. Iodine charges with QAO or ZBD-QAO are not improved compared to Mulliken, the trends are still chemically unintuitive.

## C/Al Atomic Charges


c


## Halogen Atomic Charges

b $\quad 0.4$

d

...x.. ESP $\quad \infty+\infty$ CM5


-     -         -             - Mulliken $\int$ NBO

f

h



Figure 4-3. Central atom effect on atomic charges (y axis) ploted for tetra-halogen structures $\mathrm{AX}_{4}$ for $\mathrm{A}=(\mathrm{C}, \mathrm{Al})$ $\mathrm{X}=(\mathrm{F}, \mathrm{Cl}, \mathrm{Br}, \mathrm{I})$. Common population methods (CM5, QH, ESP, Mulliken, NPA) and Q1, Q2, Q3 (QUAMBO, QUAO, IAO) and Zero-bond orthogonalized versions (prefixed with letter "Z").

Switching from the central atom of tetra-halogen structure to aluminum which is a less electronegative atom. Common population methods for carbon center Figure 4-3.a give the expected trend (slope is negative) even though we see some negative charges. For aluminum center this trend is broken with ESP because AlCl4 is lower than AlBr4. Figure 4-3.c most populations (CM5, QH, Mulliken) have no aluminum charge difference between chlorine or bromine substitutions. QAO and ZBD-QAO populations carbon charges are all in trend except for the bromine charge problem with QUAMBO and QUAO. IAO charges Figure 4-3.e,g are very close to NPA charges in Figure 4-3.a,c. For bromine error with QUAMBO and QUAO changes sign between carbon and aluminum central atom. This is one of the reasons why QUAMBO and QUAO have unusually high variance. Atomic charge range for the central atom with CM5 and QH type is too low. We expect that if a carbon (or an aluminum) is bonded to four fluorine atoms, the positive charge on the central atom should be greater than 0.5 . We see a slight difference in results for aluminum central atom between carbon and aluminum centers between CM5 and QH ; CM5 charges are more neutral than QH . There is almost no difference between atomic charges of carbon and aluminum for CM5 and QH either. This is a clear example why these methods have very low variance. On the other hand, NPA population has the highest variance for different halogens. ESP and Mulliken break when the carbon is replaced with the aluminum atom. ZBD-QAO performs slightly better than Mulliken for fluorine and iodine substitutions but offer no differentiation between bromine and chlorine. Overall, IAO seems to perform the best out of all the QAO populations because it can differentiate between bromine and chlorine substitutions.

|  | CM5 | QH | ESP | Mulliken | NPA | Q1 | Q2 | Q3 | Z-Q1 | Z-Q2 | Z-Q3 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Halogen trends | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |

### 4.4 Hydrogen bond

After the discovery that the DNA bases stabilized by intermolecular hydrogen bonds ${ }^{59,60}$ (H-bond), it has been excepted as one of the most important non-covalent interactions. Studied extensively for its applications in bioorganic chemistry, ${ }^{61,62}$ a H -bond can be shown as $\mathrm{X}-\mathrm{H} \cdots \mathrm{Y}$ where X is the proton donor and Y is the acceptor. ${ }^{63}$ Most commonly Y is an electronegative atom such as N , O or F but it has been shown that electron rich regions such as delocalized $\pi$ system could also participate in H -bonding. The strength of the H -bond is dependent on the molecules, distance, angle and it can b a weak or strong as a covalent bond. Hydrogen bonds are very complicated and have contributions not just from electrostatic but also polarization, van der Waals and even charge transfer. ${ }^{64}$ In the framework of atomic charges, in the presence of H-bond a charge transfer is expected from proton acceptor to donors sigma antibonding orbital. This causes the proton donator to have elongated X-H bond. ${ }^{65}$ There different types of hydrogen bonding where this is not the case (blue shifting or anti H -bond). ${ }^{66}$

Total anion charges for anion-neutral intermolecular hydrogen bonded interactions are presented in Table 4-5. All molecules in this table are from dataset AHB21, a dataset specifically designed to test quantum chemical methods for binding energies of H -bonds for structures can be found in appendix B. ${ }^{67}$ The reference found the strongest H -bonds in this dataset are seen for $\mathrm{F}^{-}(\mathrm{HF})$ $>\mathrm{Cl}^{-}(\mathrm{HCl})>\mathrm{OH}^{-}(\mathrm{H} 2 \mathrm{O})$ interactions. Within the same anionic species, these molecules also produce the highest atomic charges

Table 4-5. Bolded anion charges H-bonded to a neutral molecule with B3LYP/Def2-SVPP. ID 818-834. Q1, Q2, Q3 are QUAMBO, QUAO, IAO and Zero-bond orthogonalized versions are prefixed with letter " $Z$ ". For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases.

| interaction | CM5 | QH | ESP | M | NPA | Q1 | Q2 | Q3 | Z-Q1 | Z-Q2 | Z-Q3 |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathbf{F}^{-} \ldots \mathrm{H}_{3} \mathbf{N}$ | -0.76 | -0.75 | -0.87 | -0.78 | -0.86 | -0.83 | -0.84 | -0.84 | -0.83 | -0.83 | -0.83 |
| $\mathbf{F}^{-} \ldots \mathrm{H}_{2} \mathrm{O}$ | -0.69 | -0.67 | -0.82 | -0.76 | -0.83 | -0.79 | -0.79 | -0.79 | -0.76 | -0.76 | -0.76 |
| $\mathbf{F}^{-} \ldots \mathrm{HF}$ | -0.59 | -0.55 | -0.73 | -0.69 | -0.76 | -0.74 | -0.74 | -0.74 | -0.65 | -0.65 | -0.65 |
| $\mathbf{C l}^{-} \ldots \mathrm{H}_{3} \mathbf{N}$ | -0.84 | -0.84 | -0.90 | -0.84 | -0.92 | -0.91 | -0.91 | -0.91 | -0.90 | -0.91 | -0.90 |
| $\mathbf{C l}^{-} \ldots \mathrm{H}_{2} \mathrm{O}$ | -0.80 | -0.79 | -0.86 | -0.82 | -0.89 | -0.87 | -0.87 | -0.87 | -0.85 | -0.85 | -0.85 |
| $\mathbf{C l}^{-} \ldots \mathrm{HF}$ | -0.74 | -0.73 | -0.82 | -0.79 | -0.84 | -0.82 | -0.82 | -0.82 | -0.78 | -0.78 | -0.78 |
| $\mathbf{C l}^{-} \ldots \mathrm{H}_{2} \mathrm{~S}$ | -0.75 | -0.74 | -0.82 | -0.75 | -0.81 | -0.80 | -0.80 | -0.80 | -0.80 | -0.80 | -0.80 |
| $\mathbf{C l}^{-} \ldots \mathrm{HCl}$ | -0.55 | -0.52 | -0.65 | -0.62 | -0.62 | -0.60 | -0.60 | -0.60 | -0.53 | -0.53 | -0.53 |
| $\mathbf{H O}^{-} \ldots \mathrm{H}_{3} \mathbf{N}$ | -0.76 | -0.74 | -0.88 | -0.75 | -0.87 | -0.81 | -0.82 | -0.82 | -0.80 | -0.80 | -0.80 |
| $\mathbf{H O}^{-} \ldots \mathrm{H}_{2} \mathrm{O}$ | -0.67 | -0.61 | -0.81 | -0.69 | -0.79 | -0.73 | -0.73 | -0.72 | -0.67 | -0.67 | -0.67 |
| $\mathbf{N}^{-} \ldots \mathrm{H}_{3} \mathrm{~N}$ | -0.90 | -0.88 | -0.98 | -0.90 | -0.97 | -0.94 | -0.95 | -0.95 | -0.93 | -0.93 | -0.93 |
| $\mathbf{N}^{-} \ldots \mathrm{H}_{2} \mathrm{O}$ | -0.86 | -0.83 | -0.94 | -0.88 | -0.95 | -0.91 | -0.91 | -0.91 | -0.89 | -0.89 | -0.89 |
| $\mathbf{N}^{-} \ldots \mathrm{HF}$ | -0.79 | -0.73 | -0.86 | -0.83 | -0.88 | -0.84 | -0.84 | -0.84 | -0.78 | -0.78 | -0.78 |
| $\mathbf{N}^{-} \ldots \mathrm{H}_{2} \mathbf{S}$ | -0.85 | -0.82 | -0.91 | -0.85 | -0.92 | -0.90 | -0.90 | -0.90 | -0.89 | -0.89 | -0.89 |
| $\mathbf{H S}^{-} \ldots \mathrm{H}_{3} \mathrm{~N}$ | -0.83 | -0.82 | -0.89 | -0.84 | -0.92 | -0.90 | -0.90 | -0.90 | -0.89 | -0.89 | -0.89 |
| $\mathbf{H S}^{-} \ldots \mathrm{H}_{2} \mathrm{O}$ | -0.77 | -0.76 | -0.84 | -0.81 | -0.88 | -0.86 | -0.86 | -0.86 | -0.83 | -0.83 | -0.83 |
| $\mathbf{H S}^{-} \ldots \mathrm{HF}$ | -0.71 | -0.69 | -0.81 | -0.78 | -0.82 | -0.80 | -0.80 | -0.80 | -0.75 | -0.75 | -0.75 |

From charges in Table 4-5 we expect reasonable numbers for both anion and neutral molecule. All anions should be negatively charged; the neutral molecules should be more positive than the anions. While chemical intuition dictates that the total charge on the anion should be as close to -1 as possible, this is not a desirable trend in quantum mechanics. We need unique and non-integer charges especially in the case of two interacting molecules to account for charge transfer.

One of the reasons why H -bond interactions are complicated is also the strength cannot be attributed to a single chemically intuitive expectation. If the electronegativity was the main driving force for the H -bond, as the anion becomes more electronegative the charge should become more
negative. However, the trend for $\mathrm{Cl}^{-}$and $\mathrm{F}^{-}$is the opposite, where the former is more negative than the. Instead considering the effect charge transfer in the of Pearson hardness-softness or Lewis acid-base framework. ${ }^{68}$ With softer hydrogen donors the negative charge on the anion can be relocate. As the strength of the bond increases the anions gets more positively charged as expected. For N3 molecule the anion charge is the most negative because instead of participating in intermolecular, intramolecular charge transfer is observed. It is not recommended to use ESP population for hydrides because atomic charges of the anion interacting with ammonia and water is the same.

|  | CM5 | QH | ESP | Mulliken | NPA | Q1 | Q2 | Q3 | Z-Q1 | Z-Q2 | Z-Q3 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| H- <br> bond | $\checkmark$ | $\checkmark$ | $\times$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |

Table 4-6. Bolded atomic charges for non-interacting water and cation-water interaction of with B3LYP/Def2-SVPP. ID 839-841\&101. Q1, Q2, Q3 are QUAMBO, QUAO, IAO and Zero-bond orthogonalized versions are prefixed with letter "Z". For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases.

| interaction | CM 5 | QH | ESP | M | NPA | Q 1 | Q 2 | Q 3 | Z-Q1 | Z-Q2 | Z-Q3 |
| ---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathbf{L i}^{+} \ldots \mathrm{H}_{2} \mathrm{O}$ | 0.87 | 0.77 | 0.96 | 0.85 | 0.98 | 0.98 | 0.98 | 0.98 | 0.95 | 0.95 | 0.95 |
| $\mathbf{N a}^{+} \ldots \mathrm{H}_{2} \mathrm{O}$ | 0.93 | 0.83 | 0.98 | 0.86 | 0.98 | 0.97 | 0.97 | 0.97 | 0.95 | 0.95 | 0.95 |
| $\mathbf{K}^{+} \ldots \mathrm{H}_{2} \mathrm{O}$ | 0.96 | 0.87 | 0.97 | 0.89 | 0.98 | 0.99 | 0.99 | 0.99 | 0.98 | 0.98 | 0.98 |
| $\mathrm{H}_{2} \mathbf{O}$ | -0.65 | -0.32 | -0.77 | -0.59 | -0.86 | -0.88 | -0.86 | -0.85 | -0.57 | -0.57 | -0.56 |
| $\mathrm{Li}^{+} \ldots \mathrm{H}_{2} \mathbf{O}$ | -0.65 | -0.23 | -1.03 | -0.64 | -1.00 | -1.02 | -0.99 | -0.99 | -0.65 | -0.64 | -0.64 |
| $\mathrm{Na}^{+} \ldots \mathrm{H}_{2} \mathbf{O}$ | -0.67 | -0.25 | -0.99 | -0.61 | -0.97 | -0.98 | -0.95 | -0.95 | -0.62 | -0.61 | -0.61 |
| $\mathrm{~K}^{+} \ldots \mathrm{H}_{2} \mathbf{O}$ | -0.70 | -0.27 | -0.91 | -0.44 | -0.94 | -0.98 | -0.95 | -0.95 | -0.63 | -0.63 | -0.63 |
| $\mathrm{Hi}_{2} \mathrm{O}$ | 0.32 | 0.16 | 0.38 | 0.30 | 0.43 | 0.44 | 0.43 | 0.43 | 0.29 | 0.28 | 0.28 |
| $\mathrm{Li}^{+} \ldots \mathbf{H}_{2} \mathrm{O}$ | 0.39 | 0.23 | 0.53 | 0.39 | 0.51 | 0.52 | 0.51 | 0.50 | 0.35 | 0.35 | 0.35 |
| $\mathrm{Na}^{+} \ldots \mathbf{H}_{2} \mathrm{O}$ | 0.37 | 0.21 | 0.51 | 0.38 | 0.49 | 0.50 | 0.49 | 0.49 | 0.33 | 0.33 | 0.33 |
| $\mathrm{~K}^{+} \ldots \mathbf{H}_{2} \mathrm{O}$ | 0.37 | 0.20 | 0.47 | 0.36 | 0.48 | 0.50 | 0.48 | 0.48 | 0.33 | 0.32 | 0.32 |

In the presence of a cation the oxygen should be a bit more positive
$\mathbf{M}^{+}$: Going down the periodic table the anion becomes more softer and positive so that $\mathrm{K}^{+}>\mathrm{Na}^{+}$ $>\mathrm{Li}^{+}$. For ESP and Mulliken population this trend is not observed.
$\mathbf{O}:$ In the presence of a cation interaction, the oxygen atomic charge of water molecule is expected to be slightly more positive than the non-interacting water oxygen. QH is the only population this trend is seen for all three different interactions. For Mulliken only K interaction has a more positive oxygen.

H : Water hydrogen interacting with the cation should be become less positive as the cation becomes a softer Lewis acid. While every population shows this trend, the hydrogen charge of $\mathrm{Li}^{+}$ interaction is significantly higher than

Cation and hydrogen interactions (alkali-water interactions) from CHB6 dataset can be seen in Table 4-6. These alkali-water interactions CM5 and QH is lower than any other population for
cation $\mathrm{M}^{+}(\mathrm{Li}, \mathrm{Na}, \mathrm{K})$ atomic charges. We expect the metal to be close to positive one, but darker background is only seen with ESP, NPA, QAO, ZBD-QAO. There is a clear difference between CM5 and QH , oxygen charges with QH is $\sim 0.3$ higher than CM5 charges. For QH population charges for alkali metals are the lowest. Lowest oxygen charges are seen with ESP, NPA, QUAMBO, QUAO and IAO populations. ZBD-QAO oxygen atomic charges are higher than the QAO populations, close to CM5 charges. Muliken population predicts the oxygen charge of the water interacting with potassium slightly more positive than the non-interaction water molecule. For ZBD-QAO populations oxygen charges in the presence of an anion are barely different than non-interacting water case. CM5 the existence of the cation has no effect on the charges, but for ESP, NPA, and QAO oxygen charge decreases. Expected trend is in the presence of a cation, the oxygen of the hydrogen donor should be slightly more positive. So we can summarize the results as:


### 4.5 Silica

Another chemical trend we can look at is the different silica dimer dataset from MBID paper. ${ }^{23}$ This dataset consists of permutations of intramolecular interactions of 12 silica containing molecules with 20 different molecules. In the previous chapter we have seen that silica is one of the atoms that have low atomic charge spread. In reference paper standard deviations of 15 different population methods are provided. There populations CM5, QH, and ESP are among these methods

Table 4-7. Standard deviations (STD) for atomic charges of silica atoms in ZG237 dataset compared with reference STD. ${ }^{23}$ ID 1034-1271.

| Population | STD | REF STD |
| :---: | :---: | :---: |
| CM5 | 0.053 | 0.003 |
| QH | 0.050 | 0.004 |
| ESP | 0.087 | 0.092 |
| Mulliken | 0.062 | - |
| NPA | 0.063 | - |
| QUAMBO | 0.075 | - |
| QUAO | 0.071 | - |
| IAO | 0.070 | - |
| ZBD-QUAMBO | 0.053 | - |
| ZBD-QUAO | 0.053 | - |
| ZBD-IAO | 0.052 | - |

Starting with the populations also provided in the REF values, standard deviance (STD) is higher for Hirshfeld populations CM5 and QH. There are two reasons for this difference (a) the reference STD values are grouped together for same type of silica atoms, then divided by the mean value of the whole dataset (b) the values include three different methods and three different basis sets. ESP population surprisingly has lower STD compared to the reference values. The highest variance is
seen with QAO populations Q1, Q2, Q3 (QUAMBO, QUAO, IAO). ZBD orthogonalization decreases the STD of QAO populations. From the common populations NPA is the highest STD.

Silica charges from ZG237 dataset has been plotted against the molecule ID (mid) with different populations are given in Figure 4-4. As shown in the legend at the bottom right corner there are six different silica structures. A single data point on the graph is colored by the silica structure non-covalently interacting with another molecule differentiated by a molecule ID. For silica atomic charges two trends are expected:

1. $\mathrm{H}_{3} \mathrm{O}_{3} \mathrm{Si}-\mathrm{O}-\mathrm{SiO}_{3} \mathrm{H}_{3}<\mathrm{H}_{3} \mathrm{O}_{3} \mathrm{Si}-\mathrm{O}-\mathrm{AlO}_{3} \mathrm{H}_{3}<\mathrm{H}_{3} \mathrm{O}_{3} \mathrm{Si}-\mathrm{O}-\mathrm{PO}_{3} \mathrm{H}$ and
with distinct atomic charge clusters. Only with ESP population clustering of same silica molecules is not seen. While other populations present distinct clusters, Mulliken there is no difference between $\mathrm{H}_{3} \mathrm{O}_{3} \mathrm{Si}-\mathrm{O}-\mathrm{AlO}_{3} \mathrm{H} 3$ and $\mathrm{H}_{3} \mathrm{O}_{3} \mathrm{Si}-\mathrm{O}-\mathrm{PO}_{3} \mathrm{H}$

## 2. $\mathrm{SiO}_{4} \mathrm{H}_{3}<\mathrm{SiO}_{4} \mathrm{H}_{3} \mathrm{CH}_{3}<\mathrm{SiO}_{4} \mathrm{H}_{4}$

For CM5, QH and Mulliken there is no difference between $\mathrm{SiO}_{4} \mathrm{H}_{4}$ and $\mathrm{SiO}_{4} \mathrm{H}_{3}$.

Overall, QAO improves the clustering of silica charges of Mulliken and ZBD orthogonalization lowers the charges. Mulliken should not be used for silica charges.

|  | CM5 | QH | ESP | Mulliken | NPA | Q 1 | Q 2 | Q 3 | Z-Q1 | Z-Q2 | Z-Q3 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Trend (1) | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| Trend (2) | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| Clustering | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| Total | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |



Figure 4-4. Silicon charges (y axis) from ZG237 dataset with molecule ID (x axis) 1035-1271 for populations CM5, QH, ESP, Mulliken, NPA, QAO and ZBD-QAO flavors for B3LYP/Def2-SVPP separated by molecular structure presented in legend.

### 4.6 Xenon

After looking at silica charges that appeared in very localized in chapter two graphs, we will consider the band like atomic charges seen in NPA and QAO populations. All these atomic charges are from stable structures of the heavy noble gas xenon from G18 dataset. Thes molecules have been studied since the 60 's $s^{69-71}$ and received great chemical interest because they are can break the octet rule $\left(\mathrm{XeF}_{4}\right.$ which is planar). ${ }^{72}$ Noble gas halides have been considered as ionic in character ${ }^{73}$ where halide is negatively charged while the noble gas is positively charged. Xenon atom have been found in many oxidation states ranging from zero to eight. Earlier explanations of the bonding patterns with Molecular Orbital Theory states that xenon bonds are mainly $p_{\sigma}$ atomic orbitals. ${ }^{74}$

Table 4-8. Bolded atomic charges for xenon containing compounds with B3LYP/Def2-SVPP. ID 839-841\&101. Q1, Q2, Q3 are QUAMBO, QUAO, IAO and Zero-bond orthogonalized versions are prefixed with letter "Z". For clarity, atomic charges are conditional formatted on color scale; background darkens as the charge increases.

| Molecule | CM5 | QH | ESP | M | NPA | Q1 | Q2 | Q3 | Z-Q1 | Z-Q2 | Z-Q3 |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathbf{X e F ~}_{2}$ | 0.62 | 0.57 | 0.61 | 0.75 | 1.14 | 1.22 | 1.22 | 1.22 | 1.39 | 1.39 | 1.39 |
| $\mathbf{X e F}_{4}$ | 1.03 | 0.93 | 1.05 | 1.29 | 2.17 | 2.31 | 2.32 | 2.32 | 2.52 | 2.52 | 2.52 |
| $\mathbf{X e F}_{6}$ | 1.07 | 0.97 | 1.09 | 1.29 | 2.16 | 2.30 | 2.30 | 2.30 | 2.51 | 2.51 | 2.51 |
| $\mathbf{X e O F}_{4}$ | 1.27 | 1.08 | 1.35 | 1.45 | 2.97 | 3.07 | 3.08 | 3.09 | 3.32 | 3.33 | 3.33 |
| $\mathbf{X e O}_{4}$ | 1.26 | 0.99 | 1.53 | 1.14 | 2.88 | 2.91 | 2.93 | 2.93 | 3.18 | 3.18 | 3.19 |
| $\mathbf{X e F}_{\mathbf{2}}$ | -0.24 | -0.21 | -0.26 | -0.30 | -0.55 | -0.61 | -0.61 | -0.61 | -0.70 | -0.70 | -0.70 |
| $\mathbf{X e F}_{4}$ | -0.26 | -0.23 | -0.26 | -0.32 | -0.54 | -0.58 | -0.58 | -0.58 | -0.63 | -0.63 | -0.63 |
| $\mathbf{X e F}_{6}$ | -0.18 | -0.16 | -0.18 | -0.21 | -0.36 | -0.38 | -0.38 | -0.38 | -0.42 | -0.42 | -0.42 |
| $\mathbf{X e O F}_{4}$ | -0.24 | -0.21 | -0.26 | -0.30 | -0.55 | -0.57 | -0.58 | -0.58 | -0.62 | -0.62 | -0.62 |
| $\mathbf{X e O}_{4}$ | -0.32 | -0.25 | -0.38 | -0.28 | -0.72 | -0.73 | -0.73 | -0.73 | -0.79 | -0.80 | -0.80 |

Previously studies on compounds containing xenon with NPA population concluded that Xe-C and $\mathrm{Xe}-\mathrm{O}$ bonds are electrostatic in character because of Coulombic attraction between highly
positive xenon and negatively charged carbon or oxygen. ${ }^{69}$ In Table 4-8 we will look at some highly stable xenon compounds from literature to see the bonding trends. For xenon charges there is a clear difference between CM5, QH, ESP, Mulliken and NPA, QAO, ZD-QAO populations. Former population methods produce significantly lower xenon charges, range seen for different structures is very small. While the latter populations have a wide range of atomic charges proving that QAO, much like NPA, considers these structures electrostatic in nature. For all studied populations, xenon charges in tetra- and hexa-fluoride are indistinguishable. Furthermore, QH and Mulliken fail to distinguish between xenon charges of tetrafluoride and tetraoxide. $\mathrm{XeF}_{4}$ is square planar molecule while $\mathrm{XeO}_{4}$ is tetrahedral with four double bonded oxygens. Unlike QH and Mulliken populations suggest, there should be difference between the atomic charges of oxygen and fluorine atoms. Overall, highest (or lowest) charges are observed with ZBD-QAO populations. This is expected because ZBD is localizes the electrons to atom centers, while density partitioning methods like CM5 and QH allow the electrons to be more delocalized. As one would expect, these xenon structures are the band like atomic charges seen for NPA and QAO populations.

|  | CM5 | QH | ESP | Mulliken | NPA | Q1 | Q2 | Q3 | Z-Q1 | Z-Q2 | Z-Q3 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Xe | $\boldsymbol{x}$ | $\boldsymbol{x}$ | $\boldsymbol{x}$ | $\boldsymbol{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |

## 5 Conclusion

In this work CM5, QH, ESP, Mulliken, NPA and the new QAO populations (QUAMBO, QUAO, IAO) and Zero-Bond Dipole orthogonalized versions (ZBD-QUAMBO , ZBD-QUAO, ZBD-IAO) were compared with three different methods (HF, B3LYP, $\omega$ B97XD) and basis sets (Def2-SVPP, Def2-TZVPP, Def2-QZVPP) over 1894 different molecular structures. For mathematical accuracy method, basis set, conformation, atom type dependency have been considered.

|  | CM5 | QH | ESP | Mulliken | NPA | QUAMBO | QUAO | IAO |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Method independence (with MB08) | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ |
| Basis set independence (with MB08) | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ |
| Atom type | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ |
| Conformational stability | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| Outliers | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ |

The resulting suggestion is CM5, QH and IAO for covering desired mathematical traits. Nevertheless, extreme cases or outliers to break the expected charges exist for all methods.

|  | CM5 | QH | ESP | Mulliken | NPA | Q1 | Q2 | Q3 | Z-Q1 | Z-Q2 | Z-Q3 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Hydrocarbons | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| Halogen trends | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| H-bond | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| Silica | $\checkmark$ | $\checkmark$ | $\mathbf{x}$ | $\checkmark$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |
| Xenon | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\mathbf{x}$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ |

For chemical trend expectations, non-orthogonalized QUAMBO and QUAO are not an improvement over Mulliken population. We recommend IAO to improve chemical trends or using ZBD orthogonalization with any of the QAO flavors. ESP population should not be used if reliable chemical trends or mathematical accuracy is desired.

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## A. APPENDIX : Chemical Database

JPCA (ID 860-133) quantum chemistry benchmarking dataset for polarizability of DFT functionals. This is a detailed study on wave function methods and basis sets. Basis sets used in this thesis are not included in this list. However, five different basis sets and ten different methods have been put to test. Their results on dipole moments show that B3LYP is better than all other methods.

Mobley (ID 132-775) this dataset is from Mobley's hydration free energies database FreeSolv ${ }^{75}$ and consists of small neutral molecules. This research has some interesting molecules which they refer to as "extremas".

JOC (ID 774-818) intermolecular charge transfer compounds from zwitterions and neutral carbocations. ${ }^{51}$

AHB21 (ID 817-839) anion-neutral interactions ${ }^{67}$
CHB6 (ID 838-845) cation-neutral interactions ${ }^{67}$
IL16 (ID 844-861) anion-cation interactions, a subset of IL-2013 ${ }^{76}$
ZG237 (ID 1035-1271) non-covalent interactions of silica clusters with different types of molecules including noble gases, cationic and neutral small organic molecules. ${ }^{23}$ There are 12 different silica clusters interacting with one of the 20 different molecules. ${ }^{77}$
MB08 (ID 1272-1451) unusual bonding dataset for "mindless" DFT benchmarking. ${ }^{78}$ This dataset is first introduced as one of the sets to benchmark Becke and Minnesota density functionals. This dataset consists of 165 molecules which are artificially created to strip chemical bias from methods. While it provides a way to test for electronically challenging systems it is not completely random ansatz. All the geometries were optimized by PBE/TZVP level and benchmarked with $\operatorname{CCSD}(\mathrm{T}) / \mathrm{cc}-\mathrm{pVTZ}$.

X40 (ID 1452-1491) is a dataset of 40 non-covalent interactions of halogens and small organic molecules. ${ }^{54,79}$ It covers a variety of different interaction types but possibly the most notable are halogen bonding and $\pi$-halogen interactions. All geometries are optimized using $\operatorname{CCSD}(\mathrm{T}) / \mathrm{CBS}$ method.

S66 (ID 1492-1558) well-balanced non-covalent interactions dataset for benchmarking interaction energies. It is an extension of their bioorganic chemistry dataset $\mathrm{S} 22^{80}$ aimed for parametrization of various computational techniques. Like S22, S66 dataset is considered wellbalanced because it includes almost equal amounts of electrostatic, dispersions and mixed interaction types. These interactions are further categorized into H -bonding, dispersion dominated and other type of interactions. The geometries of these molecules were optimized using in several series of steps ending with MP2/cc-pVTZ and reported in the supporting information.

Figure A-1. Molecule ID and chemical formulas in database.

| 0 | Cl4C1 | 31 | N1H2 | 62 | As1Cl3O1 | 93 | S1O1 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 1 | Cl3C1H1 | 32 | S1O4H2 | 63 | S1F2 | 94 | O2C1 |
| 2 | Cl2C1H2 | 33 | S1O4H1 | 64 | S1F4 | 95 | S1O2 |
| 3 | Cl1C1H3 | 34 | S1O4 | 65 | S1F6 | 96 | C2H4 |
| 4 | C1H4 | 35 | S1O3H2 | 66 | S1F2O1 | 97 | C3H8 |
| 5 | Br4C1 | 36 | S1O3H1 | 67 | Cl1F1O1 | 98 | C4H6 |
| 6 | Br3C1H1 | 37 | P1O4H3 | 68 | Cl1F1O2 | 99 | C4H8 |
| 7 | Br2C1H2 | 38 | P1O3H1 | 69 | Cl1F3O1 | 100 | C5H10 |
| 8 | Br1C1H3 | 39 | Cl1O4H1 | 70 | Cl1F1O3 | 101 | O1H2 |
| 9 | C1H4 | 40 | Cl1O3H1 | 71 | Cl1F3O2 | 102 | O1C1H4 |
| 10 | F4C1 | 41 | C60 | 72 | Br1F1O2 | 103 | O1C2H6 |
| 11 | F3C1H1 | 42 | Al1F4 | 73 | Br1F3O1 | 104 | O2C2H4 |
| 12 | F2C1H2 | 43 | Cl4Al1 | 74 | Br1F1O3 | 105 | O2C3H6 |
| 13 | F1C1H3 | 44 | Br4Al1 | 75 | Cl1F1 | 106 | O1C3H6 |
| 14 | C1H4 | N1C1H4 | 61 | As1F3O1 | 92 | O1N1 | 123 | N2C3H4


| 124 | O1C4H4 | 158 | C15O2N1C6 | 192 | O1C6H12 | 224 | S1C3H8 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 125 | S1C4H4 | 159 | Cl3S1O2N1C9H8 | 193 | Cl3F3C2 | 225 | O1C6H6 |
| 126 | N1C5H5 | 160 | C8H10 | 194 |  | 226 | C3H8 |
| 127 | O1C6H6 | 161 | C10H14 | 6 | Cl1S3P1O2C11H1 | 227 | O2C13H18 |
| 128 | Cl1C6H5 | 162 | C12O2C12H6 | 195 | C14C6H2 | 228 | O3C16H14 |
| 129 | F1C6H5 | 163 | O1C9H18 | 196 | Cl2C2H4 | 229 | I1C3H7 |
| 130 | C7H8 | 164 | N1C6H7 | 197 | O1C8H10 | 230 | O1N1C7H5 |
| 131 | C6H6 | 165 | F1O2C15H13 | 198 | S1C3H8 | 231 | O1C8H10 |
| 132 | O1N3C4H5 | 166 | S1C4H10 | 199 | C7H8 | 232 | C5H10 |
| 133 | O2C7H14 | 167 | O1C8H10 | 200 | O1C5H10 | 233 | O1C1H2 |
| 134 | O1C4H10 | 168 | O2C8H16 | 201 | O1C5H10 | 234 | C11C5H11 |
| 135 | C16C12H4 | 169 | O1C6H14 | 202 | C14C2H2 | 235 | C10H14 |
| 136 | N1C6H13 | 170 | O1C1H4 | 203 | Cl1C6H13 | 236 | C10H22 |
| 137 | O2C7H6 | 171 | O1C4H10 | 204 | O5C5H10 | 237 | C11-2H5 |
| 138 | O2C4H8 | 172 | O1N1C4H9 | 205 | C6H12 | 238 | C6H14 |
| 139 | Cl2C6H4 | 173 | C4H8 | 206 | O1C4H10 | 239 | O1C4H10 |
| 140 | I1C2H5 | 174 | C6H10 | 207 | Br1C7H7 | 240 | C12H10 |
| 141 | C8H18 | 175 | S1O2C2H6 | 208 | S1P1O5N1C8H10 | 241 | O3C14H14 |
| 142 | O1C4H10 | 176 | O2C2H4 | 209 | C4H10 | 242 | O3C4H10 |
| 143 | O1C10H16 | 177 | O2C6H12 | 210 | S1H2 | 243 | O2C3H6 |
| 144 | Cl1O1C6H5 | 178 | F8C4 | 211 | BriO2N2C9H13 | 244 | O3C8H8 |
| 145 | S1C7H8 | 179 | O1N1C7H7 | 212 | O1N1C17H21 | 245 | O1C2H6 |
| 146 | I1C3H7 | 180 | O2C12H8 | 213 | O2N1C1H3 | 246 | O3N1C16H13 |
| 147 | Cl1C3H7 | 181 | Br1O1C6H5 | 214 | O1N1C3H7 | 247 | C10H20 |
| 148 | O2N1C5H11 | 182 | O2C6H12 | 215 | O1C2H4 | 248 | O2C6H12 |
| 149 | O1C7H14 | 183 | O4C8H14 | 216 | O1C5H8 | 249 | O1C8H10 |
| 150 | C5H12 | 184 | O1C8H10 | 217 | O1C9H18 | 250 | O2C6H12 |
| 151 | Cl 6 C 2 | 185 | C11-7H7 | 218 | Cl1C3H7 | 251 | N1C7H9 |
| 152 | O1C8H18 | 186 | S2P1O3N3C10H12 | «219 | C9H12 | 252 | O1C7H14 |
| 153 | P1O4C6H15 | 187 | O2C6H12 | 220 | C12H10 | 253 | O4C7H12 |
| 154 | Cl3C2H3 | 188 | Br2C2H4 | 221 | C2H6 | 254 | N1C2H7 |
| 155 | O4N1C8H7 | 189 | S1C2H6 | 222 | C11F5O1C3H2 | 255 | O1C4H10 |
| 156 | S1O1N1C10H21 | 190 | C5H12 | 223 | O1C8H14 | 256 | O2N2C14H10 |
| 157 | N1C7H9 | 191 | N1C9H9 |  |  | 257 | N1C7H5 |


| 258 | O2C7H8 | 290 | Br1C4H9 | 324 | C9H12 | 358 | Cl1C4H9 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 259 | Cl3O2N1C1 | 291 | C10H8 | 325 | N1C7H9 | 359 | O1C10H8 |
| 260 | Cl1C7H7 | 292 | N1C4H5 | 326 | O2N4C11H18 | 360 | O1C6H10 |
| 261 | O1C6H12 | 293 | C14O2C12H4 | 327 | O6N2C3H6 | 361 | O2C6H14 |
| 262 | Cl2C6H4 | 294 | C14O2C12H4 | 328 | C6H10 | 362 | O2C7H14 |
| 263 | C15C2H1 | 295 | O2C7H6 | 329 | C8H10 | 363 | C9H18 |
| 264 | Cl2C2H2 | 296 | C8H8 | 330 | O3C3H8 | 364 | C12H12 |
| 265 | F3O4N3C14H16 | 297 | O1C5H12 | 331 | N1C10H9 | 365 | O2C6H4 |
| 266 | Br1C7H15 | 298 | O3N1C4H9 | 332 | Cl1O4C9H9 | 366 | Br1C5H11 |
| 267 |  | 299 | O4C9H8 | 333 | F3N1C9H10 | 367 | C9H10 |
| H17 | Cl1S2P1O4N1C14 | 300 | O1C8H10 | 334 | O1C4H10 | 368 | $\mathrm{Cl3C2H} 3$ |
| 268 | Cl1O1N3C10H8 | 301 | O1C7H8 | 335 | C17C12H3 | 369 | Cl2C1H2 |
| 269 | C7H16 | 302 | O2C5H10 | 336 | O5N2C10H12 | 370 | N1C5H7 |
| 270 | C16H10 | 303 | N1C6H15 | 337 | O1C9H18 | 371 | O2N2C6H6 |
| 271 | O2C8H16 | 304 | Cl6O2C12H2 | 338 | S1O2C4H8 | 372 | O3N1C6H13 |
| 272 | C7H16 | 305 | N1C5H5 | 339 | O3C10H14 | 373 | N1C10H9 |
| 273 | O2C8H10 | 306 | C14H12 | 340 | O2C10H14 | 374 | O1C3H6 |
| 274 | O6N2C3H6 | 307 | S1C4H4 | 341 | F2C2H4 | 375 | O1C5H8 |
| 275 | O1N1C10H13 | 308 | C4H8 | 342 | F1O2N2C4H3 | 376 | O2C8H8 |
| 276 | O1N1C7H5 | 309 | Cl3C1H1 | 343 | O1C9H20 | 377 | O1C7H6 |
| 277 | Cl3C6H3 | 310 | F3O1C2H3 | 344 | O1C5H10 | 378 | O2C9H10 |
| 278 | C6H12 | 311 | C3H6 | 345 | I1C6H5 | 379 | C15O2C12H3 |
| 279 | N2C8H12 | 312 | O2C2H4 | 346 | O1C6H14 | 380 | Cl3C6H3 |
| 280 | S1O6N3C13H19 | 313 | C9H12 | 347 | C11F1C1H2 | 381 | O2C3H6 |
| 281 | O1N1C6H11 | 314 | S1N5C9H17 | 348 | C9H12 | 382 | Cl2C2H4 |
| 282 | I1O2N2C4H3 | 315 | C6H6 | 349 | O1C9H10 | 383 | O1C7H14 |
| 283 | O3N1C6H5 | 316 | C9H20 | 350 | O2C7H8 | 384 | O1C7H8 |
| 284 | O1C8H10 | 317 | O2C3H8 | 351 | O4C6H10 | 385 | Br1O2N2C4H3 |
| 285 | N2C5H12 | 318 | Cl1O2N2C9H13 | 352 | C11H16 | 386 | C5H10 |
| 286 | O2N1C8H5 | 319 | O1C3H8 | 353 | O1C6H14 | 387 | C7H16 |
| 287 | C3H6 | 320 | O1C8H10 | 354 | O2C8H16 | 388 | N2C6H14 |
| 288 | Cl1N1C5H4 | 321 | O1C10H22 | 355 | O1C7H14 | 389 | Cl2O2C12H6 |
| 289 | O1C6H10 | 322 | C8H18 | 356 | Cl1O3C5H11 | 390 | C8H18 |
|  |  | 323 | Cl1N1C6H6 | 357 | O1C8H18 | 391 | O1N1C9H11 |


| 392 | O2N1C6H5 | 426 | O2C6H14 | 460 | S1O2N2C7H14 | 494 | C12H12 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 393 | O1N1C7H9 | 427 | O1C8H16 | 461 | N2C6H8 | 495 | C6H10 |
| 394 | C14C6H2 | 428 | Cl2C3H6 | 462 | S1C1H4 | 496 | N1C2H7 |
| 395 | C10H14 | 429 | C8H16 | 463 | C12H12 | 497 | Cl2O3C8H6 |
| 396 | N1C6H7 | 430 | I1C7H15 | 464 | O6N2C2H4 | 498 | N2C4H6 |
| 397 | Cl1N1C5H4 | 431 | C7H14 | 465 | N1C20H23 | 499 | O2N1C7H7 |
| 398 | C5H8 | 432 | O1C8H10 | 466 | Cl2C4H8 | 500 | O4C6H14 |
| 399 | N1C3H5 | 433 | O2C5H10 | 467 | C6H12 | 501 | O1C5H12 |
| 400 | Cl1O2N2C4H3 | 434 | C16C6 | 468 | O1C7H8 | 502 | S1O4C2H6 |
| 401 | I1C1H3 | 435 | Cl1S1O2C1H3 | 469 | N1C8H11 | 503 | O2C3H8 |
| 402 | O3N1C14H9 | 436 | O3C8H10 | 470 | O1C6H12 | 504 | C6H12 |
| 403 | C9H20 | 437 | N1C6H7 | 471 | Cl2F2O1C3H4 | 505 | N1C9H7 |
| 404 | Cl1O1C7H7 | 438 | N1C7H9 | 472 | $\mathrm{Cl1O2C12H7}$ | 506 | O2C6H14 |
| 405 | Cl1C1H3 | 439 | N1C5H9 | 473 | O2C5H10 | 507 | C12H18 |
| 406 | O4C6H10 | 440 | O2C6H12 | 474 | S1P1O3N2C12H21 | 508 | O2C6H12 |
| 407 | C12C2H2 | 441 | C7H12 | 475 | C9H12 | 509 | S2C4H10 |
| 408 | C14H12 | 442 | O3C11H16 | 476 | C5H12 | 510 | O2C8H10 |
| 409 | F1C6H5 | 443 | O2N1C15H15 | 477 | Cl10C12 | 511 | C6H14 |
| 410 | Br1C7H7 | 444 | O4N1C3H5 | 478 | O1C10H14 | 512 | O2N2C6H6 |
| 411 | Br1Cl1F3C2H1 | 445 | S1C4H10 | 479 | O2C7H14 | 513 | C14C2 |
| 412 | Cl2C6H4 | 446 | O2N1C14H9 | 480 | C12H12 | 514 | O1C5H12 |
| 413 | C6H14 | 447 | O1C10H14 | 481 | F6C3 | 515 | N1C6H7 |
| 414 | N1C7H9 | 448 | N2C6H4 | 482 | N2C4H6 | 516 | O2N1C4H9 |
| 415 | O6C6H14 | 449 | S1C6H14 | 483 | O3C5H12 | 517 | F2O3C13H8 |
| 416 | $\mathrm{Cl2O1C4H8}$ | 450 | O1C5H10 | 484 | Cl 4 O 2 C 12 H 4 | 518 | N1C6H15 |
| 417 | O3C9H10 | 451 | O3N1C6H5 | 485 | N1C7H9 | 519 | O1C8H14 |
| 418 | N2C10H10 | 452 | O1N1C7H9 | 486 | S1C6H6 | 520 | O2N2C6H6 |
| 419 | O2C5H8 | 453 | F3O4N4C11H13 | 487 | Cl 3 C 12 H 7 | 521 | C2H4 |
| 420 | O2C4H10 | 454 | O1C7H16 | 488 | Cl5C12H5 | 522 | O1C12H10 |
| 421 | O2C2H6 | 455 | C9H10 | 489 | N1C8H11 | 523 | P1O4C3H9 |
| 422 | F6C8H4 | 456 | C12H12 | 490 | O2N1C10H13 | 524 | O1C8H8 |
| 423 | O1C9H12 | 457 | C4H6 | 491 | O1C10H18 | 525 | C14C2H2 |
| 424 | O2C5H12 | 458 | O1C6H14 | 492 | O1C4H8 | 526 | Cl2O4C9H8 |
| 425 | Cl7C10H5 | 459 | C4H10 | 493 | N1H3 | 527 | O6C9H14 |


| 528 | O3C10H12 | 562 | Cl7C12H3 | 596 | C11C7H15 | 628 | O1C6H14 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 529 | O1N1C6H5 | 563 | Cl2O3C8H8 | 597 | F3O4N3C13H16 | 629 | Cl 3 C 2 H 1 |
| 530 | Cl1C4H9 | 564 | N1C1H5 | 598 | O3N1C6H5 | 630 | O1C10H16 |
| 531 | O3N3C3H3 | 565 | O4N1C2H5 | 599 | N1C7H17 | 631 | O2C7H6 |
| 532 | N1C8H19 | 566 | Cl8C10H6 | 600 | F1O1C6H5 | 632 | S2C2H6 |
| 533 | I1C6H13 | 567 | O2C4H8 | 601 | O1N1C6H13 | 633 | Br1C3H7 |
| 534 | Cl1N1C6H6 | 568 | O1C8H10 | 602 | O1C5H12 | 634 | Br1F3C1 |
| 535 | N1C3H7 | 569 | F4C1 | 603 | $\mathrm{Cl1O} 2 \mathrm{C} 12 \mathrm{H} 7$ | 635 | N2C3H4 |
| 536 | Br1C4H9 | 570 | O1N1C7H7 | 604 | N2H4 | 636 | S4P2O4C9H22 |
| 537 | F3O1C3H5 | 571 | Cl4C6H2 | 605 | O1C7H8 | 637 | O2C3H6 |
| 538 | C14C12H6 | 572 | C6H14 | 606 | O2N1C7H7 | 638 | $\mathrm{Br} 1 \mathrm{Cl1C2H} 4$ |
| 539 | N1C7H9 | 573 | F3O1C8H7 | 607 |  | 639 | Br1C4H9 |
| 540 | N1C5H11 | 574 | O2C4H8 | 11 | Cl3S1P1O3N1C9H | 640 | N1C7H9 |
| 541 | O2C9H10 | 575 | O1N2C9H12 | 608 | O1C3H8 | 641 | C5H10 |
| 542 | Cl3P1O4C4H8 | 576 | C8H18 | 609 | F3O3C5H9 | 642 | F3O2N2C5H3 |
| 543 | S1N5C10H19 | 577 | O1C3H8 | 610 | O1C9H14 | 643 | Cl3C6H3 |
| 544 | O1N1C7H7 | 578 | O1N1C3H9 | 611 | O1C11H22 | 644 | F3O4N3C13H16 |
| 545 | F6C8H4 | 579 | Cl1O2C3H5 | 612 | O2N4C8H10 | 645 | O1C7H14 |
| 546 | Cl 4 C 1 | 580 | O 2 C 12 H 20 | 613 | O3C9H10 | 646 | N1C8H19 |
| 547 | Cl2C12H8 | 581 | O2C4H8 | 614 | O3N2C9H10 | 647 | O3N1C4H9 |
| 548 | N1C6H13 | 582 | O2C8H14 | 615 | O3C6H12 | 648 | C10H14 |
| 549 | C14H10 | 583 | O2C5H10 | 616 | O2C5H10 | 649 | O3C11H14 |
| 550 | C8H16 | 584 | N1C7H9 | 617 | Cl2O1N1C9H9 | 650 | O2C7H16 |
| 551 | C9H12 | 585 | O1C8H10 | 618 | O1C9H12 | 651 | O2C5H10 |
| 552 | O2C8H16 | 586 | O1C6H12 | 619 | O1C8H8 | 652 | O1C6H14 |
| 553 | N1C4H9 | 587 | O1C2H6 | 620 | N1C2H3 | 653 | O1C5H12 |
| 554 | Cl1C2H3 | 588 | C14H10 | 621 | O1C6H14 | 654 | O2C7H6 |
| 555 | O1C4H6 | 589 | O1C10H8 | 622 | O1N1C7H9 | 655 | C5H10 |
| 556 | $\mathrm{Cl3P1O} 4 \mathrm{C} 12 \mathrm{H} 14$ | 590 | Cl1C4H9 | 623 | O2C5H10 | 656 | O1N1C3H7 |
| 557 | C7H12 | 591 | Cl1O1C6H5 | 624 | Br3C1H1 | 657 | O1N1C2H5 |
| 558 | O2C7H14 | 592 | Cl1C3H5 | 625 | Br1C6H5 | 658 | O2N1C14H9 |
| 559 | O3N1C12H15 | 593 | C6H14 | 626 | O2C9H18 | 659 | Cl1O1C6H5 |
| 560 | O1C3H6 | 594 | N1C5H13 | 627 | Cl1C6H5 | 660 | Cl6O1C12H8 |
| 561 | I2C1H2 | 595 | Br2C6H4 |  |  | 661 | O1C3H6 |


| 662 | Cl1O2N1C14H20 | 696 | Cl1N1C6H6 | 730 | C4H6 | 764 | O6N2C4H8 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 663 | C8H10 | 697 | O1C5H10 | 731 | C8H16 | 765 | O1C5H12 |
| 664 | O1C10H18 | 698 | N1C7H9 | 732 | N1C3H9 | 766 | C18O2C12 |
| 665 | Cl1F3C2H2 | 699 | O2C4H8 | 733 | C8H16 | 767 | O1C5H12 |
| 666 | Cl1N5C7H12 | 700 | N2C6H4 | 734 | S1O3C2H6 | 768 | C7H16 |
| 667 | O2C4H8 | 701 | C5H8 | 735 | N1C3H9 | 769 | O1C10H18 |
| 668 | C18C12H2 | 702 | I1C4H9 | 736 | C5H8 | 770 | C12C2H2 |
| 669 | N1C4H7 | 703 | O1C6H12 | 737 | Br 2 C 1 H 2 | 771 | C9H12 |
| 670 | C3H4 | 704 | I1O1C6H5 | 738 | Cl2O1C6H4 | 772 | Br1C2H5 |
| 671 | Cl6C12H4 | 705 | O3N1C6H11 | 739 | S1P1O5N1C10 | 773 | S1C6H14 |
| 672 | Cl1F2C1H1 | 706 | O1N1C6H5 | 740 | Br1C6H13 | 774 | F3O1C3H5 |
| 673 | O2N1C2H5 | 707 | C10H14 | 741 | O1C8H16 | 776 | C8H6 |
| 674 | O1C10H20 | 708 | F3C7H5 | 742 | C11H10 | 777 | C6N2O2H6 |
| 675 | O1C6H12 | 709 | Cl5C12H5 | 743 | Br1C3H7 | 778 | C16H8 |
| 676 | N1C4H11 | 710 | Cl 3 O 2 C 12 H 5 | 744 | S3P1O2C7H17 | 779 | C14H12 |
| 677 | O1N1C3H7 | 711 | N1C7H9 | 745 | C8H10 | 780 | C15H12 |
| 678 | C7H16 | 712 | O1C4H8 | 746 | N1C7H9 | 781 | C11H8 |
| 679 | N1C6H15 | 713 | O1C8H8 | 747 | C14C12H6 | 782 | C16H16 |
| 680 | C7H14 | 714 | C5H8 | 748 | N2C4H10 | 783 | C16H16 |
| 681 | O1C5H10 | 715 | O1C5H10 | 749 | O6C6H12 | 784 | C16H16 |
| 682 | O2C7H14 | 716 | S2P1O6C10H19 | 750 | Cl1O2N2C4H3 | 785 | C16H16 |
| 683 | C8H14 | 717 | N2C5H6 | 751 | C13H10 | 786 | N1C5H9 |
| 684 | I1C5H11 | 718 | Br1C1H3 | 752 | C16S1O3C9H6 | 787 | N1C5H10 |
| 685 | F1O1C6H5 | 719 | C6H10 | 753 | O1C10H20 | 788 | C2H2 |
| 686 | O1N1C5H11 | 720 | O2N1C12H11 | 754 | Cl2C3H6 | 789 | C2H1 |
| 687 | O1C4H8 | 721 | Br1C8H17 | 755 | O2C4H10 | 790 | N1C3H7 |
| 688 | S1O1C2H6 | 722 | F3O2C3H3 | 756 | O1C10H16 | 791 | C3H7N1 |
| 689 | O2C6H12 | 723 | O3N1C4H9 | 757 | O2N1C3H7 | 792 | H5C3 |
| 690 | C7H16 | 724 | F1C1H3 | 758 | O2N1C3H7 | 793 | C8N1H13 |
| 691 | C7H16 | 725 | C1H4 | 759 | S1C5H6 | 794 | C5H5 |
| 692 | Br1F4C2H1 | 726 | S1C2H6 | 760 | Cl1C12H9 | 795 | C8N1H13 |
| 693 | O1C7H8 | 727 | C7H14 | 761 | C7H8 | 796 | C8N1H13 |
| 694 | N1C6H15 | 728 | C5H10 | 762 | N1C4H11 | 797 | C10N1H9 |
| 695 | S1O1N1C10H21 | 729 | O2N1C4H5 | 763 | Cl2N1C7H3 | 798 | N1C7H5 |


| 799 | N1C7H6 | 833 | S1H3O1 | 867 | C8O1N1H9 | 902 | N1C6H6Cl1 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 800 | C14N2H22 | 834 | S1H2F1 | 868 | H7C3O1N1 | 903 | C3H6 |
| 801 | C8H6 | 835 | O2C2H6N1 | 869 | H7C3N1O2 | 904 | C7N1O2H7 |
| 802 | C14N2H24 | 836 | O3C2H5 | 870 | H9C5Cl1O1 | 905 | O2C1H2 |
| 803 | C14N2H24 | 837 | O3C1H3 | 871 | C1O1H2 | 906 | C2O1N1H5 |
| 804 | C8H8 | 838 | O2C1H2F1 | 872 | C4H9F1 | 907 | H3F1C4N2 |
| 805 | C9N1H13 | 839 | Li1O1H2 | 873 | H5N1C2O2 | 908 | C3H8 |
| 806 | C9N1H13 | 840 | Na1O1H2 | 874 | H11C4N1 | 910 | C2H3F3 |
| 807 | C8N1H15 | 841 | K1O1H2 | 875 | C3H5F3 | 911 | H9C5F1O1 |
| 808 | N1C8H15 | 842 | Li1C6H6 | 876 | O1H5C6Cl1 | 912 | F1C1H4N1 |
| 809 | N1C8H16 | 843 | Na1C6H6 | 877 | H5C3O1Cl1 | 913 | C2H3N1 |
| 810 | C9H15 | 844 | K1C6H6 | 878 | O1H5C6Cl1 | 914 | C3H4 |
| 811 | N1C10H15 | 845 | C5N2H9Cl1 | 879 | N1C6H7 | 915 | Cl1C6H11 |
| 812 | N1C10H16 | 846 | C4N1H9O2F2 | 880 | C6H6 | 916 | H3N1C1O2 |
| 813 | C8H9 | 847 | C4N1H8O2F3 | 881 | O1H2 | 917 | C3H8N1Cl1 |
| 814 | C7N1H9 | 848 | C4N2H7Cl1 | 882 | H3C4Cl1O1 | 918 | C5H12 |
| 815 | N1C7H9 | 849 | C4N3H7O3 | 883 | H5F1C6 | 919 | H9C4O1N1 |
| 816 | C7N1H9 | 850 | C4N2H7O4Cl1 | 884 | C1H4 | 920 | C4N2H4 |
| 817 | C7N1H9 | 851 | C5N1H12Cl1 | 885 | C3H8N1F1 | 921 | C3O1H6 |
| 818 | F1N1H3 | 852 | C4N1H12Cl1 | 886 | N1C6H6F1 | 922 | C1O1H4 |
| 819 | F1O1H2 | 853 | C3N1H10Cl1 | 888 | H10C5N1F1 | 923 | N1C6H6F1 |
| 820 | F2H1 | 854 | C3N2H10O3 | 889 | O1H5C6F1 | 924 | C2O1H4 |
| 821 | Cl1N1H3 | 855 | C3N1H10O4Cl1 | 890 | O1Cl1C6H5 | 925 | N1C7H9 |
| 822 | Cl1O1H2 | 856 | C2N1H8Cl1 | 891 | C3H6F2 | 926 | C4O1H10 |
| 823 | C11F1H1 | 857 | C2N2H8O3 | 892 | H8C5 | 927 | C7O4N2H6 |
| 824 | Cl1S1H2 | 858 | C2N1H8O4Cl1 | 893 | C4H8F2 | 928 | H4C6F2 |
| 825 | C12H1 | 859 | C3N1H11O3S1 | 894 | H4F2C6 | 929 | H3C4F1N2 |
| 826 | O1H4N1 | 860 | C3N1H8O3S1F3 | 895 | H6C4O1 | 930 | H9C5O1F1 |
| 827 | O2H3 | 861 | Cl1C5H10N1 | 896 | C5N1H5 | 931 | H11C5N1 |
| 828 | N4H3 | 862 | C5N2H12 | 897 | N2C5O1H12 | 932 | C4H6 |
| 829 | N3O1H2 | 863 | C3H7F1 | 898 | Cl1C5H9O1 | 933 | N2C7O1H6 |
| 830 | N3F1H1 | 864 | N1C6H6F1 | 899 | H4C5Cl1N1 | 934 | H8N1C4Cl1O1 |
| 831 | N3S1H2 | 865 | H4C3N2 | 900 | C8O5N4H12 | 935 | N5C11H11 |
| 832 | S1H4N1 | 866 | C2H6 | 901 | H8N1C4F1O1 | 936 | C4H7F3 |


| 937 | H4C4O1 | 975 | H4C5F1N1 | 1010 | H3C4Cl1N2 | 1045 | Si1O4H12C3 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 938 | H3C4Cl1O1 | 976 | O2C2H4 | 1011 | C4N2H6 | 1046 | Si1O4H10C3 |
| 939 | F1O2H3C2 | 977 | H6N2C7 | 1012 | H8N1F1C4O1 | 1047 | Si1O4H8C3 |
| 940 | C3O1H8 | 978 | H2C2 | 1013 | C3H6F2 | 1048 | Si1O4H7N1 |
| 941 | C4H10 | 979 | N1H3 | 1014 | O1C2H6 | 1049 | SilO4H8N1 |
| 943 | H4C4F1N1 | 980 | H8C3O1 | 1015 | H7C7O1N1 | 1050 | Si1O4H9N1C1 |
| 944 | H4F1C5N1 | 981 | N1C8H11 | 1016 | H4C4F1N1 | 1051 | Si1O4H10N1C1 |
| 945 | C15N2O2H12 | 982 | H5C2N1O2 | 1017 | H10C5N1Cl1 | 1052 | SilO4H16N1C4 |
| 946 | H10C5Cl1N1 | 984 | H11C9O1N1 | 1018 | C2O1H6 | 1053 | Si1O4H4Ne1 |
| 947 | Cl1C1H4N1 | 985 | C5O1N1H11 | 1019 | C7F3H5 | 1054 | Si1O4H4Ar1 |
| 949 | H4C5F1N1 | 986 | O1C6H6 | 1020 | F1H3C4N2 | 1055 | Si1O5H5 |
| 950 | C7H11F3 | 987 | Cl1H3C4N2 | 1021 | H9C4N1O2 | 1056 | Si1O4H7C1 |
| 951 | H4C4Cl1N1 | 988 | O1F1C6H5 | 1022 | N1C6H6Cl1 | 1057 | Si1O4H3N2 |
| 952 | H13C5N1 | 989 | H4Cl1C5N1 | 1023 | C2N1H7 | 1058 | Si1O4H5 |
| 953 | H5C3O1F1 | 990 | O3N2C6H6 | 1024 | C4H9F1 | 1059 | Si1O4H9C6 |
| 954 | C4N2H4 | 991 | H11C9N1O1 | 1025 | H5C2N1 | 1060 | Si1O5H7C1 |
| 955 | H9C4O1N1 | 992 | H3C4F1O1 | 1026 | H3Cl1C4N2 | 1061 | Si1O4H9C2 |
| 956 | C5N3O1H5 | 993 | C6N1O2H5 | 1027 | C2H4 | 1062 | Si1O4H7C2 |
| 957 | H6C3O2 | 994 | C 3 N 1 H 7 O 2 | 1029 | H10C5F1N1 | 1063 | SilO4H5C2 |
| 958 | C2H4F2 | 995 | H9C5O1Cl1 | 1030 | H6C2N1Cl1 | 1064 | Si1O4H11C3 |
| 959 | N2C3O1H8 | 996 | H4C4Cl1N1 | 1031 | C3N1O4H5 | 1065 | Si1O4H9C3 |
| 960 | O2C4N2H4 | 997 | H4F2C6 | 1032 | F1C6H11 | 1066 | Si1O4H7C3 |
| 961 | H3C4F1O1 | 998 | F1C2H6N1 | 1033 | C1N1H5 | 1067 | SilO4H6N1 |
| 962 | C6H12 | 999 | H9C8O1N1 | 1034 | C4N1H5 | 1068 | Si1O4H7N1 |
| 963 | C5H7N1 | 1000 | C2O2H4 | 1035 | Si1O5H6 | 1069 | Si1O4H8N1C1 |
| 964 | Cl1O2H3C2 | 1001 | N1C6H6Cl1 | 1036 | SilO6H4C1 | 1070 | SilO4H9N1C1 |
| 966 | C4O1H10 | 1002 | C6N1H13 | 1037 | Si1O4H8C1 | 1071 | Si1O4H15N1C4 |
| 967 | C6N2O2H6 | 1003 | C2H5F1 | 1038 | SilO4H4N2 | 1072 | Si1O4H3Ne1 |
| 968 | F1C5H9O1 | 1004 | H4C5Cl1N1 | 1039 | Si1O4H6 | 1073 | SilO4H3Ar1 |
| 969 | O1H5C6F1 | 1005 | H4C2O1 | 1040 | Si1O4H10C6 | 1074 | Al1O5H6 |
| 971 | C3H7F1 | 1006 | C4H10 | 1041 | Si1O5H8C1 | 1075 | AllO6H4C1 |
| 972 | F1C5H10N1 | 1007 | C2N1H7 | 1042 | Si1O4H10C2 | 1076 | AllO4H8C1 |
| 973 | C3N1H9 | 1008 | H8N1Cl1C4O1 | 1043 | SilO4H8C2 | 1077 | AllO4H4N2 |
| 974 | H10C5O1 | 1009 | O6C6N1H9 | 1044 | Si1O4H6C2 | 1078 | Al1O4H6 |


| 1079 | Al1O4H10C6 | 1113 | P1O4H3Ar1 | 1147 | Si2O7H9N1 | 1176 | Si1P1O7H5N2 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1080 | Al1O5H8C1 | 1114 | Si2O8H8 | 1148 | Si2O7H10N1C1 | 1177 | SilP1O7H7 |
| 1081 | Al1O4H10C2 | 1115 | Si2O9H6C1 | 1149 | Si2O7H11N1C1 | 1178 | Si1P1O7H11C6 |
| 1082 | Al1O4H8C2 | 1116 | Si2O7H10C1 | 1150 | Si2O7H17N1C4 | 1179 | SilP1O8H9C1 |
| 1083 | Al1O4H6C2 | 1117 | Si2O7H6N2 | 1151 | Si2O7H5Ne1 | 1180 | Si1P1O7H11C2 |
| 1084 | Al1O4H12C3 | 1118 | Si2O7H8 | 1152 | Si2O7H5Ar1 | 1181 | Si1P1O7H9C2 |
| 1085 | Al1O4H10C3 | 1119 | Si2O7H12C6 | 1153 | Si1Al1O8H8 | 1182 | SilP1O7H7C2 |
| 1086 | Al1O4H8C3 | 1120 | Si2O8H10C1 | 1154 | Si1Al1O9H6C1 | 1183 | Si1P1O7H13C3 |
| 1087 | Al1O4H7N1 | 1121 | Si2O7H12C2 | 1155 | Si1Al1O7H10C1 | 1184 | Si1P1O7H11C3 |
| 1088 | AllO4H8N1 | 1122 | Si2O7H10C2 | 1156 | Si1Al1O7H6N2 | 1185 | Si1P1O7H9C3 |
| 1089 | AllO4H9N1C1 | 1123 | Si2O7H8C2 | 1157 | Si1Al1O7H8 | 1186 | SilP1O7H8N1 |
| 1090 | Al1O4H10N1C1 | 1124 | Si2O7H14C3 | 1158 | Si1Al1O7H12C6 | 1187 | SilP1O7H9N1 |
| 1091 | AllO4H16N1C4 | 1125 | Si2O7H12C3 | 1159 | Si1Al1O8H10C1 | 1188 | SilP1O7H10N1C1 |
| 1092 | AllO4H4Ne1 | 1126 | Si2O7H10C3 | 1160 | Si1Al1O7H12C2 | 1189 | SilP1O7H11N1C1 |
| 1093 | Al1O4H4Ar1 | 1127 | Si2O7H9N1 | 1161 | Si1Al1O7H10C2 | 1190 | SilP1O7H17N1C4 |
| 1094 | P105H5 | 1128 | Si2O7H10N1 | 1162 | Si1Al1O7H8C2 | 1191 | SilP1O7H5Ne1 |
| 1095 | P1O6H3C1 | 1129 | Si2O7H11N1C1 | 1163 | Si1Al1O7H14C3 | 1192 | SilP1O7H5Ar1 |
| 1096 | P1O4H7C1 | 1130 | Si2O7H12N1C1 | 1164 | Si1Al1O7H12C3 | 1193 | SilP1O8H6 |
| 1097 | P1O4H3N2 | 1131 | Si2O7H18N1C4 | 1165 | Si1Al1O7H10C3 | 1194 | SilP1O9H4C1 |
| 1098 | P1O4H5 | 1132 | Si2O7H6Ne1 | 1166 | Si1Al1O7H9N1 | 1195 | SilP1O7H8C1 |
| 1099 | P1O4H9C6 | 1133 | Si2O7H6Ar1 | 1167 | Si1AllO7H10N1 | 1196 | Si1P1O7H4N2 |
| 1100 | P105H7C1 | 1134 | Si2O8H7 | 1168 |  | 1197 | Si1P1O7H6 |
| 1101 | P1O4H9C2 | 1135 | Si2O7H9C1 | 1 | Si1Al1O7H11N1C | 1198 | Si1P1O7H10C6 |
| 1102 | P104H7C2 | 1136 | Si2O7H5N2 | 1169 |  | 1199 | Si1P1O8H8C1 |
| 1103 | P1O4H5C2 | 1137 | Si2O7H7 |  | Si1Al1O7H12N1C | 1200 | SilP1O7H10C2 |
| 1104 | P1O4H11C3 | 1138 | Si2O7H11C6 | 1 |  | 1201 | Si1P1O7H8C2 |
| 1105 | P1O4H9C3 | 1139 | Si2O8H9C1 | 1170 | Si1Al1O7H18N1C | 1202 | SilP1O7H6C2 |
| 1106 | P104H7C3 | 1140 | Si2O7H11C2 | 4 |  | 1203 | SilP1O7H12C3 |
| 1107 | P1O4H6N1 | 1141 | Si2O7H9C2 | 1171 | Si1Al1O7H6Ne1 | 1204 | SilP1O7H10C3 |
| 1108 | P1O4H7N1 | 1142 | Si2O7H7C2 | 1172 | Si1Al1O7H6Ar1 | 1205 | Si1P1O7H8C3 |
| 1109 | P1O4H8N1C1 | 1143 | Si2O7H13C3 | 1173 | SilP1O8H7 | 1206 | SilP1O7H7N1 |
| 1110 | P1O4H9N1C1 | 1144 | Si2O7H11C3 | 1174 | SilP1O9H5C1 | 1207 | SilP1O7H9N1C1 |
| 1111 | P1O4H15N1C4 | 1145 | Si2O7H9C3 | 1175 | Si1P1O7H9C1 | 1208 | SilP1O7H10N1C1 |
| 1112 | P1O4H3Ne1 | 1146 | Si2O7H8N1 |  |  | 1209 | SilP1O7H16N1C4 |


| 1210 | Si1P1O7H4Ne1 | 1244 | SilO4C4H10 | 1278 | h7si1 | 1312 | p1h4f2al1 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1211 | SilP1O7H4Ar1 | 1245 | Si1O4C1H9N1 | 1279 | h5lilc2 | 1313 | h5b1f1li1 |
| 1212 | P1Al108H7 | 1246 | SilO4C1H10N1 | 1280 | h4be1allblfı | 1314 | s1c1h4cl1al1 |
| 1213 | P1Al1O9H5C1 | 1247 | Si1O4C2H11N1 | 1281 | h502na1 | 1315 | h7al1 |
| 1214 | P1Al1O7H9C1 | 1248 | SilO4C2H12N1 | 1282 | h7be1 | 1316 | h6na1b1 |
| 1215 | P1Al1O7H5N2 | 1249 | SilO4C5H18N1 | 1283 | h7b1 | 1317 | h4b1nalbe1si1 |
| 1216 | P1Al1O7H7 | 1250 | SilO4C1H6Ne1 | 1284 | h6belp1 | 1318 | h6lilp1 |
| 1217 | P1A11O7H11C6 | 1251 | SilO4C1H6Ar1 | 1285 | li2h5ol | 1319 | o1h5c1al1 |
| 1218 | P1Al1O8H9C1 | 1252 | Si1O4C1H8 | 1286 | h6olbe1 | 1320 | h6be1s1 |
| 1219 | P1AllO7H11C2 | 1253 | Si1O5C2H6 | 1287 | h6lilb1 | 1321 | h6cl1al1 |
| 1220 | P1Al1O7H9C2 | 1254 | Si1O3C2H10 | 1288 | h5s1cllbe1 | 1322 | h5n1f1li1 |
| 1221 | P1Al1O7H7C2 | 1255 | Si1O3C1H6N2 | 1289 | h6mg1si1 | 1323 | s1h5blc1 |
| 1222 | P1AllO7H13C3 | 1256 | Si1O3C1H8 | 1290 | h5mg1p1b1 | 1324 | h5clolb1 |
| 1223 | P1Al1O7H11C3 | 1257 | SilO3C7H12 | 1291 | h5li1fıb1 | 1325 | h5n1be2 |
| 1224 | P1Al1O7H9C3 | 1258 | Si1O4C2H10 | 1292 | h3c2sıflbe1 | 1326 | cl1h4f1mg1s1 |
| 1225 | P1Al1O7H8N1 | 1259 | Si1O3C3H12 | 1293 | h6p1o1 | 1327 | lilh6f1 |
| 1226 | P1AllO7H9N1 | 1260 | Si1O3C3H10 | 1294 | li2h5b1 | 1328 | b1h6na1 |
| 1227 | P1Al1O7H10N1C1 | 1261 | Si1O3C3H8 | 1295 | b1h5s1be1 | 1329 | h5li 1 l 2 |
| 1228 | P1Al1O7H11N1C1 | 1262 | SilO3C4H14 | 1296 | h6s 1 n 1 | 1330 | h7cl1 |
| 1229 | P1AllO7H17N1C | 1263 | SilO3C4H12 | 1297 | h5b1n2 | 1331 | h5b1n1f1 |
| 1230 | P1AllO7H5Ne1 | 1264 | Si1O3C4H10 | 1298 | h6c1si1 | 1332 | h6be1s1 |
| 1231 | P1Al1O7H5Ar1 | 1265 | SilO3C1H9N1 | 1299 | h5blolf1 | 1333 | h7na1 |
| 1232 | Si1O5C1H8 | 1266 | SilO3C1H10N1 | 1300 | c1mg1h4flol | 1334 | h4s1mg1f1al1 |
| 1233 | Si1O6C2H6 | 1267 | SilO3C2H11N1 | 1301 | n1be1h6 | 1335 | h5c1si1n1 |
| 1234 | Si1O4C2H10 | 1268 | SilO3C2H12N1 | 1302 | h6f1b1 | 1336 | h601mg1 |
| 1235 | SilO4C1H6N2 | 1269 | SilO3C5H18N1 | 1303 | h2silli2n1al1ol | 1337 | h6alln1 |
| 1236 | Si1O4C1H8 | 1270 | Si1O3C1H6Ne1 | 1304 | h5b1f1cl1 | 1338 | n1h5b1al1 |
| 1237 | SilO4C7H12 | 1271 | SilO3C1H6Ar1 | 1305 | h5li1f1c1 | 1339 | h6b1n1 |
| 1238 | SilO5C2H10 | 1272 | h6c1ol | 1306 | h4b1c1mg1li1 | 1340 | h6n1f1 |
| 1239 | SilO4C3H12 | 1273 | h5olpln 1 | 1307 | h5lilna1c1 | 1341 | h5belflc 1 |
| 1240 | Si1O4C3H10 | 1274 | n1li1b2h3c1 | 1308 | silh5c1mg1 | 1342 | h5al1c1o1 |
| 1241 | Si1O4C3H8 | 1275 | h6s1be1 | 1309 | h4c1olbe1n1 | 1343 | h5na1o1si1 |
| 1242 | SilO4C4H14 | 1276 | be1h5n1cl1 | 1310 | h4p1b1c1cl1 | 1344 | clh5blbe 1 |
| 1243 | SilO4C4H12 | 1277 | h4allb1be1n1 | 1311 | be2liln2h2cl1 | 1345 | li1si1be 1 b2h3 |


| 1346 | h4n1f1c1o1 | 1380 | h6n2 | 1414 | h5c2n1 | 1448 | si1h4 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1347 | h6li1b1 | 1381 | c3h4mg1 | 1415 | h5al1cl1p1 | 1449 | p2 |
| 1348 | h4f1n2b1 | 1382 | n1c3h4 | 1416 | b2h3c2p1 | 1450 | s2 |
| 1349 | olal1h5be1 | 1383 | h3c3o1p1 | 1417 | h4c2na1al1 | 1451 | cl2 |
| 1350 | h7f1 | 1384 | h3mg1c2o1li1 | 1418 | h5c1si1f1 | 1452 | C9Br1H14N1 |
| 1351 | h4be1c1b1li1 | 1385 | alln1h5c1 | 1419 | c2s1h3b1si1 | 1453 | Cl1H5O1C1 |
| 1352 | h6li1p1 | 1386 | o1h5n1c1 | 1420 | c1h5n1s1 | 1454 | H6C7I1F3 |
| 1353 | n1h5c2 | 1387 | p1h4olallf1 | 1421 | n1al1c2h4 | 1455 | C2F3H5 |
| 1354 | c3f1h3li1 | 1388 | c2f1h5 | 1422 | c2h5n1 | 1456 | C9H11Cl1O1 |
| 1355 | h6c2 | 1389 | h5al1o2 | 1423 | c1h5n1o1 | 1457 | C2I1F3O1H2 |
| 1356 | h5c2ol | 1390 | h5f1o1p1 | 1424 | si1cl2o1h4 | 1458 | C2Br1F3O1H2 |
| 1357 | h7b1 | 1391 | h6s1li1 | 1425 | h3c3f1si1 | 1459 | Cl1H6N1C1 |
| 1358 | h4mg1c1b1al1 | 1392 | h5c2al1 | 1426 | al2li1h3c2 | 1460 | H6C7Br1F3 |
| 1359 | c3h3n1s1 | 1393 | p1h3c1o2si1 | 1427 | h5si2cl1 | 1461 | C1Cl2H4 |
| 1360 | h4n1c2b1 | 1394 | h6c1n1 | 1428 | h4c4 | 1462 | C2Cl1H7 |
| 1361 | h7c1 | 1395 | c2si1p1h4 | 1429 | c2h4silo1 | 1463 | C1I2H4 |
| 1362 | c1h4b1o2 | 1396 | li1h4c1cl1s1 | 1430 | h5mg1p1o1 | 1464 | F6C12H6 |
| 1363 | h6c1mg1 | 1397 | h5o1b1c1 | 1431 | h5cl2p1 | 1465 | C1H4F2 |
| 1364 | h5p1si1n1 | 1398 | si1h6c1 | 1432 | h5n2cl1 | 1466 | C7Br1H9S1 |
| 1365 | c1s1h5ol | 1399 | p1c1h5mg1 | 1433 | h6c1si1 | 1467 | O2H3C1F3 |
| 1366 | p1h3c3mg1 | 1400 | c5h2ol | 1434 | o1c2s1h4 | 1468 | C9H11Br1O1 |
| 1367 | h5c2p1 | 1401 | h4s1c2si1 | 1435 | c1h5oln1 | 1469 | C9Cl1H14N1 |
| 1368 | h5s1c2 | 1402 | h5c2p1 | 1436 | c3h3o1li1 | 1470 | C2Cl2H6 |
| 1369 | s1h6ol | 1403 | c2f1h4b1 | 1437 | h2 | 1471 | H7O1C2Cl1 |
| 1370 | h6c1o1 | 1404 | h6p1f1 | 1438 | li1h1 | 1472 | C2F2H6 |
| 1371 | h5c2b1 | 1405 | n 2 c 1 silh 4 | 1439 | be1h2 | 1473 | F3H9C12 |
| 1372 | h7o1 | 1406 | p1cl1n2h4 | 1440 | b1h3 | 1474 | C2Br1H5O1 |
| 1373 | h5c1mg1o1 | 1407 | h5o1c1b1 | 1441 | c1h4 | 1475 | H9C7I1 |
| 1374 | h4o1c2n1 | 1408 | h6c1sil | 1442 | n2 | 1476 | C2C11H5O1 |
| 1375 | c2h4si1li1 | 1409 | h6na1n1 | 1443 | o2 | 1477 | H7O1C2F1 |
| 1376 | c2h5n1 | 1410 | h5n1c2 | 1444 | f2 | 1478 | C1H4Br2 |
| 1377 | h4p1c2f1 | 1411 | h5o1b1c1 | 1445 | na1h1 | 1479 | H9C7Br1 |
| 1378 | h5c1n2 | 1412 | h6s1c1 | 1446 | mg1h2 | 1480 | C2Cl1F3O1H2 |
| 1379 | h4s1p1c1n1 | 1413 | h4o1s1c2 | 1447 | al1h3 | 1481 | C7I1H9S1 |


| 1482 | F1H6N1C1 | 1516 | N 2 C 10 H 10 | 1550 | C2H4O1 | 1584 | C2N1H8O1 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1483 | F1H5O1C1 | 1517 | N4H8C8O4 | 1551 | C4H6O2 | 1585 | C2N1H8O1 |
| 1484 | Br1H5O1C1 | 1518 | C11H11N1 | 1552 | C7H16O2 | 1586 | C2N1H8O1 |
| 1485 | C9I1H14N1 | 1519 | C10H10N2O2 | 1553 | C7H17O1N1 | 1587 | C2N1H8O1 |
| 1486 | I1H5O1C1 | 1520 | N3C9H9O2 | 1554 | C8H10O2 | 1588 | C2N1H8O1 |
| 1487 | C2I1H5O1 | 1521 | C8H10 | 1555 | C5H11O1N1 | 1589 | C2N1H8O1 |
| 1488 | C2F1H7 | 1522 | N2H8C6O2 | 1556 | N1C7H7 | 1590 | C2N2H11 |
| 1489 | C 2 Cl 3 H 5 | 1523 | N2H6C6O2 | 1557 | N2H10C6 | 1591 | C2N2H11 |
| 1490 | O 2 H 3 C 1 Cl 3 | 1524 | N1C7H9 | 1558 | C3O3H7 | 1592 | C2N2H11 |
| 1491 | C9H11I1O1 | 1525 | C10H24 | 1559 | C3O3H7 | 1593 | C2N2H11 |
| 1492 | O2H4 | 1526 | C10H24 | 1560 | C3O3H7 | 1594 | C2N2H11 |
| 1493 | O2H6C1 | 1527 | C10H24 | 1561 | C3O3H7 | 1595 | C2N2H11 |
| 1494 | O1H7N1C1 | 1528 | C10H22 | 1562 | C3O3H7 | 1596 | C2N2H11 |
| 1495 | O2H9C3N1 | 1529 | C10H20 | 1563 | C3O3H7 | 1597 | C2N2H11 |
| 1496 | O2H8C2 | 1530 | C11H16 | 1564 | C3O3H7 | 1598 | C2N1H10O1 |
| 1497 | O1H9C2N1 | 1531 | C11H18 | 1565 | C3O3H7 | 1599 | C2N1H10O1 |
| 1498 | O2H11C4N1 | 1532 | N2H16C9O2 | 1566 | C2O3H5 | 1600 | C2N1H10O1 |
| 1499 | O2H6C1 | 1533 | N2H14C9O2 | 1567 | C2O3H5 | 1601 | C2N1H10O1 |
| 1500 | N1H9C2O1 | 1534 | N2H16C9O2 | 1568 | C2O3H5 | 1602 | C2N1H10O1 |
| 1501 | N2H10C2 | 1535 | C7H16 | 1569 | C2O3H5 | 1603 | C2N1H10O1 |
| 1502 | N2H12C4O1 | 1536 | C7H14 | 1570 | C2O3H5 | 1604 | C2N1H10O1 |
| 1503 | N1H7C1O1 | 1537 | C8H19O1N1 | 1571 | C2O3H5 | 1605 | C2N1H10O1 |
| 1504 | C4H11O2N1 | 1538 | C12H12 | 1572 | C2O3H5 | 1606 | C1N1H8O1 |
| 1505 | C4H12O1N2 | 1539 | N2C10H10 | 1573 | C2O3H5 | 1607 | C1N1H8O1 |
| 1506 | C6H14O2N2 | 1540 | C11H11N1 | 1574 | C3O2H8N1 | 1608 | C1N1H8O1 |
| 1507 | C3H9O2N1 | 1541 | C8H8 | 1575 | C3O2H8N1 | 1609 | C1N1H8O1 |
| 1508 | N4H8C8O4 | 1542 | C4H4 | 1576 | C3O2H8N1 | 1610 | C1N1H8O1 |
| 1509 | O1H7N1C5 | 1543 | C8H10O2 | 1577 | C3O2H8N1 | 1611 | C1N1H8O1 |
| 1510 | O1H9C6N1 | 1544 | C8H11O1N1 | 1578 | C3O2H8N1 | 1612 | C1N1H8O1 |
| 1511 | C4O4H8 | 1545 | C6H8O1 | 1579 | C3O2H8N1 | 1613 | C1N1H8O1 |
| 1512 | C4O2N2H10 | 1546 | C7H10O1 | 1580 | C3O2H8N1 | 1614 | C2N3H8O1 |
| 1513 | C6O4H8N2 | 1547 | C7H11N1 | 1581 | C3O2H8N1 | 1615 | C2N3H8O1 |
| 1514 | C6O3N3H9 | 1548 | C9H13O1N1 | 1582 | C2N1H8O1 | 1616 | C2N3H8O1 |
| 1515 | C12H12 | 1549 | N 2 C 10 H 10 | 1583 | C2N1H8O1 | 1617 | C2N3H8O1 |


| 1618 | C2N3H8O1 | 1652 | C4N2H7O1 | 1686 | N1H3 | 1720 | C5H12O1 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1619 | C2N3H8O1 | 1653 | C4N2H7O1 | 1687 | C5H9CL1 | 1721 | C4H7N1 |
| 1620 | C2N3H8O1 | 1654 | C4N3H10 | 1688 | C4H9N1O2 | 1722 | C5O1H6 |
| 1621 | C2N3H8O1 | 1655 | C4N3H10 | 1689 | C4H8O2 | 1723 | C4O1H8 |
| 1622 | C2N4H11 | 1656 | C4N3H10 | 1690 | C1H4O1 | 1724 | C7H8 |
| 1623 | C2N4H11 | 1657 | C4N3H10 | 1691 | C6H12O2 | 1725 | C6H14 |
| 1624 | C2N4H11 | 1658 | C4N3H10 | 1692 | C6N1H7 | 1726 | C7O1N2H16 |
| 1625 | C2N4H11 | 1659 | C4N3H10 | 1693 | C7H14 | 1727 | C6H10 |
| 1626 | C2N4H11 | 1660 | C4N3H10 | 1694 | C6N1H9 | 1728 | C6H14 |
| 1627 | C2N4H11 | 1661 | C4N3H10 | 1695 | C7H10O1 | 1729 | C5H12O2 |
| 1628 | C2N4H11 | 1662 | C4N2H9O1 | 1696 | C7H14 | 1730 | C5H10 |
| 1629 | C2N4H11 | 1663 | C4N2H9O1 | 1697 | C6H12 | 1731 | C7H12 |
| 1630 | C2N3H10O1 | 1664 | C4N2H9O1 | 1698 | C5H9N1O1 | 1732 | C3H8S1 |
| 1631 | C2N3H10O1 | 1665 | C4N2H9O1 | 1699 | C7S1H10 | 1733 | C3H9N1 |
| 1632 | C2N3H10O1 | 1666 | C4N2H9O1 | 1700 | N1C5H11O1 | 1734 | C4H10S1O2 |
| 1633 | C2N3H10O1 | 1667 | C4N2H9O1 | 1701 | C4H10O2 | 1735 | C5N1H7 |
| 1634 | C2N3H10O1 | 1668 | C4N2H9O1 | 1702 | C4N2H6 | 1736 | C5H10 |
| 1635 | C2N3H10O1 | 1669 | C4N2H9O1 | 1703 | C5H8 | 1737 | C4H10O2 |
| 1636 | C2N3H10O1 | 1670 | C3N2H7O1 | 1704 | C6H10O2 | 1738 | C7H10 |
| 1637 | C2N3H10O1 | 1671 | C3N2H7O1 | 1705 | C1H2O1 | 1739 | C4H10S1O1 |
| 1638 | C1N3H8O1 | 1672 | C3N2H7O1 | 1706 | C5H12N2O1 | 1740 | C6O2H10 |
| 1639 | C1N3H8O1 | 1673 | C3N2H7O1 | 1707 | CL1H1 | 1741 | C6H12 |
| 1640 | C1N3H8O1 | 1674 | C3N2H7O1 | 1708 | C6H14 | 1742 | C1O1 |
| 1641 | C1N3H8O1 | 1675 | C3N2H7O1 | 1709 | C4O1H9N1 | 1743 | C7H4 |
| 1642 | C1N3H8O1 | 1676 | C3N2H7O1 | 1710 | C6H10O2 | 1744 | C6H14S2 |
| 1643 | C1N3H8O1 | 1677 | C3N2H7O1 | 1711 | C6H10O2 | 1745 | C5H10O2 |
| 1644 | C1N3H8O1 | 1678 | C6O1H12 | 1712 | C4H10S1 | 1746 | H2 |
| 1645 | C1N3H8O1 | 1679 | C4H11N1 | 1713 | C5H8O1 | 1747 | C1CL2O1 |
| 1646 | C4N2H7O1 | 1680 | N1H11C4 | 1714 | O2H2 | 1748 | C4N2H6 |
| 1647 | C4N2H7O1 | 1681 | C7H10 | 1715 | C6H9N1 | 1749 | C4H10O3S1 |
| 1648 | C4N2H7O1 | 1682 | S1H2 | 1716 | C1H1N1 | 1750 | C4O2H8 |
| 1649 | C4N2H7O1 | 1683 | C4H9O2N1 | 1717 | C1O2 | 1751 | C5H10O1 |
| 1650 | C4N2H7O1 | 1684 | CL2 | 1718 | C3O1H7N1 | 1752 | C7H4 |
| 1651 | C4N2H7O1 | 1685 | C5H8 | 1719 | C6O1H12 | 1753 | C4H7N1O1 |


| 1754 | C5H10 | 1783 | C17N8B1 | 1812 | B2C1N3O6H1 | 1841 | C9B1N8O16H1 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1755 | C9H20 | 1784 | C9N8O16B1 | 1813 | B2C1N3O6H1 | 1842 | C9B1N8O16H1 |
| 1756 | C4H10O2 | 1785 | C1B2H4 | 1814 | B2C1N3O6H1 | 1843 | C9B1N8O16H1 |
| 1757 | O1H2 | 1786 | C1B2F3H1 | 1815 | C5F5H1 | 1844 | C9B1N8O16H1 |
| 1758 | C9H20 | 1787 | B2C4N3H1 | 1816 | C10N5H1 | 1845 | C9B1N8O16H1 |
| 1759 | C3O2H6 | 1788 | B2C1N3O6H1 | 1817 | C5B1F6H1 | 1846 | C9B1N8O16H1 |
| 1760 | C6H14 | 1789 | C5H6 | 1818 | C5B1F6H1 | 1847 | C9H9B1 |
| 1761 | C7H12 | 1790 | C5F5H1 | 1819 | C11B1N6H1 | 1848 | C9H9B1 |
| 1762 | C5H8 | 1791 | C10N5H1 | 1820 | C11B1N6H1 | 1849 | C9H9B1 |
| 1763 | C5O1H10 | 1792 | C5N5O10H1 | 1821 | C11B1N6H1 | 1850 | C9F8B1H1 |
| 1764 | C2H4 | 1793 | C5H7B1 | 1822 | C11B1N6H1 | 1851 | C9F8B1H1 |
| 1765 | C1B2H3 | 1794 | C5B1F6H1 | 1823 | C5B1N6O12H1 | 1852 | C9F8B1H1 |
| 1766 | C1B2F3 | 1795 | C11B1N6H1 | 1824 | C5B1N6O12H1 | 1853 | C9F8B1H1 |
| 1767 | B2C4N3 | 1796 | C5B1N6O12H1 | 1825 | C5B1N6O12H1 | 1854 | C9F8B1H1 |
| 1768 | B2C1N3O6 | 1797 | C9H9B1 | 1826 | C5B1N6O12H1 | 1855 | C17N8B1H1 |
| 1769 | C5H5 | 1798 | C9B1F8H1 | 1827 | C9H9B1 | 1856 | C17N8B1H1 |
| 1770 | C5F5 | 1799 | C17B1N8H1 | 1828 | C9H9B1 | 1857 | C17N8B1H1 |
| 1771 | C10N5 | 1800 | C9B1N8O16H1 | 1829 | C9H9B1 | 1858 | C17N8B1H1 |
| 1772 | C5N5O10 | 1801 | C9H9B1 | 1830 | C9B1F8H1 | 1859 | C17N8B1H1 |
| 1773 | C5H6B1 | 1802 | C9F8B1H1 | 1831 | C9B1F8H1 | 1860 | C17N8B1H1 |
| 1774 | C5B1F6 | 1803 | C17N8B1H1 | 1832 | C9B1F8H1 | 1861 | C17N8B1H1 |
| 1775 | C11B1N6 | 1804 | C9N8O16B1H1 | 1833 | C9B1F8H1 | 1862 | C9N8O16B1H1 |
| 1776 | C5B1N6O12 | 1805 | C1B2H4 | 1834 | C9B1F8H1 | 1863 | C9N8O16B1H1 |
| 1777 | C9H8B1 | 1806 | C1B2F3H1 | 1835 | C9B1F8H1 | 1864 | C9N8O16B1H1 |
| 1778 | C8B1F8 | 1807 | C1B2F3H1 | 1836 | C17B1N8H1 | 1865 | C9N8O16B1H1 |
| 1779 | C17B1N8 | 1808 | B2C4N3H1 | 1837 | C17B1N8H1 | 1866 | C9N8O16B1H1 |
| 1780 | C9B1N8O16 | 1809 | B2C4N3H1 | 1838 | C17B1N8H1 |  |  |
| 1781 | C9H8B1 | 1810 | B2C4N3H1 | 1839 | C17B1N8H1 |  |  |
| 1782 | C9F8B1 | 1811 | B2C4N3H1 | 1840 | C17B1N8H1 |  |  |

## B. APPENDIX : Structure Figures

Molecular formulas in Appendix A is not meaningful at all for intermolecular interactions. The structures used in Chapter 4 generated with PyMol are provided in this section. The color legend for atoms can be found at https://pymolwiki.org/index.php/Color_Values
ABH21
$\bigcirc$









## IL16



Figure 26: m845



Figure 28: m847


Figure 29: m848



Figure 32: m851


Figure 35: m854


Figure 30: m849


Figure 33: m852


Figure 36: m855


Figure 31: m850





Figure 37: m856


Figure 38: m857



Figure 39: m858


Figure 40: m859

Figure 41: m860

## S66




Figure 44: m1494

Figure 43: m1493



Figure 46: m1496
Figure 47: m1497






Figure 51: m1501


Figure 54: m1504


Figure 57: m1507


Figure 52: m1502


Figure 55: m1505



Figure 58: m1508


Figure 53: m1503


Figure 56: m1506


Figure 59: m1509


Figure 60: m1510
Figure 61: m1511







Figure 62: m1512


Figure 63: m1513
Figure 64: m1514



Figure 68: m1518


Figure 69: m1519


Figure 72: m1522


Figure 75: m1525


Figure 70: m1520


Figure 73: m1523


Figure 76: m1526




Figure 77: m1527


Figure 78: m1528
Figure 79: m1529


Figure 80: m1530


Figure 83: m1533
Figure 82: m1532


Figure 85: m1535
Figure 86: m1536


Figure 87: m1537
\&

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Figure 90: m1540



Figure 93: m1543

Figure 88: m1538
Figure 89: m1539




Figure 92: m1542


Figure 95: m1545


Figure 96: m1546



Figure 99: m1549


Figure 102: m1552

Figure 97: m1547





Figure 98: m1548


Figure 101: m1551


Figure 104: m1554



Figure 106: m1556
Figure 105: m1555

ZG237



Figure 108: m1035
Figure 109: m1036

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Figure 111: m1038
Figure 112: m1039


Figure 107: m1557


Figure 110: m1037


Figure 113: m1040


Figure 114: m1041





Figure 117: m1044
Figure 118: m1045


Figure 121: m1048



Figure 116: m1043

Figure 119: m1046


Figure 122: m1049



Figure 123: m1050


Figure 126: m1053



Figure 129: m1056

Figure 124: m1051
Figure 125: m1052


Figure 128: m1055

Figure 127: m1054


Figure 130: m1057


Figure 131: m1058





Figure 133: m1060
Figure 134: m1061


Figure 135: m1062
Figure 136: m1063
Figure 137: m1064







Figure 141: m1068



Figure 144: m1071


Figure 147: m1074


Figure 142: m1069
Figure 143: m1070


Figure 146: m1073


Figure 149: m1076


Figure 150: m1077


Figure 153: m1080


Figure 156: m1083


Figure 154: m1081


Figure 157: ml084


Figure 155: m1082



Figure 158: m1085


Figure 159: m1086



Figure 162: m1089


○

Figure 165: m1092


Figure 160: m1087


Figure 163: m1090


0


Figure 166: m1093


Figure 161: m1088


Figure 164: m1091



Figure 167: m1094






Figure 172: m1099


Figure 174: m1 101


Figure 173: m1 100


Figure 175: m1 102


Figure 176: m1103


Figure 177: ml 104


Figure 180: ml 107






Figure 182: ml 109


Figure 185: m1 112
o



Figure 186: m1113
Figure 187: m1 114


Figure 190: m1117
Figure 189: m1116


Figure 192: ml119


Figure 193: ml 120

Figure 188: m1115


Figure 191: m1 118


Figure 194: m1 121


Figure 195: ml 122


Figure 198: ml 125


Figure 201: m1 128


Figure 196: m1 123


Figure 199: m1 126


Figure 202: ml 129


Figure 197: ml 124


Figure 200: ml 127


Figure 203: ml 130


Figure 204: ml 131
Figure 205: m1 132



Figure 206: m1133


Figure 207: ml134


○○



Figure 211: m1 138


Figure 212: ml 139


Figure 213: m1 140

Figure 217: ml 144
Figure 218: m1 145


Figure 219: ml 146
Figure 216: ml 143



Figure 220: ml 147



Figure 221: ml 148

Figure 214: m1 141







Figure 222: ml 149


Figure 225: m1152


Figure 228: ml 155

Figure 223: m1 150


Figure 226: m1153


8

Figure 229: ml 156


Figure 227: ml 154


Figure 231: m1 158


Figure 234: m1 161


Figure 237: ml 164


Figure 232: m1 159


Figure 235: ml 162


Figure 238: ml 165


Figure 233: m1 160


Figure 236: ml 163


Figure 239: m1 166


Figure 240: m1 167


Figure 243: m1170


Figure 246: ml 173


Figure 241: m1 168

0


Figure 244: ml 171


Figure 247: ml 174


Figure 242: m1 169

0


Figure 245: ml 172


Figure 248: ml 175


Figure 249: ml176


Figure 252: ml 179


Figure 255: ml 182

Figure 253: ml 180
Figure 250: ml 177



Figure 256: ml 183

Figure 251: m1 178


Figure 254: ml 181


Figure 257: m1 184


Figure 258: m1185


Figure 261: m1188


Figure 264: ml 191


Figure 259: m1 186


Figure 262: m1 189


Figure 265: ml 192


Figure 260: m1 187


Figure 263: ml 190


Figure 266: m1 193



Figure 267: m1 194


Figure 270: ml 197


Figure 273: m1200

Figure 268: ml 195


Figure 271: m1 198


Figure 274: m1201


Figure 272: ml 199


Figure 275: m1202


Figure 276: m1203


Figure 279: m1206


Figure 282: m1209


Figure 277: m1204


Figure 280: m1207


Figure 283: m1210


Figure 278: m1205


Figure 281: m1208


Figure 284: m1211


Figure 285: m1212


Figure 288: m1215


Figure 291: m1218


6


Figure 286: m1213


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Figure 289: m1216


Figure 292: m1219




Figure 287: m1214


Figure 290: m1217


Figure 293: m1220


Figure 294: m1221


Figure 297: ml224


Figure 300: m1227


Figure 295: m1222


Figure 298: m1225


Figure 301: m1228


Figure 296: m1223


Figure 299: m1226


Figure 302: m1229



Figure 303: m1230


Figure 306: m1233


Figure 309: m1236



Figure 305: m1232


Figure 308: m1235


Figure 311: m1238


Figure 312: m1239


Figure 315: m1242


Figure 318: m1245


Figure 313: m1240
Figure 314: m1241


Figure 317: m1244



Figure 316: m1243


Figure 319: m1246


Figure 320: m1247



Figure 321: m1248
Figure 322: m1249



Figure 324: m1251
Figure 325: m1252
Figure 326: m1253



Figure 328: m1255



Figure 330: m1257


Figure 333: m1260


Figure 336: m1263


Figure 331: m1258


Figure 334: ml 261


Figure 337: ml264


Figure 332: m1259


Figure 335: m1262


Figure 338: m1265




Figure 339: m1266
Figure 340: m1267
Figure 341: m1268


Figure 342: m1269
Figure 343: m1270
Figure 344: m1271


[^0]:    ${ }^{2}$ https://seaborn.pydata.org/generated/seaborn.stripplot.html

