







From JEDI to SITH

A Journey to the Dark Side of Druggability

Joan Clark-Nicolas
ScotCHEM Conference
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University of St Andrews

Contents



Part 1: Druggability of protein cryptic pockets

Part 2: The JEDI approach

Part 3: The SITH sampling protocol

Part 4: Conclusions

Contents



Part 1: Druggability of cryptic protein pockets

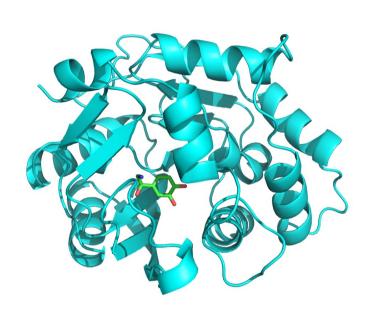
Part 2: The JEDI approach

Part 3: The SITH sampling protocol

Part 4: Conclusions

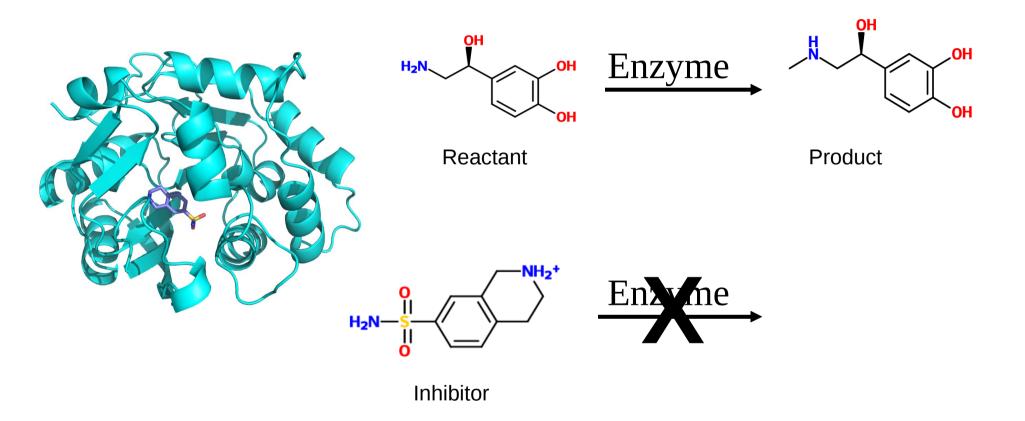
How are diseases related to proteins?





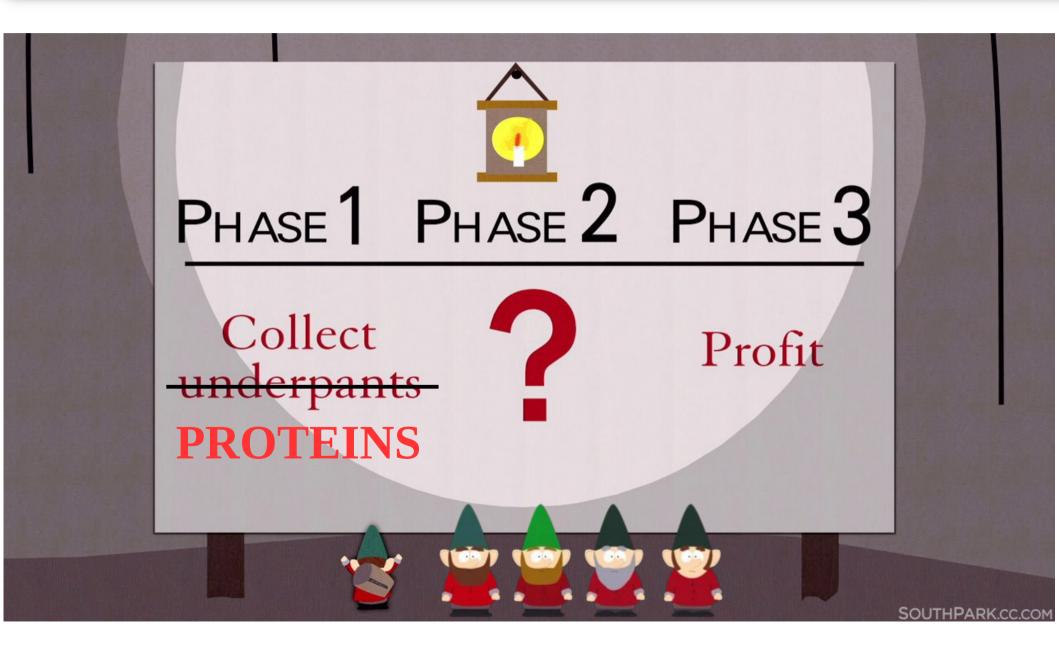
How are diseases related to proteins?





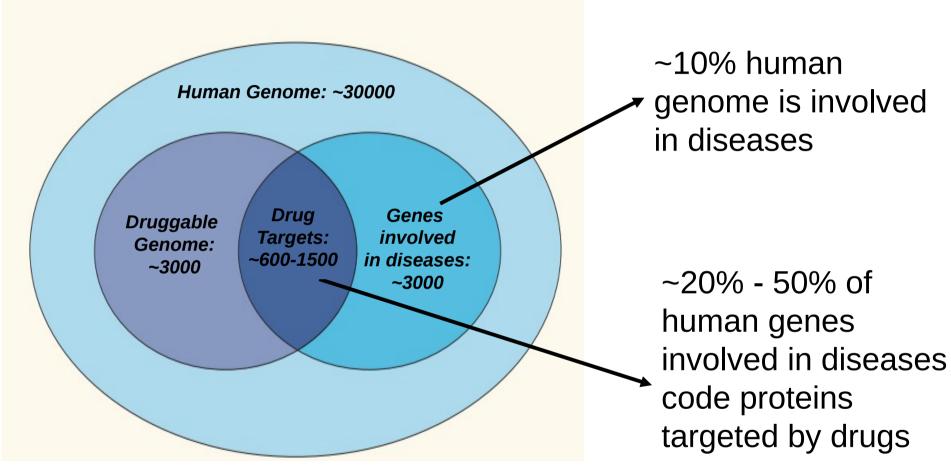
So how do we cure diseases?





Not all proteins can bind drugs...

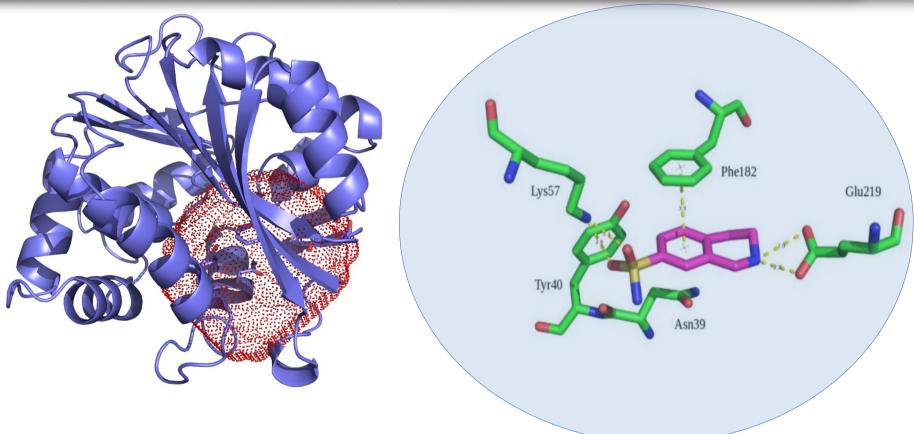




Hopkins & Groom, Nat. Rev. Drug. Disc. 2002

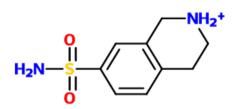
So what does a protein need to be considered a drug target?





- Volume
- Hydrophobicity
- Enclosure



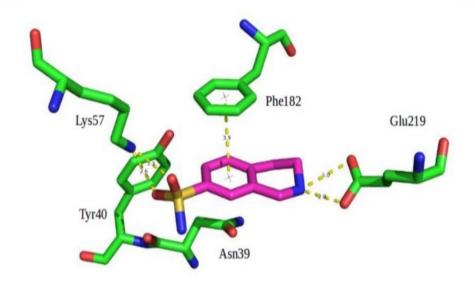


Inhibitor SKF

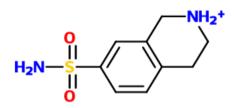
Volume = 258 Å^3

Ki= 580 nM

Pocket Volume: 304 Å³





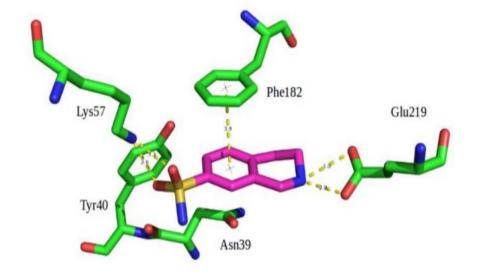


Inhibitor SKF

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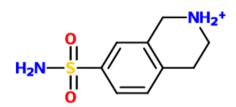
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Inhibitor F83



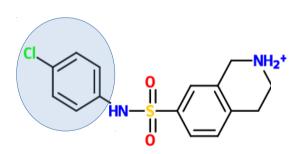


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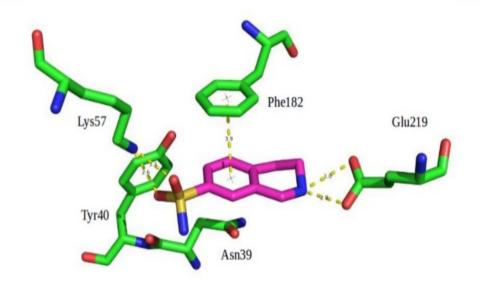
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Ki= 580 nM

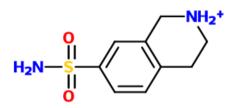
Pocket Volume: 304 Å³



Inhibitor F83





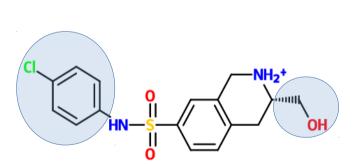


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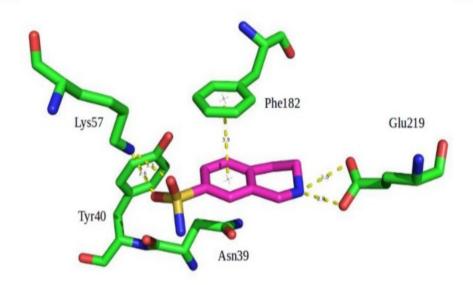
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Ki= 580 nM

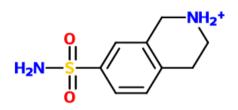
Pocket Volume: 304 Å³



Inhibitor F83





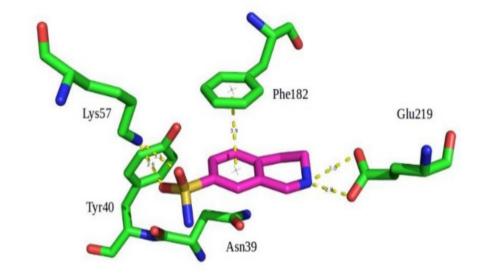


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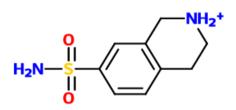




Inhibitor F83

Volume = 422 Å^3



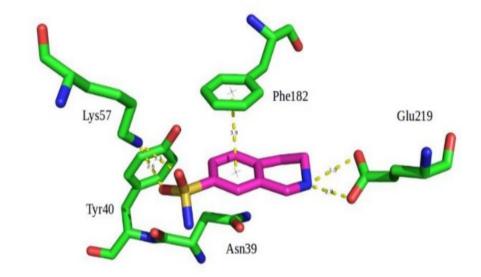


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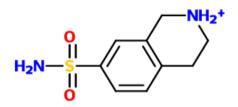


Inhibitor F83

Volume = 422 Å^3

Ki= 63 nM





Inhibitor SKF

Volume = 258 Å^3

Ki= 580 nM

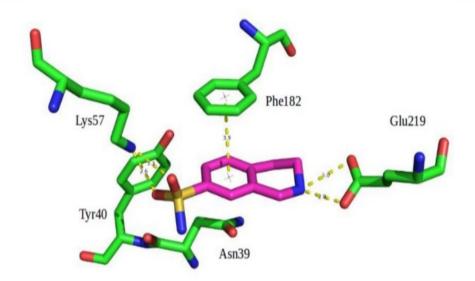
Pocket Volume: 304 Å³

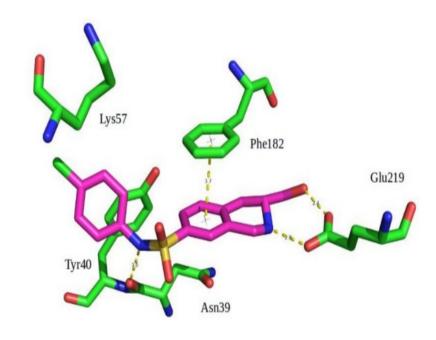


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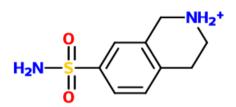
Volume = 422 Å^3

Ki= 63 nM







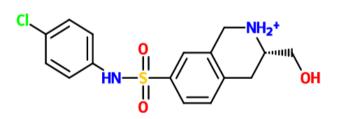


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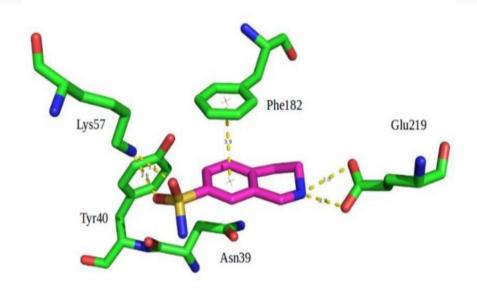


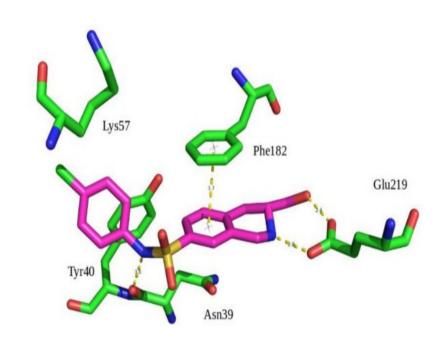
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Volume = 422 Å^3

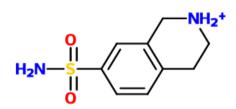
Ki= 63 nM

Pocket Volume: 545 Å³







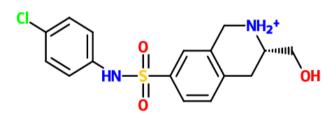


Inhibitor SKF

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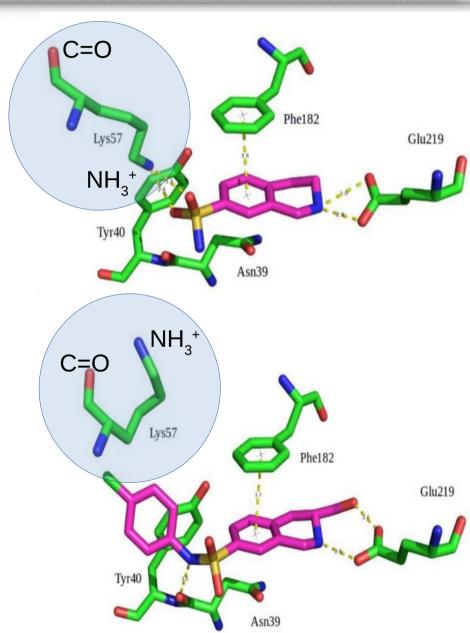


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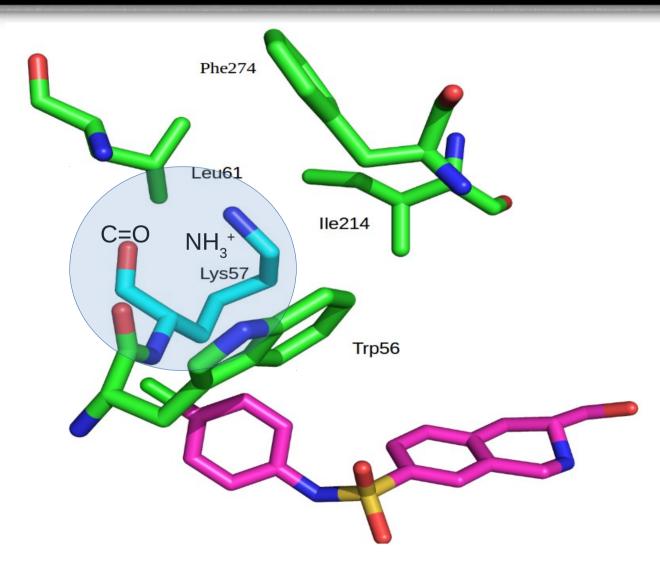
Ki= 63 nM

Pocket Volume: 545 Å³



Cryptic Binding pockets





NOT DETECTED EXPERIMENTALLY
IN THE ABSENCE OF A LIGAND



$$U(R) = \sum_{bonds} k_r (r - r_{eq})^2 \qquad bond$$

$$+ \sum_{angles} k_{\theta} (\theta - \theta_{eq})^2 \qquad angle$$

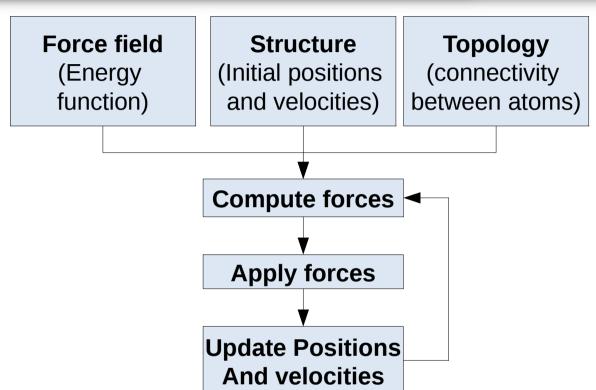
$$+ \sum_{dihedrals} k_{\phi} (1 + \cos[n\phi - \gamma]) \qquad dihedral$$

$$+ \sum_{i < j} k_{\omega} (\omega - \omega_{eq})^2 \qquad improper$$

$$+ \sum_{i < j} \varepsilon_{ij} \left[\left(\frac{r_m}{r_{ij}} \right)^{12} - 2 \left(\frac{r_m}{r_{ij}} \right)^6 \right] \qquad van \ der \ Waals$$

electrostatic

 $+\sum_{i\leq j}^{atoms} \frac{q_i q_j}{4\pi\varepsilon_0 r_{ii}}$





$$U(R) = \sum_{bonds} k_r (r - r_{eq})^2 \qquad bond$$

$$+ \sum_{angles} k_{\theta} (\theta - \theta_{eq})^2 \qquad angle$$

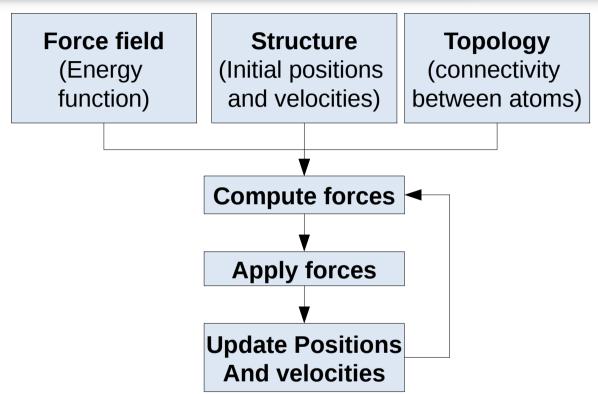
$$+ \sum_{dihedrals} k_{\phi} (1 + \cos[n\phi - \gamma]) \qquad dihedral$$

$$+ \sum_{impropers} k_{\omega} (\omega - \omega_{eq})^2 \qquad improper$$

$$+ \sum_{i < j} k_{\omega} (\omega - \omega_{eq})^2 \qquad van \ der \ Waals$$

$$+ \sum_{i < j} t_{ij} \left[\left(\frac{r_m}{r_{ij}} \right)^{12} - 2 \left(\frac{r_m}{r_{ij}} \right)^6 \right] \qquad van \ der \ Waals$$

$$+ \sum_{i < j} t_{ij} \frac{q_i q_j}{4\pi \varepsilon_0 r_{ii}} \qquad electrostatic$$



Naturally occurring forces **Equilibrium Dynamics**





$$U(R) = \sum_{bonds} k_r (r - r_{eq})^2 \qquad bond$$

$$+ \sum_{angles} k_{\theta} (\theta - \theta_{eq})^2 \qquad angle$$

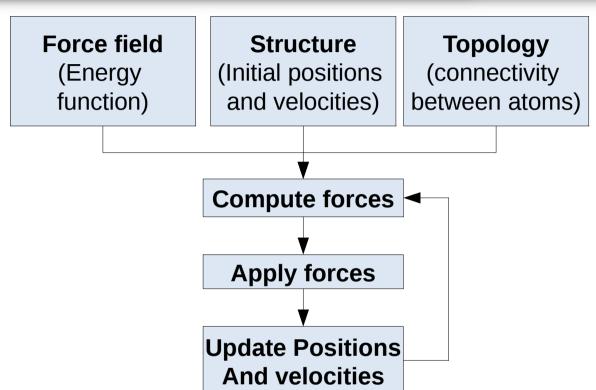
$$+ \sum_{dihedrals} k_{\phi} (1 + \cos[n\phi - \gamma]) \qquad dihedral$$

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electrostatic

 $+\sum_{i\leq j}^{atoms} \frac{q_i q_j}{4\pi\varepsilon_0 r_{ii}}$





$$U(R) = \sum_{bonds} k_r (r - r_{eq})^2 \qquad bond$$

$$+ \sum_{angles} k_{\theta} (\theta - \theta_{eq})^2 \qquad angle$$

$$+ \sum_{dihedrals} k_{\phi} (1 + \cos[n\phi - \gamma]) \qquad dihedral$$

$$+ \sum_{impropers} k_{\omega} (\omega - \omega_{eq})^2 \qquad improper$$

$$+ \sum_{i < j} k_{\omega} \left[\left(\frac{r_m}{r_{ij}} \right)^{12} - 2 \left(\frac{r_m}{r_{ij}} \right)^6 \right] \qquad van \ der \ Waals \qquad \longrightarrow$$

 $+\sum_{i\leq j}^{aloms} \frac{q_i q_j}{4\pi\varepsilon_0 r_{ii}}$

Force field Structure (Initial positions function) and velocities)

Topology (connectivity between atoms)

Compute forces

Apply forces

Update Positions
And velocities

+U(CV) Additional energy term

electrostatic



Additional Forces: **Biased Dynamics**



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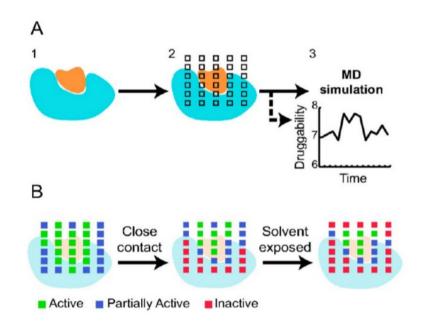
Part 4: Conclusions





A Collective Variable for the Rapid Exploration of Protein Druggability

Rémi Cuchillo, Kevin Pinto-Gil, and Julien Michel*



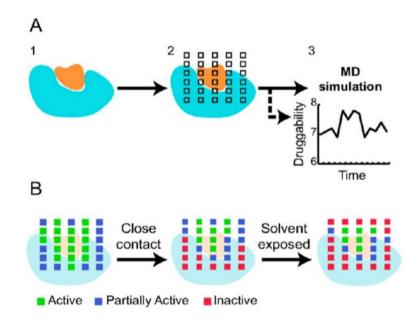
$$a_i = S_{BS_i}^{off}(1.0, BS_{min}, \Delta BS) \ S_{mind_i}^{on}(1.0, CC_{mind}, \Delta CC) S_{exposure_i}^{on}(1.0, E_{min}, \Delta E)$$



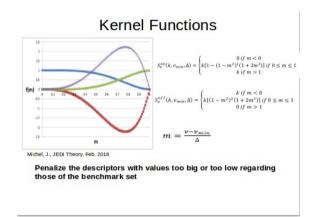


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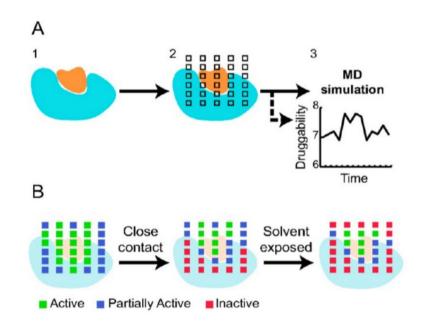




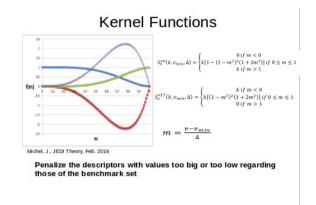


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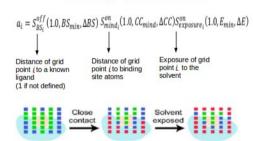
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Activity calculation

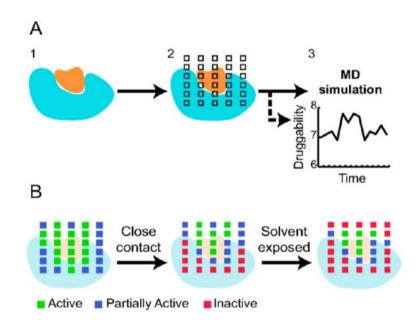






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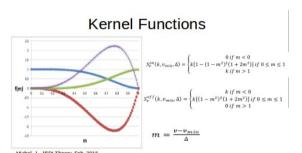
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 $a_i = S_{BS_i}^{off}(1.0, BS_{min}, \Delta BS) \; S_{mind_i}^{on}(1.0, CC_{mind}, \Delta CC) \\ S_{exposure_i}^{on}(1.0, E_{min}, \Delta E)$

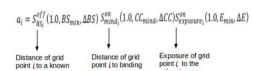
Article

pubs.acs.org/JCTC



Penalize the descriptors with values too big or too low regathose of the benchmark set

Activity calculation



Hydrophobicity Descriptor

 $h_i = \frac{apolar_i}{contacts_i}$

$$contacts_i = \sum_{j=1}^{M} S_{\parallel r_{ii},\parallel}^{off}(a_i, d_{hydro}, \Delta d_{hydro})$$

$$apolar_i = \sum_{j=1}^{M} I_{apolar}(j) S_{\|r_{ij}\|}^{off}(a_i, d_{hydro}, \Delta d_{hydro})$$

$$I_{apolar}(j)$$
 {1 if $j \in apolar \ group$ } {0 if $j \in polar \ group$ }

$$H_a = \sum_{i=1}^{N} \frac{h_i a_i}{\sum_{i=1}^{N} a_i}$$

Apolar and polar atoms are defined at the same time as the grid, before the simulation



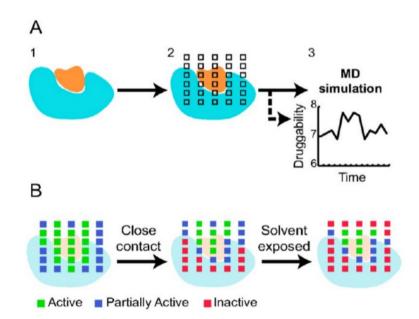


Article

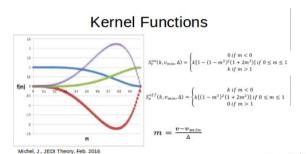
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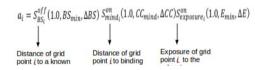
Rémi Cuchillo, Kevin Pinto-Gil, and Julien Michel*



 $a_i = S_{BS_i}^{off}(1.0, BS_{min}, \Delta BS) \; S_{mind_i}^{on}(1.0, CC_{mind}, \Delta CC) \\ S_{exposure_i}^{on}(1.0, E_{min}, \Delta E)$



Activity calculation



Hydrophobicity Descriptor

 $=\frac{apolar_i}{contacts_i}$

$$tacts_i = \sum_{j=1}^{M} S_{\parallel r_{i,i,t} \parallel}^{off}(a_i, d_{hydro}, \Delta d_{hydro})$$

$$lar_i = \sum_{j=1}^{M} I_{apolar}(j) S_{\parallel r_{i,t},\parallel}^{off}(a_i, d_{hydro}, \Delta d_{hydro})$$

$$_{olar}(j)$$
 {1 if $j \in apolar \ group$ } 0 if $j \in polar \ group$

$$= \sum_{i=1}^{N} \frac{h_i a_i}{\sum_{i=1}^{N} a_i}$$

Apolar and polar atoms are defined at the same time as the grid, before the simulation

Active Volume Descriptor

$$V = \sum_{i=1}^{N} a_i V_g$$

$$V_g = spacing^3$$
 ———— ONLY FOR EVENL SPACED GRIDS!!!

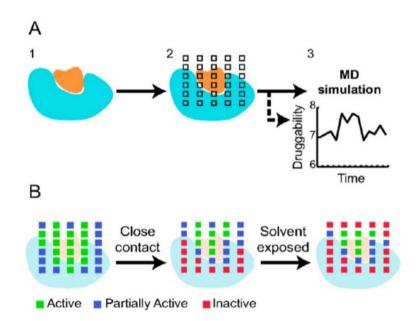
$$V_a = \frac{V}{V_{max}}$$
 PARAMETER

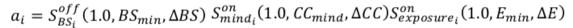


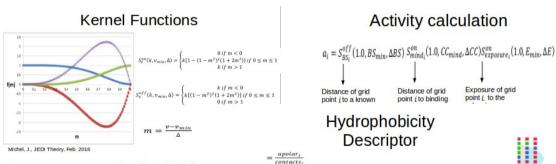


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Active Volume Descriptor

$$\begin{split} &tacts_i = \sum_{j=1}^{M} S_{\parallel r_{ij,k}\parallel}^{off}(\alpha_i, d_{hydro}, \Delta d_{hydro}) \\ &dar_i = \sum_{j=1}^{M} I_{apolar}(f) S_{\parallel r_{ij,k}\parallel}^{off}(\alpha_i, d_{hydro}, \Delta d_{hydro}) \end{split}$$

$$V = \sum_{i=1}^{N} a_i V_g$$

$$V_g = spacing^3 \longrightarrow \begin{array}{c} \text{Druglike Volume} \\ \text{Descriptor} \end{array}$$

$$V_g = \frac{V}{V_g} = \frac{V}{V_g}$$

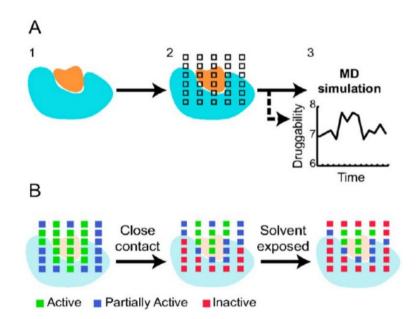
$$V_{a} = \frac{V}{V_{max}} \xrightarrow{\text{PAR}} V_{druglike} = S_{V}^{off}(1.0, V_{max}, \Delta V_{max}) S_{V}^{on}(1.0, V_{min}, \Delta V_{min})$$
 at the same time as
$$V_{max} = V_{max} + V_{min} + V_$$





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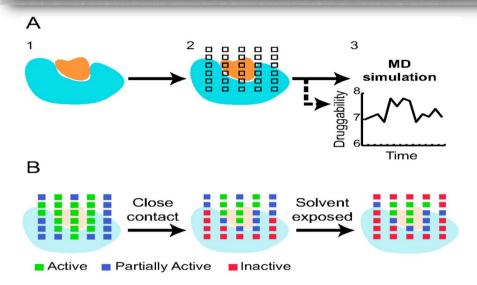
JEDI score

$JEDI = V_{druglike}(\alpha V_a + \beta H_a + \gamma)$

Symbol	Definition	Value
α	PLS derived volume coefficient	5.31
β	PLS derived hydrophobicity coefficient	24.29
γ	PLS derived intercept	-13.39
Δ_g	grid spacing	0.15 nm
BS_{min}	Minimum distance to $ligand group$ from which the lig_i value starts to decrease	0.2 nm
ΔBS	distance interval over which lig_i decreases to 0	0.6 nm
CC_{mind}	distance below which a grid point is fully in close contact with the binding site group	0.15 nm
ΔCC	distance interval over which a grid point is in partial contact with the binding site group	0.15 nm
E_{min}	minimum exposure value from which a grid point is considered to be partially exposed to the binding site group	10.0
ΔE	interval over which a grid point becomes fully exposed to the binding site group	20.0
CC2 _{min}	minimum distance below which a grid point is overlapping the binding site group	0.15 nm
$\Delta CC2$	distance interval over which a grid point is in partial contact with the binding site group	0.14 nm

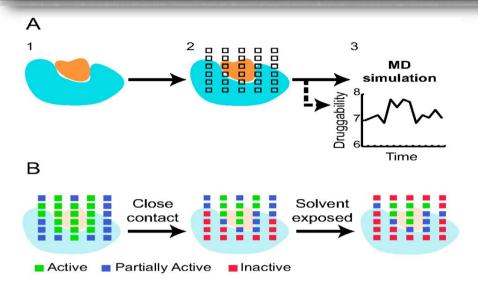
Symbol	Definition	Value
GP_{min}	distance above which a grid point k is considered neighbor of grid point i	0.25 nm
GP_{max}	distance below which a grid point k is considered neighbor of grid point i	0.35 nm
d_{hydro}	distance below which a grid point <i>i</i> is in contact with a binding site atom (for hydrophobicity calculation)	0.40 nm
Δd_{hydro}	distance interval over which a grid point i is in partial contact with a binding site atom (for hydrophobicity calculation)	0.05 nm
V_{max}	volume below which $V_{druglike}$ is equal to 1	0.5 nm^3
ΔV_{max}	volume interval over which $V_{druglike}$ goes from 1 to 0	0.050 nm
V_{min}	volume below which $V_{druglike}$ is equal to 0	0.0 nm^3
ΔV_{min}	volume interval over which $V_{druglike}$ goes from 0 to 1	0.050 nm





$$JEDI = F(a_{gridpoints})$$

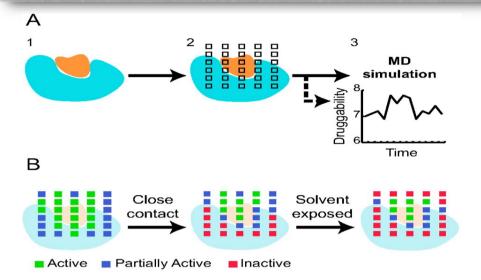




$$JEDI = F(a_{gridpoints})$$

$$a_i = F(\vec{r}_{gridpoints}, \vec{r}_{atoms})$$



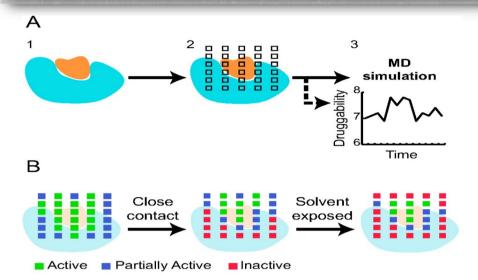


$$JEDI = F(a_{gridpoints})$$

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$$JEDI = F(\vec{r}_{gridpoints}, \vec{r}_{atoms})$$





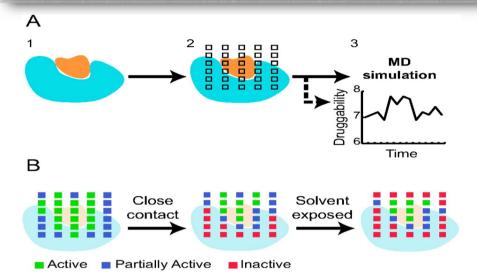
$$JEDI = F(a_{gridpoints})$$

$$a_i = F(\vec{r}_{gridpoints}, \vec{r}_{atoms})$$

$$JEDI = F(\vec{r}_{gridpoints}, \vec{r}_{atoms})$$

$$U_{system} = FF + U_{JEDI}$$





$$JEDI = F(a_{gridpoints})$$

$$a_i = F(\vec{r}_{gridpoints}, \vec{r}_{atoms})$$

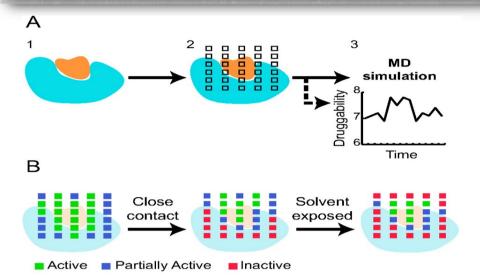
$$JEDI = F(\vec{r}_{gridpoints}, \vec{r}_{atoms})$$

$$U_{system} = FF + U_{JEDI}$$

$$\vec{F}_{system} = -\left(\frac{dFF}{d\vec{r}_{system}} + \frac{dU_{JEDI}}{d\vec{r}_{system}}\right)$$

Quantification of Protein Druggability: JEDI





$$JEDI = F(a_{gridpoints})$$

$$a_i = F(\vec{r}_{gridpoints}, \vec{r}_{atoms})$$

$$JEDI = F(\vec{r}_{gridpoints}, \vec{r}_{atoms})$$

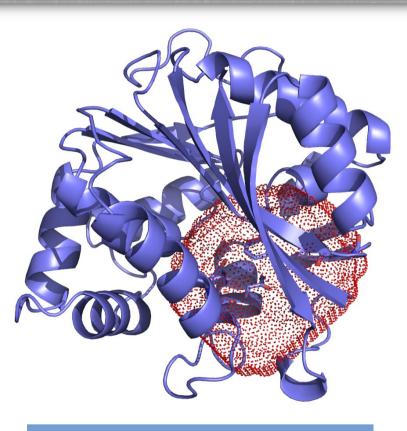
$$U_{system} = FF + U_{JEDI}$$

$$\vec{F}_{system} = -\left(\frac{dFF}{d\vec{r}_{system}} + \frac{dU_{JEDI}}{d\vec{r}_{system}}\right)$$

$$\vec{F}_{JEDI} = -\left| \frac{dU_{JEDI}}{dJEDI} \frac{dJEDI}{d\vec{r}_{system}} \right|$$

Can JEDI distinguish protein conformations?

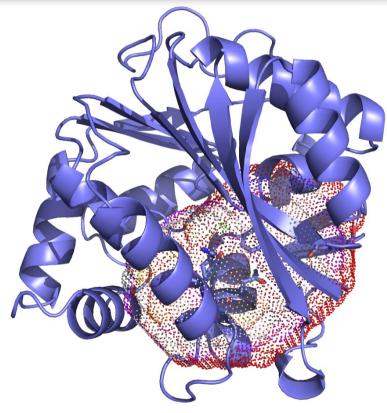




Pocket Small

LIGAND SKF (580nM)

JEDI 7.3

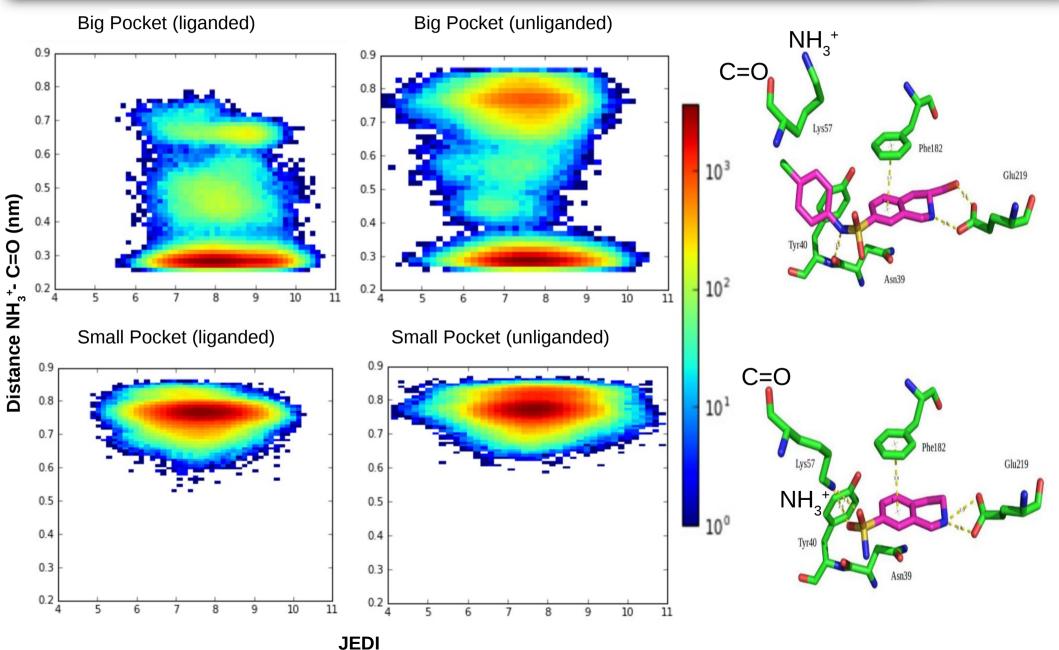


Pocket Big
LIGAND F83 (63 nM)
JEDI 9.8

Lower Druggability Higher Druggability

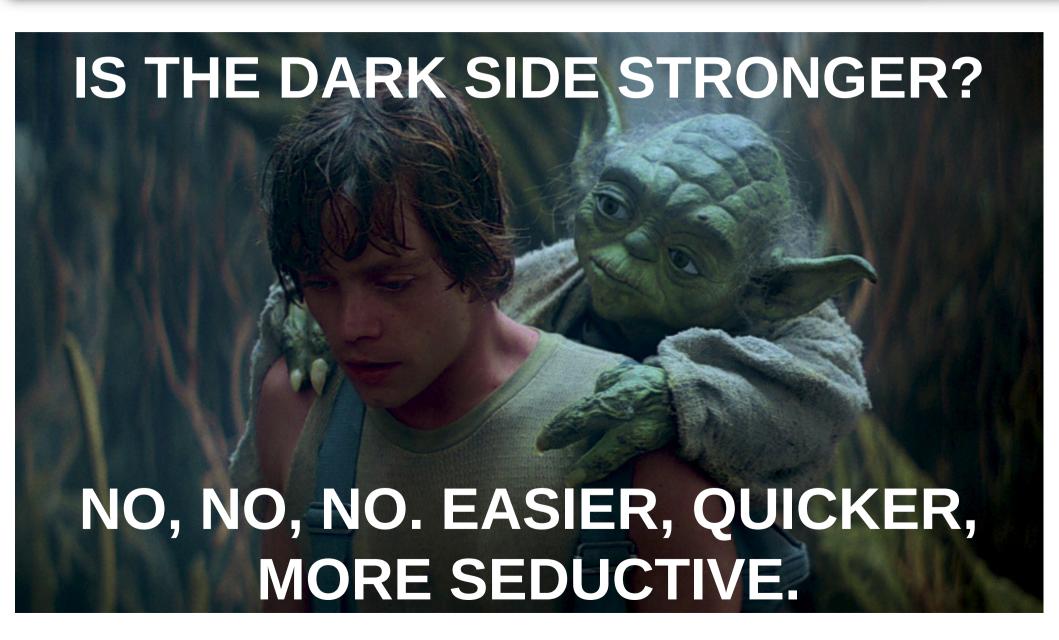
Sampling of protein conformations in microsecond scale MD





How do we sample different conformations?





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Part 1: Druggability of cryptic protein pockets

Part 2: The JEDI approach

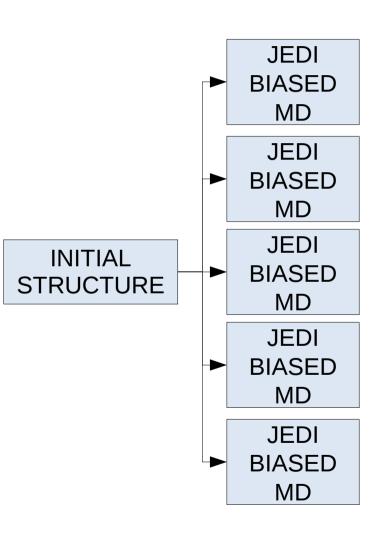
Part 3: The SITH sampling protocol

Part 4: Conclusions

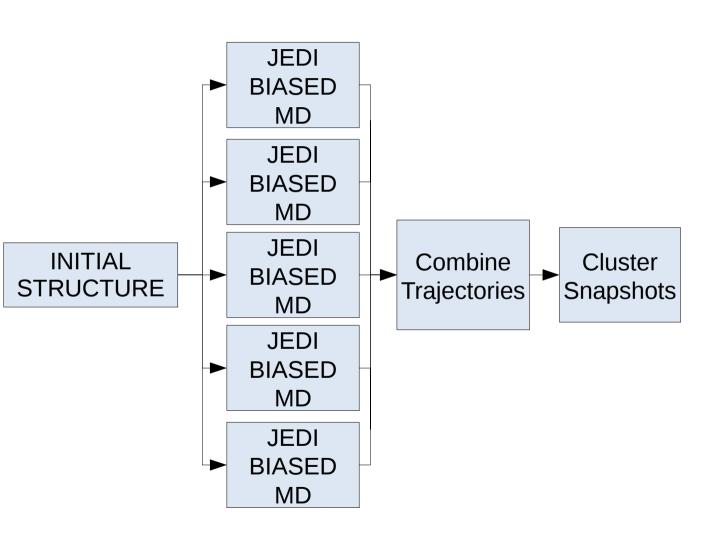


INITIAL STRUCTURE

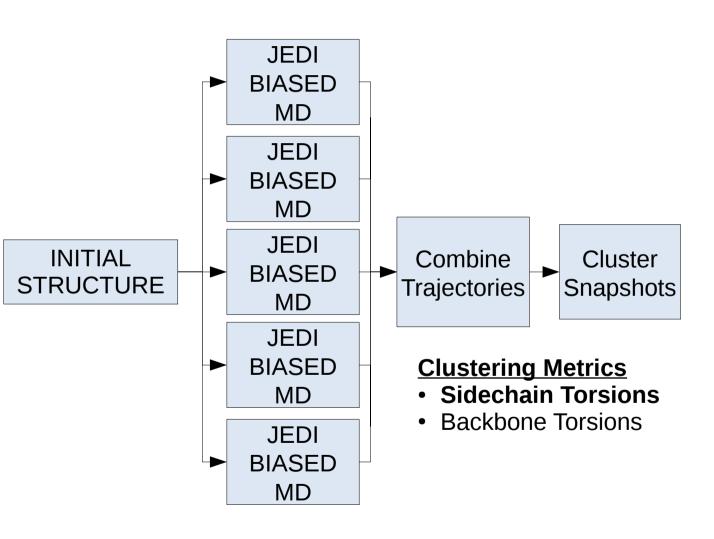




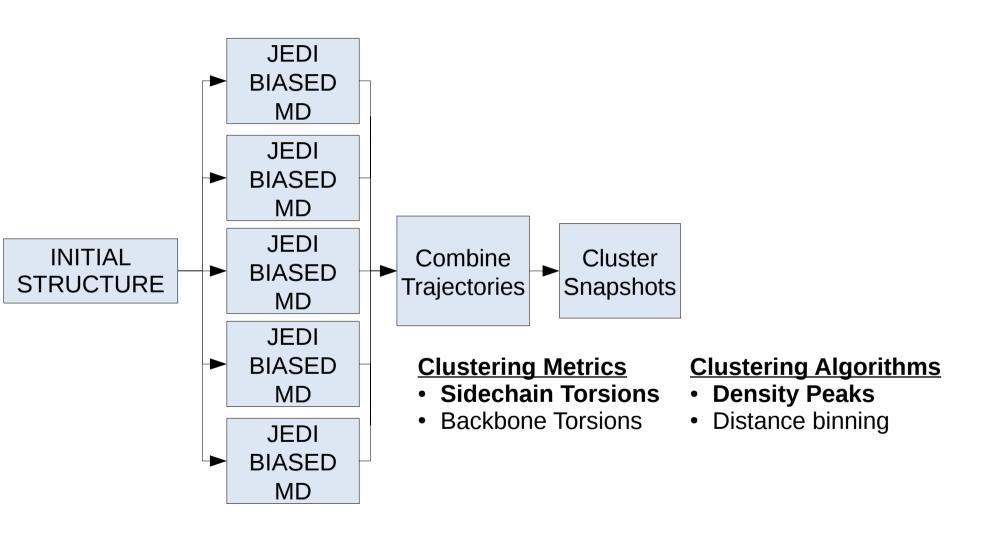




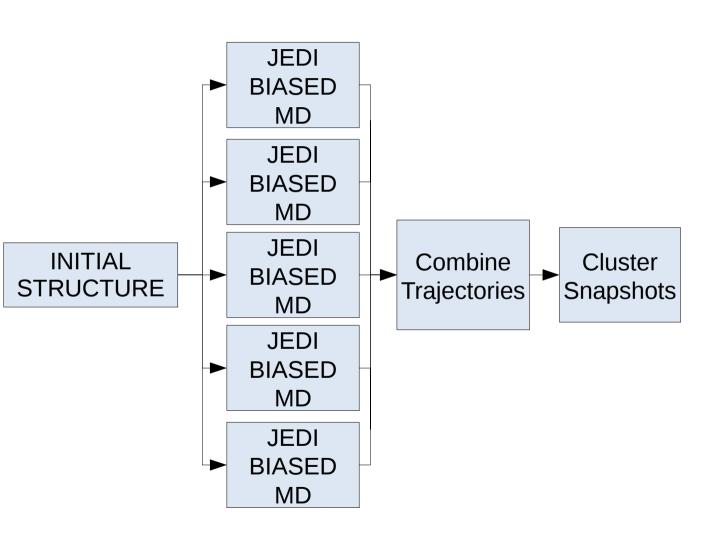




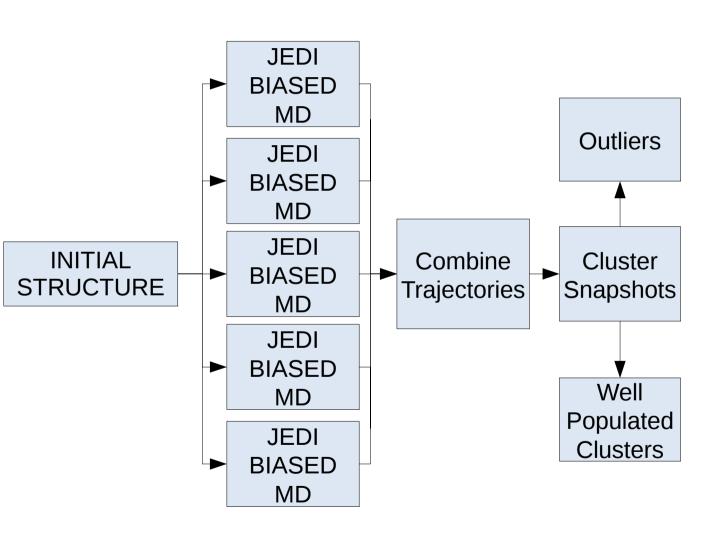




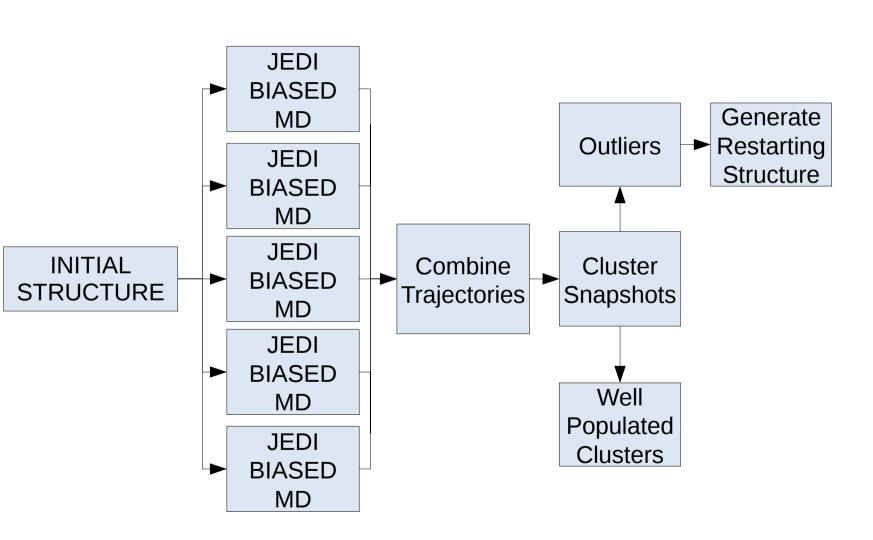




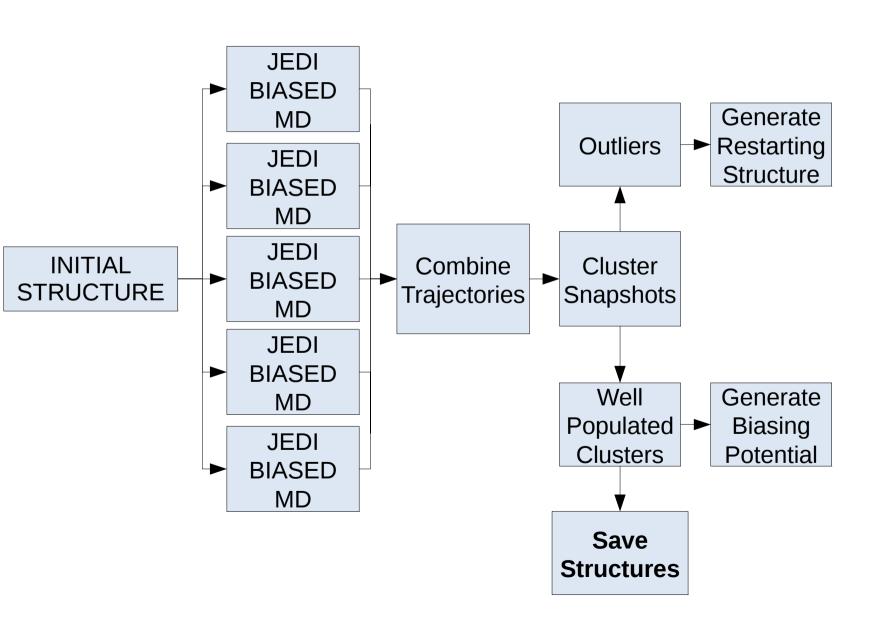




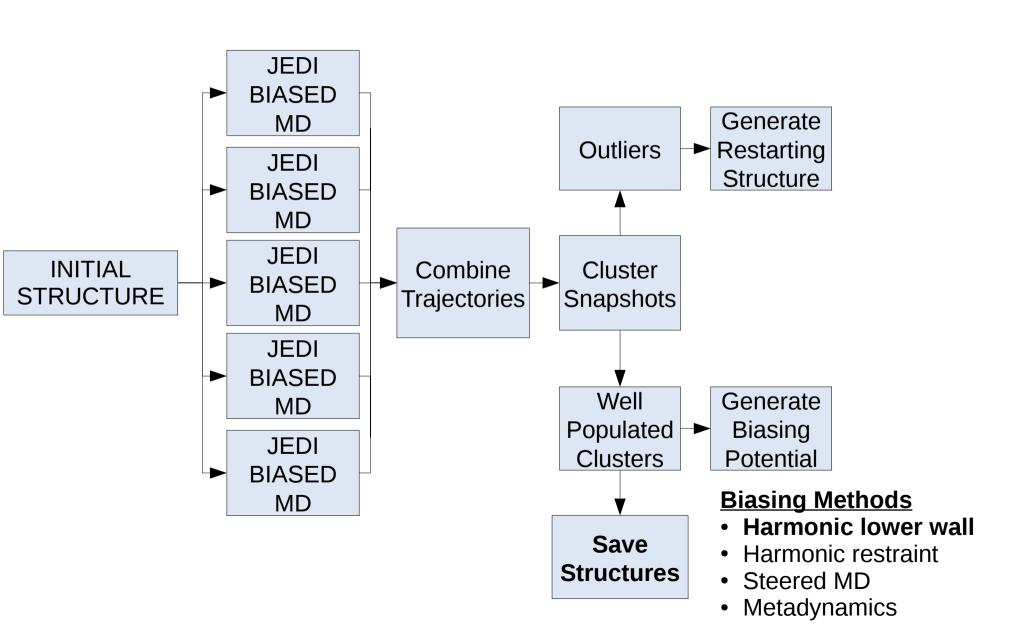




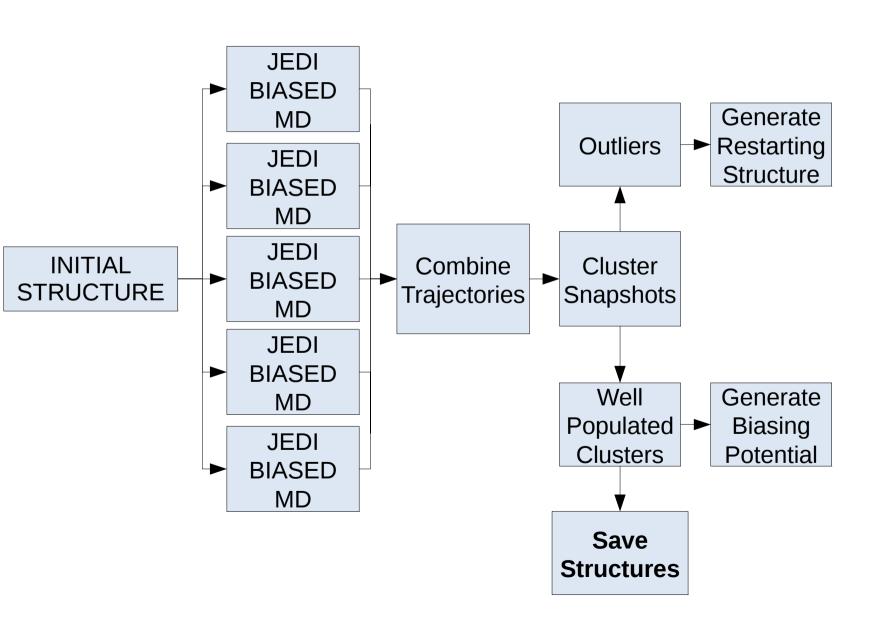




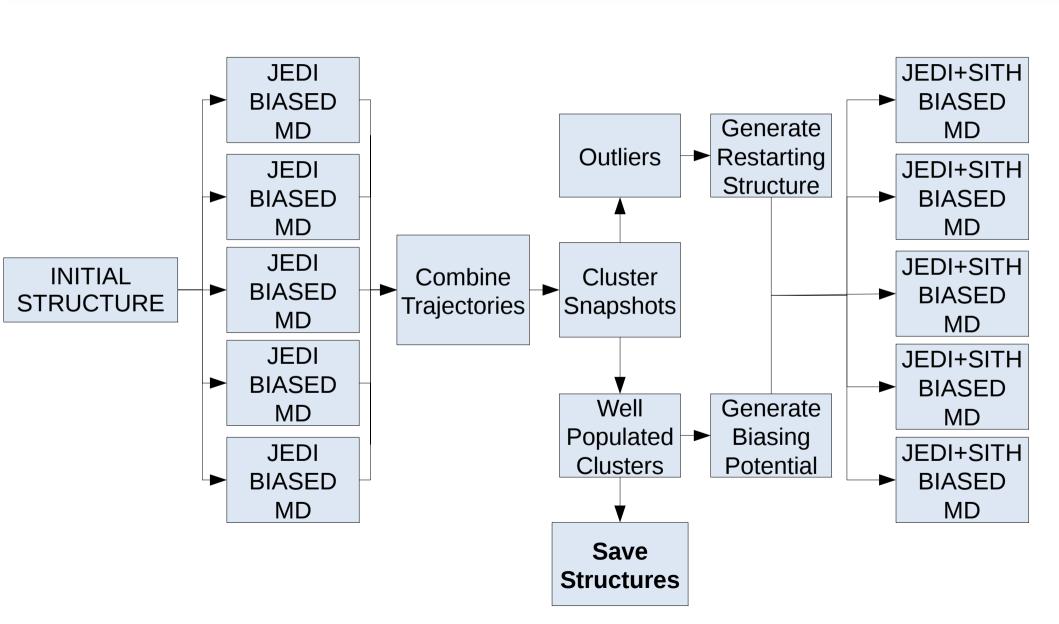




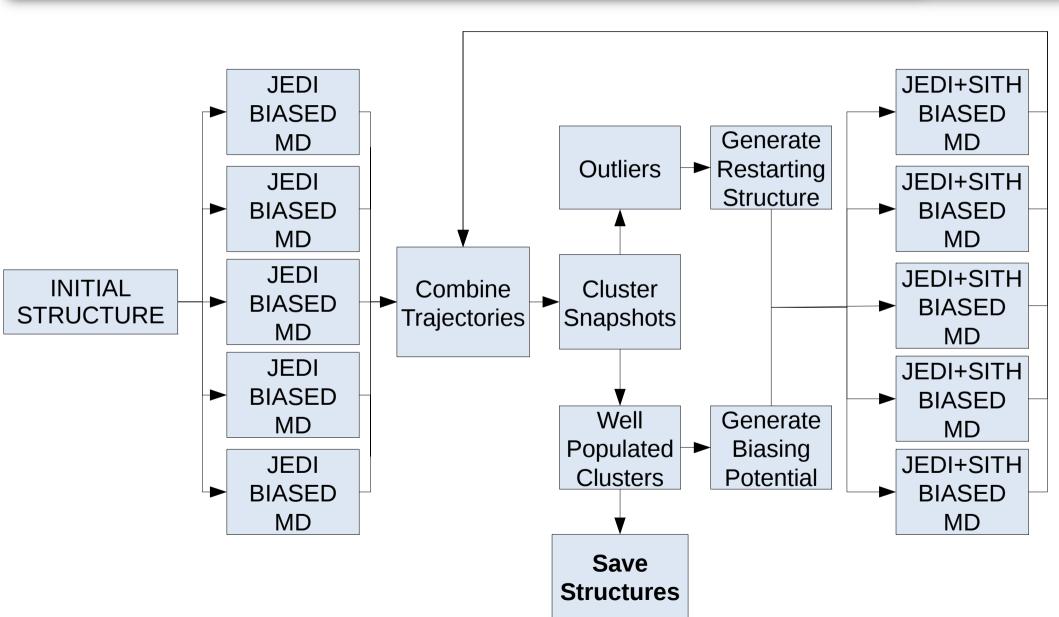






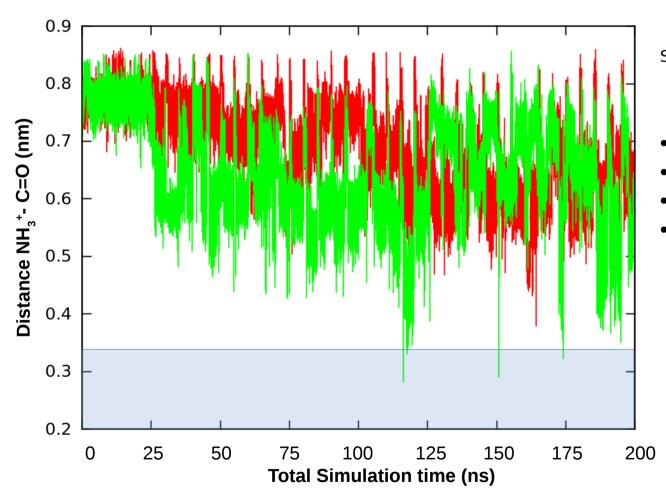






Results: sampling of Lys57 hydrogen bond



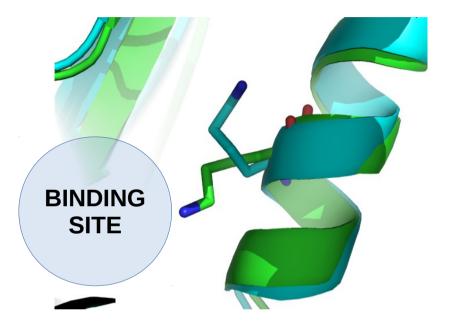




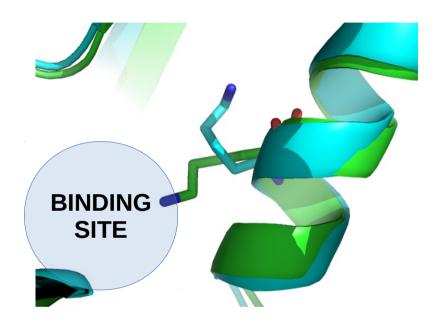
- 8 iterations
- 5 x 5 ns trajectories
- Total = 200 ns
- SITH on Lys57 torsions



SITH without a JEDI bias

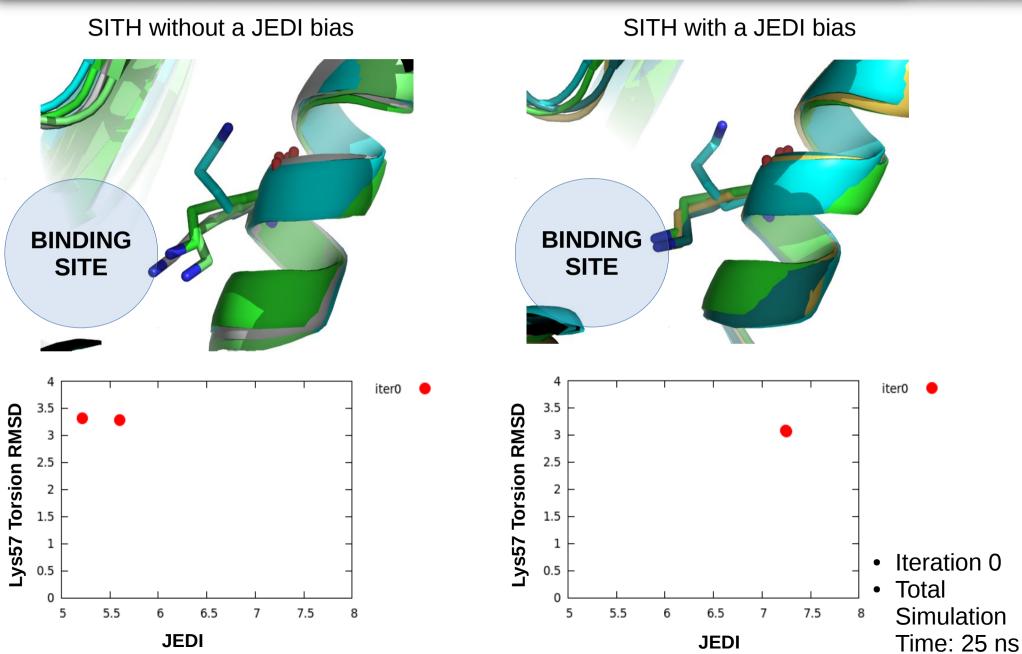


SITH with a JEDI bias

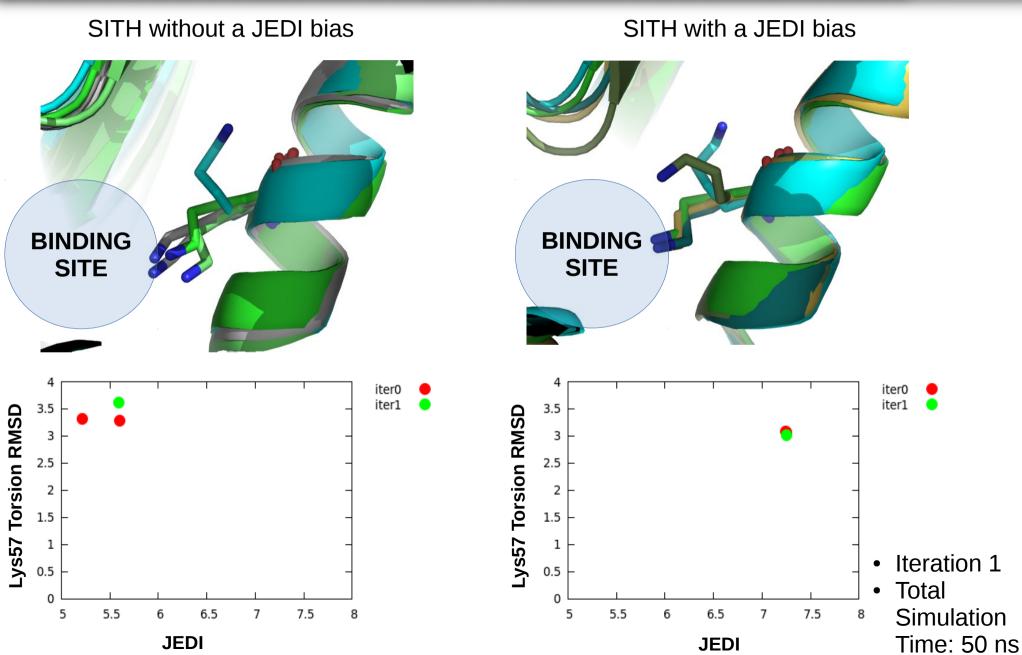


- Start
- Total Simulation Time: 0 ns

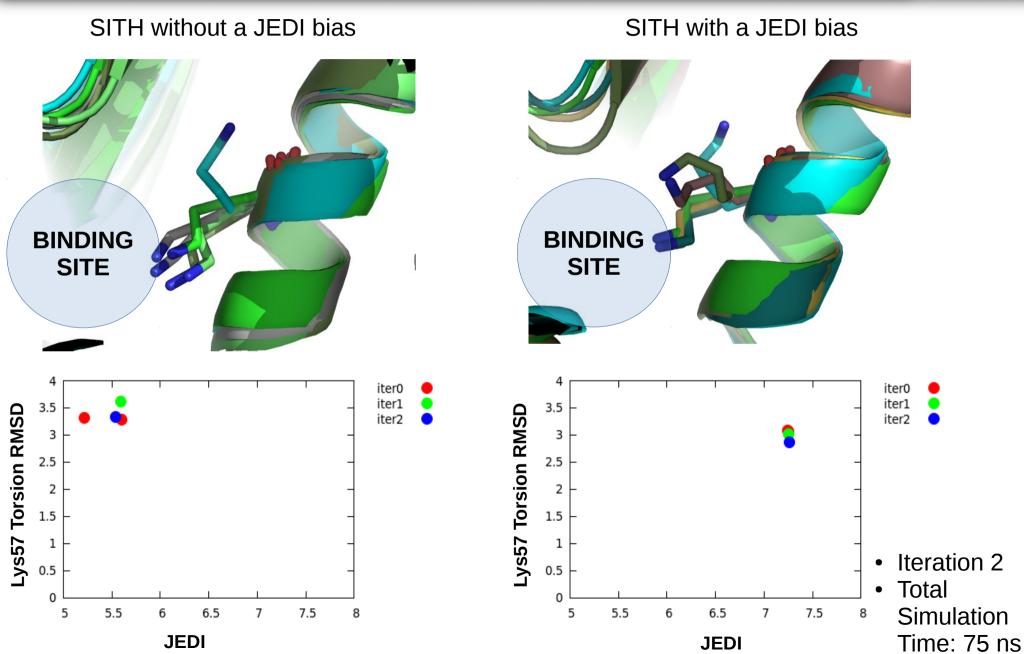




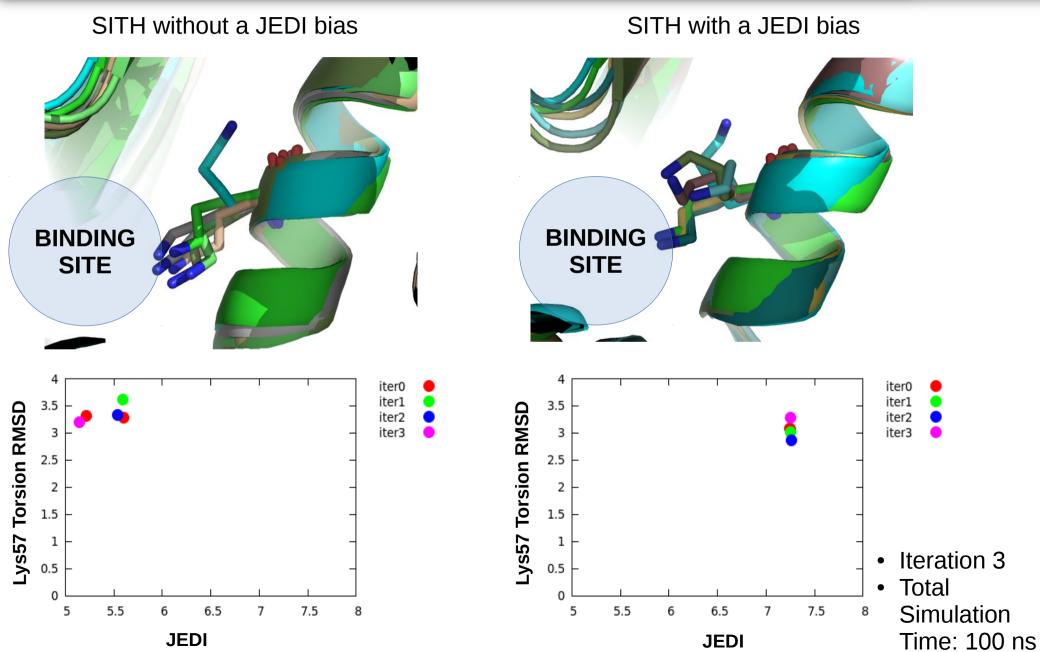




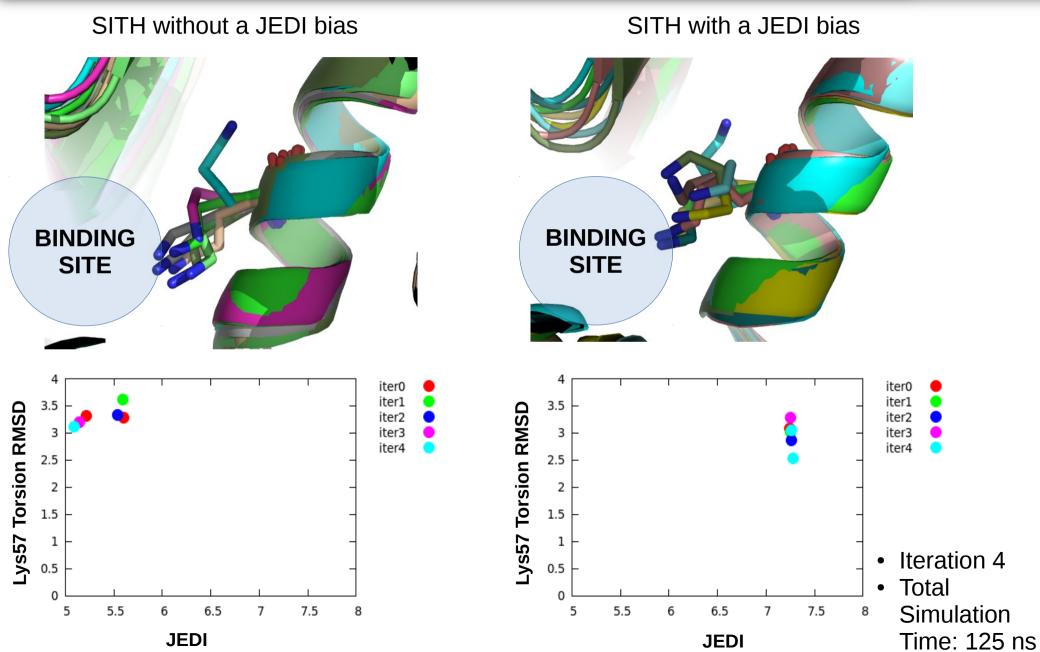




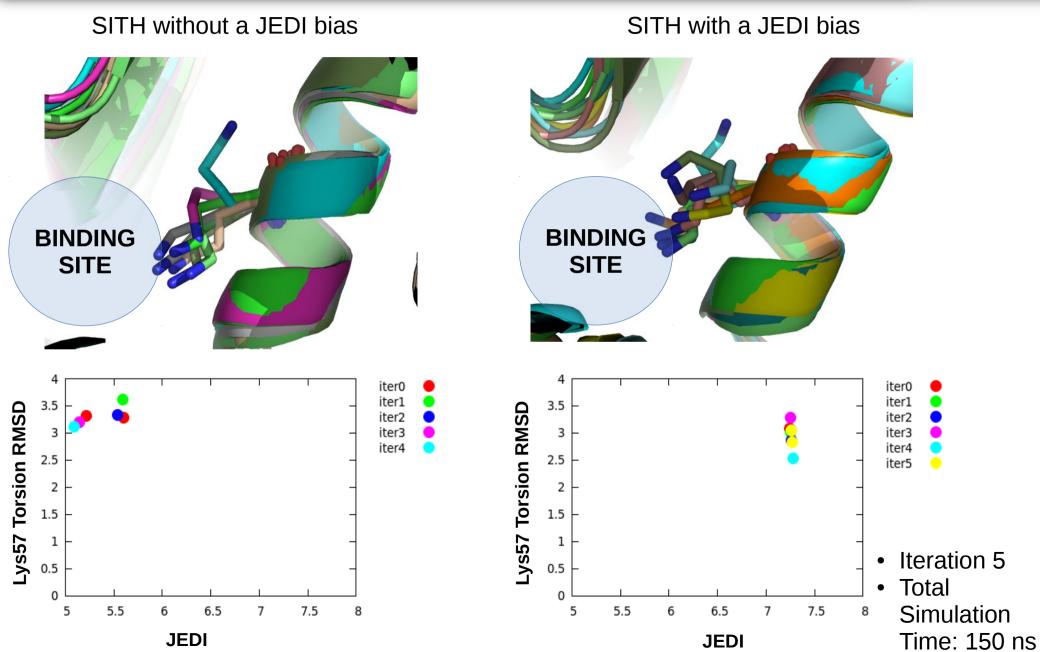




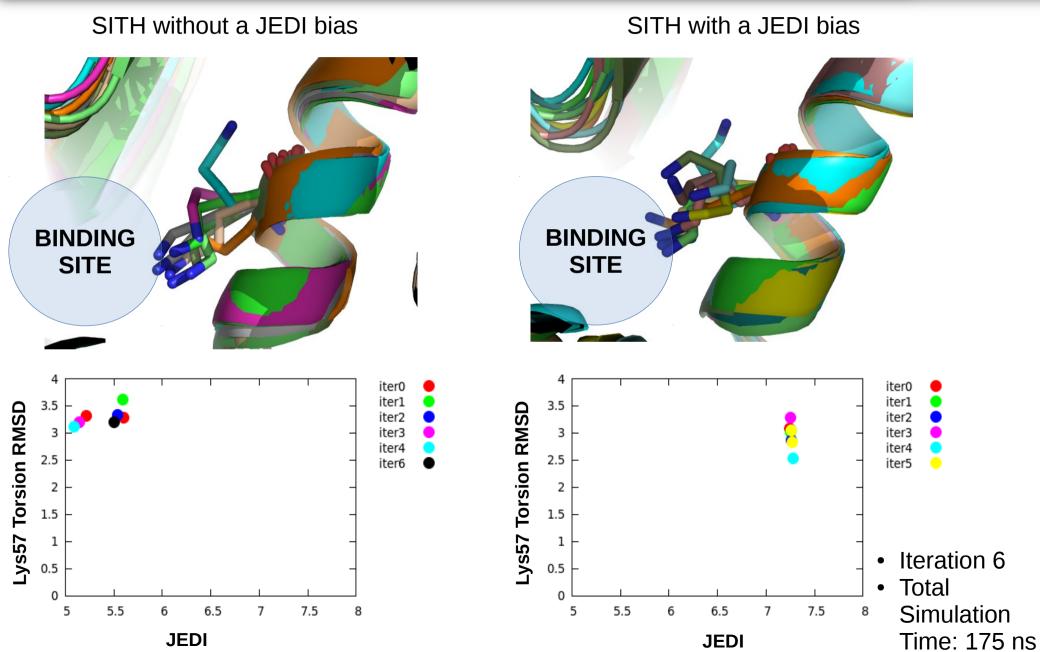




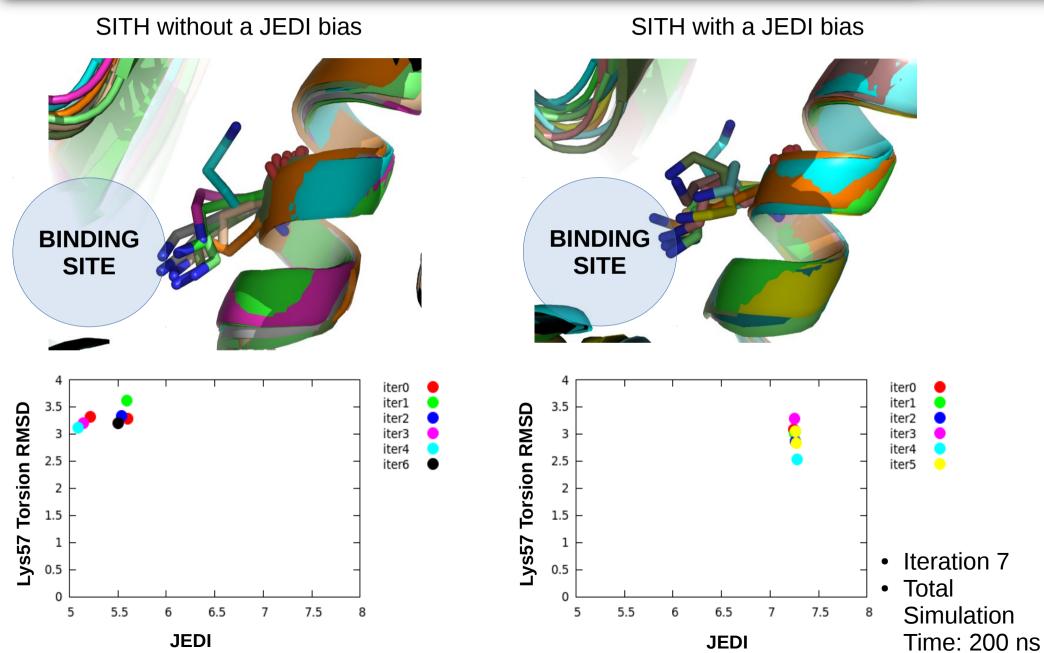












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Conclusions



Part 1: Druggability of cryptic protein pockets

 Exploring druggability could help design drugs for targets currently considered undruggable or improve the efficacy of treating known targets

Part 2: The JEDI approach

 JEDI is able to distinguish different protein conformations in rigid structures, but the scoring needs to be fixed to work in long MD simulations

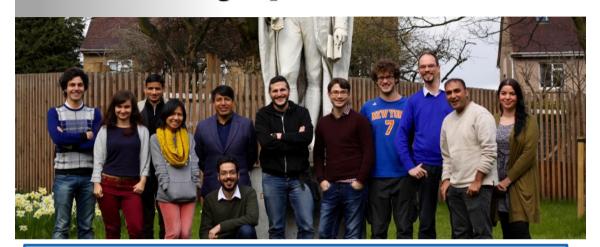
Part 3: The SITH sampling protocol

• The SITH protocol helps generate different conformations and sample the target structure, but the clustering function needs to be optimised in order to identify it as a cluster center.

Acknowledgements



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