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## **Supporting Material**

### **Statistics and physical origins of pK and ionization state changes upon proteinligand binding**

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# Supporting Material

### Brief summary of the methodology for  $pK$  estimates

The standard continuum electrostatics methodology  $(1)$  was used to compute pK values; the physical conditions such as dielectric constants used are given in the "Methods" section of the main text. Within our computational model, the difference between a residue's  $pK$  and the  $pK$  of the corresponding model compound in solution is determined by the combined effect of two distinct contributions to the total electrostatic (free) energy change. First is the "Born term" or desolvation penalty, which always penalizes burial of a charge inside a low dielectric medium. Second is the "background term", which represents the electrostatic interactions of the residue in question with all other fixed charges in the molecule not belonging to any ionizable residues. These energy terms, as well as the matrix of site–site interactions  $W_{ij}$  are estimated through a sequence of finite-difference Poisson-Boltzmann calculations in which residues in the protein and their corresponding model compounds have their charge distributions set to those of the protonated or deprotonated form, and suitable energy differences are taken. In the finite difference lattices, several levels of focusing are used. In the coarsest level the bounding box is set to twice the molecule's maximum extent and the grid points are spaced  $2 \text{ Å}$ apart. The finest lattice is "focused" on the region of interest, and the grid points are  $0.5$  Å apart. The probe radius for defining the molecular surface, which is used as the boundary between the interior and exterior dielectric regions, is set to  $1.4 \text{ Å}$ .

The electrostatics calculation outlined above provides (free) energies of each of the  $2^N$ protonation micro-states in the system, where  $N$  is the number of ionizable residues. Based on these free energies, H++ uses Boltzmann averages to compute the probability of protonation of each residue at different pH values, which define the titration curves from which  $pK$  values are calculated as mid-points.

### Validation

In what follows, we (i) estimate the average systematic error of the computed  $\Delta pK$ values by comparison with the available experimental numbers, and (ii) provide additional material used in the estimate of random error.

### Systematic error of computed  $|\Delta pK|$  — comparison with experiment

We compared the calculated  $pK$  changes with the corresponding experimental values for 13 cases where experimental data for  $pK$  changes upon binding are available, see Table S1. In most cases, the direction of the computed  $pK$  change (the sign) is in agreement with experiment. The magnitude of  $pK$  changes for individual residues is also in reasonable agreement with the experiment. Most importantly, the absolute value of the average computed  $pK$  change is in quantitative agreement with the corresponding experimental value. Specifically, the experimentally determined  $\Delta pKs$  shown in Table S1 have a root mean square (RMS) of 2.91  $pK$  units. The RMS of the computationally determined  $\Delta pKs$  is 3.23. Thus, our methodology is able to predict, on average, substantial pK changes ( $|\Delta pK| > 1.0$ ) upon ligand binding.

Table S1: Comparison between the computed and experimental pK changes,  $\Delta pK$ , upon ligand binding. Each  $\Delta pK$  value was computed as the difference between the pK values of the residue in the complex and in the unligated protein. The "overall" procedure was used, see "Methods" in the main text. In some cases two ionizable residues are so strongly coupled that their individual pKs may lose their conventional meaning  $(2)^{\dagger}$ . Such residues are listed together, separated by a "/" in the table. In the case of HIV protease dimer, ASP25 exists in each of its two chains; the two residues are distinguished by labeling one as ASP25 and the other as ASP25'. Experimental literature reference is given in ( ), next to each data point.

|                              | Protein PDB |               | $pK$ change                  |             |  |
|------------------------------|-------------|---------------|------------------------------|-------------|--|
| <b>Site</b>                  | In absence  | In complex    | Experiment                   | Computation |  |
|                              | of ligands  | with a ligand |                              |             |  |
| ASP25                        | 3HVP        | 1HPX          | $\geq +2.2(3, 4)$            | $+16.3$     |  |
| ASP25'                       | 3HVP        | 1HPX          | $\langle -1.5(3, 4) \rangle$ | $-0.5$      |  |
| ASP34/214                    | 1PFZ        | 1SME          | $+0.1(5)$                    | $+5.3$      |  |
| <b>HIS164</b>                | 1PFZ        | 1SME          | $+1.5(5)$                    | $+0.5$      |  |
| APS33/231                    | 1LYW        | 1LYB          | > 0(5)                       | $+7.8$      |  |
| HIS77                        | 1LYW        | 1LYB          | > 0(5)                       | $+2.1$      |  |
| GLU <sub>260</sub>           | 1LYW        | 1LYB          | > 0(5)                       | $-2.6$      |  |
| $\text{ASP}25/2\overline{5}$ | 1QBS        | 1QBS          | $+2.19(6)$                   | $+4.1$      |  |
| ASP25/25'                    | 1HHP        | 1QBS          | $+2.19(6)$                   | $+3.7$      |  |
| HIS <sub>57</sub>            | 6GCH        | 6GCH          | $+3.3(7)$                    | $-0.4$      |  |
| <b>GLU172</b>                | 1BVV        | 1BVV          | $-2.5(8)$                    | $-1.3$      |  |
| ASP35/GLU172                 | 1C5I        | 1C5I          | < 0.2(8)                     | $+0.2$      |  |
| <b>HIS235</b>                | 2YAS        | 2YAS          | $+5.5(9)$                    | $+3.5$      |  |

 $\dagger$ The proper single pK of such pairs is obtained from a combined titration curve, which is defined as the average of the computationally determined protonation probability for the two residues, at different pH values.

#### Complementary material for the random error estimation

#### Dataset for the random error estimate

Table S2: Collection of 7 proteins used in the estimation of the false positive level in the percentages of ionizable residues that exhibit substantial  $pK$  change in protein-ligand binding. For each of the proteins listed, several X-ray structures of its unligated form are available. Reported experimental conditions, as well as specific crystal symmetry groups, differ between many of these structures, suggesting that the contribution of the corresponding factors to the "structural noise" is taken into account by our estimate.



#### t-test analysis of the structural "noise" (random error)

We use a t-test to compare the mean (average) of the number of substantial  $pK$  changes due to structural "noise" ("noise" sample) to the mean of the number of substantial  $pK$ changes due to ligand binding ("signal" samples). An analysis presented in the main text shows that it is only the significance of  $pK$  changes outside the binding interface region that may be in question, and so we apply the t-test only to residues out of the interface region (more than  $6 \text{ Å}$  away from the ligand). Four data samples are constructed for the test: three "signal" samples, and the "noise" sample.

We set up three "signal" samples, one for protein-protein complexes, one for proteinsmall molecule, and one for protein-nucleic acid complexes. Each "signal" sample consists of 20 data points which represent the percentage of ionizable residues out of the interface that exhibit substantial and biologically relevant  $pK$  changes due to ligand binding.

The "noise" sample contains 80 data points, one for each pair of unligated structures presented in Table S2. Each data point represents the percentage of residues located outside the interface region that exhibit substantial difference between the  $pK$  values of the pair of unligated structures. As before, we considered only the  $pK$  values within the biologically relevant pH range from 4-8. It is worth mentioning that the proteins in Table S2 were selected from the protein-protein data set, so the set of ionizable residues inside and outside the interface region of the proteins used in the "noise" sample is identical to the set of ionizable residues in the corresponding proteins of the "signal"

sample. We performed a t-test of the null hypothesis that data in the "noise" and the "signal" samples have equal means, against the alternative hypothesis that the means are not equal. The results of the t-test of the null hypothesis for a probability of 0.95 are presented in table S3. Thus, we conclude that the computed substantial  $pK$  changes outside of the binding interface region are statistically significant in the protein-protein and protein-nucleic acid complexes. In the case of protein-small molecule complexes we do not have enough statistics to confirm or reject the possibility of substantial changes outside the binding interface region.

Table S3: Results of the t-test of the null hypothesis that data in the "noise" sample and the "signal" samples have equal means, with a probability of 0.95. The mean of the noise sample is 4.2%

| Complex type           |          |      | Mean "Signal"   p-value   t-test conclusion |
|------------------------|----------|------|---|
| Protein-small molecule | $4.6\%$  | 0.56 | Null hypothesis NOT rejected                |
| Protein-protein        | $6.7\%$  |      | $< 0.05$ Null hypothesis rejected           |
| Protein-nucleic acid   | $10.0\%$ |      | $< 0.05$   Null hypothesis rejected         |

## Effect of re-arrangement of hydrogen positions in response to "electrostatic" changes

To further dissect the various physical contributions to substantial  $pK$  changes seen in figure 2 of the main text, we have investigated the effect of re-arrangement of hydrogen positions in response to ligand binding that excluded any re-arrangements of heavy atoms due to "induced-fit" (that is assuming that heavy atoms did not move). Clearly, some re-arrangement of hydrogen positions and possibly of hydrogen bonding networks may occur purely due to solvation/de-solvation of the binding interface and changes in the charge state of its immediate surroundings caused by ligand binding. In other words, these are proton position changes caused by the "electrostatic only" effects introduced earlier. To single out a possible effect of such changes upon  $pK$  of ionizable residues in the receptor, we have introduced the fourth procedure for computing  $\Delta pK$ . This procedure is shown in Figure S1. Basically, we compare the  $pK$  values of the ionizable sites of the unligated proteins resulting from the "electrostatics only" and "structural changes only" procedures, see the "Methodology" section of the main text for details. The only difference between these two unligated structures is the positions of their hydrogen atoms that have responded to the binding of the ligand ( have been computationally re-optimized in the presence of the ligand) .

The black solid bars of figure S2 represent the  $pK$  changes due to hydrogen optimization. Clearly, the effect of this specific re-arranegemnt of hydrogen atoms is very small, thus its contribution to the overall effect on substantial  $pK$  changes can be safely neglected. Moreover, these results suggest that the substantial  $pK$  changes far away from the interface that we have seen are only due to the re-arrangement of heavy atoms caused by "induced fit". Of course, such conformational changes will cause movement of hydrogens, but the causal origin of these movements is the "induced fit" effects already analyzed (blue bars in figure S2 ), rather than alteration of the "electrostatic" state of the binding interface propagated out through alterations in H-bonding network.



Figure S1: Flowchart of the computational methodology used to estimate the effect of hydrogen optimization.

## Analysis of local RMS deviation in regions far from the binding interface

In order to further explore the nature of the structural changes responsible for the substantial pK changes in regions far  $(>12 \text{ Å})$  from the interface, we calculate the "local RMS deviation" for each ionizable residue of our protein-protein data set. We define "local RMS deviation" as the RMS between the heavy atoms of the complexed and unligated structures of one particular residue and its neighbors (residues within  $5 \text{ A}$ ).

We compute "local RMS deviation" for ionizable residues far from the interface that exhibit substantial  $pK$  changes, and for ionizable residues far from the interface with no substantial  $pK$  change, then we compare both samples. Figure S3 shows the histograms



Figure S2: Distance distribution of ionizable residues with substantial pK change in the biologically relevant pH range. Color coding consistent with figure 2 of the main text. Red bars: "overall" procedure, green bars: "electrostatics only" procedure, blue bars: "structural changes only" procedure, and black bars: effect of re-arrangement of hydrogen positions in response to ligand binding, assuming no movement of heavy atoms.

of the samples described above. Both histograms look somewhat similar, however, the average of "local RMS deviation" of residues that exhibit substantial  $pK$  changes is larger than those without substantial pK change,  $1.06$  and  $0.92$  respectively. This distinction is statistically significant: a t-test rejected the hypothesis  $(p<0.05)$  that both samples were identical.

These results suggest that small structural changes can produce substantial  $pK$  changes. Moreover, the similarity, broadness, and the absence of distinctive features in Figure S3 for both samples suggest that there is no single dominant structural mechanism responsible for  $pK$  changes far from the binding interface.



Figure S3: Local Root- Mean-Square Deviation (RMSD) of positions of ionizable residues that exhibit substantial  $pK$  changes (Grey) versus ionizable residues with no substantial pK changes (Red). Here we consider only the residues of the protein-protein dataset located in regions far  $(>12 \text{ Å})$  from the binding interface.

Examples of types of conformational changes that correlate with substantial  $pK$  changes



Figure S4: Examples of types of structural changes between unligated (Red) and complexed (light Grey) forms that induce substantial  $pK$  changes in some residues (thick lines). (A) An entire helix performs a small tilt movement that affect the  $pK$  value of GLU-720 of PDB 6Q21. (B) The residue ARG-310 of PDB 1E1N experiences a substantial  $pK$  shift due to random-coil to beta-sheet transition. (C) A ionizable residue (ASP-982 of PDB 6Q21) with substantial  $pK$  change located in a flexible random coil region experiences a large backbone movement due to complex formation.

# Protein-ligand datasets

Table S4: Protein-protein dataset. We also include the total number of ionizable residues and the number of residues with substantial (computed )  $pK$ change in the biologically relevant range ( $|\Delta pK| > 1$ ), inside and outside the binding interface region.



Table S5: Protein-small molecule dataset. We also include the total number of ionizable residues and the number of residues with substantial (computed )  $pK$  change in the biologically relevant range ( $|\Delta pK| > 1$ ), inside and outside the binding interface region.

|              | $\alpha$ can be considered and the state of the substanting interface |                  |                        |                   |                   |
|--------------|---|------------------|------------------------|-------------------|-------------------|
| PDB ID       | PDB ID of the   | $#$ of residues  |                        | $#$ of residues   |                   |
| of           | Unligated   | Inside interface |                        | Outside interface |                   |
| The complex  | protein   | Total            | $\Delta$ p $K$  <br>>1 | Total             | $\Delta pK$<br>>1 |
| 1AWQ         | $2$ CPL   | $\overline{4}$   | 1                      | 45                | $\overline{2}$    |
| 1JET         | 1RKM  | 14               | 4                      | 153               | $\overline{7}$    |
| 1AYC         | 1AYD  | 10               | $\theta$               | 23                | 3                 |
| 1YE3         | 8ADH  | $\overline{2}$   | $\Omega$               | 103               | $\overline{4}$    |
| 1NDV         | 1VFL  | 8                | $\Omega$               | 121               | 15                |
| 1CBX         | 5CPA  | 10               | $\overline{2}$         | 68                | $\overline{0}$    |
| 20Y2         | 20Y4  | 16               | $\overline{5}$         | 72                | $\mathbf{1}$      |
| $1{\rm G}46$ | 1FQL  | $\overline{4}$   | 1                      | 78                | $\rm 5$           |
| 1PGP         | 2PGD  | $\overline{7}$   | $\overline{2}$         | 135               | $\mathbf 5$       |
| 1PSO         | 1PSN  | 6                | $\overline{2}$         | 49                | $\overline{0}$    |
| 1RBP         | 1BRQ  | $\overline{7}$   | $\mathbf 1$            | 51                | 3                 |
| 1XIG         | 1XIB  | 12               | $\overline{5}$         | 117               | $\mathbf{1}$      |
| 3GBP         | 1GCG  | 10               | $\mathbf{1}$           | 79                | 3                 |
| 2IFB         | 1IFB  | 8                | $\theta$               | 39                | $\mathbf{1}$      |
| 5TIM         | 2V5L  | $\mathbf{1}$     | $\overline{0}$         | 59                | $\mathbf{1}$      |
| 1TYD         | 1TYC  | 9                | 1                      | 97                | $\overline{4}$    |
| <b>1BE8</b>  | 1SCD  | $\overline{2}$   | $\overline{0}$         | 43                | $\overline{2}$    |
| 1WOO         | 1WOS  | 10               | 1                      | 102               | 3                 |
| 2IZJ         | 2RTA  | $\sqrt{3}$       | $\Omega$               | 21                | 3                 |
| 1QGF         | 3EST  | 3                | 0                      | 40                | $\mathbf 1$       |

Table S6: Protein-nucleic acid dataset. We also include the total number of ionizable residues and the number of residues with substantial (computed )  $pK$  change in the biologically relevant range ( $|\Delta pK| > 1$ ), inside and outside the binding interface region.

| PDB ID      | $1010 \times 1010$ $10000$ $1$ $-1$<br>PDB ID of the | $#$ of residues  |                      | morae and educate the smally internet<br>$#$ of residues |                        |
|-------------|--|------------------|----------------------|--|------------------------|
| of          | Unligated  | Inside interface |                      | Outside interface  |                        |
| The complex | protein  | Total            | >1<br>$\Delta$ p $K$ | Total  | $\Delta$ p $K$  <br>>1 |
| 3HDD        | 1ENH   | $\overline{6}$   | $\overline{2}$       | 12   | $\overline{2}$         |
| 1J59        | 1G6N   | $25\,$           | $\overline{5}$       | 98   | 25                     |
| 1M5O        | 10IA   | 24               | 3                    | 27   | $\overline{2}$         |
| 2E1C        | 2CYY   | 8                | $\overline{2}$       | 43   | $\overline{2}$         |
| $1$ MJM     | $1$ MJ $K$   | 10               | $\mathbf{1}$         | 74   | 9                      |
| 2AC0        | 2OCJ   | 40               | 3                    | 224  | 16                     |
| 1EMH        | 1AKZ   | $\overline{9}$   | 3                    | 61   | 3                      |
| 1RCN        | 1C9X   | 9                | 3                    | 23   | $\mathbf{1}$           |
| 1RVA        | 1RVE   | 33               | 8                    | 149  | 13                     |
| 2PVI        | 1K0Z   | 29               | 6                    | 77   | $8\,$                  |
| 1A74        | 1EVX   | 26               | $\overline{5}$       | 60   | 8                      |
| 1G9Z        | 207M   | 40               | 8                    | 54   | 11                     |
| 1QUM        | 1QTW   | 17               | 3                    | 71   | 3                      |
| 1G59        | 1GLN   | 40               | 13                   | 133  | 14                     |
| 2HW8        | 1AD <sub>2</sub>                                     | 16               | 3                    | 56   | $\mathfrak{Z}$         |
| 1SDS        | 1RA4   | 6                | $\theta$             | 33   | $\overline{5}$         |
| 1M8W        | 1IB2   | 20               | 1                    | 87   | $\,$ 6 $\,$            |
| 1ZBL        | 1ZBF   | 8                | $\overline{2}$       | 36   | $\overline{4}$         |
| 2F8K        | 2D3D   | 8                | 1                    | 23   | $\overline{2}$         |
| 2A8V        | 1A62   | 10               | 1                    | 26   | $\mathbf{1}$           |

# References

- 1. Bashford, D., and M. Karplus. 1990.  $pK_a$ 's of ionizable groups in proteins: atomic detail from a continuum electrostatic model. Biochemistry. 29:10219–10225.
- 2. Onufriev, A., D. A. Case, and G. M. Ullmann. 2001. A novel view of pH titration in biomolecules. Biochemistry. 40:3413–3419.
- 3. Smith, R., I. M. Brereton, R. Y. Chai, and S. B. Kent. 1996. Ionization states of the catalytic residues in HIV-1 protease. Nat. Struct. Mol. Biol. 3:946–950.
- 4. Wang, Y. X., D. I. Freedberg, T. Yamazaki, P. T. Wingfield, S. J. Stahl, J. D. Kaufman, Y. Kiso, and D. A. Torchia. 1996. Solution NMR evidence that the HIV-1 protease catalytic aspartyl groups have different ionization states in the complex formed with the asymmetric drug KNI-272. Biochemistry. 35:9945–9950.
- 5. Xie, D., S. Gulnik, L. Collins, E. Gustchina, L. Suvorov, and J. W. Erickson. 1997. Dissection of the pH dependence of inhibitor binding energetics for an aspartic protease: Direct measurement of the protonation states of the catalytic aspartic acid residues. Biochemistry. 36:16166–16172.
- 6. Yamazaki, T., L. K. Nicholson, P. Wingfield, S. J. Stahl, J. D. Kaufman, C. J. Eyermann, N. C. Hodge, P. Y. Lam, and D. A. a. Torchia. 1994. NMR and X-ray evidence that the HIV protease catalytic aspartyl groups are protonated in the complex formed by the protease and a non-peptide cyclic urea-based inhibitor. J. Am. Chem. Soc. 116:10791–10792.
- 7. Cassidy, C. S., J. Lin, and P. A. Frey. 1997. A new concept for the mechanism of action of chymotrypsin: The role of the low-barrier hydrogen bond. Biochemistry. 36:4576–4584.
- 8. Joshi, M. D., G. Sidhu, J. E. Nielsen, G. D. Brayer, S. G. Withers, and L. P. Mcintosh. 2001. Dissecting the electrostatic interactions and pH-dependent activity of a family 11 glycosidase. Biochemistry. 40:10115–10139.
- 9. Stranzl, G. R., K. Gruber, G. Steinkellner, K. Zangger, H. Schwab, and C. Kratky. 2004. Observation of a short, strong hydrogen bond in the active site of hydroxynitrile lyase from hevea brasiliensis explains a large  $pK_a$  shift of the catalytic base induced by the reaction intermediate. J. Biol. Chem. 279:3699–3707.