

## SUPPORT INFORMATION

### A Systematic Analysis of Atomic Protein-Ligand Interactions from the PDB

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## Computational Methods

In this study, we downloaded all protein-ligand complexes available in the PDB<sup>1</sup> (76056 PDB entries). They were extracted from a snapshot of PDB captured on September 25, 2016, and filtered using the following criteria: (i) crystal structures with resolution  $\leq 2.5$  Å, (ii) included at least one small ligand with a heavy atom count  $\geq 6$  and  $\leq 100$ , (iii) structures classified as DNA or RNA were eliminated, (iv) structures that do not contain a protein molecule, but only contain a DNA or RNA molecule complexed to a ligand were excluded, (v) we removed all ligands containing phosphorous in their structures (including nucleotides and nucleotide-like analogues) (vi) compounds of low interest for medicinal chemistry applications (such as buffers) were removed using the BioLiP list.<sup>2</sup> These selection criteria led to a set of 11,016 PDB entries. All the complexes were converted into ICM objects using Molsoft ICM suite.<sup>3</sup> In this step, alternative conformations/models molecules were removed, hydrogens were added and energy-minimized, water hydrogen rotameric state and protonation states were fixed, missing side chains in the protein were inserted, and partial charges and atom types were assigned.

We wrote an icm script to examine the environment of proteins-ligand contacts. In the first step, the script identifies all ligand and protein atoms that come within 4.0 Å

of each other. These close-contact atoms are then characterized according to their respective icm and mmff atom types. In the second step, for each ligand-protein atom pair, the respective ligand and protein atoms are expanded to include the atoms in question and their successive neighbors. In addition, the script also extracts the distance between the interacting atoms, their coordinates, as well as the coordinates for the neighboring atoms. Finally, each ligand-protein atom pair that had the same icm atom types were grouped together and saved as icm tables for further analysis.

Hydrophobic contacts were identified when a ligand carbon (or halogen) atom comes within 4.0 Å of a receptor carbon (or sulfur) atom. A hydrogen bond was identified if the hydrogen-bond donor was within 3.9 Å of the hydrogen-bond acceptor, and the angle formed between the donor, the hydrogen atom, and the acceptor,  $\theta$ , was larger than 90°. To account for the hydrogen bonds mediated by water between the protein and the ligand, the water were considered as part of the receptor and only the ones tightly bound (2-3 hydrogen bond coordination) were kept for analysis.

For weak hydrogen bonding, the distance and angle cutoffs were 3.6 Å and 130°, respectively. Potential salt bridges were detected when two atoms of opposite charges were in a contact distance below 4.0 Å. The same cutoff distance was applied to a positively charged nitrogen close to an aromatic carbon to identify potential cation- $\pi$  interactions. For interactions involving two aromatic rings (or an amide and a ring), the planar angle was calculated (Figure S1) as well as the angle between the two vectors normal to the planes ( $\theta$ ). An edge-to-face  $\pi$ - $\pi$  stacking interaction was detected if the angle  $\theta$  was between 60° and 120° ( $60^\circ \leq \theta \leq 120^\circ$ ). If  $\theta \leq 30^\circ$  or  $\geq 150^\circ$  the interaction was considered as a face-to-face  $\pi$ - $\pi$  stacking interaction. The same criteria were applied to the amide stacking interactions.

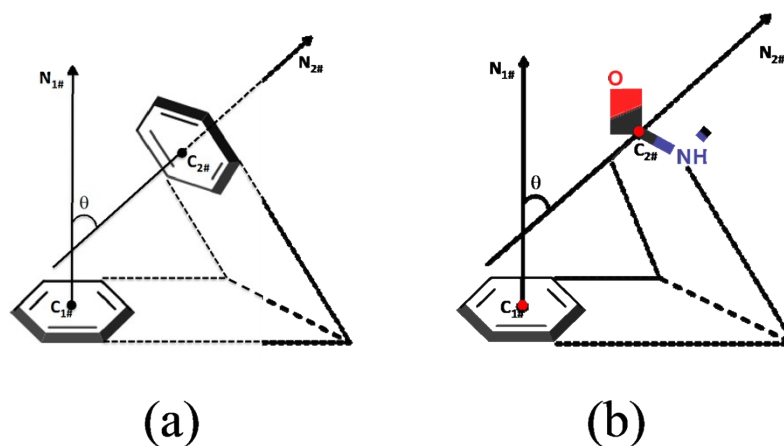


Figure S1. Distance and angles used to search for non-covalent interactions involving aromatic rings; a)  $\pi$ -stacking, b) amide stacking. The angle  $\theta$  is the planar angle between two rings or one ring and the amide bond.

For halogen bonding interactions we collected only those with  $X \cdots A$  distances that are less than their respective van der Waals radius sums plus 0.2 Å to account for the uncertainties in the distances (Figure S2a and Table S1 for the cutoff values) as well as with halogen bonding angles  $130^\circ \leq \alpha_1 \leq 180^\circ$   $90^\circ \leq \alpha_2 \leq 150^\circ$ . For multipolar halogen interactions, we also only considered the contacts that are less than their respective van der Waals radius sums plus 0.2 Å and the angles  $\Theta_1 \geq 140^\circ$  and  $70^\circ \leq \Theta_2 \leq 110^\circ$  (Figure S2b).

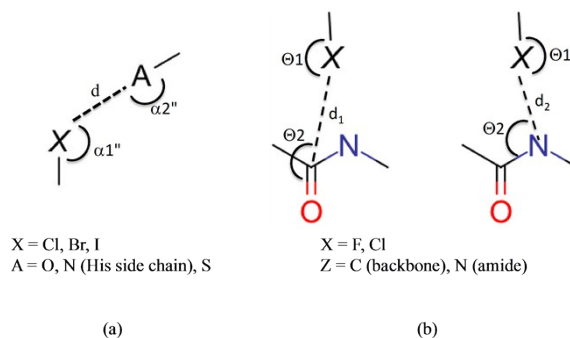


Figure S2. Distance and angles used to search for halogen bonding (a) and multipolar halogen interaction (b).

We used the fit quality (FQ) score to measure ligand efficiency of ligands with different sizes (10.1021/jm701255b)<sup>5</sup>

$$\text{FQ} = \text{LE}/\text{LE}_{\text{scale}}$$

$$\text{LE}_{\text{scale}} = 0.0715 + 7.5328/(\text{HA}) + 25.7079/(\text{HA}^2) - 361.4722/(\text{HA}^3)$$

## References

- (1) Berman, H. M. The Protein Data Bank. *Nucleic Acids Res.* **2000**, *28*, 235–242.
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- (3) Abagyan, R.; Totrov, M. Biased Probability Monte Carlo Conformational Searches and Electrostatic Calculations for Peptides and Proteins. *J. Mol. Biol.* **1994**, *235*, 983–1002.
- (4) Jubb, H. C.; Higuero, A. P.; Ochoa-Montano, B.; Pitt, W. R.; Ascher, D. B.; Blundell, T. L. Arpeggio: A Web Server for Calculating and Visualising Interatomic Interactions in Protein Structures. *J. Mol. Biol.* **2016**, *429*, 365–371.
- (5) Reynolds, C. H.; Tounge, B. A.; Bembek, S. D. Ligand Binding Efficiency: Trends, Physical Basis, and Implications. *J. Med. Chem.* **2008**, *51*, 2432–2438.

Table S2. Most frequent protein-ligand interactions extracted from PDB

Interaction	Protein Atom	Ligand Atom	Distance (Å)	Angle (°)	# Interactions
<i>Hydrophobic</i>					
aliphatic-aromatic	C ali	C aro	≤ 4.0		42443
aromatic-aliphatic	C aro	C ali	≤ 4.0		8899
aliphatic-aliphatic	C ali	C ali	≤ 4.0		8974
carbon-halogen	C	X	≤ 4.0		5147
sulfur-aromatic	S	C aro	≤ 4.0		1309
<i>Hydrogen bonding</i>					
O-H•••O	O neg	OH	≤ 3.9	≥ 90	4959
O-H•••O	OH	O neg	≤ 3.9	≥ 90	1221
O-H•••O	O	OH	≤ 3.9	≥ 90	1296
O-H•••O	OH	O	≤ 3.9	≥ 90	775
N-H•••O	NH	O	≤ 3.9	≥ 90	4872
N-H•••O	O	NH	≤ 3.9	≥ 90	2682
N-H•••O	NH	O neg	≤ 3.9	≥ 90	1441
N-H•••O	O neg	NH	≤ 3.9	≥ 90	1565
N-H•••O	NH pos	O	≤ 3.9	≥ 90	2904
N-H•••O	O	NH pos	≤ 3.9	≥ 90	1641
N-H•••N	NH	N	≤ 3.9	≥ 90	333
O•••WAT	Owat	O	≤ 3.9	≥ 90	3131
N•••WAT	Owat	N	≤ 3.9	≥ 90	1757
<i>□-Stacking</i>					
π-stacking (edge to face)	C aro	C aro	≤ 4.0	60 ≤ θ ≤ 120	8704
π-stacking (face to face)	C aro	C aro	≤ 4.0	≤ 30 or ≥ 150	8537
<i>Weak hydrogen bonding</i>					
C-H•••O	O	CH aro	≤ 3.6	≥ 130	4927
C-H•••O	CH aro	O	≤ 3.6	≥ 130	702
C-H•••O	CH ali	O	≤ 3.6	≥ 130	5316
C-H•••O	O	CH ali	≤ 3.6	≥ 130	2655
<i>Salt bridge</i>					
N•••O	N pos	O neg	≤ 4.0		4882
O•••N	O neg	N pos	≤ 4.0		2394
<i>Amide stacking</i>					
Amide stacking (face to face)	C (amide)	C aro	≤ 4.0	≤ 30 or ≥ 150	2907

Amide stacking (edge to face)	C (amide)	C aro	$\leq 4.0$	$60 \leq \theta \leq 120$	2060
<b>Cation-<math>\pi</math></b>					
N pos•••C aro	N pos	C aro	$\leq 4.0$		2338
N pos•••C aro	C aro	N pos	$\leq 4.0$		239
<b>Halogen bonding</b>					
Cl•••O	O	Cl	$\leq 3.47$	$130^\circ \leq \alpha_1 \leq 180^\circ$ $90^\circ \leq \alpha_2 \leq 150^\circ$	203
Cl•••N	N	Cl	$\leq 3.5$		1
Cl•••S	S	Cl	$\leq 3.75$		18
Br•••O	O	Br	$\leq 3.57$	$130^\circ \leq \alpha_1 \leq 180^\circ$ $90^\circ \leq \alpha_2 \leq 150^\circ$	86
Br•••N	N	Br	$\leq 3.6$		1
Br•••S	S	Br	$\leq 3.85$		4
I•••O	O	I	$\leq 3.7$	$130^\circ \leq \alpha_1 \leq 180^\circ$ $90^\circ \leq \alpha_2 \leq 150^\circ$	33
I•••N	N	I	$\leq 3.73$		0
I•••S	S	I	$\leq 3.98$		5
<b>Multipolar halogen interaction</b>					
F•••C	C (amide)	F	$\leq 3.37$	$\Theta_1 \geq 140^\circ$ $70^\circ \leq \Theta_2 \leq 110^\circ$	61
F•••N	N (amide)	F	$\leq 3.22$		48
Cl•••C	C (amide)	Cl	$\leq 3.65$	$\Theta_1 \geq 140^\circ$ $70^\circ \leq \Theta_2 \leq 110^\circ$	37
Cl•••N	N (amide)	Cl	$\leq 3.50$		28

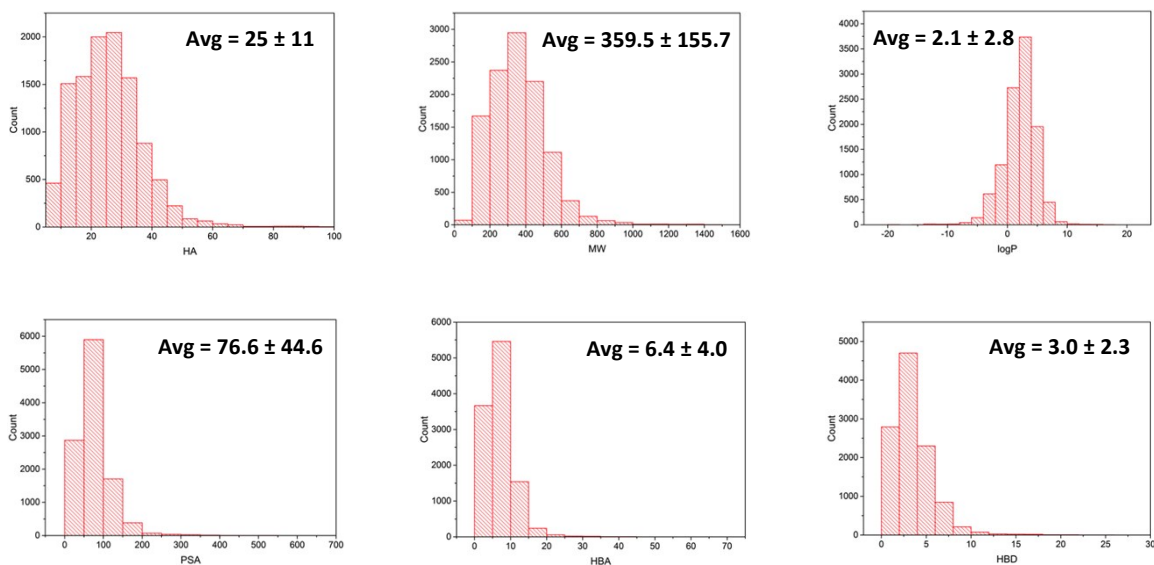


Figure S3. Selected molecular properties for the 11016 ligands in the database.

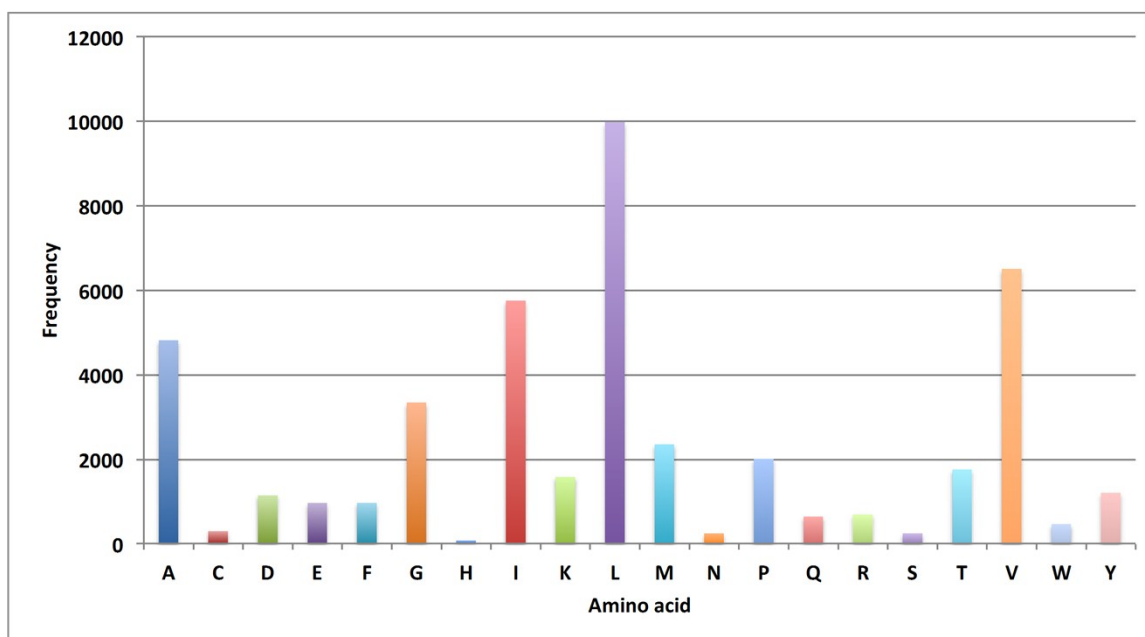


Figure S4. Frequency distribution of hydrophobic (aliphatic-aromatic) interactions with each amino acid.



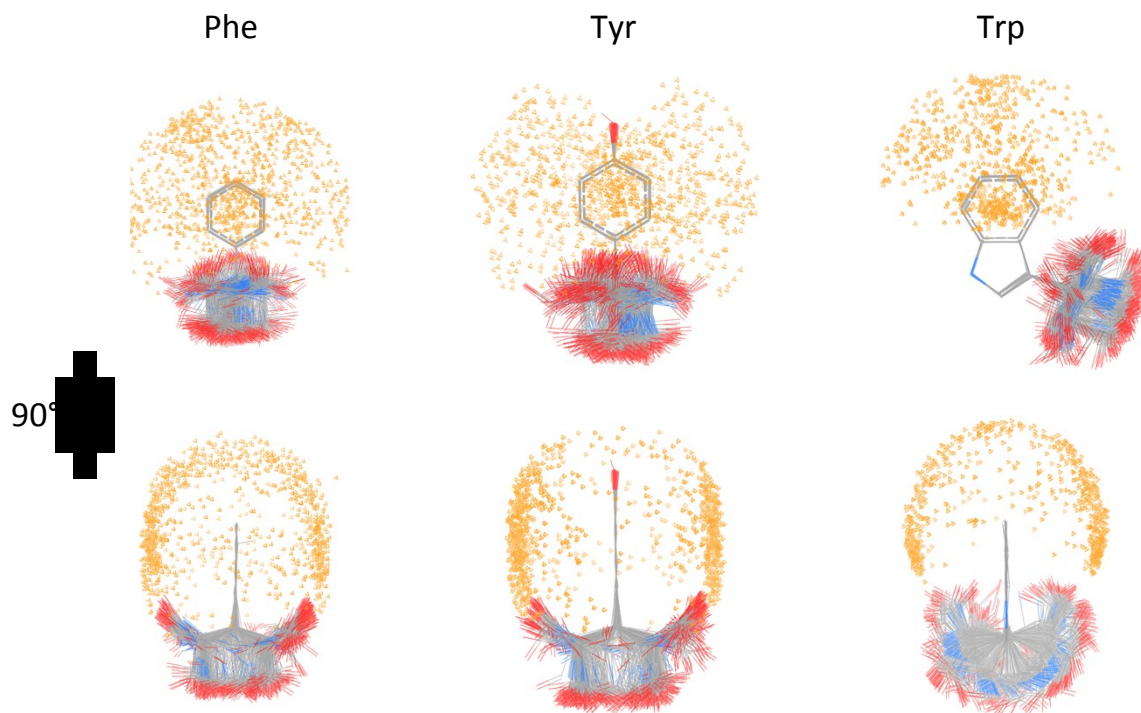


Figure S5. 3D scatter plot of the hydrophobic interactions involving an aromatic carbon from the receptor and an aliphatic carbon from the ligand.

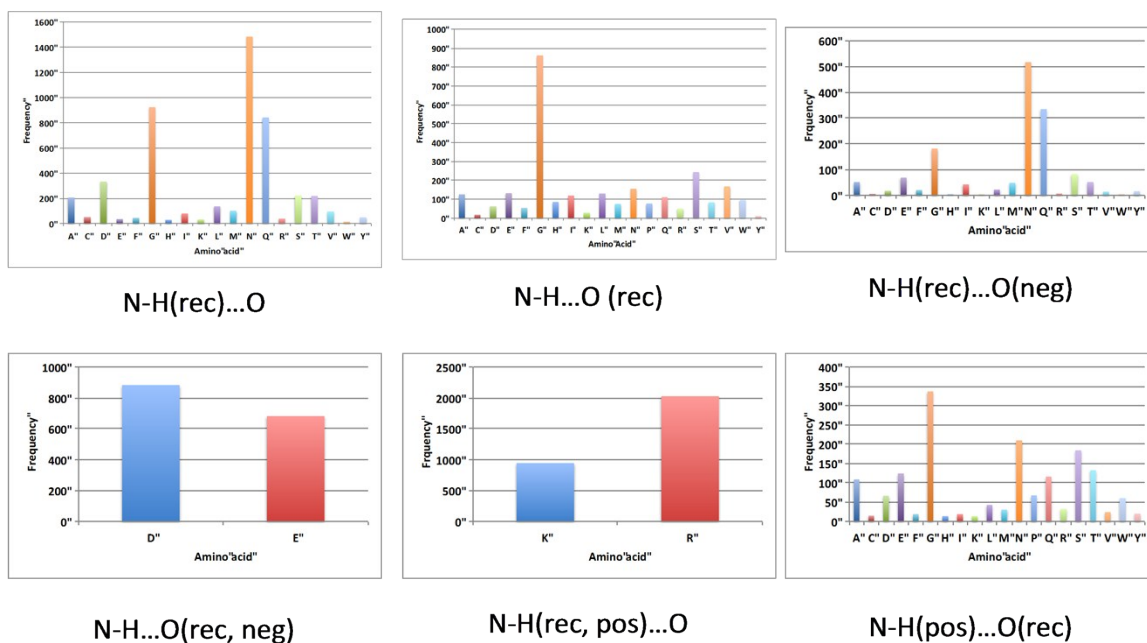
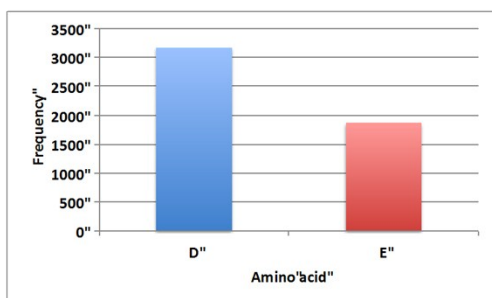
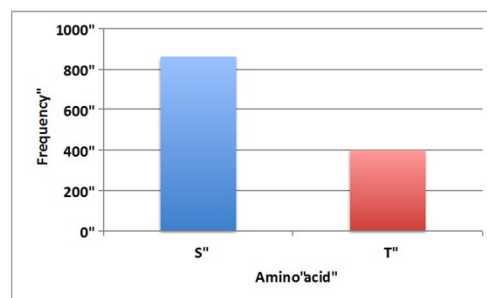


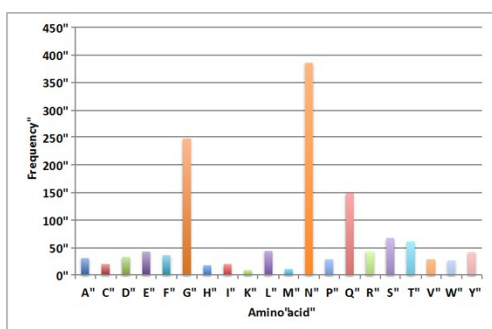
Figure S6. Frequency distribution of N-H...O interactions with each amino acid.



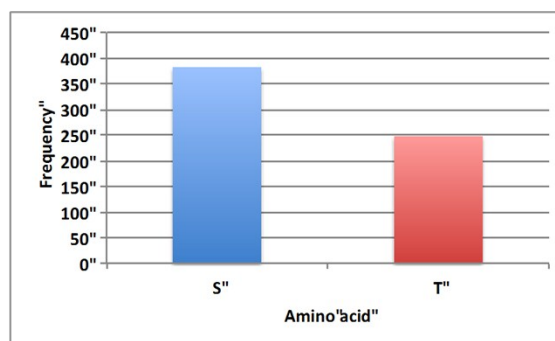
**O-H...O(rec, neg)**



**O-H(rec)...O(neg)**



**O(rec)...OH**



**O-H(rec)...O**

Figure S7. Distribution of the occurrence of the O-H...O interactions with each amino acid.

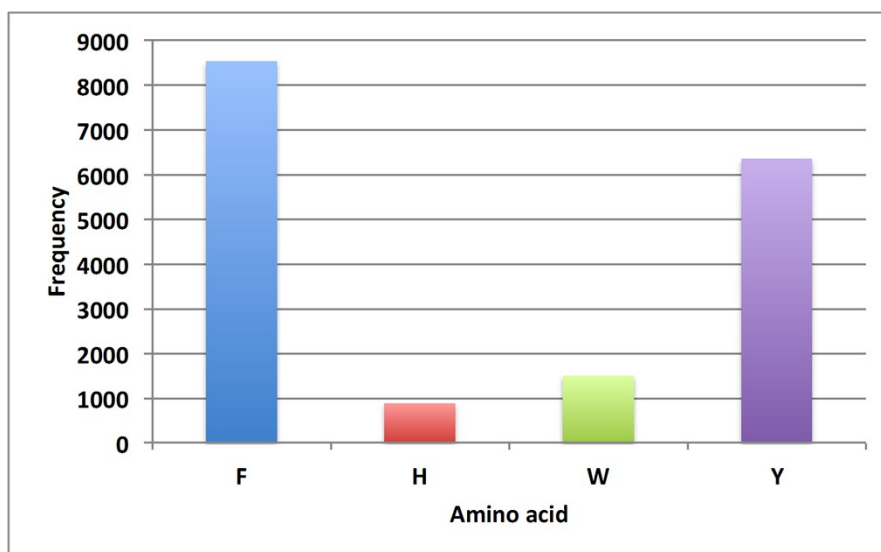
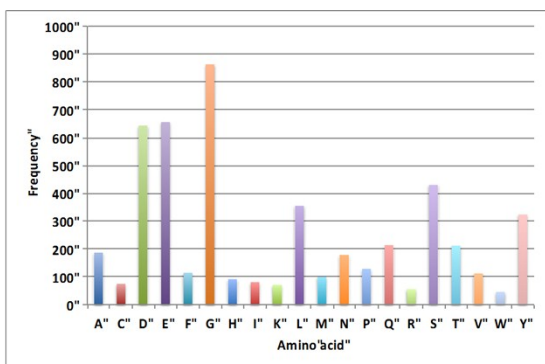
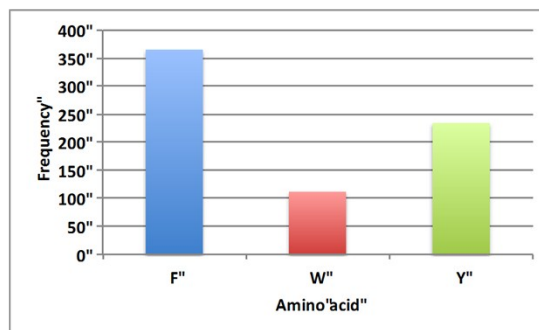


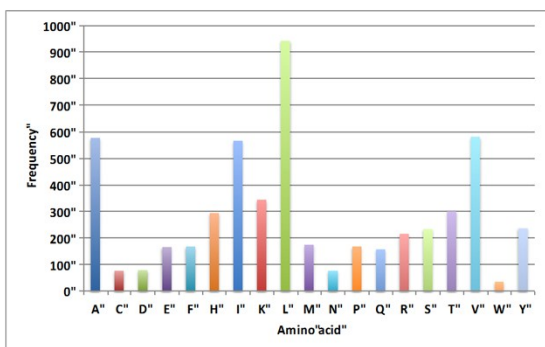
Figure S8. (a) Distribution of the occurrence of the  $\pi$ - $\pi$  stacking interactions with each amino acid.



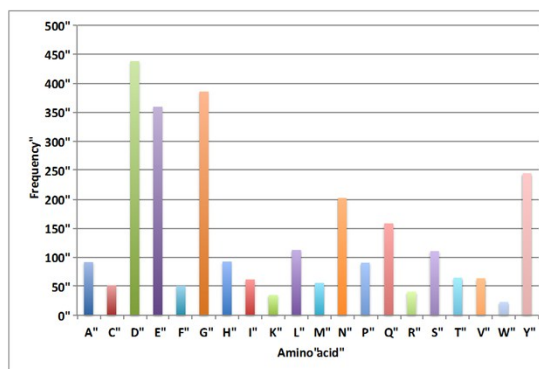
**C-H (aro)...O (rec)**



**C-H (aro/rec)...O**



**C-H (rec)...O**



**C-H (ali)...O(rec)**

Figure S9. Distribution of the occurrence of the C-H...O interactions with each amino acid

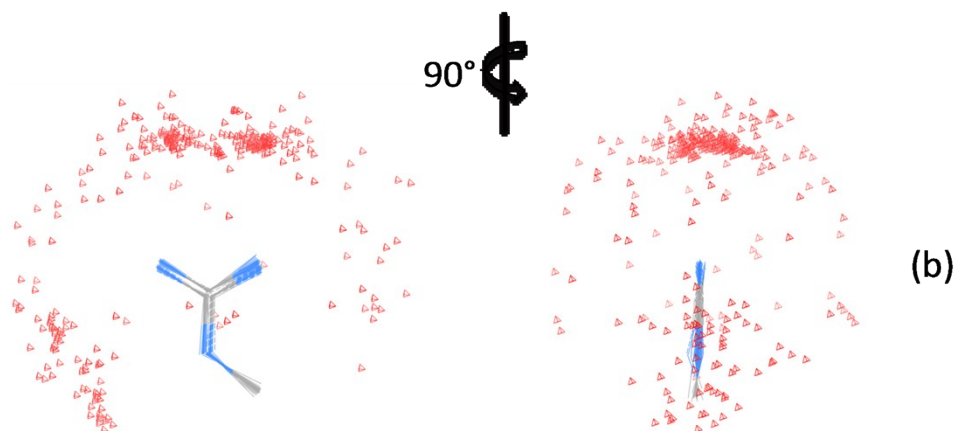
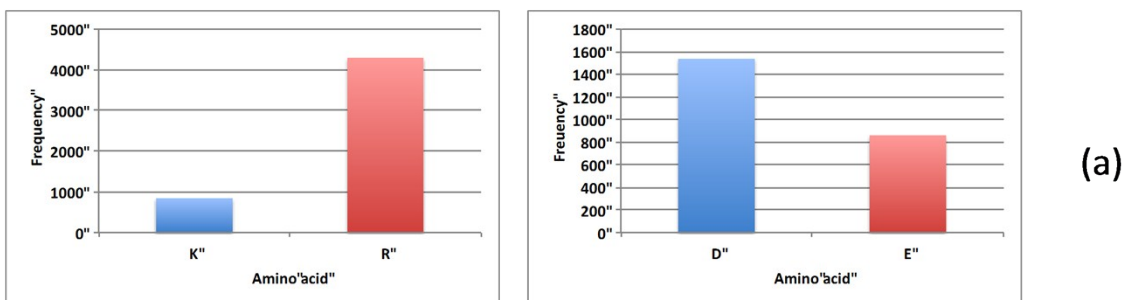


Figure S10. (a) Distribution of the occurrence of the salt bridge interactions with each amino acid; (b) 3D scatter plot of the salt bridge interactions.

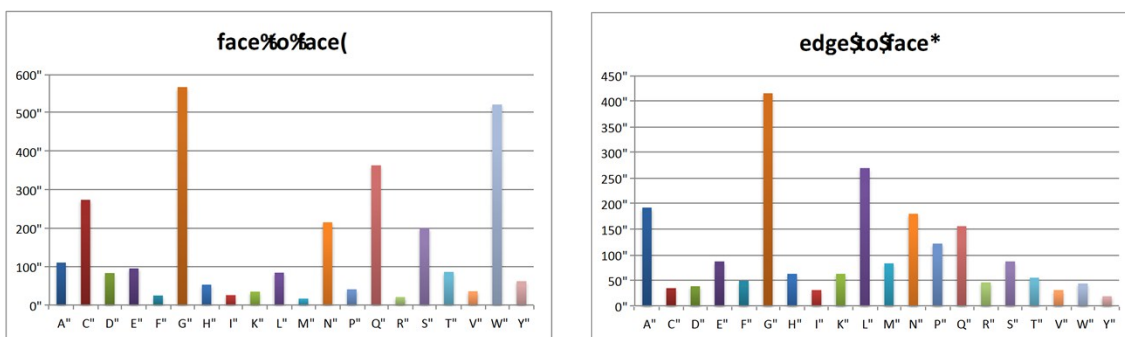


Figure S11. Distribution of the occurrence of the amide- $\pi$  stacking interactions with each amino acid.

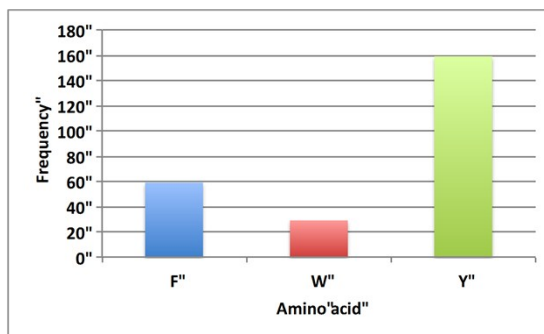
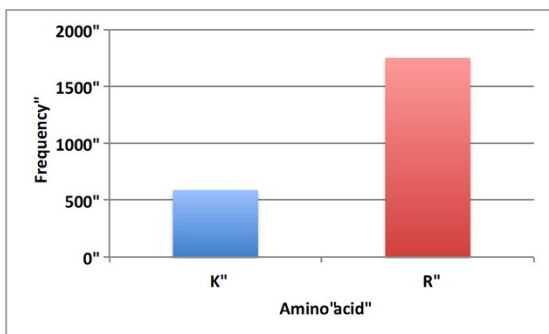


Figure S12. Distribution of the occurrence of the cation- $\pi$  stacking interactions with each amino acid

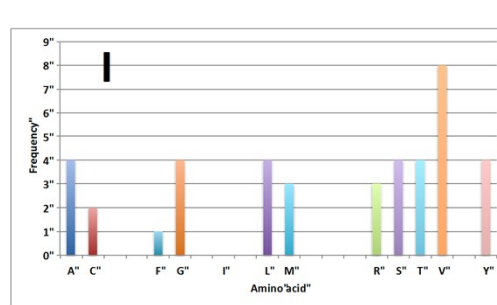
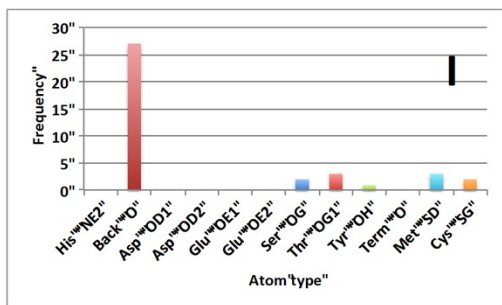
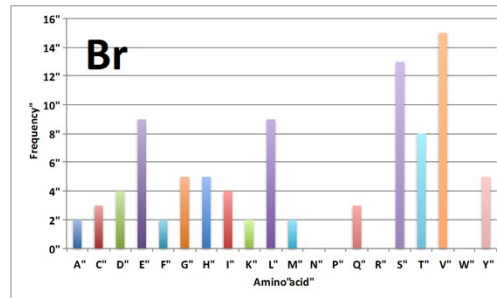
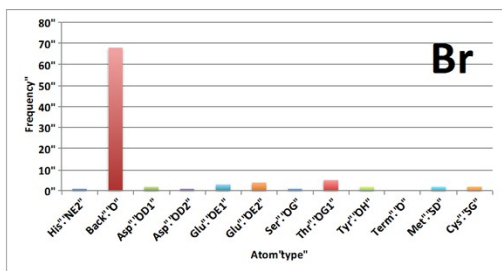
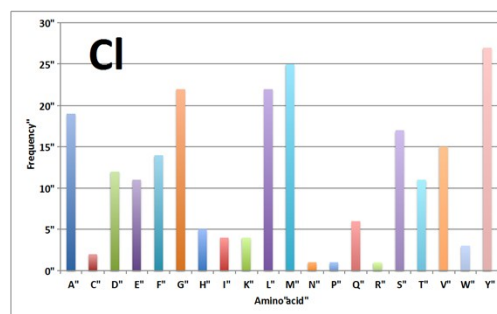
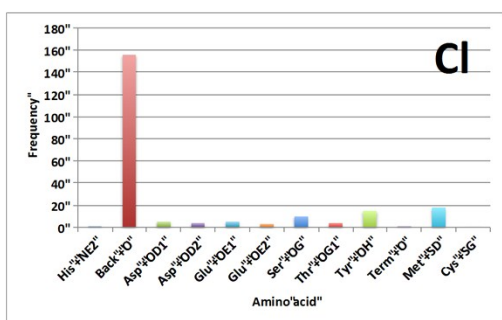


Figure S13. Distribution of the occurrence of the halogen bonding interactions with each amino acid

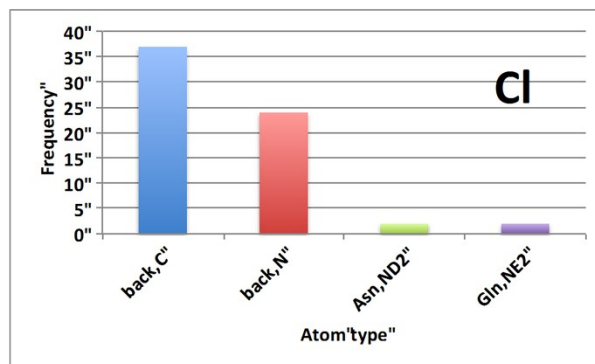
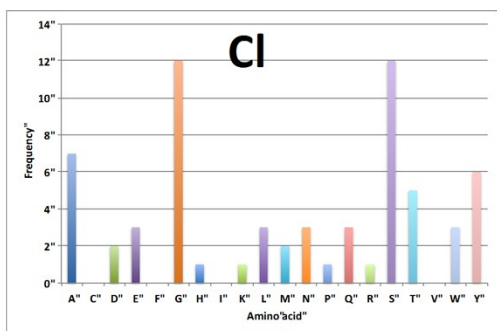
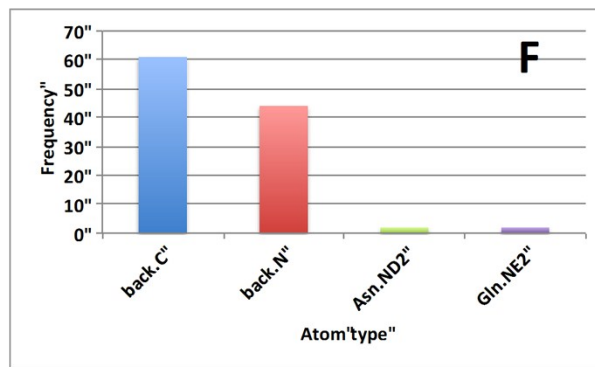
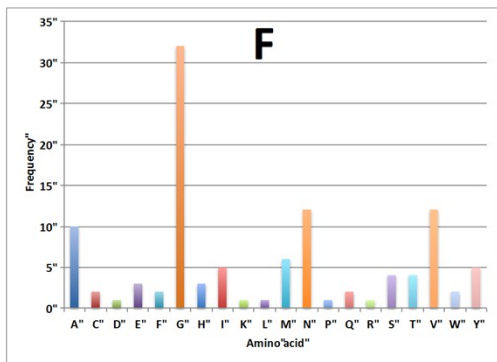


Figure S14. Distribution of the occurrence of the halogen multipolar interactions with each amino acid