From Quarks to Drugs

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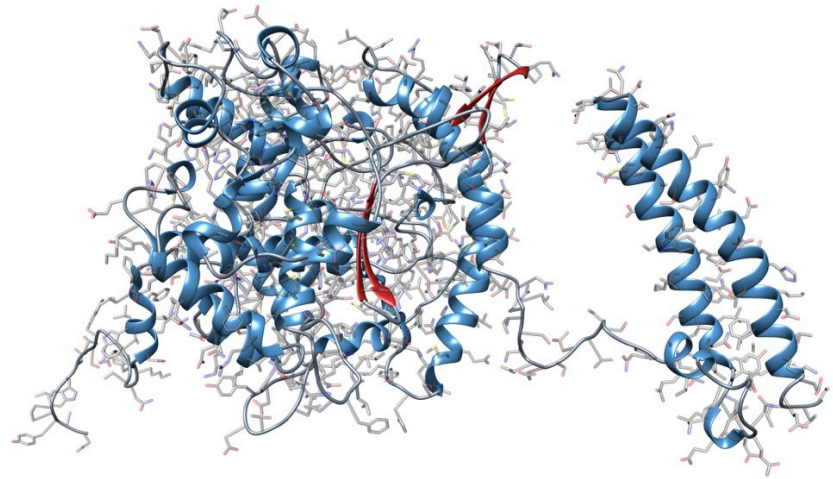
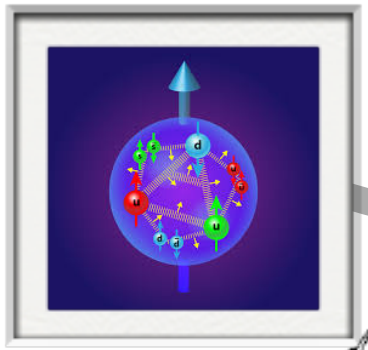
and Applications



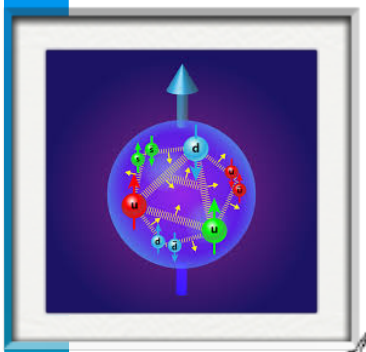
A SCIENTIFIC JOURNEY



Fundamental

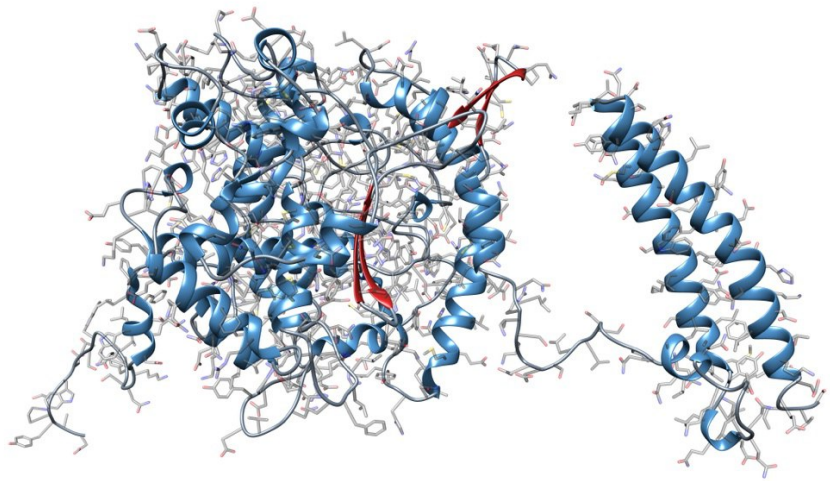
Applied

Physics

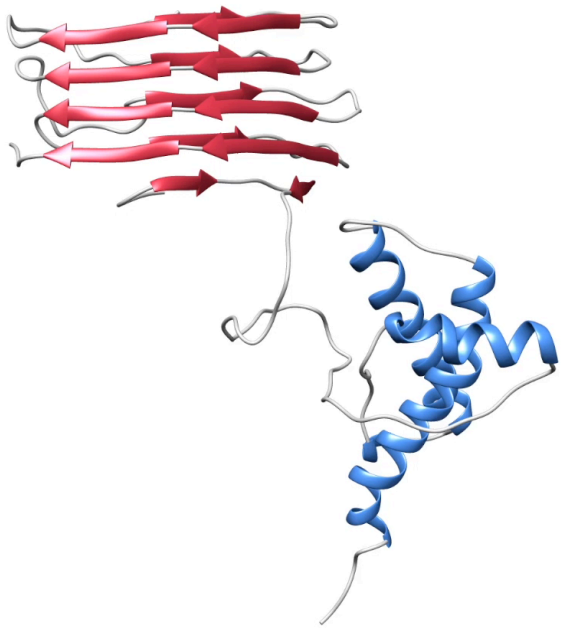


Biology

Prologue: proteins are complex many-body systems.



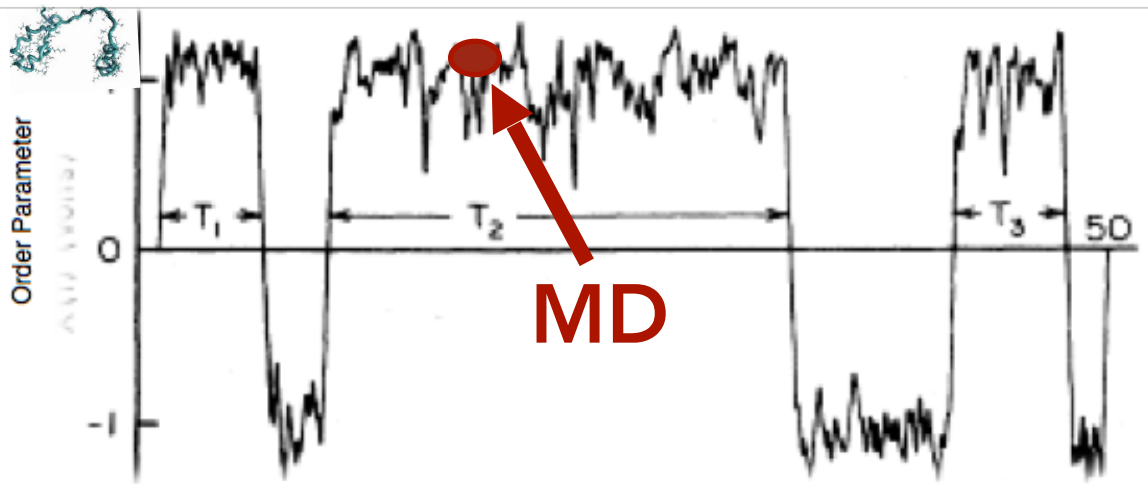
REDUCTIONIST'S APPROACH TO MOLECULAR BIOLOGY

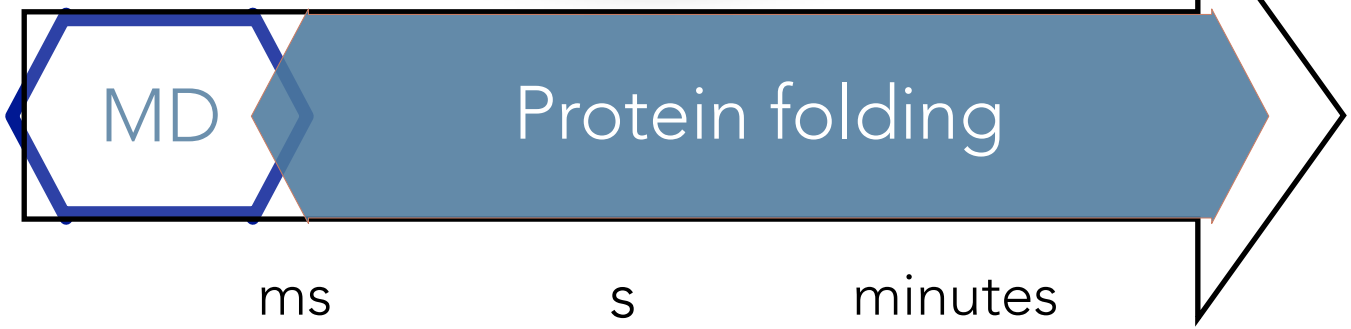


Challenge:

Integrate ~10^6 coupled Newton-type equations looking for **extremely rare events**

RARE EVENT PROBLEMS

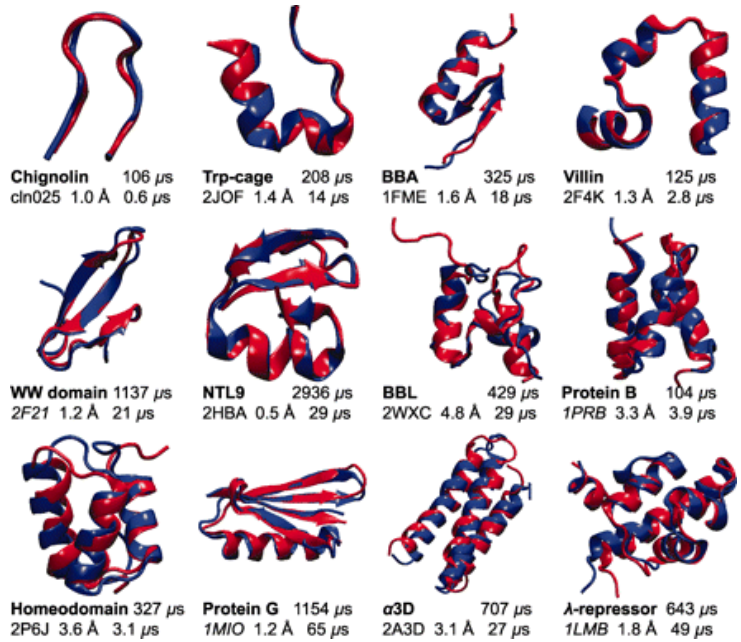




MD YIELDS CORRECT PROTEIN NATIVE STATES

Anton supercomputer
(DES Research)

MD



Science
AAAS

Atomic-Level Characterization of the Structural Dynamics of Proteins
David E. Shaw, *et al.*
Science **330**, 341 (2010);
DOI: 10.1126/science.1187409

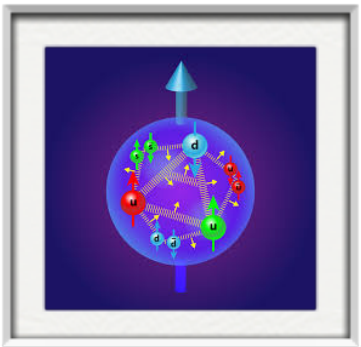
How Fast-Folding Proteins Fold

Kresten Lindorff-Larsen,[1*†] Stefano Piana,[1*†] Ron O. Dror,[1] David E. Shaw[1,2†]

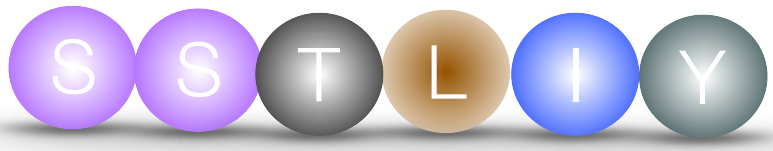
ZOOLOGY OF ENHANCED SAMPLING METHODS

Markov State Models (Folding@Home), Milestoning, Transition Path Sampling, Transition Interface Sampling, Forward Flux Sampling, Temperature Accelerated Molecular Dynamics, Metadynamics, Umbrella Sampling, Blue Moon Sampling, String Method,Stochastic Difference, … [and counting]

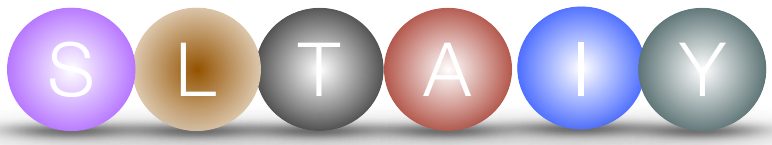
They are **all too computationally demanding** for many biologically relevant problems.



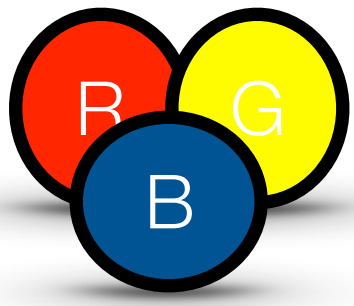
PROTEINS AND HADRONS ARE VERY SPECIAL



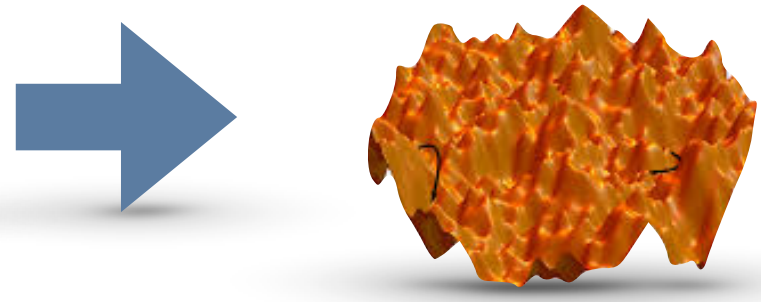
Random polypeptide

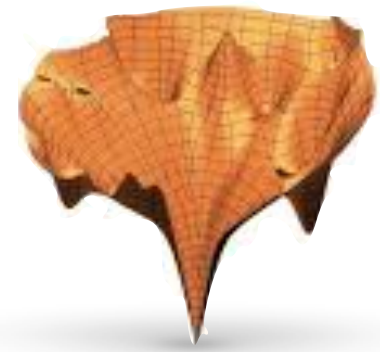


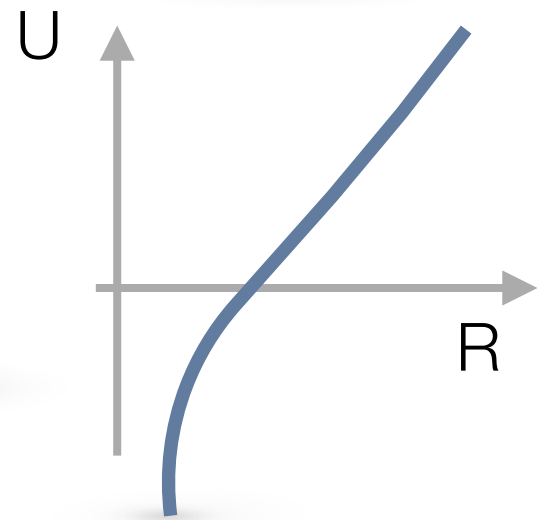
Protein



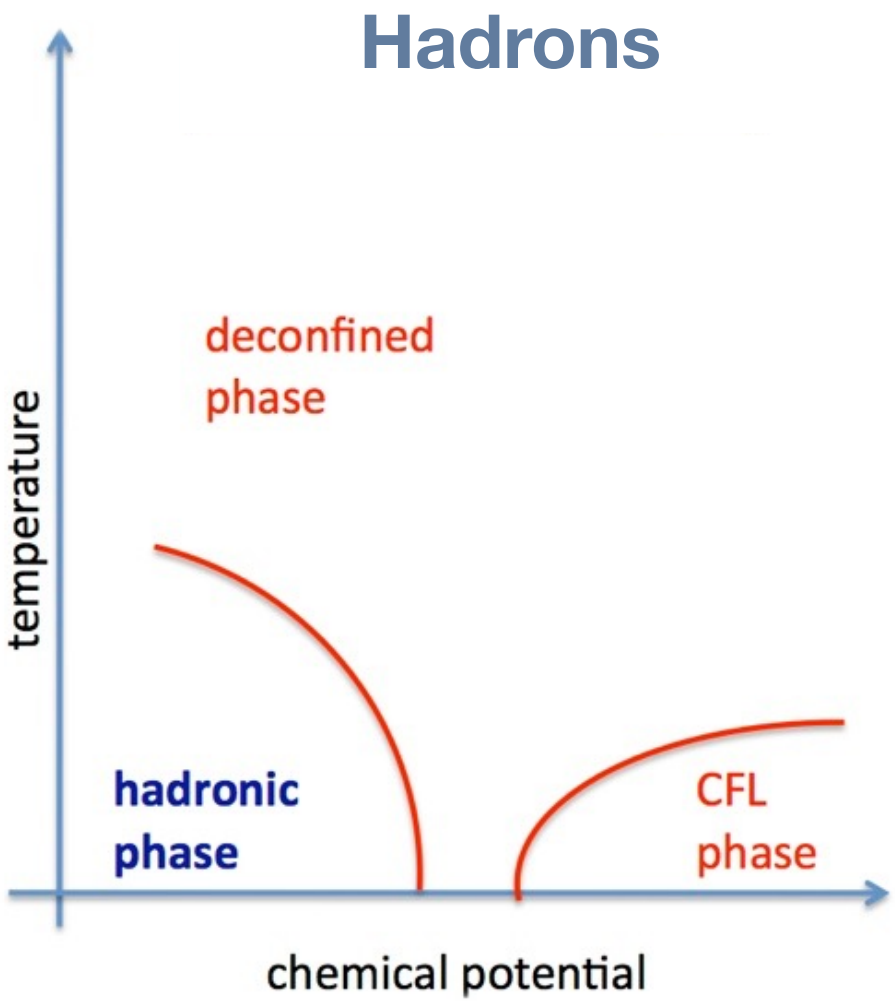
Baryon

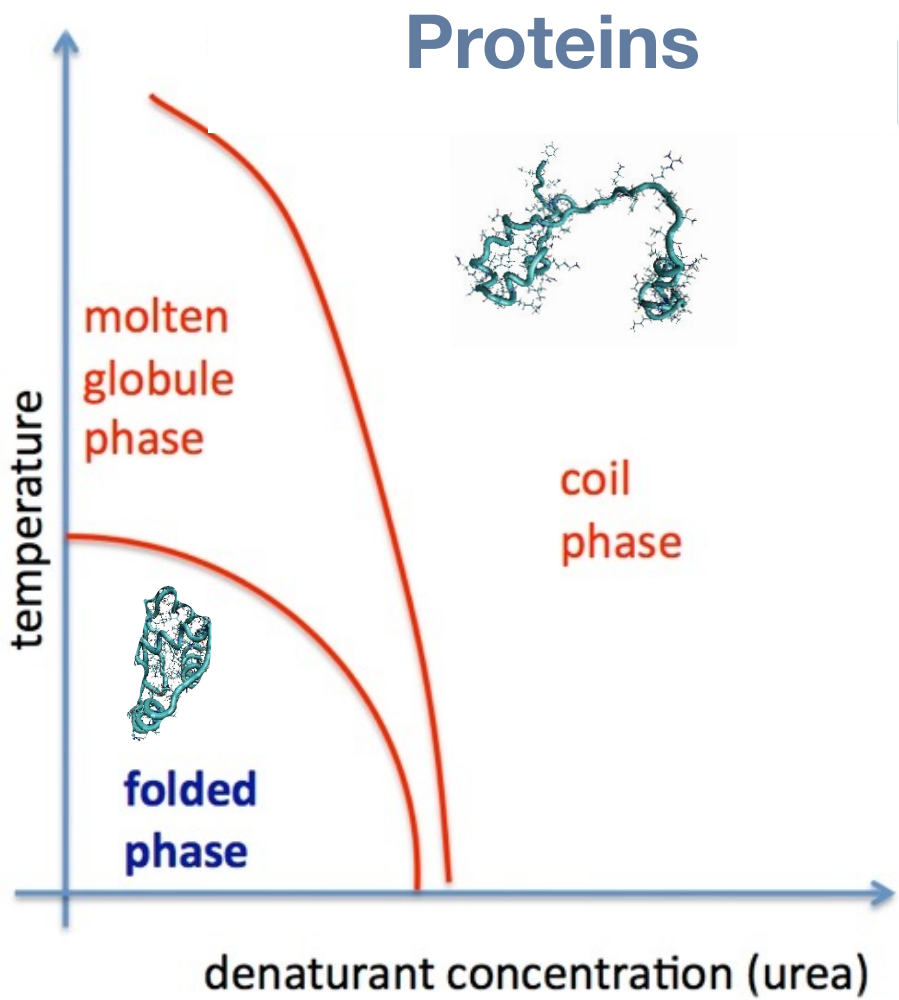




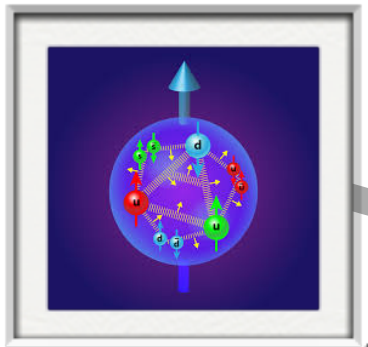


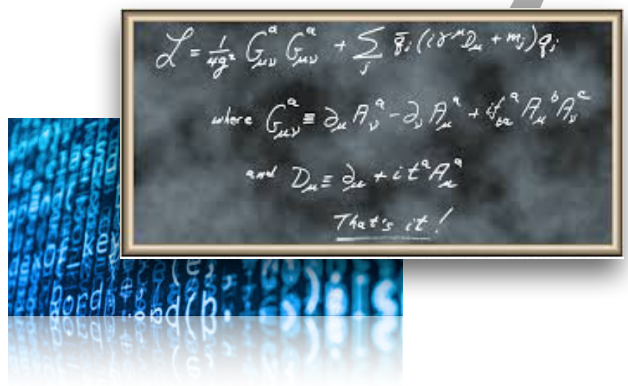
PHASE DIAGRAM





PHASE 1: MATHEMATICAL FORMALISM & HIGH PERFORMANCE COMPUTING





PATH INTEGRAL REPRESENTATION

Hamilton's equations

Langevin equations

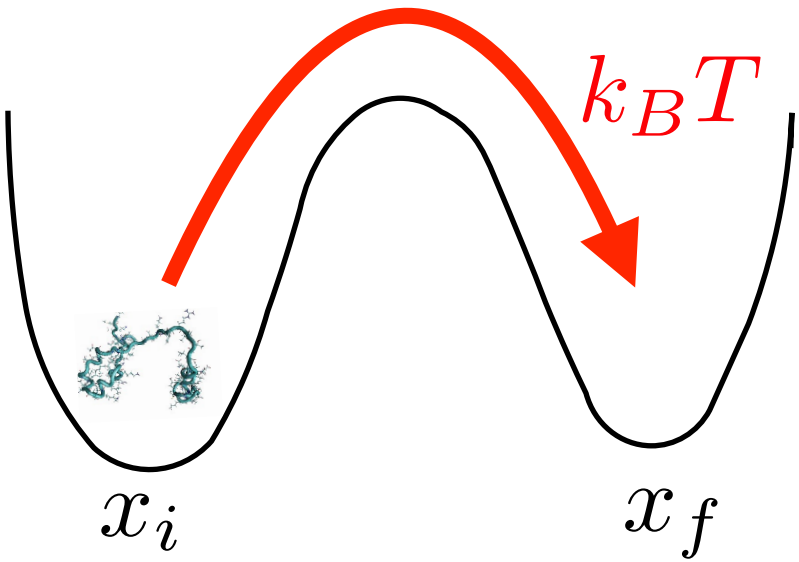
$$M\ddot{\mathbf{r}}_i = -\nabla_i U(\mathbf{R}) - \gamma_i \dot{\mathbf{r}}_i + \eta_i(t)$$

$$P(R_f, t|R_i, 0) = \int_{R_i}^{R_f} \mathcal{D}R \; e^{-\frac{\beta}{4m\gamma}\int_0^t d\tau (m\ddot{R}+m\gamma\dot{R}+\nabla U)^2}$$

A USEFUL ANALOGY

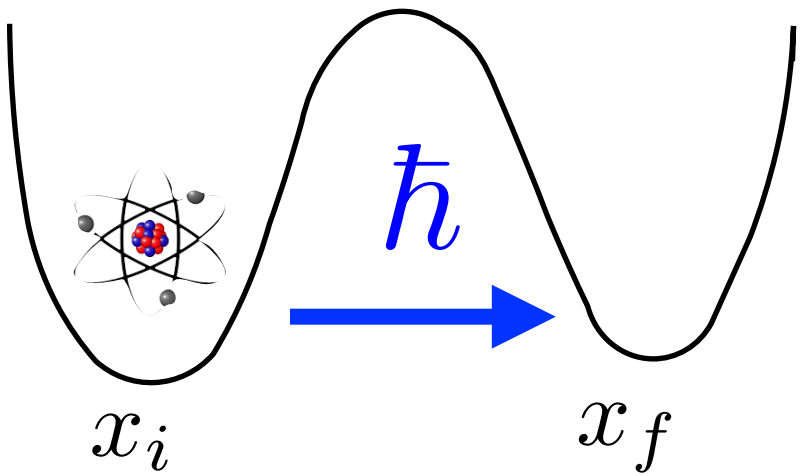
Thermal activation

$(\beta = (K_B T)^{-1})$



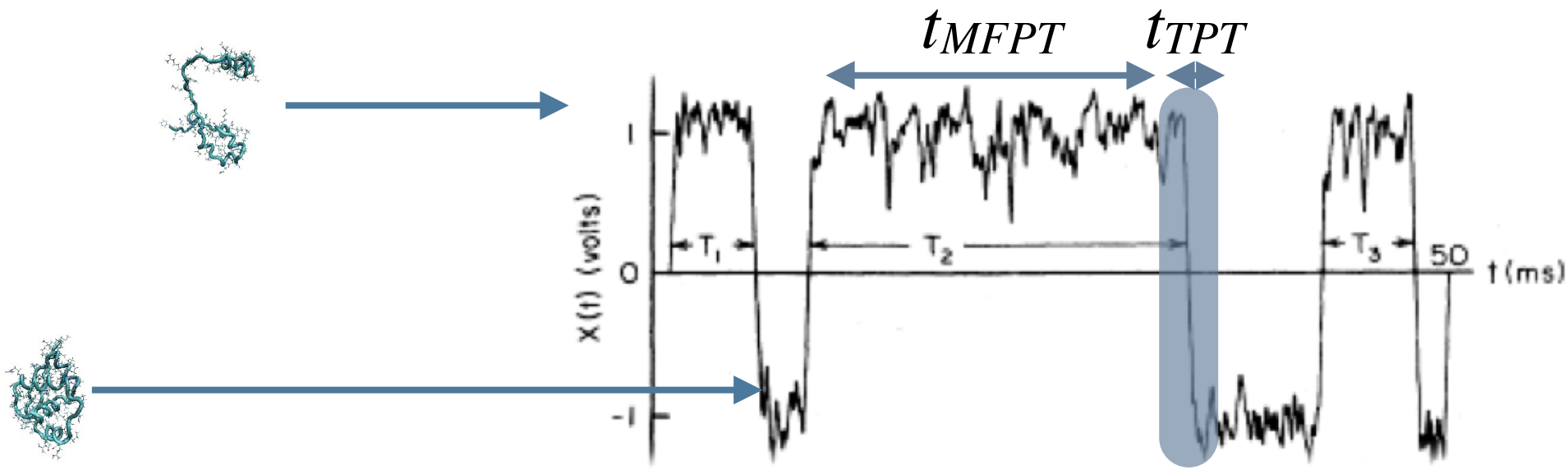
$$P(x_f, t|x_i) = \int_{x_i}^{x_f} \mathcal{D}q \; e^{-\frac{\beta}{4M\gamma} \int_0^t d\tau (M\ddot{q} + M\gamma\dot{q} + \nabla U(q))^2}$$

Quantum tunneling



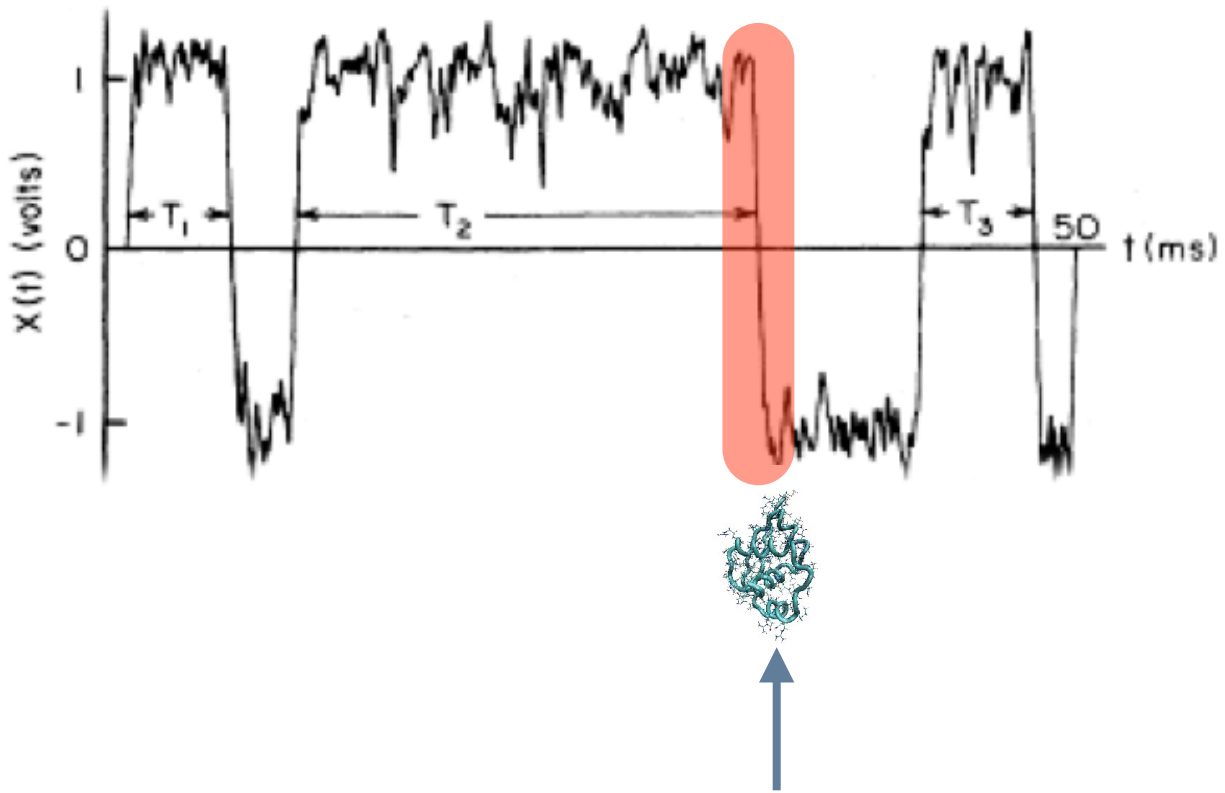
$$K_E(x_f, t|x_i) = \int_{x_i}^{x_f} \mathcal{D}q \; e^{-\frac{1}{\hbar} \int_0^t d\tau \left(\frac{M}{2}\dot{q}^2 + U(q) \right)}$$

ADVANTAGES



$$t_{TPT} \sim \tau_0 \log\left[\log\left(\frac{t_{MFPT}}{\tau_0}\right)\right]$$

IS THIS A "FREE LUNCH"?



All atom 3D structure of the native state **are given in input,** not predicted

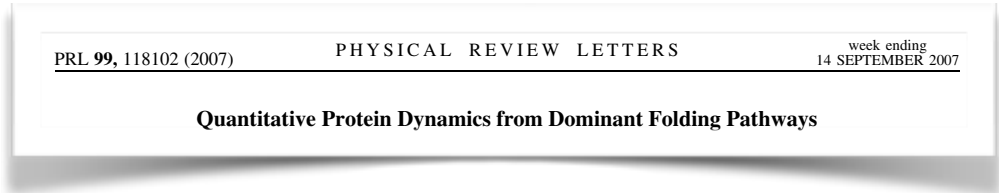
VARIATIONAL APPROACHES TO TRANSITION PATH SAMPLING

Dominant **R**eaction **P**athways


PRL **97,** 108101 (2006) PHYSICAL REVIEW LETTERS week ending 8 SEPTEMBER 2006

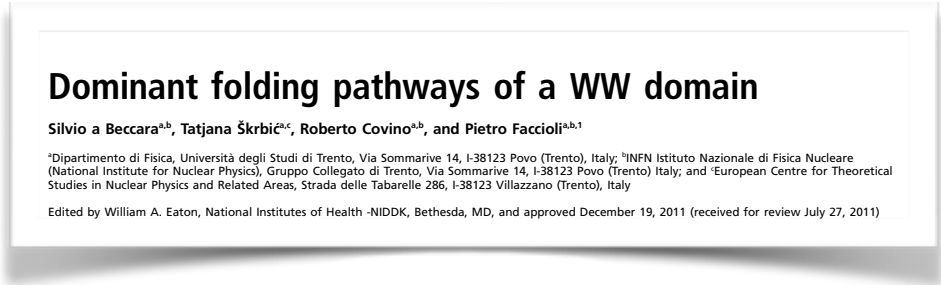
Dominant Pathways in Protein Folding

(2005)


PRL **99,** 118102 (2007) PHYSICAL REVIEW LETTERS week ending 14 SEPTEMBER 2007

Quantitative Protein Dynamics from Dominant Folding Pathways

(2006)


Dominant folding pathways of a WW domain

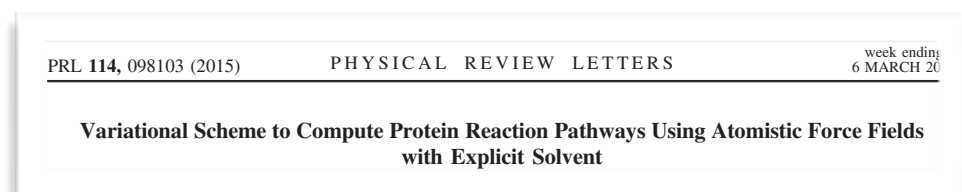
Silvio a Beccara[a,b], Tatjana Škrbić[a,c], Roberto Covino[a,b], and Pietro Faccioli[a,b,1]

[a]Dipartimento di Fisica, Università degli Studi di Trento, Via Sommarive 14, I-38123 Povo (Trento), Italy; [b]INFN Istituto Nazionale di Fisica Nucleare (National Institute for Nuclear Physics), Gruppo Collegato di Trento, Via Sommarive 14, I-38123 Povo (Trento) Italy; and [c]European Centre for Theoretical Studies in Nuclear Physics and Related Areas, Strada delle Tabarelle 286, I-38123 Villazzano (Trento), Italy

Edited by William A. Eaton, National Institutes of Health -NIDDK, Bethesda, MD, and approved December 19, 2011 (received for review July 27, 2011)

(2012)

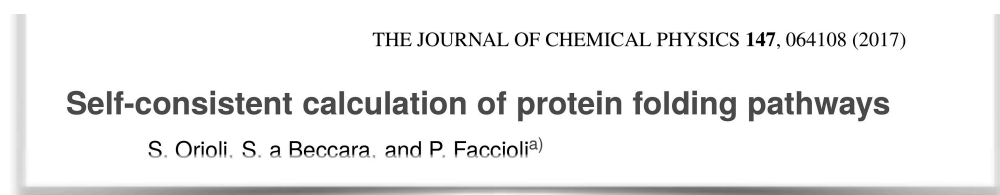
Bias **F**unctional **A**pproach


PRL **114,** 098103 (2015) PHYSICAL REVIEW LETTERS week ending 6 MARCH 20

Variational Scheme to Compute Protein Reaction Pathways Using Atomistic Force Fields with Explicit Solvent

(2015)

Self **C**onsistent **P**ath **S**ampling


THE JOURNAL OF CHEMICAL PHYSICS **147**, 064108 (2017)

Self-consistent calculation of protein folding pathways

S. Orioli, S. a Beccara, and P. Faccioli[a)]

(2017)

FULLY EXPLOITING THEORETICAL PHYSICS TOOLS

between the Gibbs distribution and the SCR estimate forward- and backward-committors, as in Eq. (A3). Introducing the distribution

$$P^{(P)}(x,t) \equiv \int dx_i\, P^{(P)}(x,t|x_i,0)\, \rho_0(x_i), \qquad (23)$$

the density in Eq. (22) reads

$$m_{SCR}(x) = \frac{1}{t_f - \tau_0} \int_{\tau_0}^{t_f} dt\; Q^{(R)}(x, t_f - t) P^{(P)}(x,t).$$

Using the detailed balance condition, we find $P^{(P)} = e^{-\beta U(x)} \frac{1}{Z_R} Q^{(P)}(x,t)$. Then, inserting this result into Eq. we find

$$m_{SCR}(x) = \frac{e^{-\beta U(x)}}{Z_R\,(t_f - \tau_0)} \int_{\tau_0}^{t_f} dt Q^{(R)}(x, t_f - t) Q^{(P)}(x,t).$$

Finally, recalling that $Q^{(R)}(x,t)$ and $Q^{(P)}(x,t)$ are n time-independent in the SCR and using Eqs. (17) and we recover a fundamental result of TPT [cf. Eq. (A Appendix A],

$$m_{SCR}(x) \propto e^{-\beta U(x)}\, q^{+}_{SCR}(x)\,(1 - q^{+}_{SCR}(x)\,).$$

Within the same framework, it is possible to d the reactive current in the SCR in complete analogy Eq. (22),

$$J^{i}_{SCR}(x) = \frac{-D}{t_f - \tau_0} \int_{\tau_0}^{t_f} dt Q^{(R)}(x, t_f - t) \times (\overrightarrow{\nabla} - \overleftarrow{\nabla} + \beta \nabla U(x))\, P^{(P)}(x,t).$$

$$\mathcal{P}_{\rm bias}[X] = \int \mathcal{D}Y e^{-S_{\rm bias}[X,Y] - U(X_i,Y_i)/k_BT}, \qquad (3)$$

where the functional $S_{\rm bias}[X,Y]$ is defined as

$$S_{\rm bias} \equiv \frac{1}{4k_BT} \int_0^t d\tau \Big[\sum_{i=1}^{N} \frac{1}{\gamma_i m_i} (m_i \ddot{\mathbf{x}}_i + m_i\gamma_i \dot{\mathbf{x}}_i + \nabla_i U - \mathbf{F}^{\rm bias}_i)^2 + \sum_{j=1}^{N'} \frac{1}{\gamma_j m_j} (m_j \ddot{\mathbf{y}}_i + m_j\gamma_j \dot{\mathbf{y}}_j + \nabla_j U)^2 \Big]. \qquad (4)$$

The Onsager-Machlup functional $S_{\rm OM}[X,Y]$ entering Eq. (2) is recovered, setting $\mathbf{F}^{\rm bias}_i = 0$ in Eq. (4).

Let us now return to the problem of computing the reaction pathways in the *unbiased* Langevin dynamics [Eq. (1)]. Using the standard reweighting trick we can write the variational condition $(\delta/\delta X)\mathcal{P}[X] = 0$ as

$$\frac{\delta}{\delta X} [\mathcal{P}_{\rm bias}[X] \langle e^{-(S_{\rm OM}[X,Y] - S_{\rm bias}[X,Y;t])} \rangle_{\rm bias}] = 0. \qquad (5)$$

We now introduce our main approximation, by restricting the search for the optimum path $X(\tau)$ within an ensemble of trajectories generated by integrating the *biased* Langevin equation. By definition, these paths have a large statistical weight in the biased dynamics; i.e., they lie in the functional vicinity of some path $\bar{X}(\tau)$ which satisfies $(\delta/\delta\bar{X})\mathcal{P}[\bar{X}] = 0$. Thus, the typical biased paths approx-

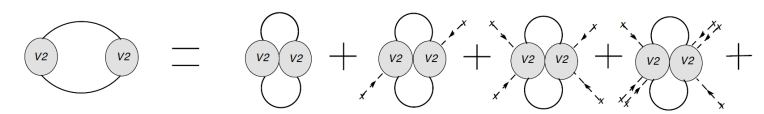


FIG. 3: Diagrammatic representation of the local time-derivative expansion of a non-local diagram —Eq. (49)—. Solid lines are fast-mode propagators, while dashed lines represent a single time derivative acting on the corresponding vertex function.

Notice that each term in the perturbative expansion (35) generates a new vertex, with an increasing power of the $x_>(\tau)$ field. The couplings to the fast modes depend implicitly on the time τ, through the slow modes $x_<(\tau)$.

By Wick theorem, each term in the series (34) can be related to a Feynman graph with vertexes given by (36) and propagators given by —see appendix A —:

$$\langle x^i_>(\tau_1)\; x^j_>(\tau_2)\rangle_0 = \sum_{|\omega_m|,|\omega_n| \in S_b} G^{0\;ij}_>(\omega_n,\omega_m)\; e^{i(\omega_m\tau_1 + \omega_n\tau_2)} = \sum_{|\omega_n| \in S_b} \delta_{ij}\, \frac{2}{\beta\;\gamma\;t\;\omega_n^2}\; e^{i\omega_m(\tau_2 - \tau_1)}. \qquad (37)$$

The expansion (34) can be re-organized as the exponent of the sum performed over only connected diagrams:

$$e^{-\beta\; S_>[x<(\tau)]} = e^{\sum \text{(all connected diagrams)}}. \qquad (38)$$

Hence, the path integral (26) for the slow modes can be given the following exact diagrammatic representation

$$Z(t) \equiv \oint \mathcal{D}x_<\; e^{-\beta\; S_{eff}[x_<(t)]] + \sum \text{(all connected diagrams)}}. \qquad (39)$$

Below we give a classification of all the connected diagrams that may give a contribution to the expansion above

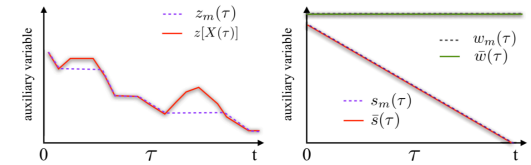


FIG. 1. Illustrative representation of the dynamics of the auxiliary variables introduced in the path integral representation of rMD (left panel) and in the derivation self-consistent path sampling algorithm (right panel).

of such a variable is frozen any time z_m becomes smaller than $z(X)$ and any time the collective coordinate $z(X)$ is increasing. Its time derivative is otherwise set equal to $\dot{z}(X)$. Therefore, by choosing the initial conditions $z_m(0) = z(X(0))$, $z_m(\tau)$ is identically set equal to the minimum value attained by the collective coordinate z until time τ (see left panel of Fig. 1).

The functional $S_{rMD}[X, z_m]$ in the exponent of Eq. (8) coincides with an OM action with the addition of the unphysical biasing force $\mathbf{F}_i$,

$$S_{rMD} = \sum_{i=1}^{N} \Gamma_i \int_0^t d\tau\, [m_i \ddot{\mathbf{x}}_i + m_i\gamma_i \dot{\mathbf{x}}_i + \nabla_i U - \mathbf{F}_i]^2. \qquad (9)$$

In Eq. (8), $\Phi[z_m, X]$ denotes a Jacobian factor that needs to be introduced in order to ensure that the statistical weight of the paths is not affected by the measure of the $\int \mathcal{D}z_m$ integral, i.e.,

$$\int \mathcal{D}z_m \Phi[z_m, X]\; \delta\Big[z_m(\tau) - \int_0^\tau d\tau' \dot{z}[X(\tau')]\theta(-\dot{z}[X(\tau')])$$

III. SELF-CONSISTENT PATH SAMPLING

Let us now introduce our new algorithm, which provides major improvement with respect to the rMD and BF schemes discussed in Sec. II A. Indeed, it follows directly from the unbiased Langevin equation and allows us to remove the systematic errors associated to the choice of biasing coordinate.

Our starting point is path integral representation of the *unbiased* Langevin dynamics (2). We introduce two dumb auxiliary variables $w_m(\tau)$ and $s_m(\tau)$ into this path integral by means of appropriate functional Dirac deltas,

$$p(X_N, t|X_U) = \int_{X_U}^{X_N} \mathcal{D}X \cdot e^{-S[X]} \int_{\bar{s}(0)} \mathcal{D}s_m \int_{\bar{w}(0)} \mathcal{D}w_m \cdot \delta\Big[w_m(\tau) - \int_0^\tau d\tau' \dot{\bar{w}}(\tau')\,\theta(-\dot{\bar{w}}(\tau'))\,\theta(w_m(\tau') - \bar{w}(\tau'))\Big] \cdot \delta\Big[s_m(\tau) - \int_0^\tau d\tau' \dot{\bar{s}}(\tau')\,\theta(-\dot{\bar{s}}(\tau'))\,\theta(s_m(\tau') - \bar{s}(\tau'))\Big], \qquad (12)$$

where $\bar{s}(\tau)$ and $\bar{w}(\tau)$ are two external time-dependent functions to be defined below. In analogy with the path integral repre-

$$V^R_{eff}(\mathbf{X}) \simeq \frac{D_0\,(1-b)}{\pi\, b\Omega} \nabla^2 V_{eff}(\mathbf{X}) + \frac{1}{2}\left(\frac{D_0(1-b)}{\pi\, b\Omega}\right)^2 \nabla^4 V_{eff}(\mathbf{X}) + \frac{1}{6}\left(\frac{D_0\,(1-b)}{\pi b\Omega}\right)^3 \nabla^6 V_{eff}(\mathbf{X}) - \frac{D_0^2(1-b^3)}{3\pi\,(b\Omega)^3}\left(\partial_i\partial_j V_{eff}(\mathbf{X})\right)^2. \qquad (24)$$

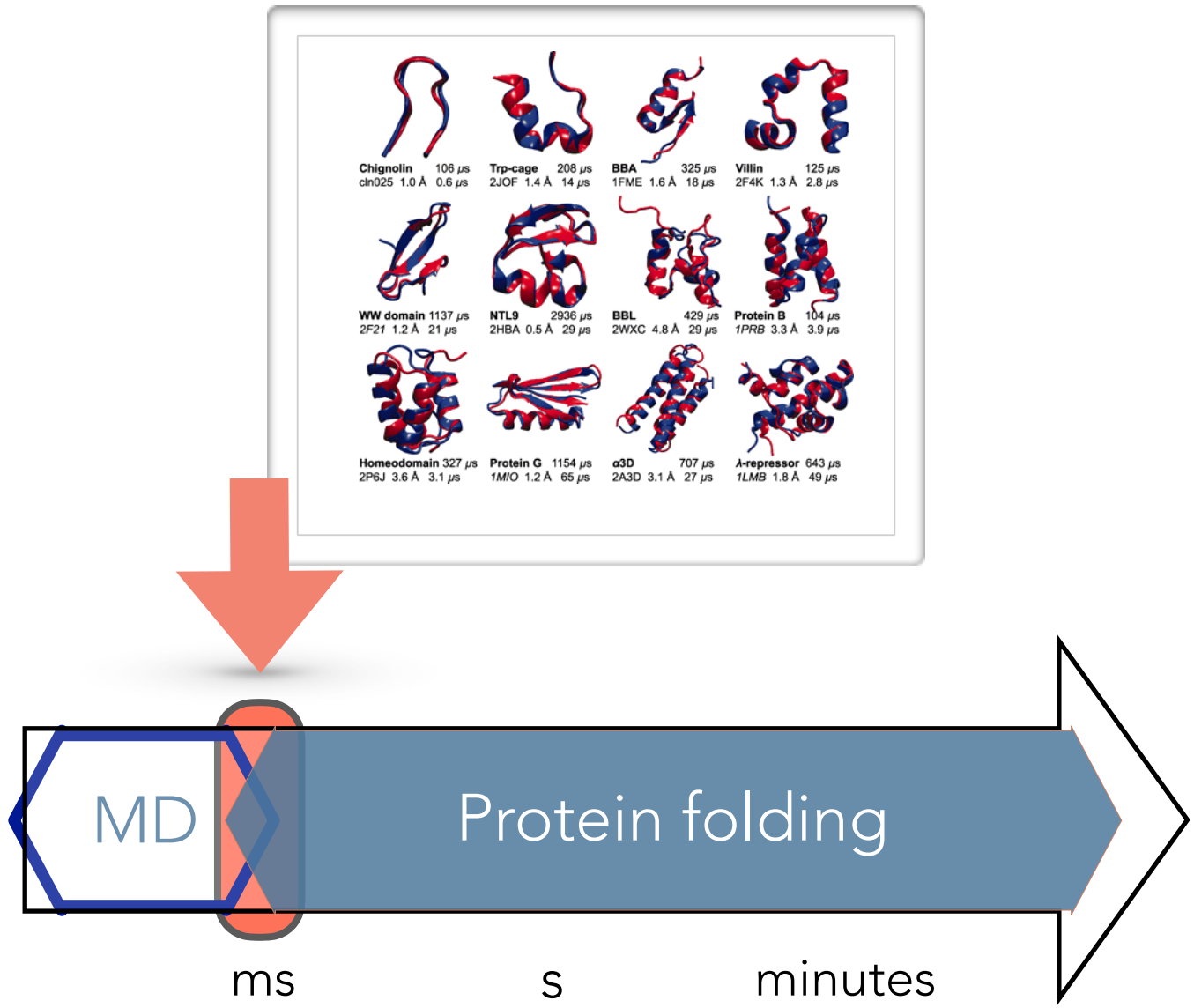
Note that the first line is the leading order term (i.e. $L = 1$) , while the second and third lines display the order $L = 2$ and $L = 3$ corrections, respectively.

We emphasize that the result of the EST construction is a new expression for the *same* path integral (15), in which the UV cutoff been lowered from Ω to $b\Omega$. Equivalently, the path integral is discretized according to a larger elementary time step, $\Delta t \to \Delta t/b$:

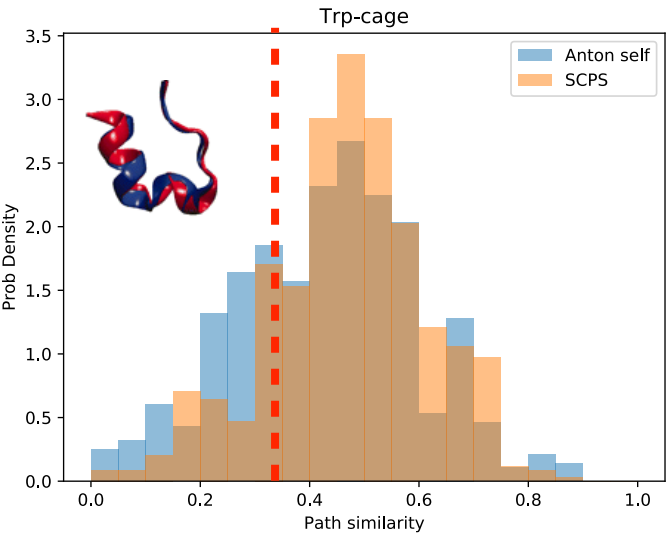
$$Z^{\Delta t}(t) \equiv \oint_{\Delta t} \mathcal{D}\mathbf{X}\, e^{-S_{eff}[\mathbf{X}]} \propto \oint_{\Delta t/b} \mathcal{D}\mathbf{X}\, e^{-S_{eff}[\mathbf{X}] - \int_0^t d\tau\, V^R_{eff}[\mathbf{X}(\tau)]} \equiv Z^{\Delta t/b}_{EST}(t) \qquad (25)$$

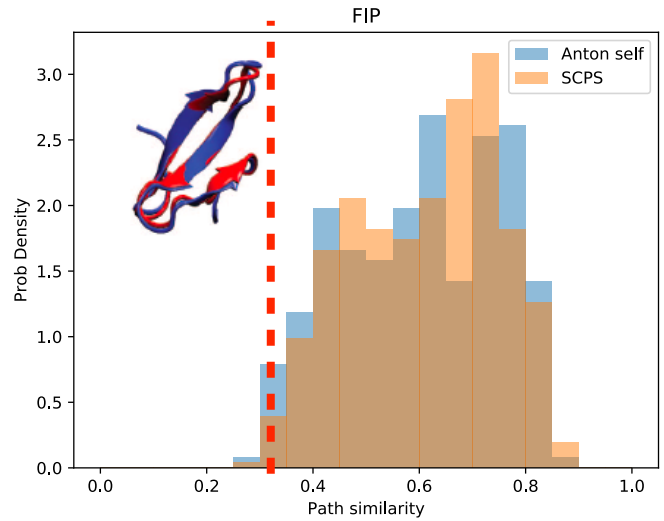
In these expressions, the symbol $\oint_{\Delta t}$ denotes the fact that the path integral is discretized according to an elementary time step Δt and we have suppressed the subscript "<", in the paths. It can be shown that the proportionality factor between $Z^{\Delta t}(t)$ and

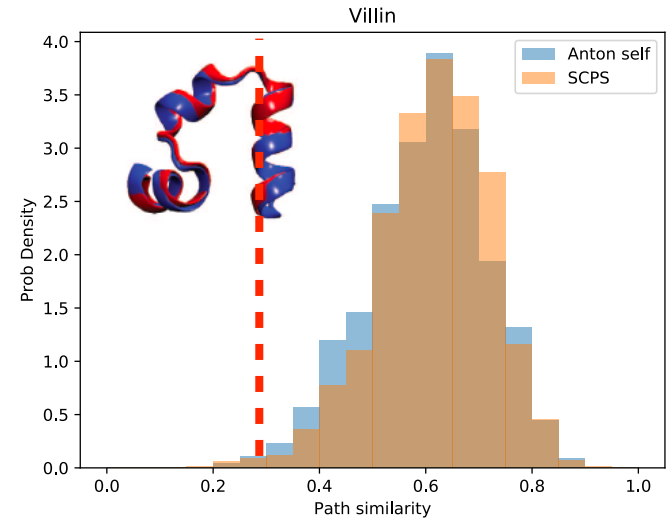
VALIDATING SCPS AGAINST MD

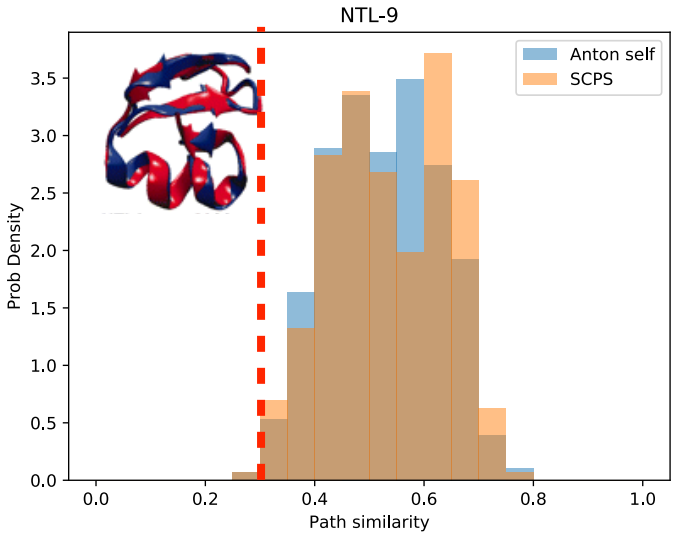


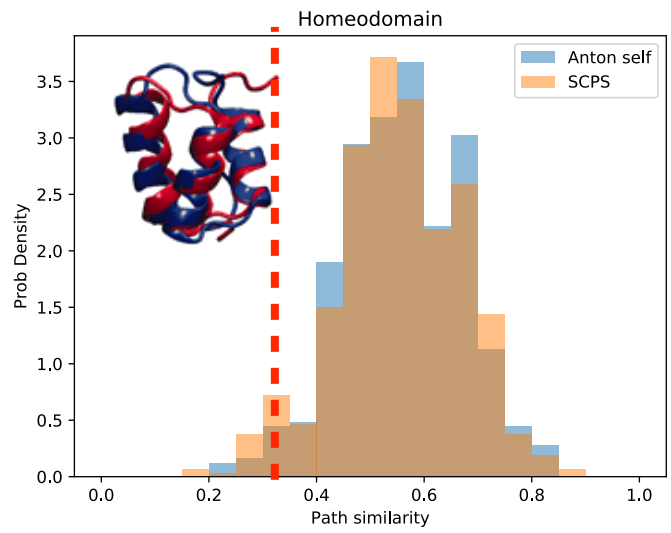
VALIDATING SCPS AGAINST MD

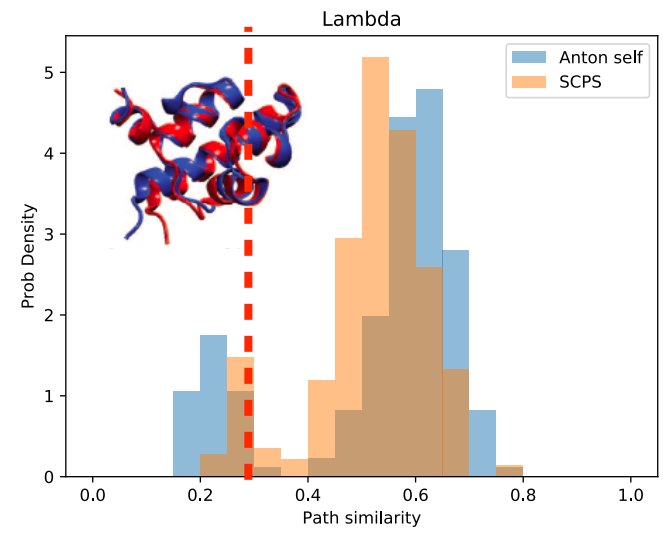




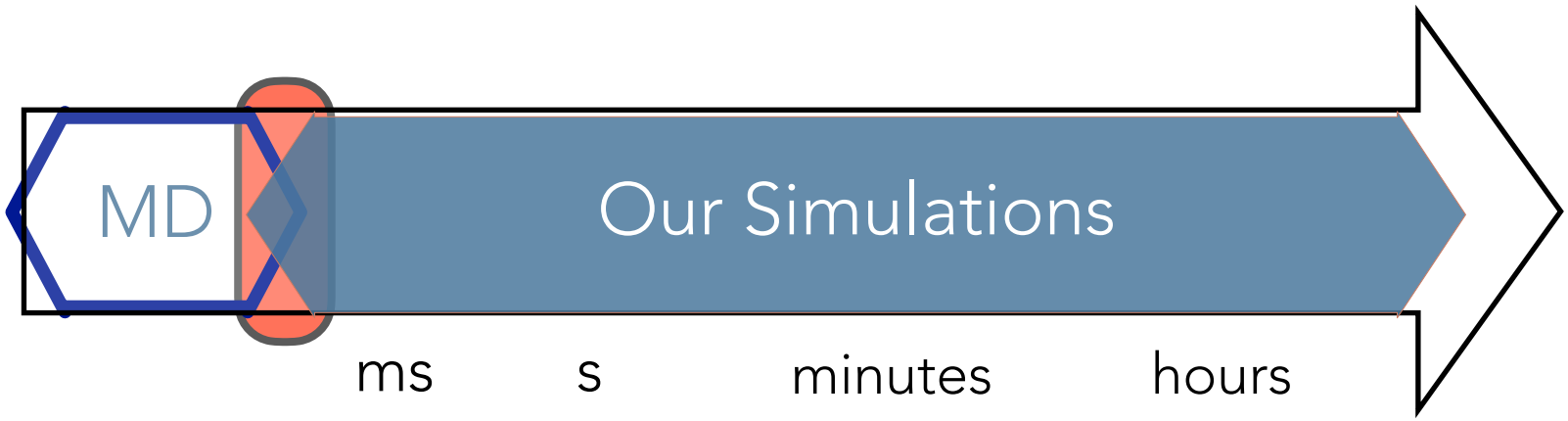


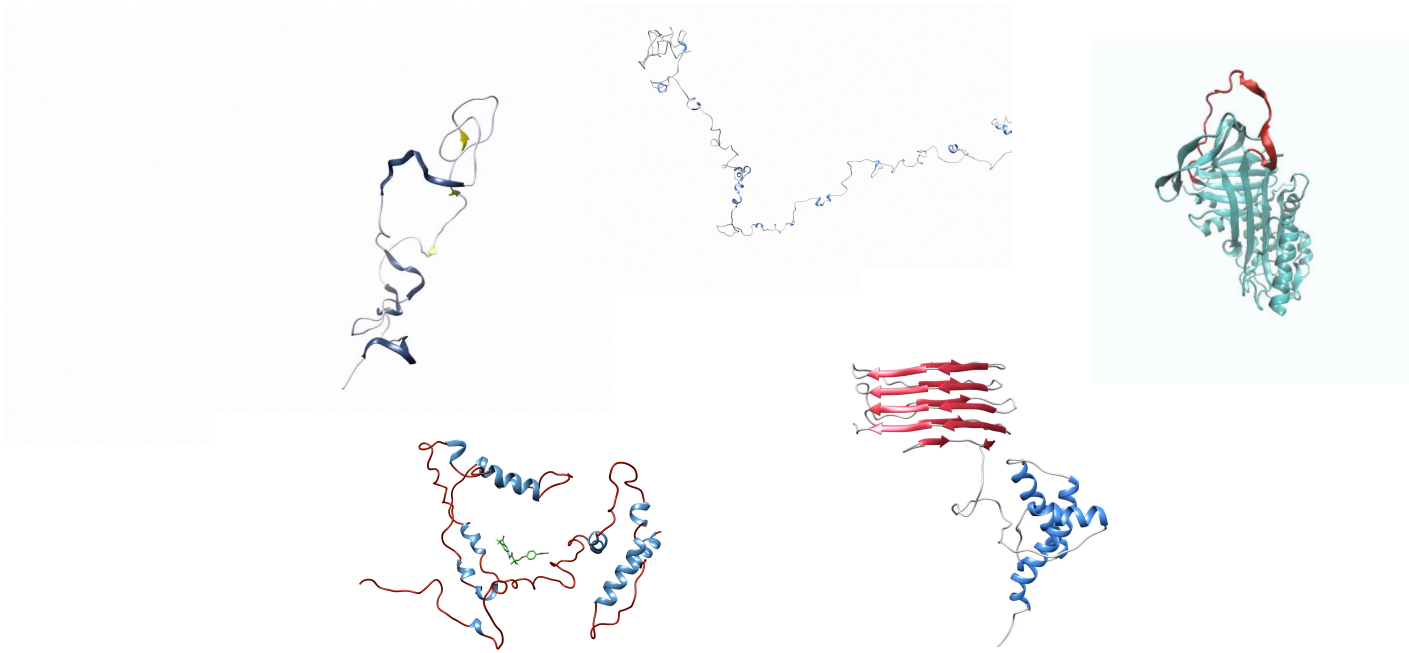




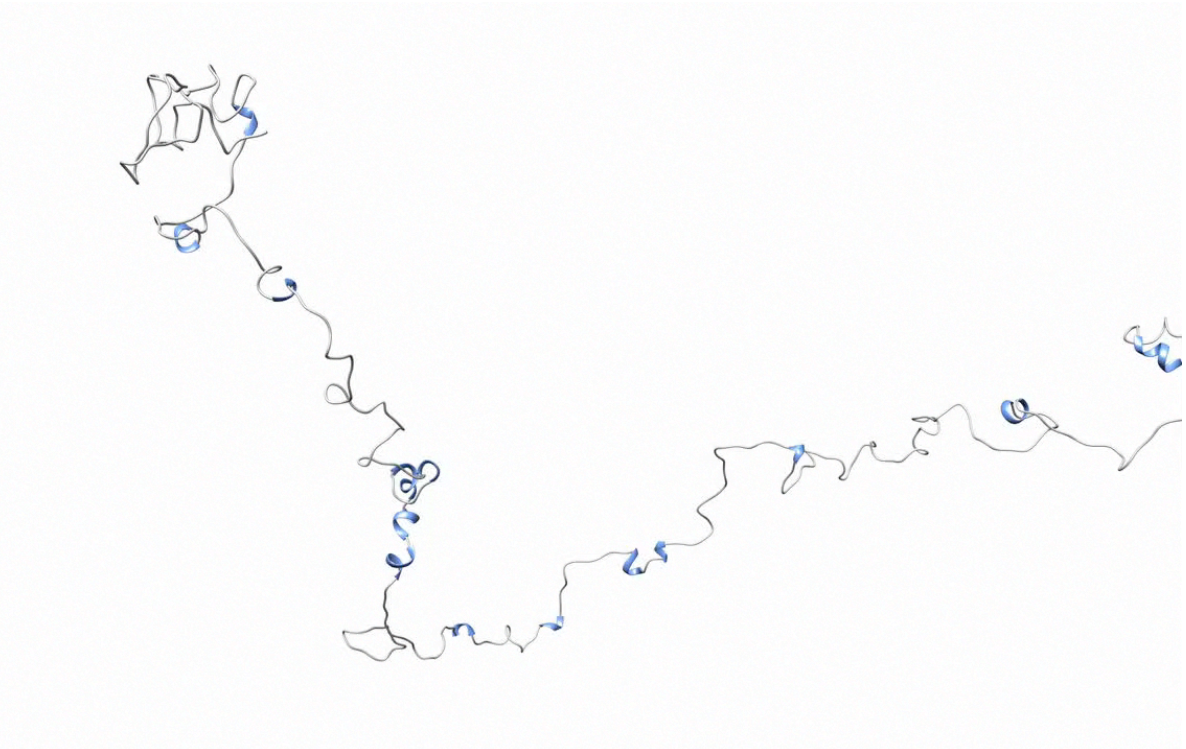


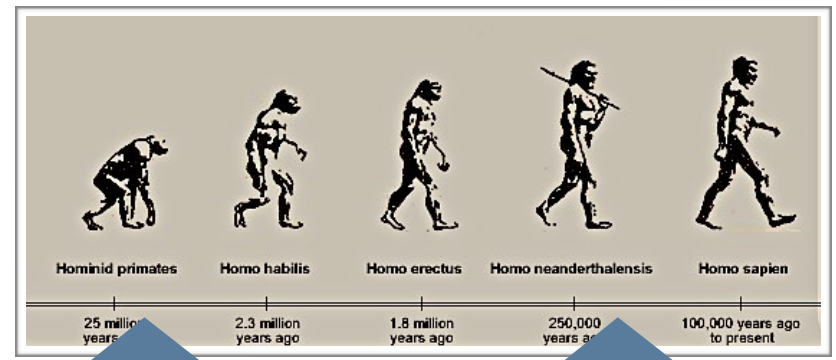
VENTURING INTO THE BIO-ZONE





HUGE COMPUTATIONAL GAIN

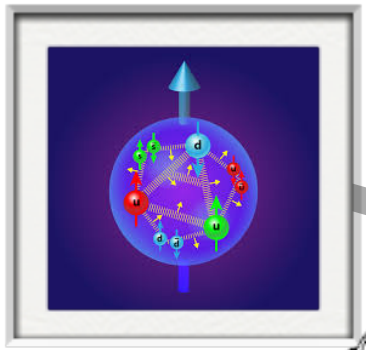


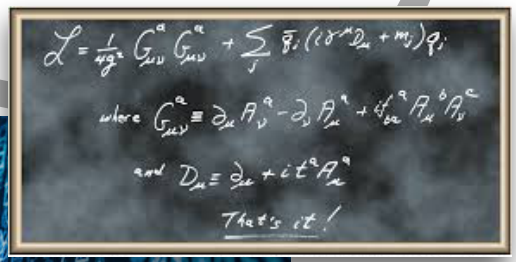


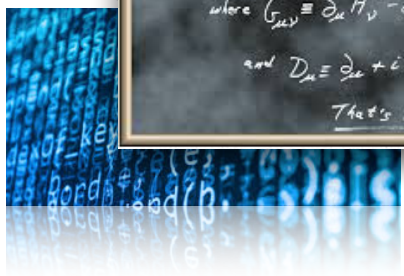
Using top all-purpose supercomputers

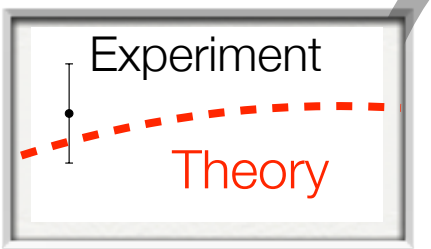
Using top special-purpose supercomputer

PHASE 2: VALIDATION

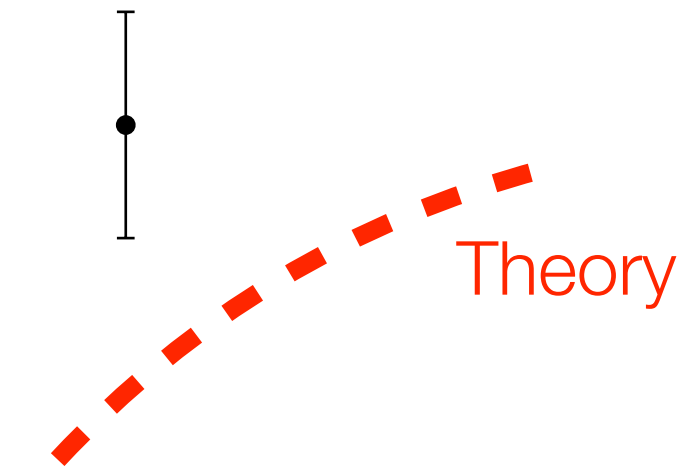








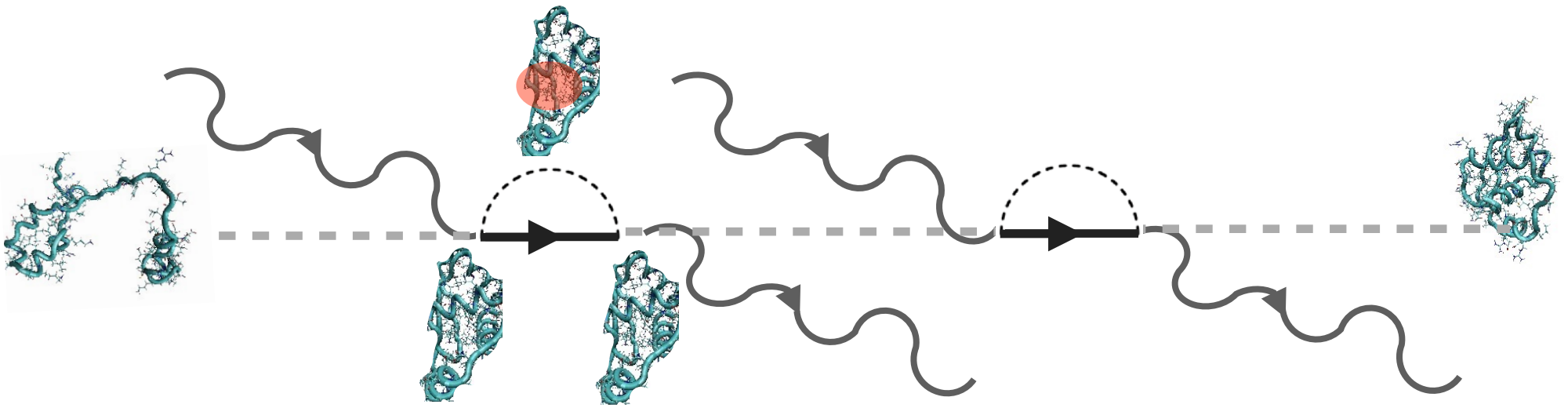
VALIDATION AGAINST EXPERIMENT



Challenge:

Most available techniques provide only indirect probes, we seek for **direct validation**

TIME-DEPENDENT LINEAR SPECTROSCOPY



Ground state

One exciton

Challenge:

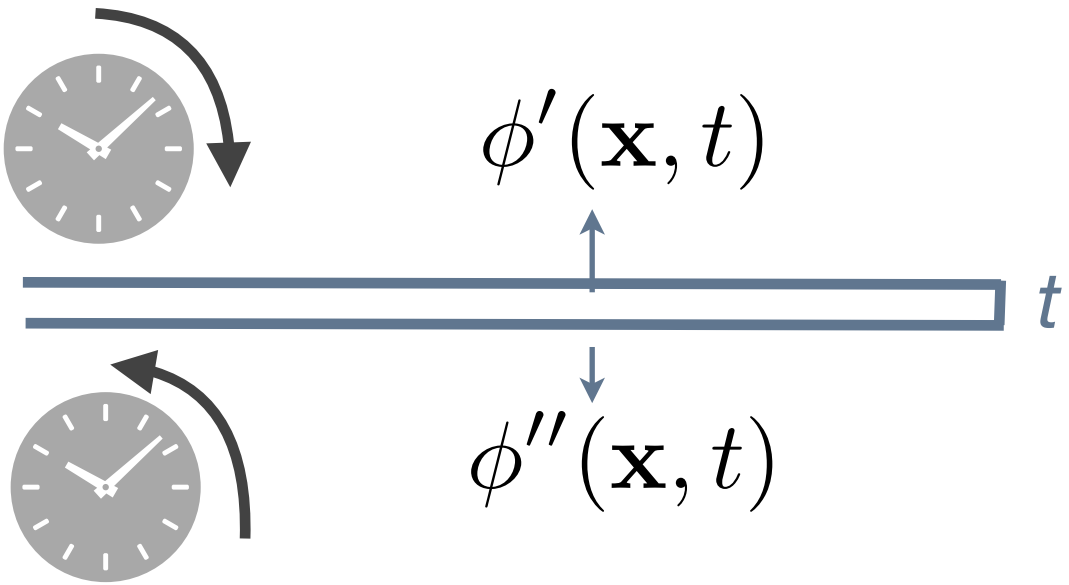
Need a theory for **non-equilibrium dynamics** of **quantum** electronic excitations in conformationally evolving proteins

$$\hat{\rho}(t) = e^{\frac{i}{\hbar}\hat{H}t}\ \hat{\rho}(0)\ e^{-\frac{i}{\hbar}\hat{H}t}$$

multiple time directions…

USE QUANTUM FIELD THEORY!

Using QFT we get rid of the multiple time issue:



$$\psi = \begin{pmatrix} \phi' \\ \phi'' \end{pmatrix}$$

Just like
anti-particles

One “relativistic” field doublet but just one time

MOLECULAR QUANTUM FIELD THEORY*

$$Z = \int \mathcal{D}\psi\mathcal{D}\bar{\psi} \int \mathcal{D}q \; e^{-S_{MQFT}[\psi,\bar{\psi},q]}$$

$$S_{MQFT}[q,\psi,\bar{\psi}] = S_{OM}[q] + S_S[\psi,\bar{\psi}] + S_{int}[q,\psi,\bar{\psi}]$$

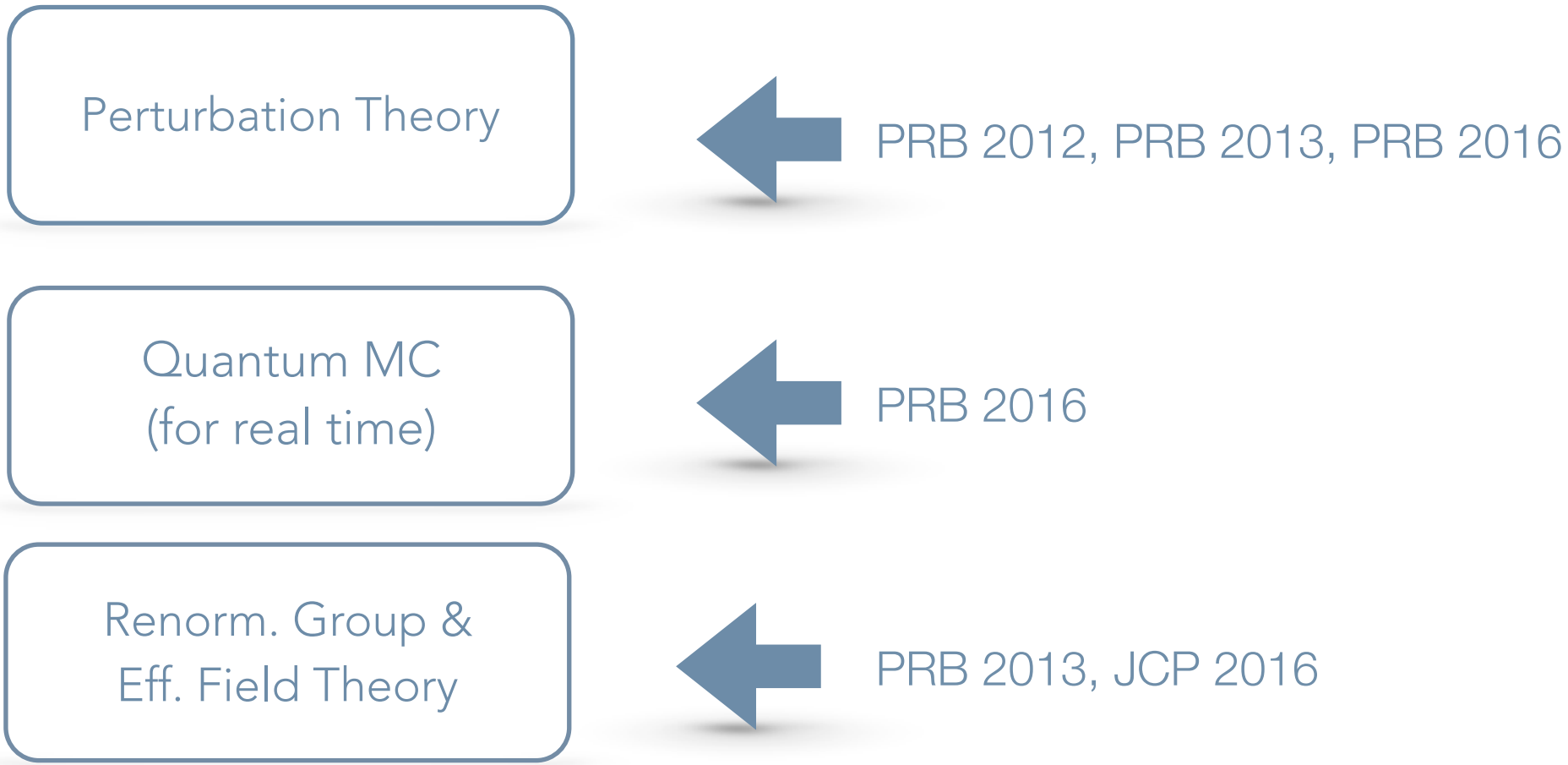
$$S_{OM}[q] = \int_0^t d\tau \frac{\beta}{4M\gamma} \left(M\ddot{q} + M\gamma\dot{q} + \nabla U(q)\right)^2$$

$$S_S[\psi,\bar{\psi}] = \sum_{n,m} \int_0^t d\tau \bar{\psi}_n(\tau) \left(i\hbar\partial_t - h^0_{nm}\right) \psi_m(\tau)$$

$$S_{int}[q,\psi,\bar{\psi}] = \sum_{nm} \sum_i \int_0^t d\tau \; f^i_{nm} \; \bar{\psi}_n \psi_m \, \delta q_i$$

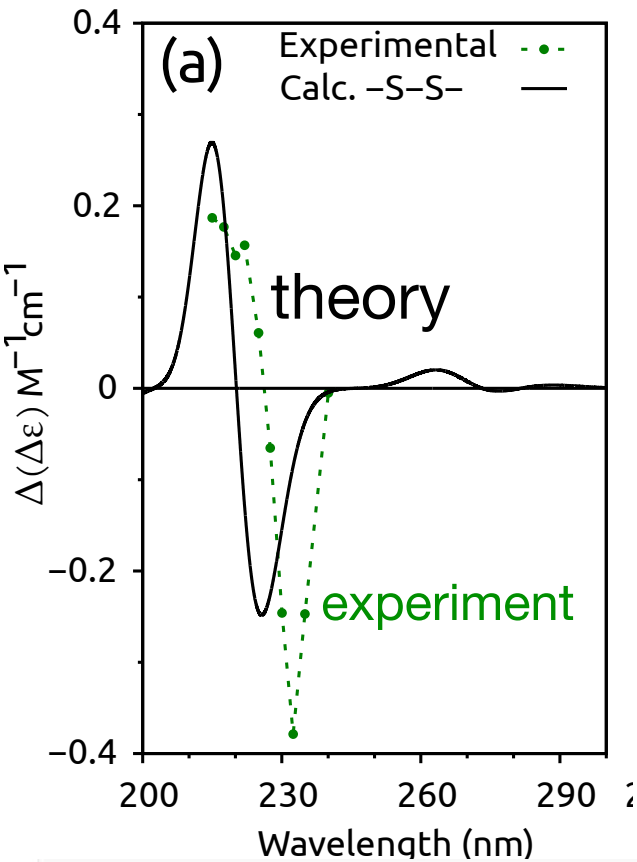
P. Faccioli & E. Schneider (2013-2016)

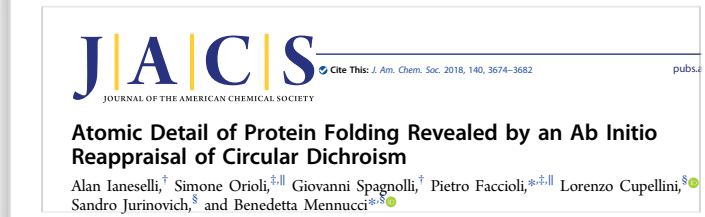
SOLVING MQFT: AN ARSENAL OF METHODS



EXAMPLES OF DIRECT COMPARISON WITH EXPERIMENTS

Time resolved near UV CD*





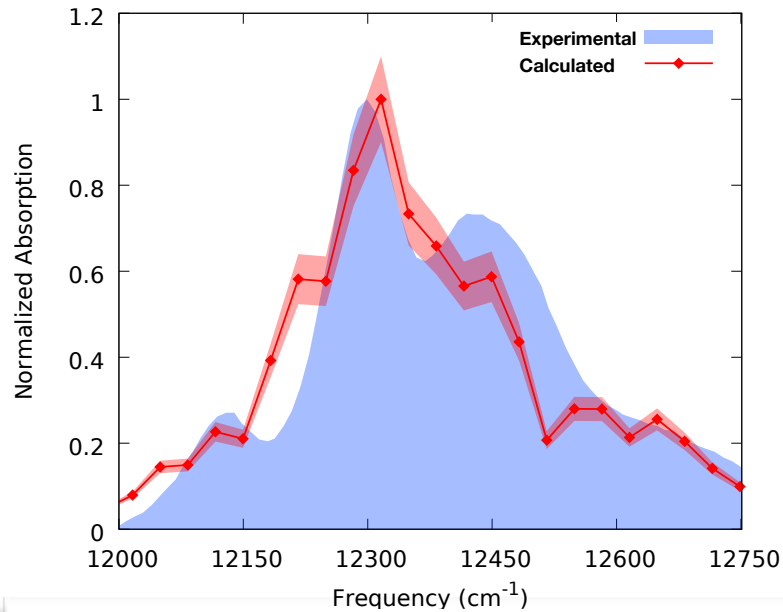
J|A|C|S
JOURNAL OF THE AMERICAN CHEMICAL SOCIETY

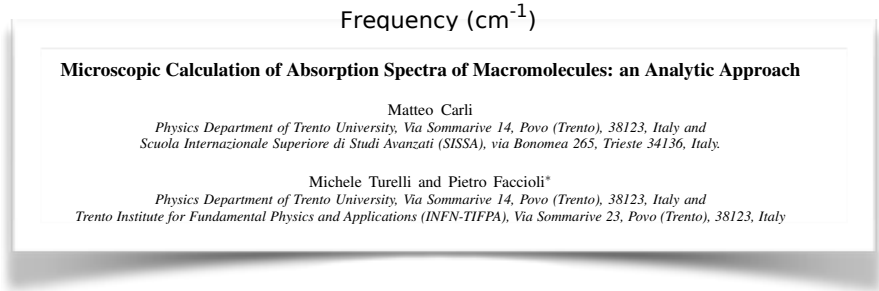
Cite This: J. Am. Chem. Soc. 2018, 140, 3674–3682

Atomic Detail of Protein Folding Revealed by an Ab Initio Reappraisal of Circular Dichroism

Alan Ianeselli,[†] Simone Orioli,[‡,∥] Giovanni Spagnolli,[†] Pietro Faccioli,[*,‡,∥] Lorenzo Cupellini,[§] Sandro Jurinovich,[§] and Benedetta Mennucci[*,§]

Linear absorption spectrum





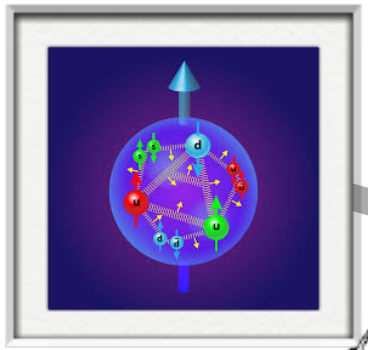
Microscopic Calculation of Absorption Spectra of Macromolecules: an Analytic Approach

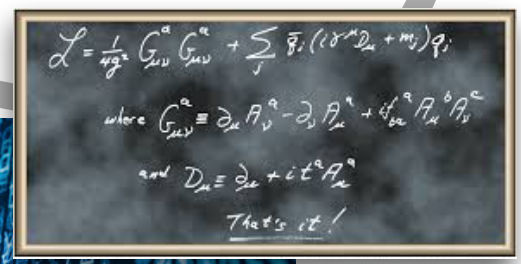
Matteo Carli
Physics Department of Trento University, Via Sommarive 14, Povo (Trento), 38123, Italy and Scuola Internazionale Superiore di Studi Avanzati (SISSA), via Bonomea 265, Trieste 34136, Italy.

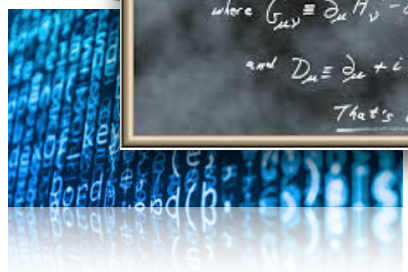
Michele Turelli and Pietro Faccioli*
Physics Department of Trento University, Via Sommarive 14, Povo (Trento), 38123, Italy and Trento Institute for Fundamental Physics and Applications (INFN-TIFPA), Via Sommarive 23, Povo (Trento), 38123, Italy

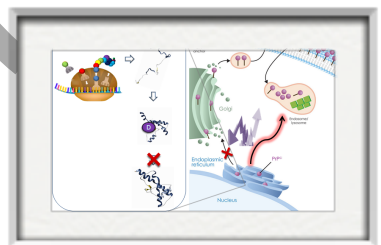
* with B. Mennucci's Lab (U. Pisa)

PHASE 3: EXPLOITATION IN MOLECULAR BIOLOGY









EXPLORING BIOLOGICAL PROCESSES

PNAS

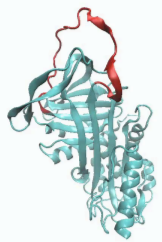
Serpin latency transition at atomic resolution

Giorgia Cazzolli[a,b], Fang Wang[c], Silvio a Beccara[b,d], Anne Gershenson[e], Pietro Faccioli[a,b,1], and Patrick L. Wintrode[c,1]

[a]Dipartimento di Fisica, Università degli Studi di Trento, 38100 Povo (Trento), Italy; [b]Trento Institute for Fundamental Physics and Applications, 38123 Povo (Trento), Italy; [c]Department of Pharmaceutical Sciences, School of Pharmacy, University of Maryland, Baltimore, MD 21201; [d]Interdisciplinary Laboratory for Computational Science, Fondazione Bruno Kessler, 38123 Povo (Trento), Italy; and [e]Department of Biochemistry and Molecular Biology, University of Massachusetts Amherst, Amherst, MA 01003

Edited by David E. Shaw, D. E. Shaw Research, New York, NY, and approved September 12, 2014 (received for review April 24, 2014)

Protease inhibition by serpins requires a large conformational transition from an active, metastable state to an inactive, stable for polypeptide chains consisting of nearly 100 amino acids (6), which are considerably smaller than PAI-1. Additionally, the



Biophysical Journal

Article

Biophysical Society

All-Atom Simulations Reveal How Single-Point Mutations Promote Serpin Misfolding

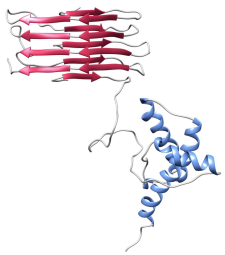
Fang Wang,[1] Simone Orioli,[2,3] Alan Ianeselli,[2,3] Giovanni Spagnolli,[2,3] Silvio a Beccara,[2,3] Anne Gershenson,[4,*] Pietro Faccioli[2,3,*] and Patrick L. Wintrode[1,*]

PLOS | PATHOGENS

RESEARCH ARTICLE

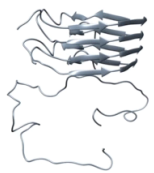
Full atomistic model of prion structure and conversion

Giovanni Spagnolli[1]*, Marta Rigoli[1,2], Simone Orioli[2,3], Alejandro M. Sevillano[4], Pietro Faccioli[2,3], Holger Wille[5], Emiliano Biasini[1]*, Jesús R. Requena[6]*



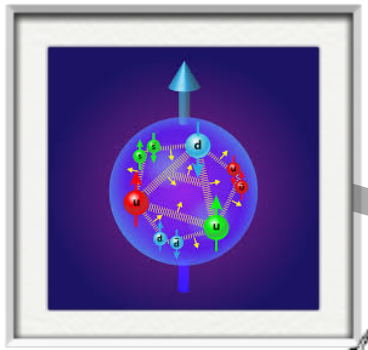
All-Atom Simulation of the HET-s Prion Replication

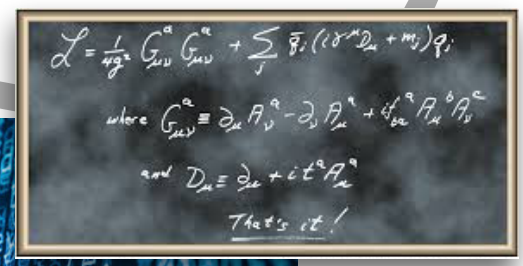
Luca Terruzzi[1,2]*, Giovanni Spagnolli[2,3]*#, Alberto Boldrini[1,2], Jesús R. Requena[4], Emiliano Biasini[2,3]# and Pietro Faccioli[5,6]#

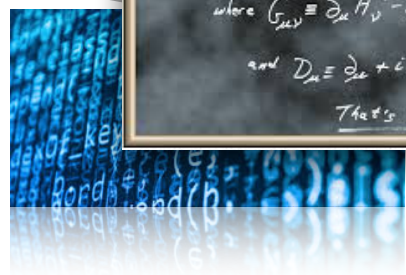


Teaming up with
E. Biasini's lab (DICIBIO)

PHASE 4: PHARMACOLOGICAL RESEARCH

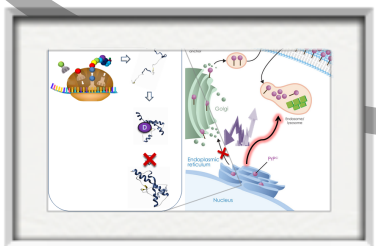






Experiment

Theory



ROLE OF PROTEIN INACTIVATION

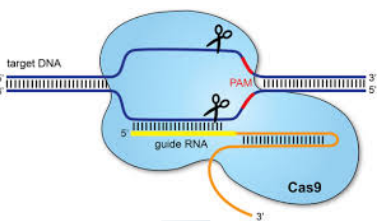
MOST OF BIOLOGICAL FUNCTIONS IN CELLS ARE CARRIED OUT BY **PROTEINS**

MOST OF MEDICINAL CHEMISTRY IS BASED ON
INHIBITING BIOLOGICAL FUNCTIONS OF PROTEINS

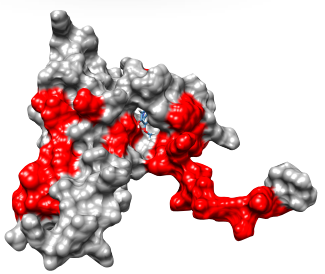
PHARMACOLOGICAL PROTEIN INACTIVATION BY FOLDING INTERMEDIATE TARGETING

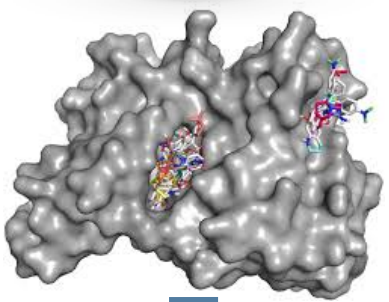
patent file # 102018000007535 (with E. Biasini)

DNA → mRNA → Ribosome → Protein folding → Protein function



RNA silencing





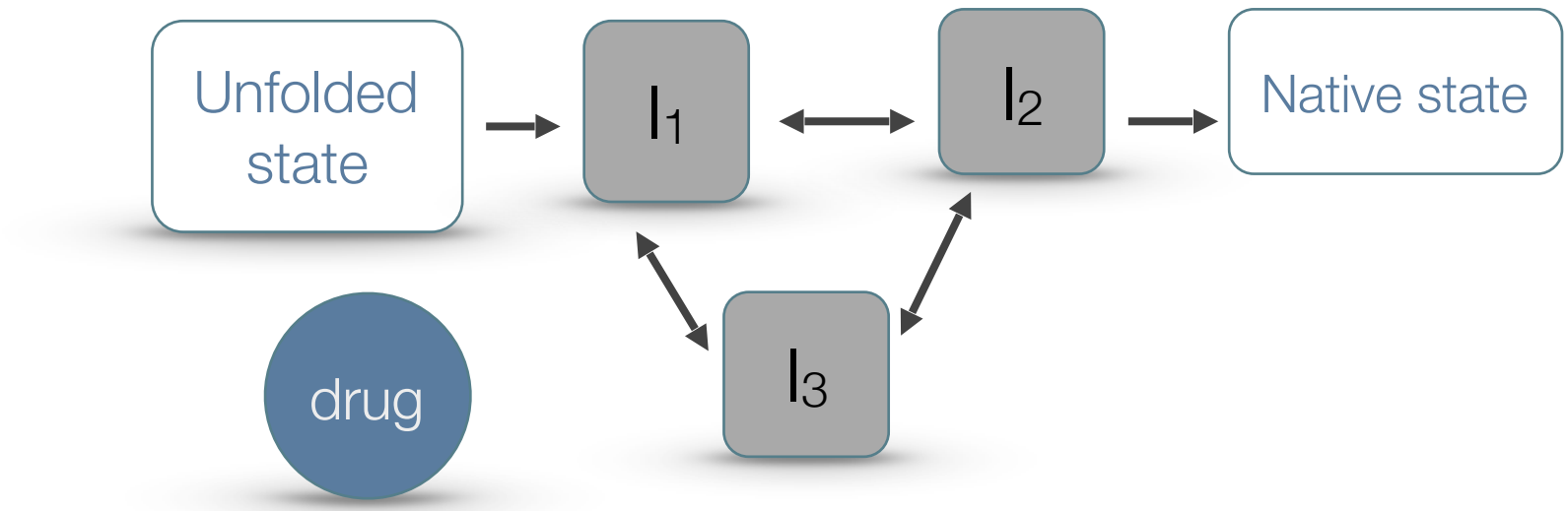
Eliminating protein from genome

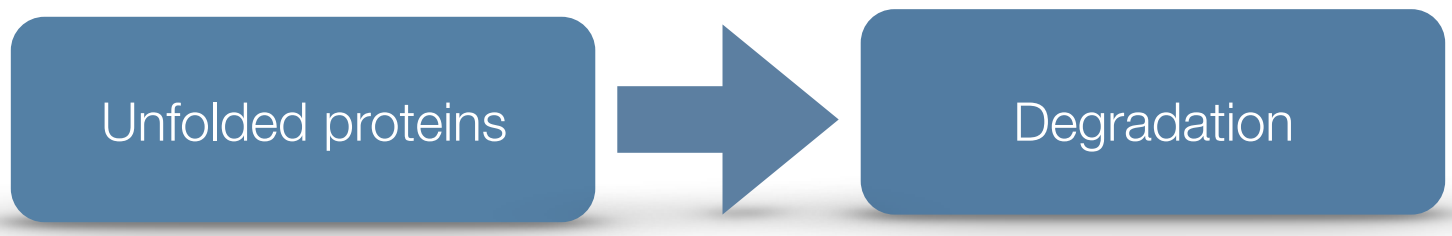
Suppressing transcription

Suppressing folding

Imparing function

PHARMACOLOGICAL PROTEIN INACTIVATION BY FOLDING INTERMEDIATE TARGETING



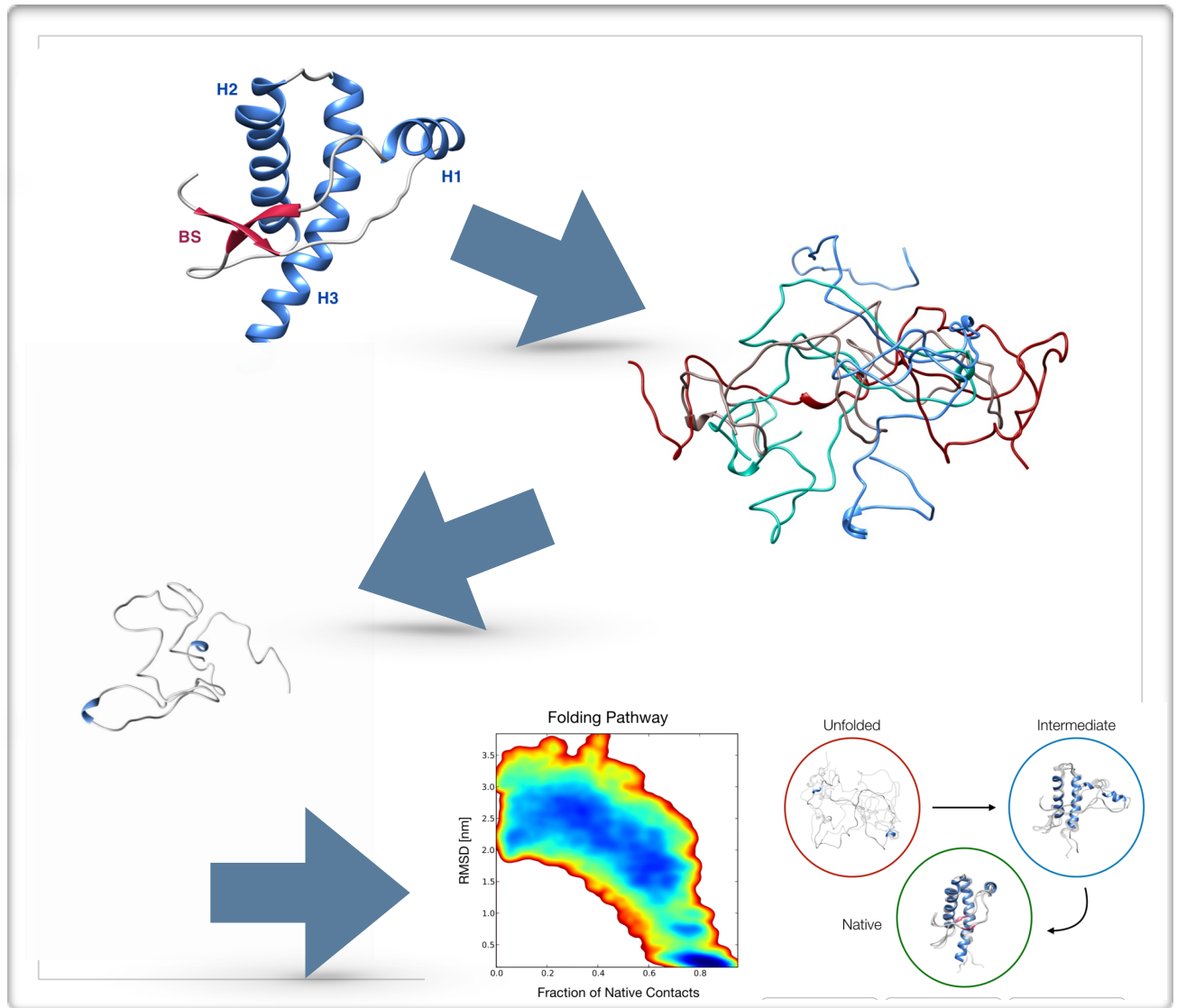


PPI-FIT PIPELINE

Folding pathway characterization

Virtual screening on folding Intermediate

Biochemical Validation



PPI-FIT PIPELINE

Folding pathway characterization

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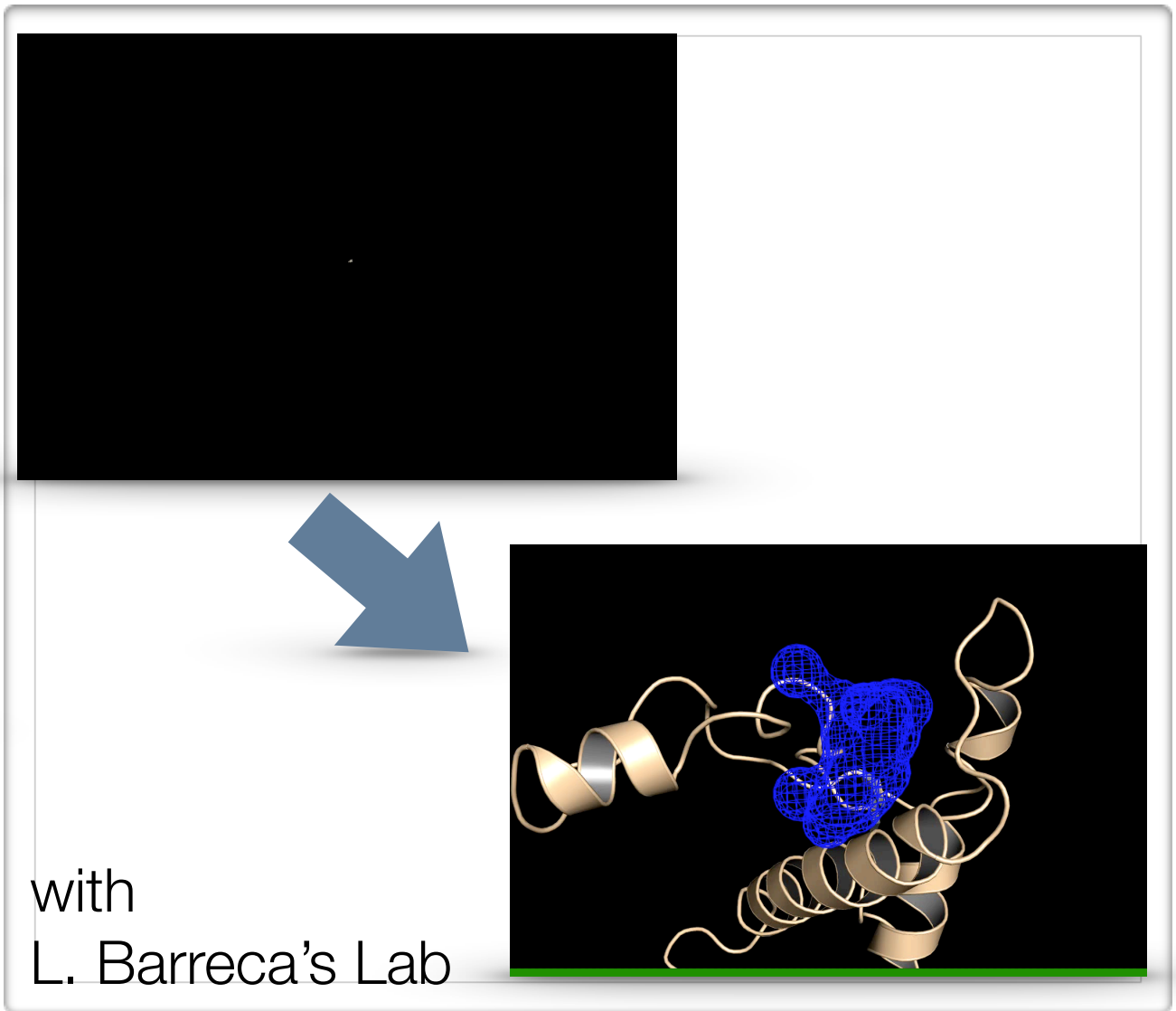
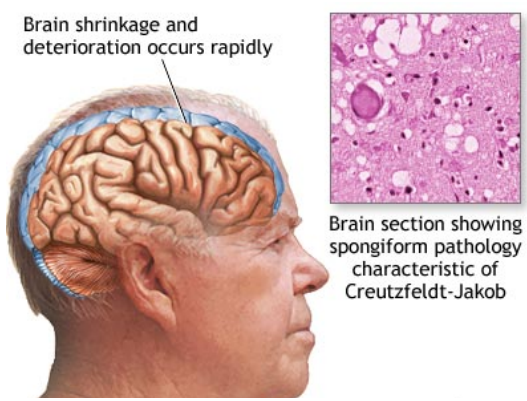
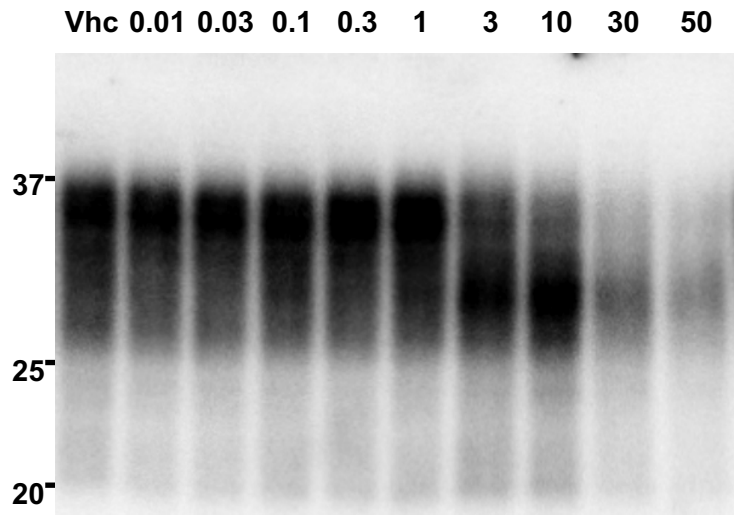


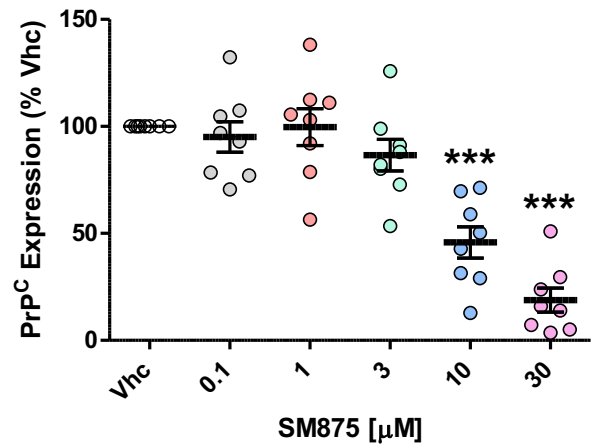
with
L. Barreca's Lab

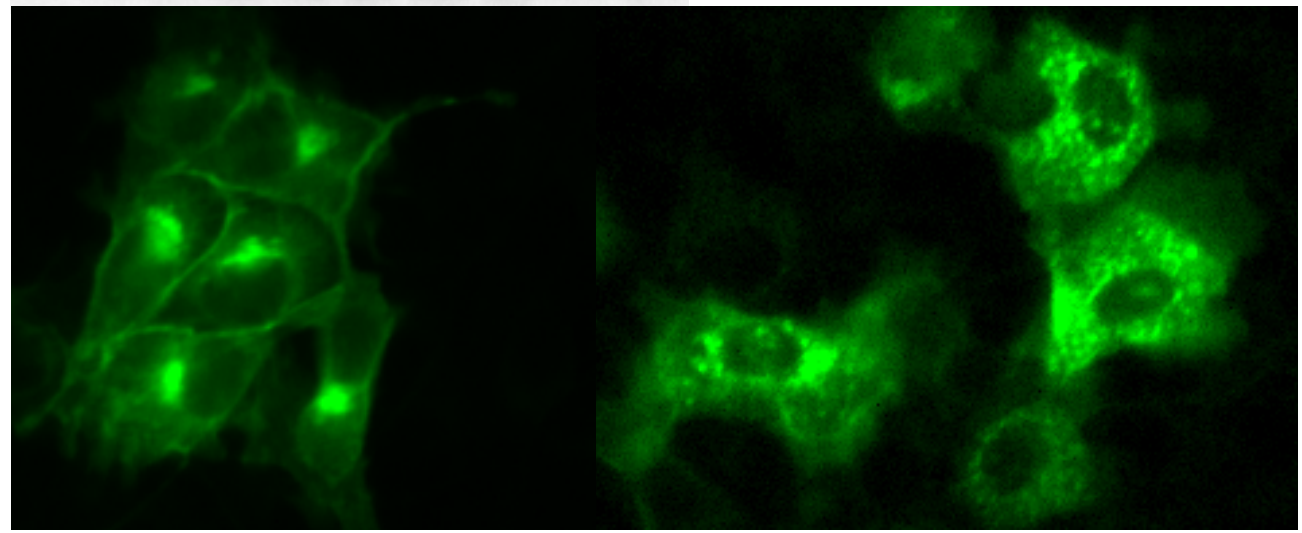
DRUGGING THE UNDRUGGABLE

Inactivation of Cellular Prion protein









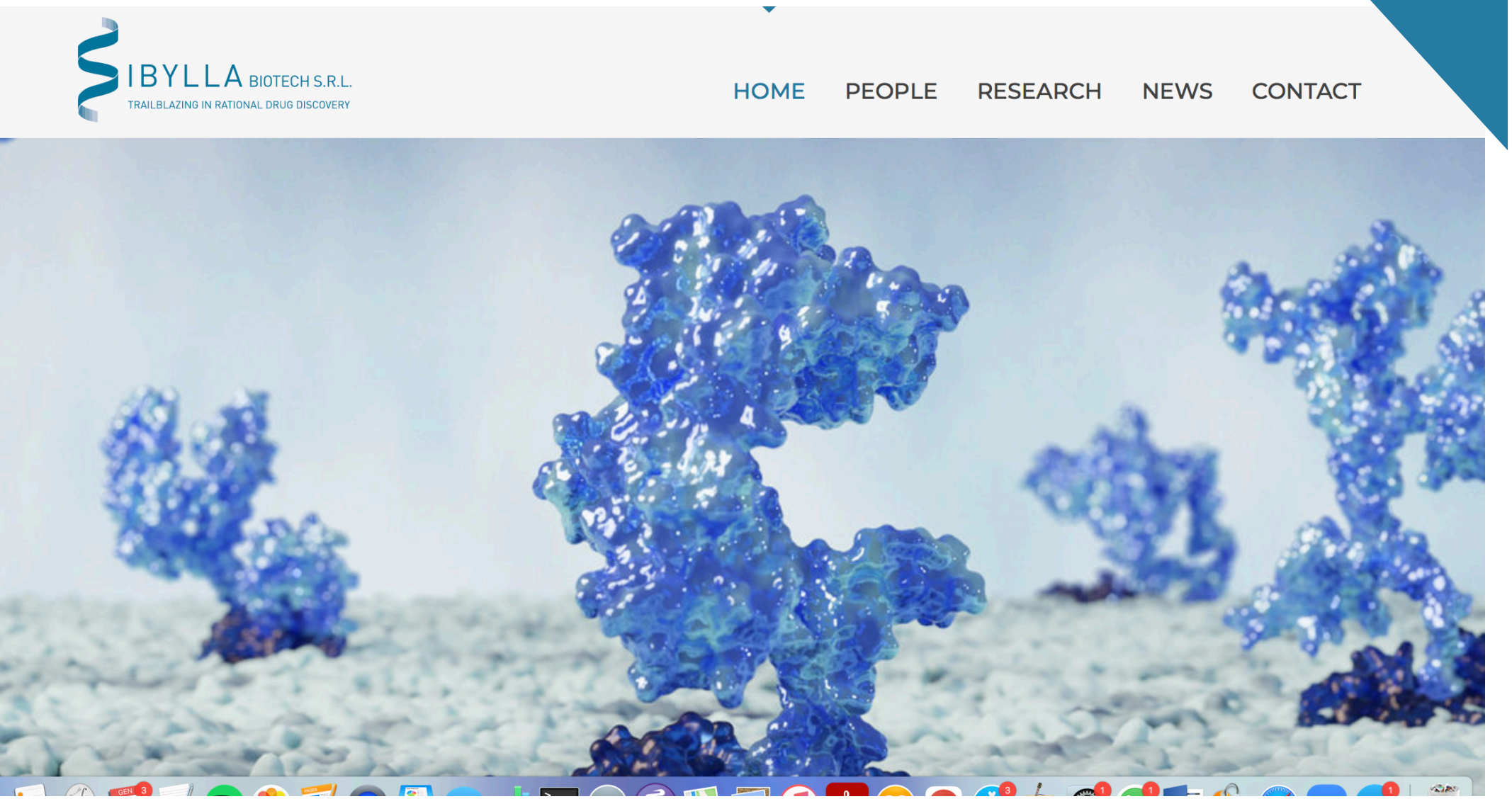
COMMUNICATIONS BIOLOGY

ARTICLE

https://doi.org/10.1038/s42003-020-01585-x OPEN

Pharmacological inactivation of the prion protein by targeting a folding intermediate

Technology Transfer Initiative



Joining Forces against **COVID-19**

Maria Letizia Barreca

UNIVERSITÀ DEGLI STUDI DI PERUGIA

Emiliano Biasini

UNIVERSITÀ DI TRENTO

FONDAZIONE Telethon

Pietro Faccioli

UNIVERSITÀ DI TRENTO

TIFPA

Graziano Lolli

UNIVERSITÀ DI TRENTO

INFN

Istituto Nazionale di Fisica Nucleare

30.000 cores in 8 data centers

Lidia Pieri

Giovanni Spagnolli

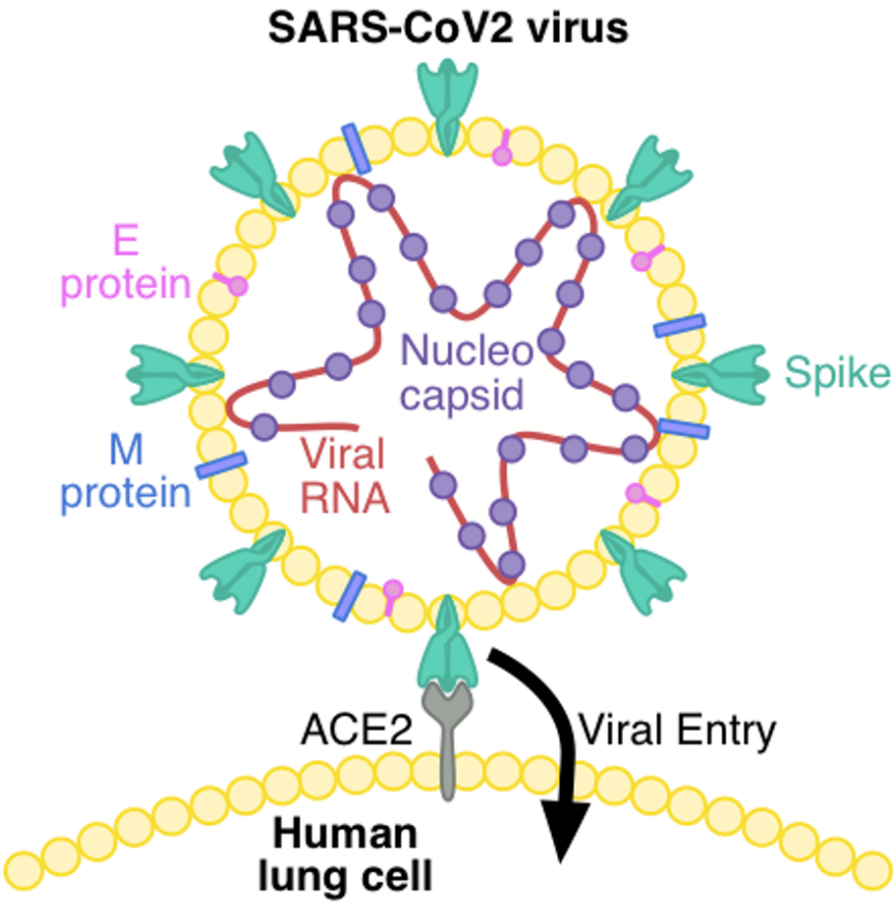
Alberto Boldrini

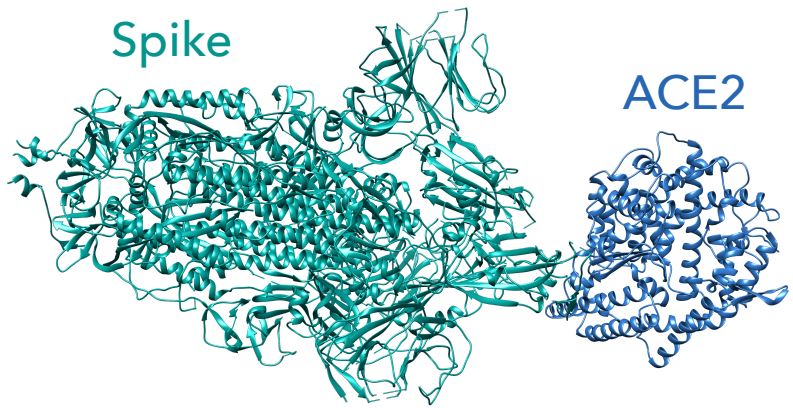
Tania Massignan

Luca Terruzzi

Andrea Astolfi

SARS-CoV-2 Replication





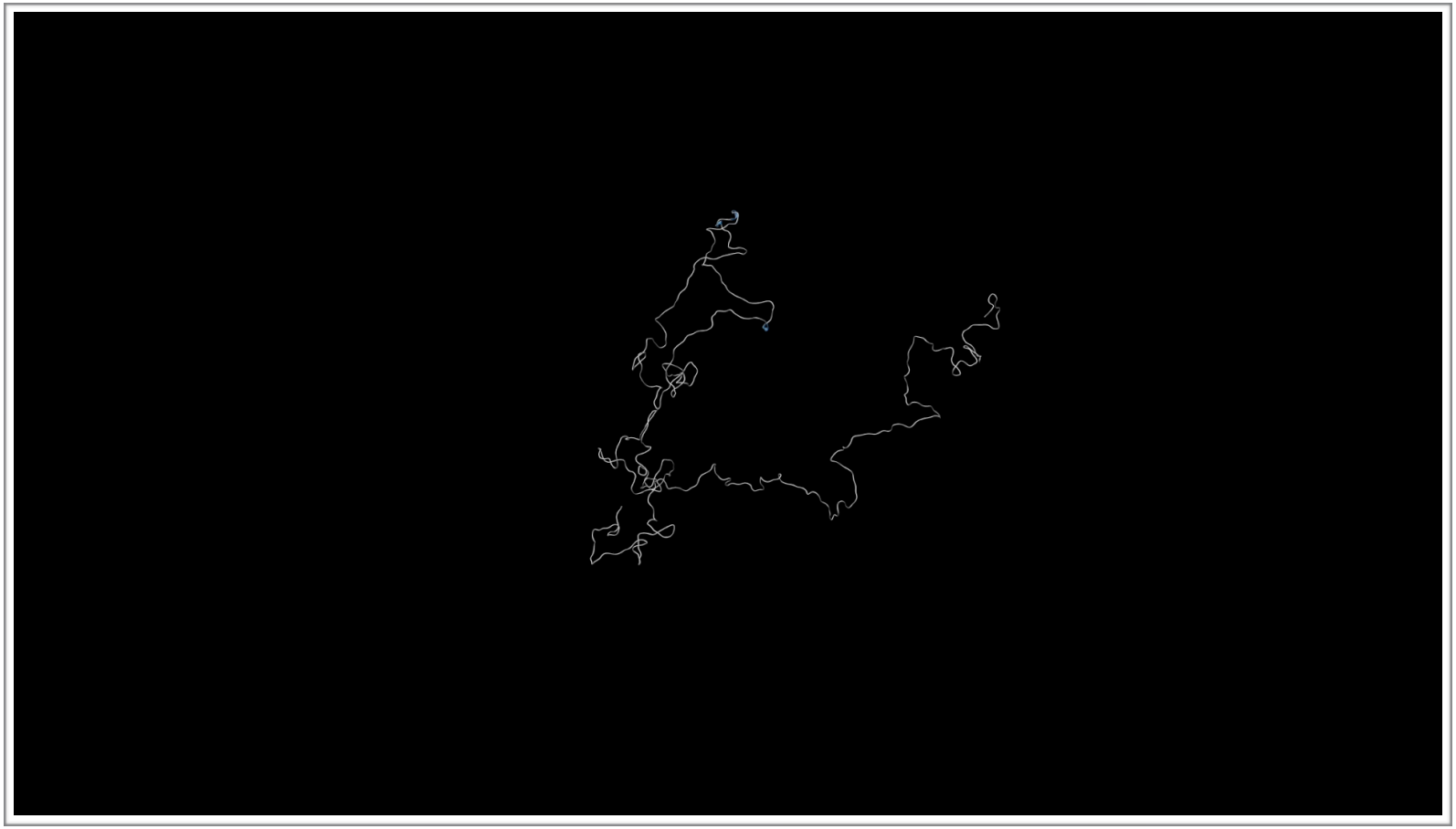
Goals:

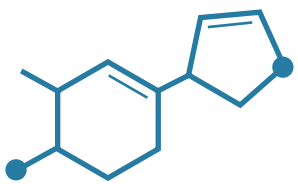
Repurposing of approved drugs!

Looking for suppressors of ACE2 expression levels

Figure taken from:
https://theconversation.com/where-are-we-at-with-developing-a-vaccine-for-coronavirus-134784

PPI-FIT ON ACE2

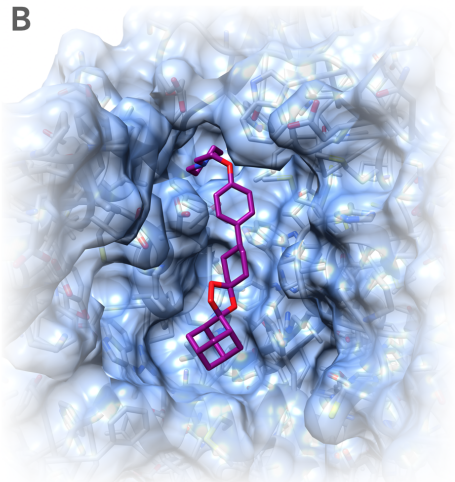


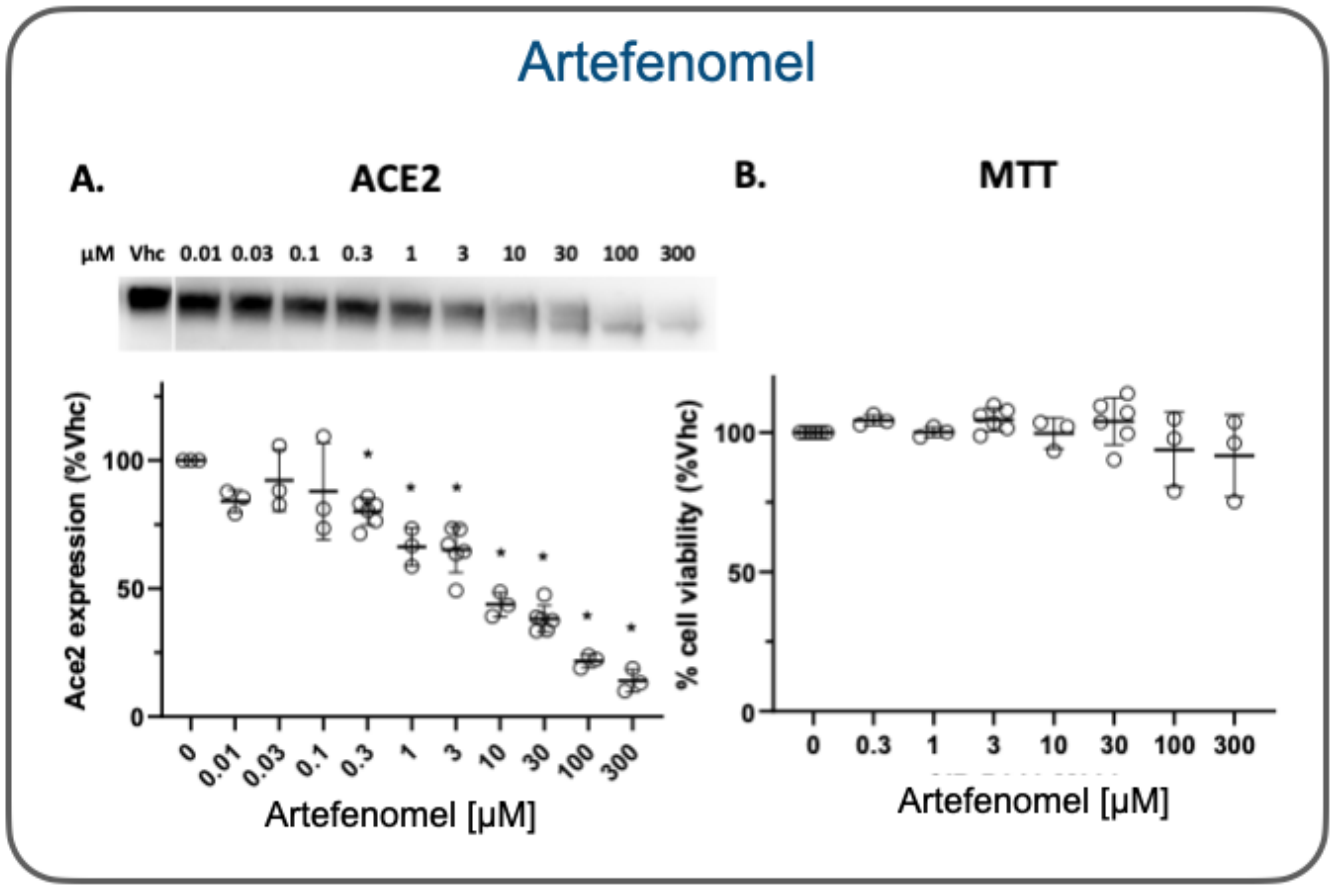


Out of 9000 candidates, we found 35 molecules binding in-silico the intermediate. Validation experiments on cellular bio-assays are ongoing.

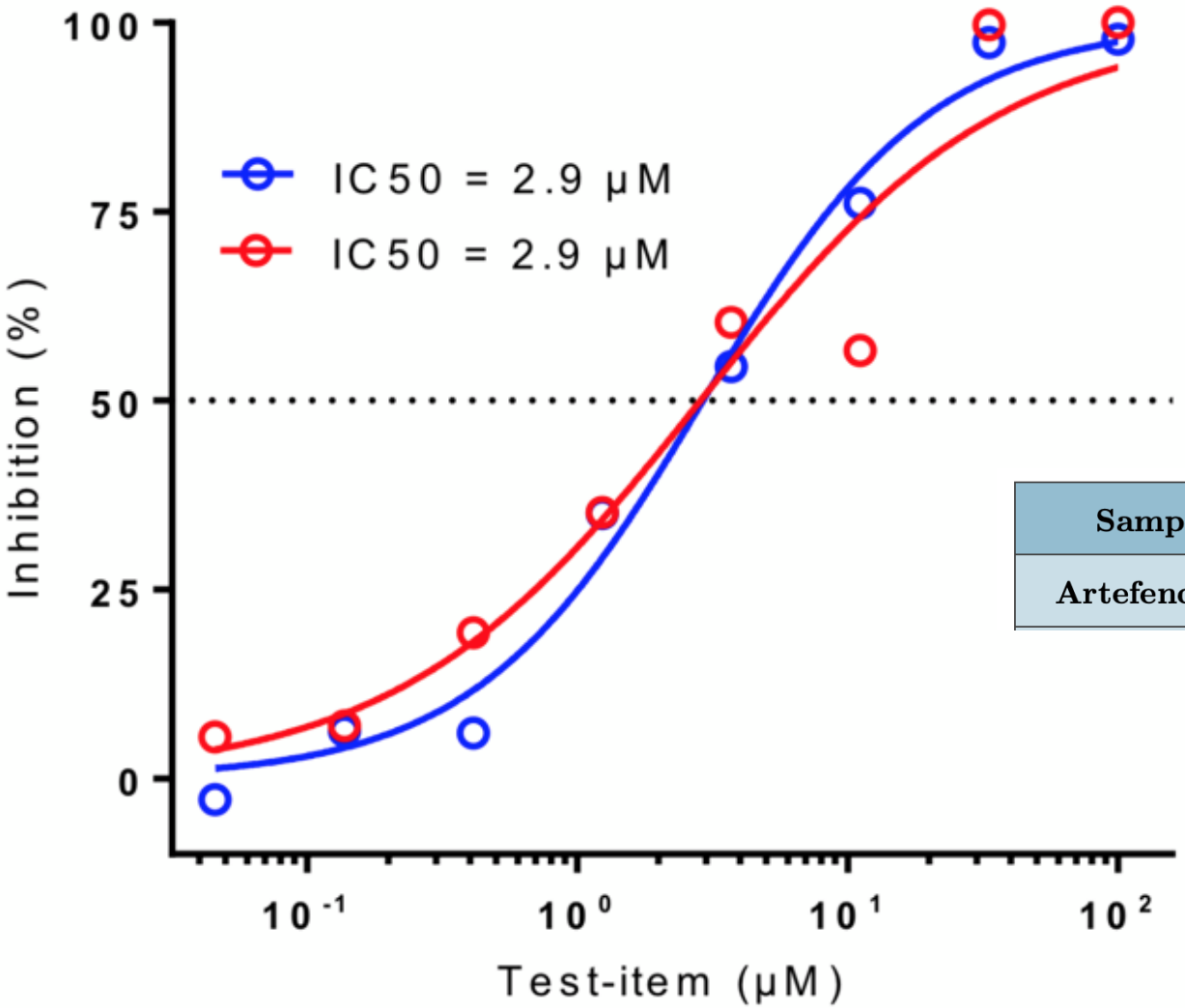
DOSE-DEPENDENT RESPONSE

B





ANTI-VIRAL ACTIVITY AGAINST LIVE SARS-COV2



Concentration at which it becomes active

Sample	IC50 [µM]	CC50 [µM]
Artefenomel	2.9	> 100

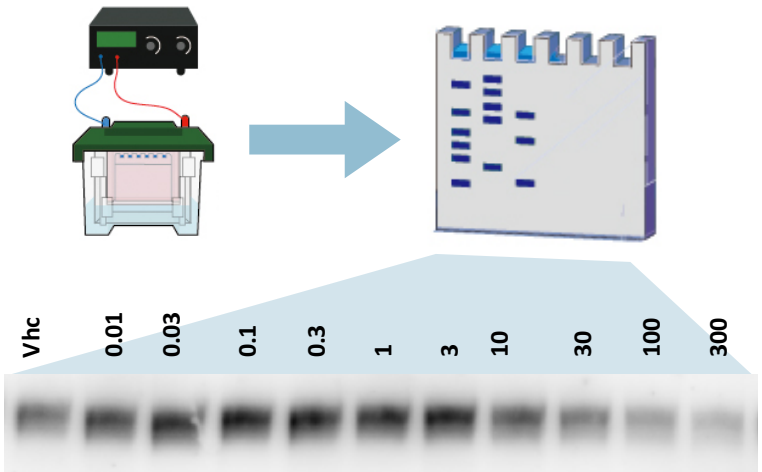
Concentration at which it becomes toxic

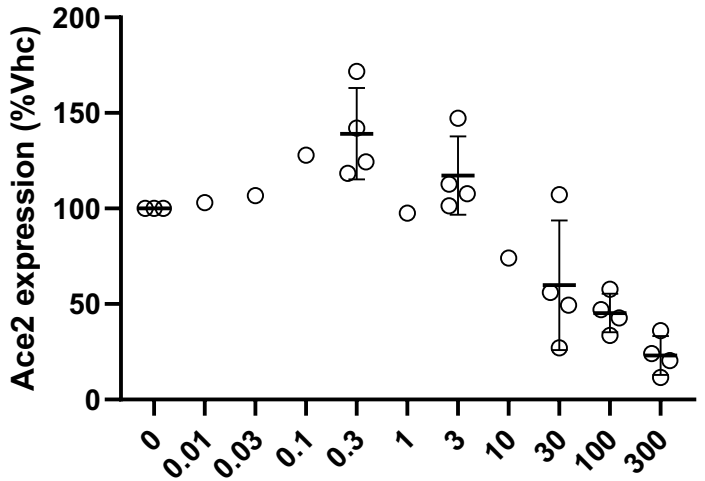
This value is *in principle* compatible with the maximum tolerated dose in humans. More to follow…

BREAKING NEWS!! (17/05/2020)

So far, Sibylla Biotech has tested 14 virtual hits

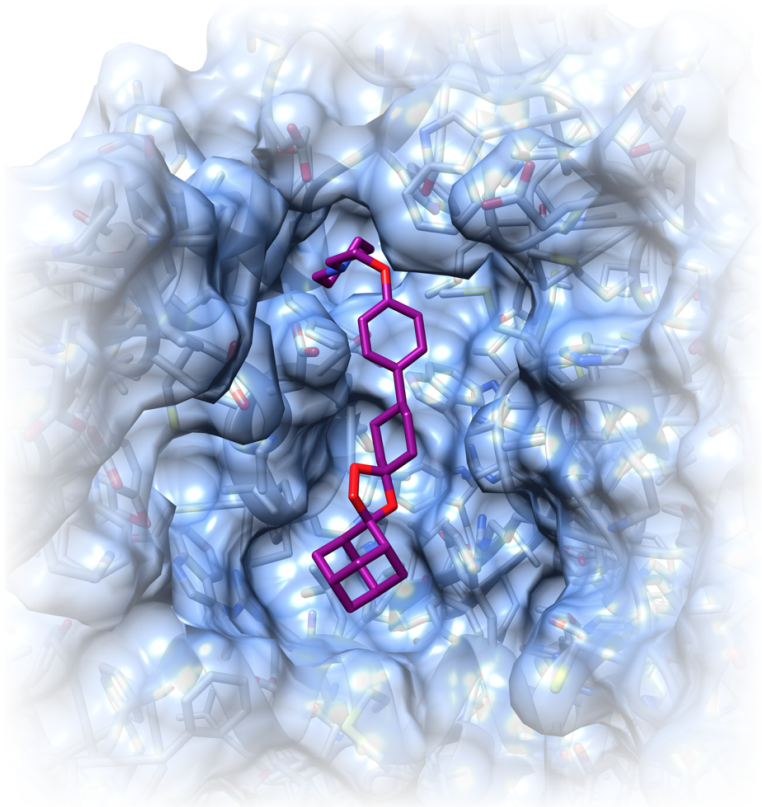
ONE DISPLAYS A **PROMINENT EFFECT** WITH CLEAR **DOSE-RESPONSE** RELATIONSHIP AND VERY **LOW TOXICITY**





SPACE IS THE NEXT FRONTIER!

A MAIN LIMITING FACTOR



Impossible to crystallize
folding intermediates
on Earth

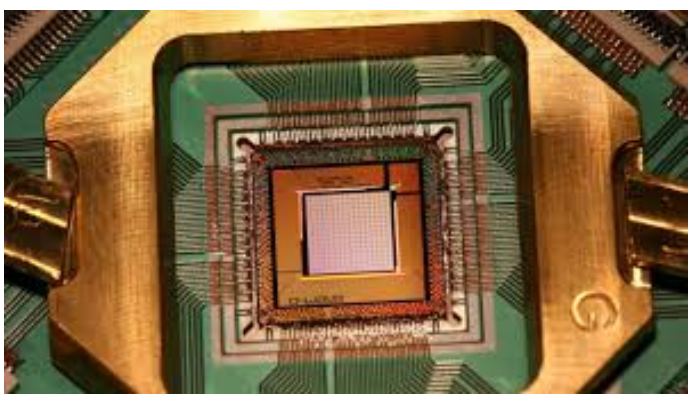
Microgravity conditions may provide the solution!

Molecular Biology PRIN

(functional role of folding intermediates?)

ZEFIR MISSION*

Quantum Computing + AI



PHYSICAL REVIEW LETTERS **VOL..XX,** 000000 (XXXX)

Dominant Reaction Pathways by Quantum Computing

Philipp Hauke,[1] Giovanni Mattiotti,[2] and Pietro Faccioli[2,3]
[1]*INO-CNR BEC Center and Department of Physics, University of Trento, Via Sommarive 14, I-38123 Trento, Italy*
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(Received 27 July 2020; accepted 18 December 2020)

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Acknowledgments

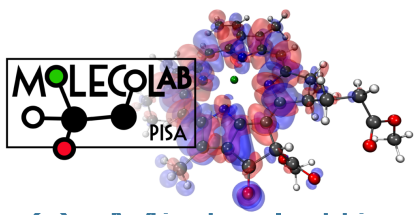
TIFPA Trento Institute for Fundamental Physics and Applications

FONDAZIONE Telethon

Italy:

Trento: *E. Biasini*, A. Ianeselli (2014-2017), G. Spagnolli S. A Beccara (2009-2017), S. Orioli (2014-2018), E. Schneider (2012-2015), M. Carli (2017), M. Turelli (2018), F. Mascherpa (2014), *G. Garberoglio, F. Pederiva, M. Sega*, R. Covino (2012-2015),

Pisa: B. Mennucci, L. Cupellini, S. Jurinovich



Perugia: L. Barreca

SISSA: C. Micheletti, A. Laio

Europe:

U. Zurich: B. Schuler

U. Compostela: J. Raquena

CEA-Saclay: H. Orland

USA:

U. Maryland: P. Wintrode

U. Mass.: A. Gershenson

MAIN TAKE-HOME MESSAGES

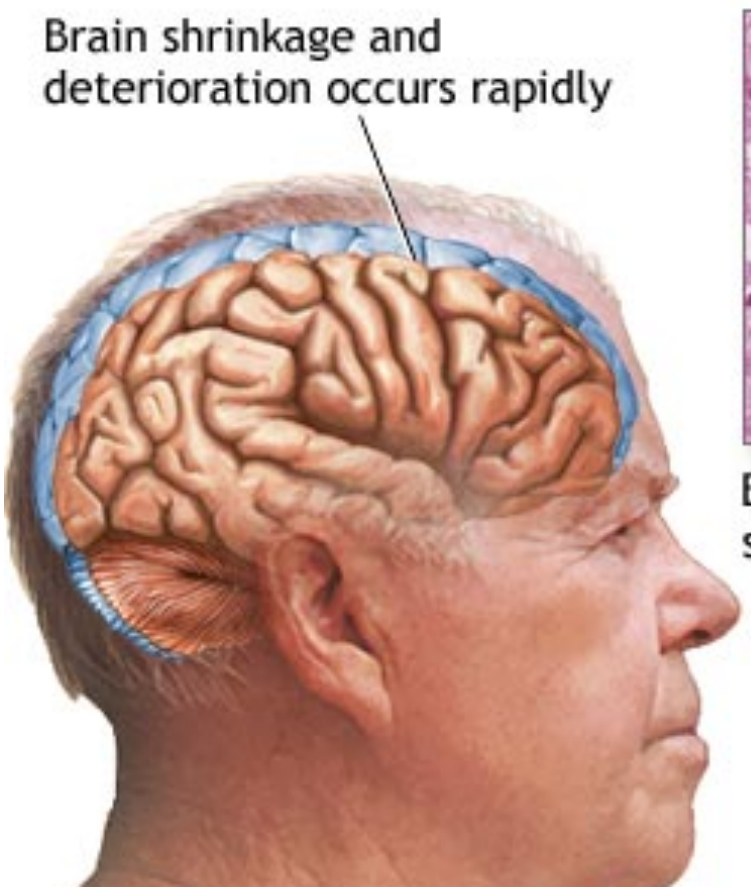
Fundamental research matters!

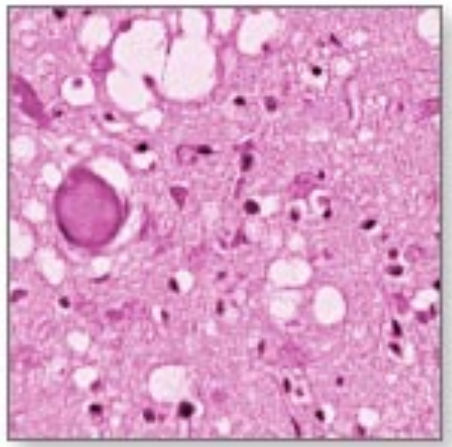
The usefulness of **theoretical physics** extends beyond its natural cultural perimeter

Major research infrastructures for fundamental research can be **re-purposed**

Technological transfer can boost research and help advance Science

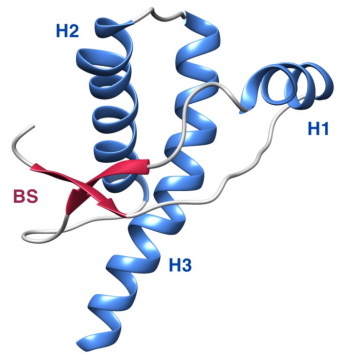
DRUGGING THE UNDRUGGABLE





Brain section showing spongiform pathology characteristic of Creutzfeldt-Jakob

PRION DISESES



ARE THERE **POTENTIAL** ADVANTAGES?

“More” (?)

Applicable to "undruggable proteins”

Applicable to misfolding proteins

“Better” (?)

More specificity

Low effective dissociation rate constant

Known mechanism of action

Heavy quark diffusion in a QGP

Heavy quark bound states in a quark–gluon plasma: Dissociation and recombination

Jean-Paul Blaizot [a], Davide De Boni [b,d], Pietro Faccioli [d,e], Giovanni Garberoglio [c,e]

EFFECTIVE STOCHASTIC DYNAMICS

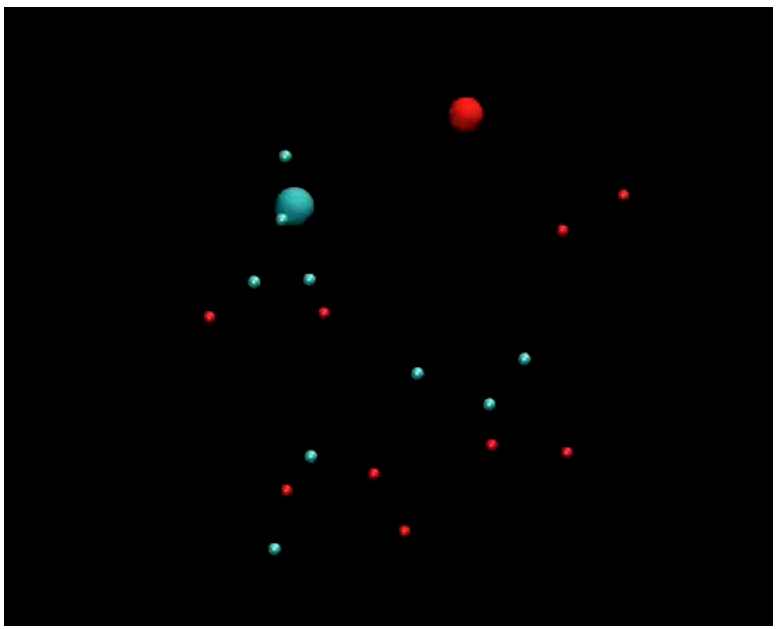
Model: NR relativistic particles coupled to an abelian plasma of fermions and gauge fields at finite temperature. After integrating out the gauge fields:

$$P(\boldsymbol{Q}_f, t_f \,|\, \boldsymbol{Q}_i, t_i) = \int_{\mathcal{C}} D\boldsymbol{Q} \int_{\mathcal{C}} D(\bar{\psi}, \psi)\, \mathrm{e}^{\mathrm{i}\, S[\boldsymbol{Q}, \psi, \bar{\psi}]}\,,$$

After integrating out the fermions and making the Ohmic approximation => **Effective Generalized Langevin**

$$M\,\ddot{\mathbf{R}} = -M\boldsymbol{\gamma}(\mathbf{R})\cdot\dot{\mathbf{R}} + \mathbf{F}(\mathbf{R}) + \boldsymbol{\xi}(\mathbf{R},t)\,,$$

$$\langle\,\xi_{i'}(\mathbf{R},t)\,\rangle = 0, \qquad \langle\,\xi_{k'}(\mathbf{R},t)\,\xi_{m'}(\mathbf{R},t')\,\rangle = \boldsymbol{\lambda}_{k'm'}(\mathbf{R})\,\delta(t-t')\,.$$

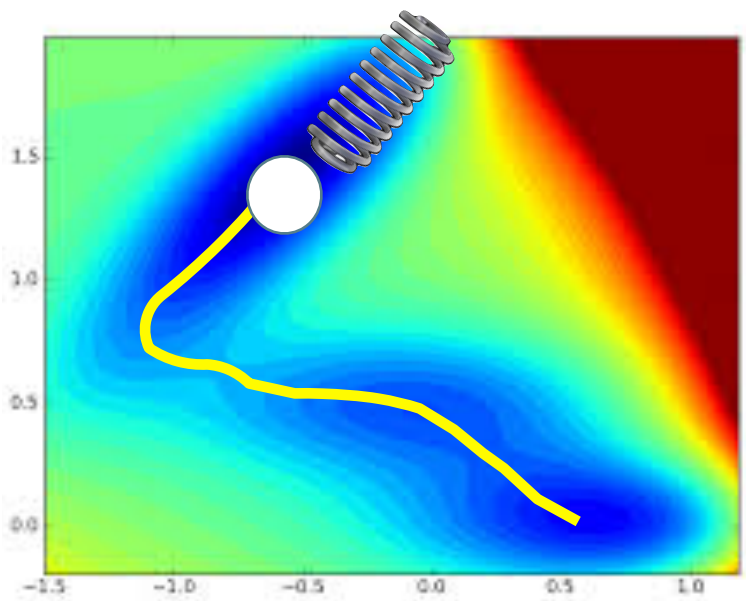


QGP plasma polarization induced by heavy fermions

RATCHET-AND-PAWL **MD**

E. Paci and M. Karplus, J. Mol. Biol. ***288****, 441 (1999).*
C. Camilloni, R. A. Broglia, and G. Tiana, J. Chem. Phys. ***134****, 045105 (2011).*

IDEAL BIAS



Theorem: rMD along the ideal reaction coordinate RC (i.e. the committor function) yields the exact equilibrium distribution and reactive current

M. Cameron and E. Vanden-Eijnden, J. Stat. Phys. 156, 427 (2014).
G. Bartolucci, S. Orioli and P. Faccioli J.Chem. Phys. 149, 072336 (2018).

Challenge:

How can we learn the RC self-consistently and compute the committor “on the fly” in a rMD calculation?

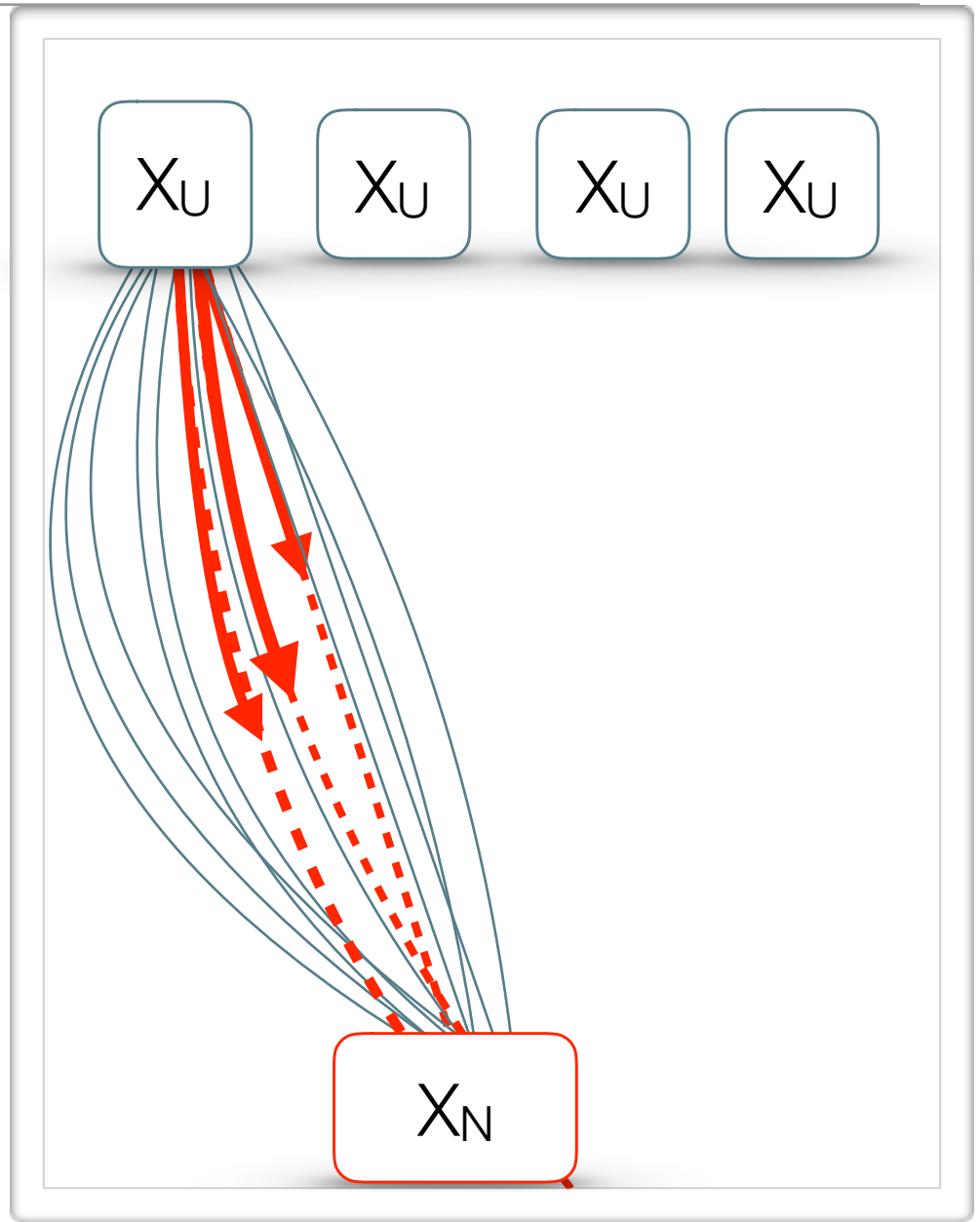
SELF CONSISTENT PATH SAMPLING

Guess a RC

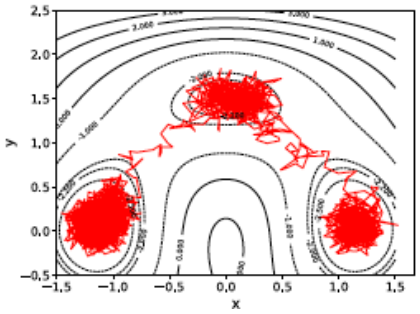
Compute trial folding pathways by rMD

Compute average path

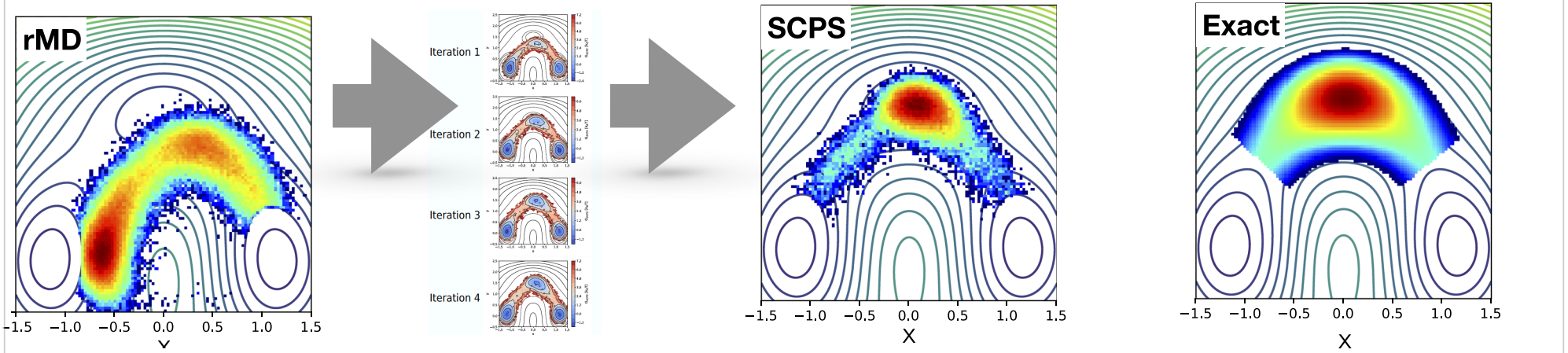
Estimate the RC from the paths



REACHING ACCURACY



three-state kinetics…

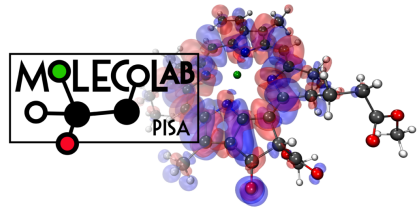


…more slides for discussion session…

Past, present and long term collaborators

Trento: *E. Biasini*, A. Ianeselli (2014-2017), G. Spagnolli S. A Beccara (2009-2017), S. Orioli (2014-2018), E. Schneider (2012-2015), M. Carli (2017), M. Turelli (2018), F. Mascherpa (2014), *G. Garberoglio, F. Pederiva, M. Sega*, R. Covino (2012-2015),

Pisa: B. Mennucci, L. Cupellini, S. Jurinovich



Perugia: L. Barreca **SISSA**: C. Micheletti, A. Laio

CEA-Saclay: H. Orland, J.P. Blaizot

U. Maryland Baltimore: P. Wintrode

U. Mass. Amherst: A. Gershenson

U. Zurich: B. Schuler

Thank you for your attention!

Implementation step 1: Trotter decomposition

Trotter decomposition: $e^{-\frac{i}{\hbar}\hat{H}t} = e^{-\frac{i}{\hbar}dt\hat{H}} \dots e^{-\frac{i}{\hbar}dt\hat{H}} + \mathcal{O}(dt^2)$

$$= e^{-\frac{i}{\hbar}dt\hat{H}} 1 e^{-\frac{i}{\hbar}dt\hat{H}} \dots 1 e^{-\frac{i}{\hbar}dt\hat{H}} + \mathcal{O}(dt^2)$$

$$1 = \int dQ \int dX \int \left(\prod_{k,s=1,2} \frac{d\phi_{k,s} d\phi^*_{k,s}}{2\pi i} \right) e^{-\sum_{s=1,2}\sum_{l=1}\phi_{1,s}\phi^*_{1,s}} |Q, X, \Phi\rangle \langle Q, X, \Phi|$$

Atomic nuclei, heat-bath variables
in first quantization
(i.e. use coordinates)

Hopping quantum excitation
in second quantization
(i.e. use coherent fields)

Implementation step 2: Integrate out solvent (Gaussian integral)

$$\int_{\mathcal{C}} \mathcal{D}X \int_{\mathcal{C}} \mathcal{D}Q \int_{\mathcal{C}} \mathcal{D}\psi \mathcal{D}\bar{\psi} \; (\ldots) = \int_{\mathcal{C}} \mathcal{D}Q \int_{\mathcal{C}} \mathcal{D}\psi \mathcal{D}\bar{\psi} \; (\ldots) \; e^{-\Phi[Q]}$$

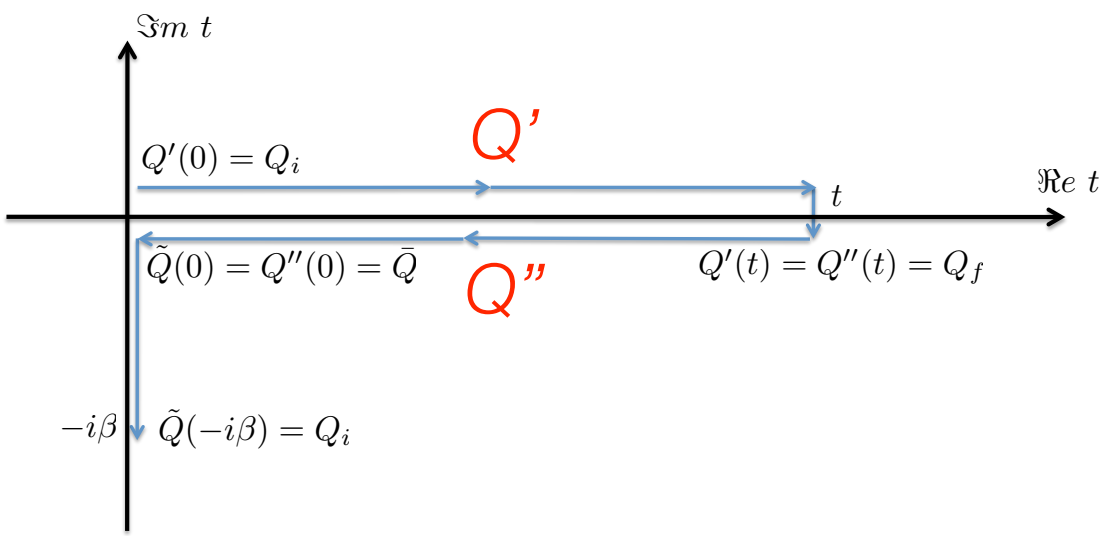
Implementation step 3: Take the Ohmic limit in the Green's function of the Caldeira-Legget bath

$$\Delta(\omega) \simeq C_0 + C_1 \; \omega$$

Implementation step 4: Classical limit on atomic motion using saddle-point approximation to *quadratic level.*

Implementing the two approximations:

1. The dynamics of the atomic nuclei is classical:



$$R \equiv \frac{1}{2}\left(Q^{'} + Q^{''}\right)$$
$$y \equiv Q^{'} - Q^{''}$$

classical limit

$$R(t) \gg y(t)$$

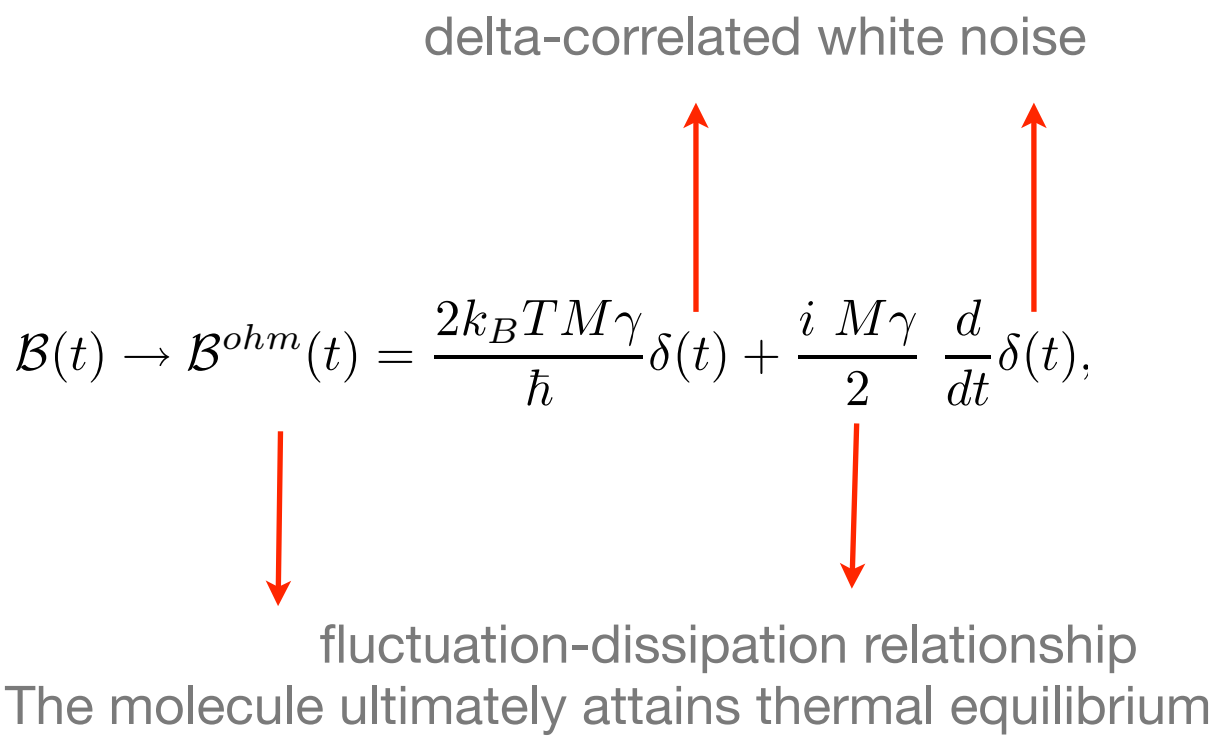
expand to order $o(y^2)$

perform $\int \mathcal{D}y$

$$P(Q_f, k_f, t|Q_i, k_i) = \int_{Q_i}^{Q_f} \mathcal{D}R \int \mathcal{D}\phi^{'*}\mathcal{D}\phi^{'} \int \mathcal{D}\phi^{''*}\mathcal{D}\phi^{''} \left(\ldots\right)$$

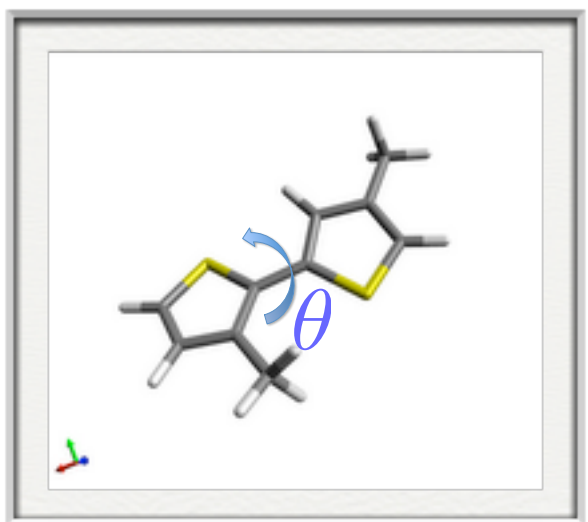
Implementing the two approximations

2. The heat-bath quickly looses its “memory”



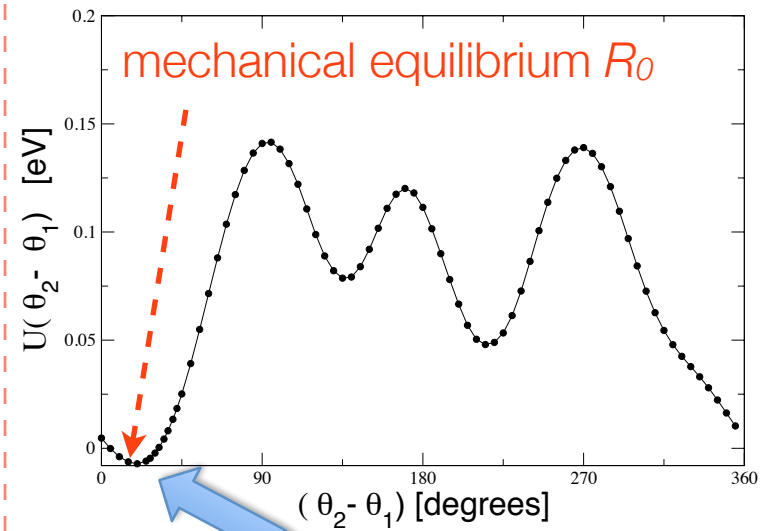
Molecular dynamics of atomic nuclei => Langevin dynamics

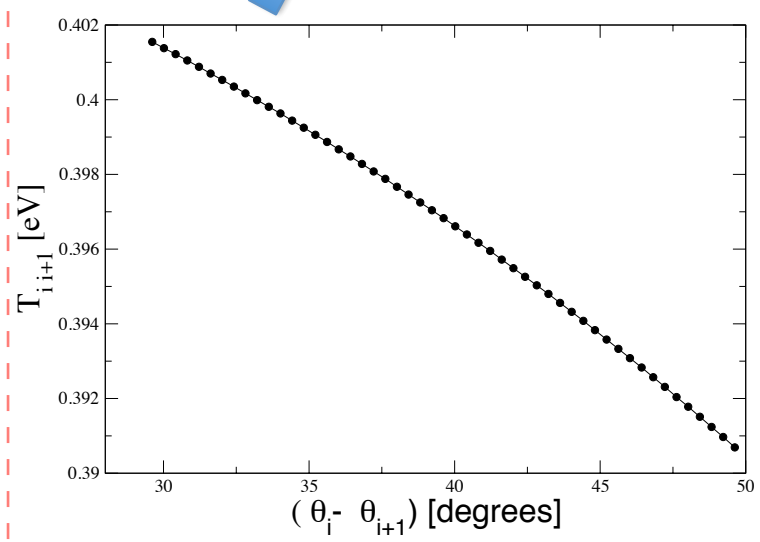
Ingredients from quantum chemistry calculations



DFT-B

density functional theory





Quantum Monte Carlo

$$Z[\eta,\bar{\eta}] = \int \mathcal{D}\delta Q\, e^{-\left(S_{OM}[\delta Q] + \mathrm{Log\,Det} G^{-1}_{\delta Q}\right)}\, e^{\frac{i}{\hbar}\sum_{mn}\int_0^t d\tau\, \bar{\eta}_n(\tau)\, G_{\delta Q}(n,\tau|m,\tau')\, \eta_m(\tau')}$$

1) **Sample** nuclear trajectories by integrating the Langevin equation:

$$S_{OM}[\Delta Q] = \frac{\beta}{4M\gamma}\int_0^t d\tau \left(M\delta\ddot{Q} + \gamma\delta\dot{Q} + \nabla U(\delta Q)\right)^2$$

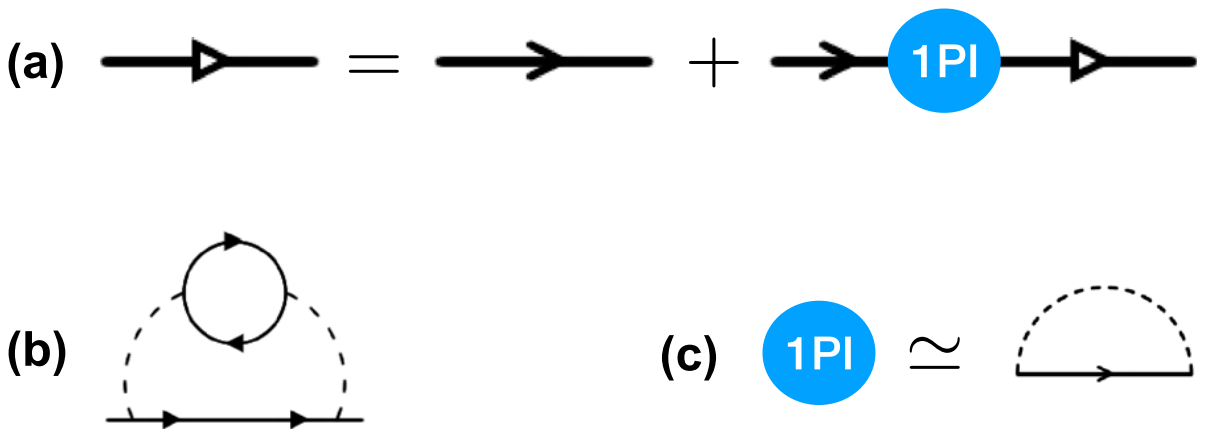
2) **Re-weigh** configurations (quantum backaction):

$$\log \mathrm{Det} G^{-1}_{\Delta Q} = \frac{1}{2}\sum_{s\neq t} C^i_{st} C^j_{ts} \int_0^t d\tau \int_0^t d\tau' \delta q^i(\tau)\, \delta q^j(\tau') \times \cos\left[(\tau-\tau')\,\frac{(E_s - E_t)}{\hbar}\right].$$

3) **Compute** Quantum propagator (and then use Wick theorem!)

$$G_{\delta Q}(n,\tau|m,\tau') = \frac{\int \mathcal{D}\bar{\psi}\mathcal{D}\psi\, \psi_n(\tau)\, \bar{\psi}_m(\tau')\, e^{\frac{i}{\hbar}\left(S_0[\psi,\bar{\psi}] + S_{int}[\psi,\bar{\psi},\delta Q]\right)}}{\int \mathcal{D}\bar{\psi}\mathcal{D}\psi\, e^{\frac{i}{\hbar}\left(S_0[\psi,\bar{\psi}] + S_{int}[\psi,\bar{\psi},\delta Q]\right)}}$$

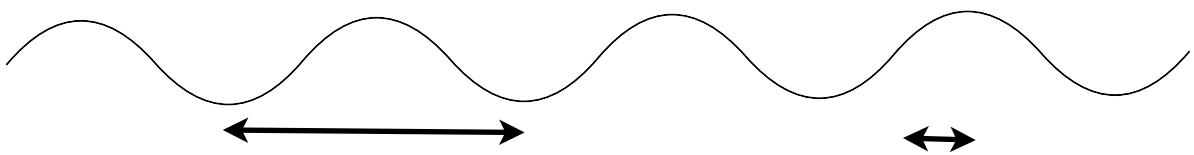
Non-Perturbative Method 2: Dynamical mean-field approximation:



Analytic (or semi-analytic) expression for green's functions!

Non-Perturbative Method 3: Effective Field Theory

Use Renormalization Group formalism to perform coarse-graining and lower the time & spatial-resolution power. Obtain an **effective theory** which yields the same results in the long-time long-distance limit:



λ (cut-off) $\quad \lambda_B$ (De Broglie's thermal wavelentgh)

from the microscopic theory we get

$$P(\mathbf{y},t|\mathbf{x},0) \simeq \int_{\mathbf{x}}^{\mathbf{y}} \mathcal{D}\mathbf{R}\; e^{-\int_0^t dT \left[\frac{1}{4D_2^b}\dot{\mathbf{R}}^2 + \left(\frac{\lambda_B}{\lambda}\right)^2 C_4^b\; \dot{\mathbf{R}}^4 + \ldots\right]}$$

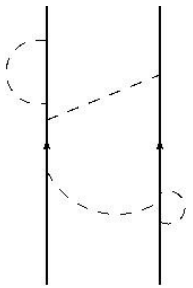
$$\ldots = \mathcal{O}\left(\frac{\lambda_B}{\lambda}\right)^2$$

quantum correction terms

where $\mathbf{A}\cdot\mathbf{B} = \sum_{ij} g_{ij}\; A_i B_j$

Different sectors of the density matrix for different physics …

$$\rho = \left(\begin{array}{c|ccc|ccc} \rho_{gg} & \rho_{ge_1} & \cdots & \rho_{ge_N} & \rho_{g\alpha_1} & \cdots & \rho_{g\alpha_{N_2}} \\ \hline \rho_{e_1 g} & \rho_{e_1 e_1} & \cdots & \rho_{e_1 e_N} & \rho_{e_1 \alpha_1} & \cdots & \rho_{e_1 \alpha_{N_2}} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \ddots & \vdots \\ \rho_{e_N g} & \rho_{e_N e_1} & \cdots & \rho_{e_N e_N} & \rho_{e_N \alpha_1} & \cdots & \rho_{e_N \alpha_{N_2}} \\ \hline \rho_{\alpha_1 g} & \rho_{\alpha_1 e_1} & \cdots & \rho_{\alpha_1 e_N} & \rho_{\alpha_1 \alpha_1} & \cdots & \rho_{\alpha_1 \alpha_{N_2}} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \ddots & \vdots \\ \rho_{\alpha_{N_2} g} & \rho_{\alpha_{N_2} e_1} & \cdots & \rho_{\alpha_{N_2} e_N} & \rho_{\alpha_{N_2} \alpha_1} & \cdots & \rho_{\alpha_{N_2} \alpha_{N_2}} \end{array}\right)$$



exciton/hole mobility $\rho_{e_k e_l}(t) \propto \int \mathcal{D}\delta R \int \mathcal{D}\psi \mathcal{D}\bar{\psi}\; e^{iS_{tot}}\; \bar{\psi}(e_l,t)\gamma_-\gamma_5\psi(e_k,t)\; \bar{\psi}(e_n,0)\gamma_+\gamma_5\psi(e_m,0)$

Diffusion of a quantum excitation:

The analytic solution (after renormalization):

diffusion of quantum excitation

$$\bar{P}(\mathbf{y},t|\mathbf{x},0) \simeq P_0(\mathbf{y},t|\mathbf{x},0;D_{ren}) \times \left[1 - C_{ren}\left(\frac{(\mathbf{y}-\mathbf{x})^4}{t^3 D_{ren}} - 20\frac{(\mathbf{y}-\mathbf{x})^2}{t^2} + \frac{60 D_{ren}}{t}\right)\right].$$

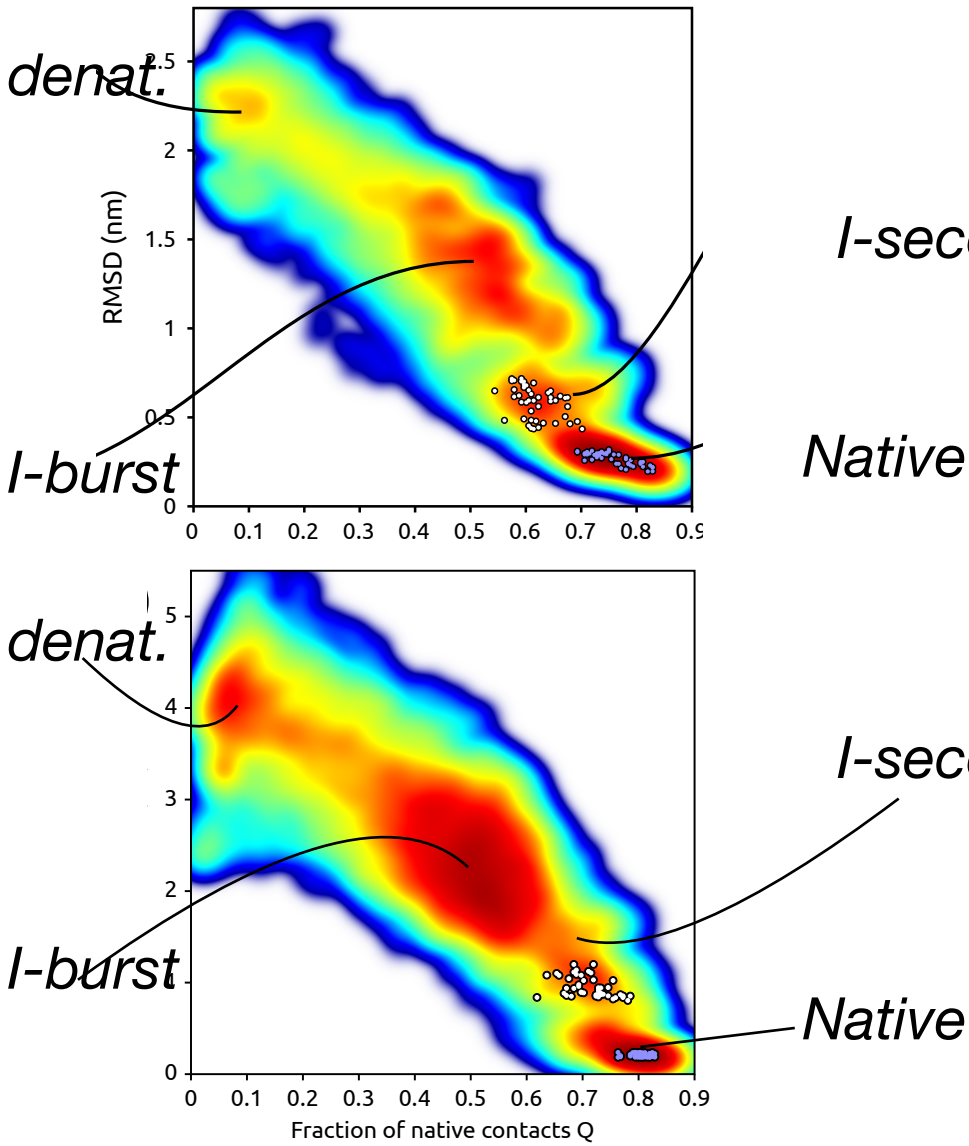
quantum correction terms

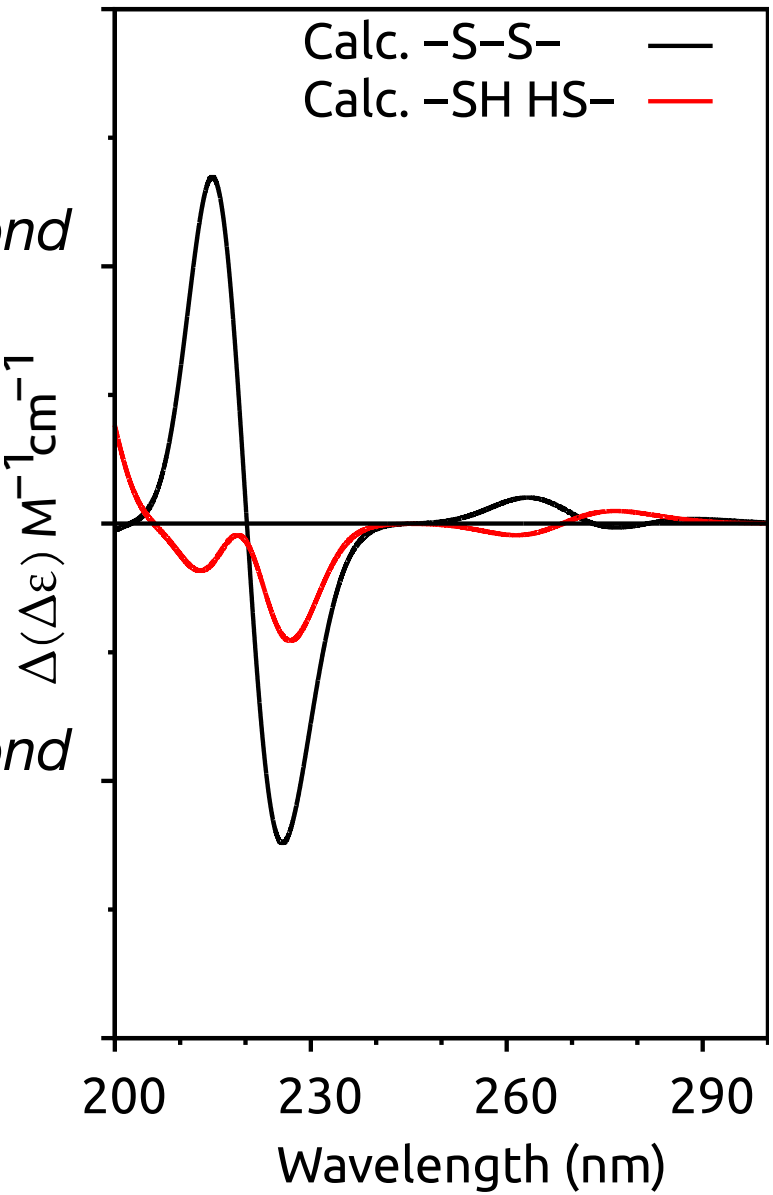
Renormalized constants, to be determined from experiments or micr. sim.s

How sensitive is this probe?

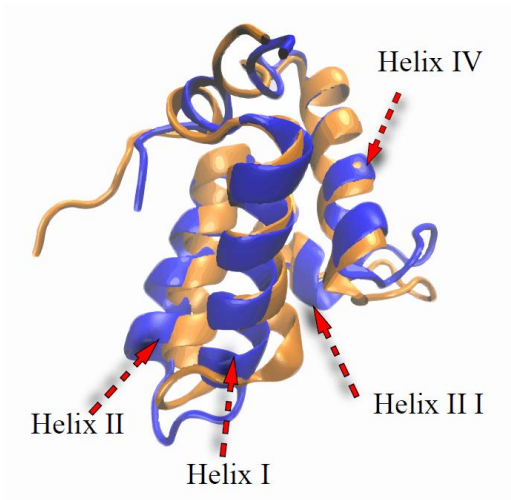
Remove the disulfide bridges:

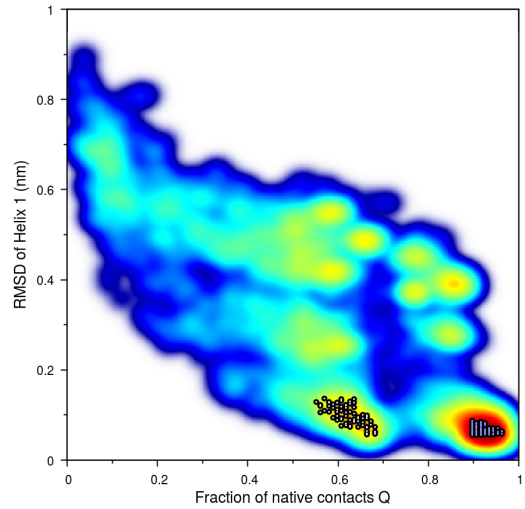
Cys30–Cys115, Cys127–Cys6, Cys94–Cys76 Cys65–Cys80

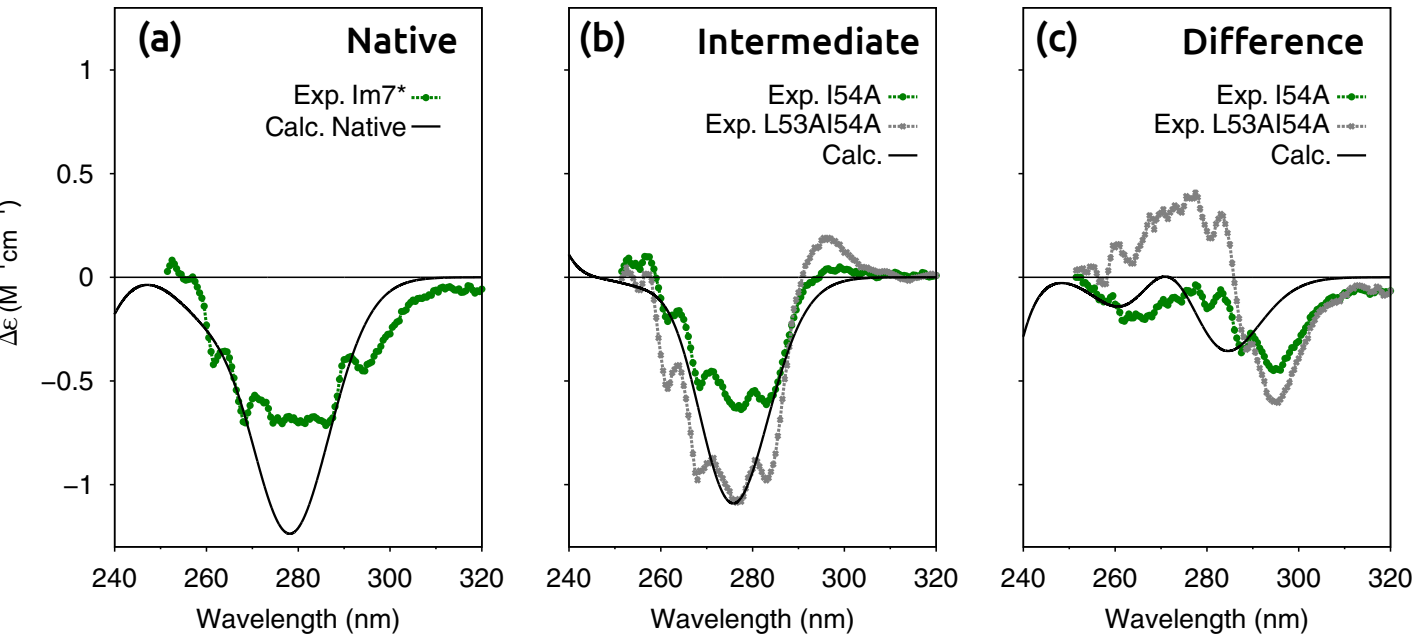




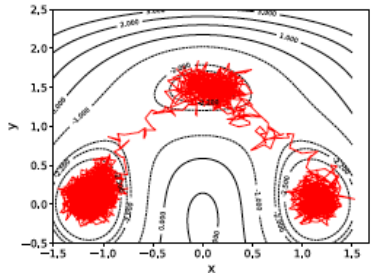
Folding of protein Im7



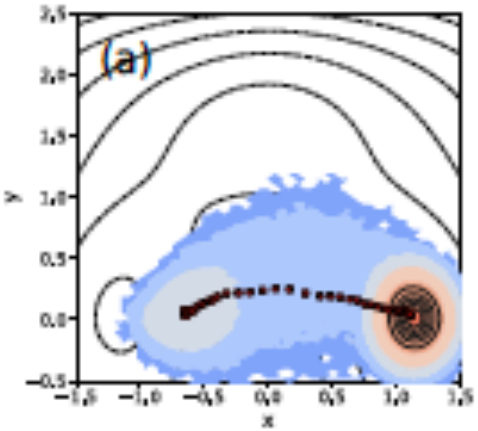




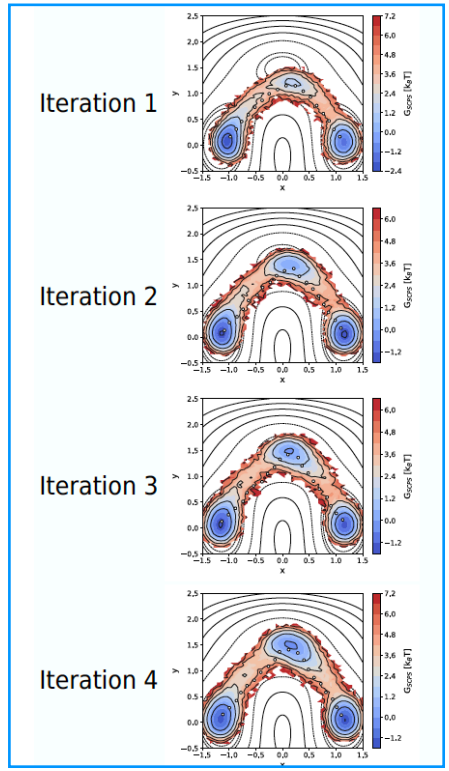
Illustrative example:



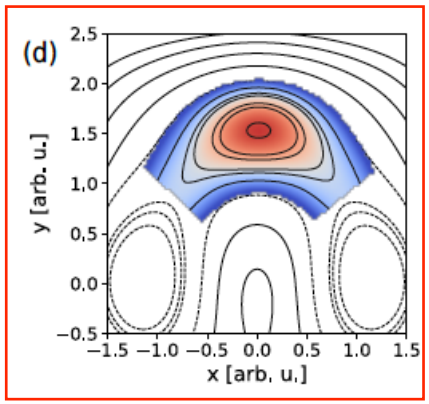
Plain steering

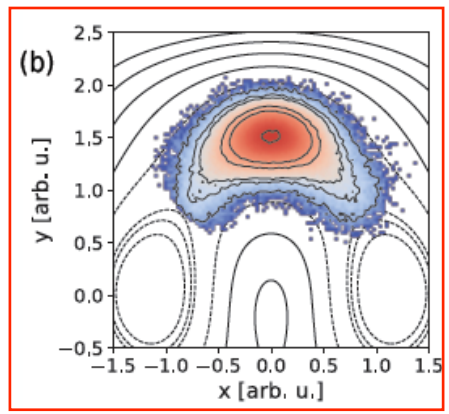


SCPS

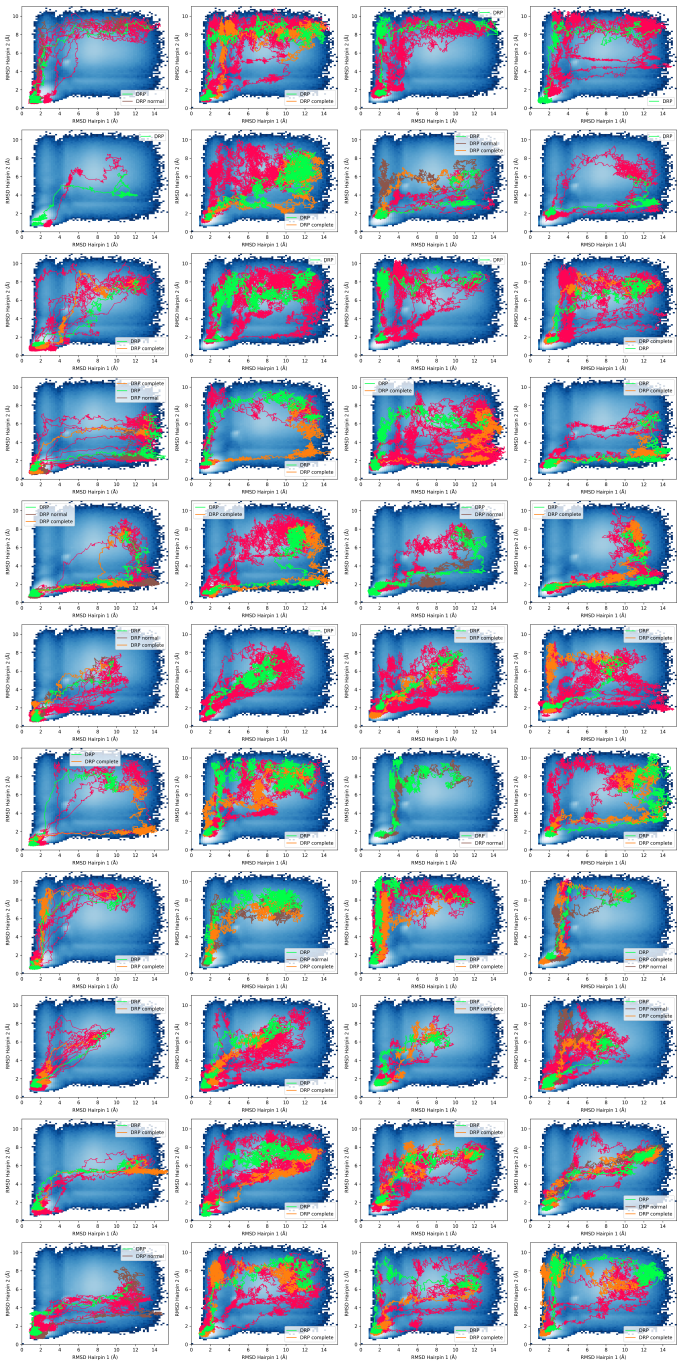


Exact (plain MD)





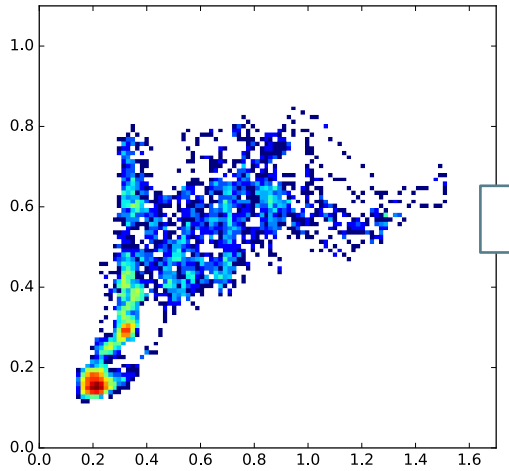
Typical calculation

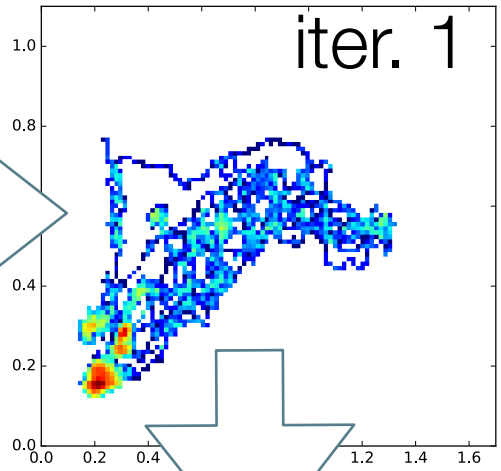


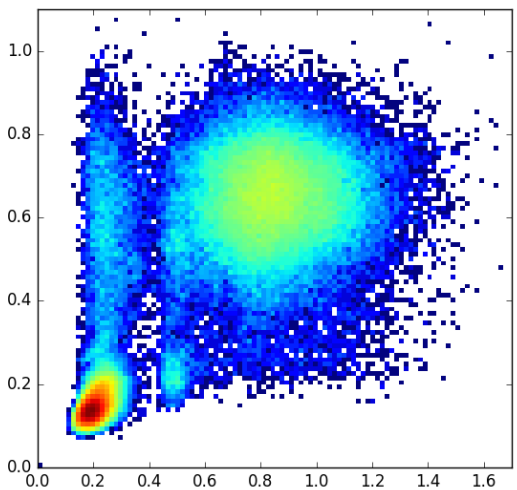
Initial conditions

SCPS iterations

Initial guess of RC

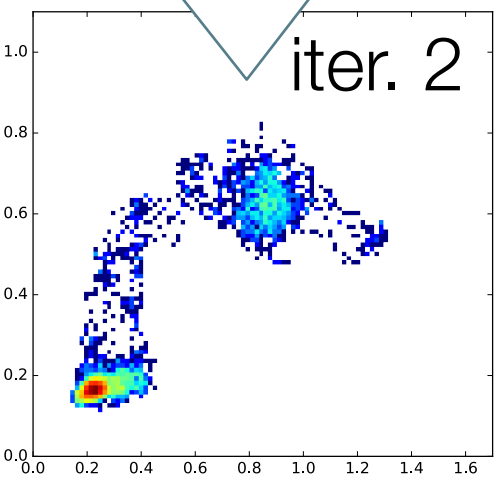


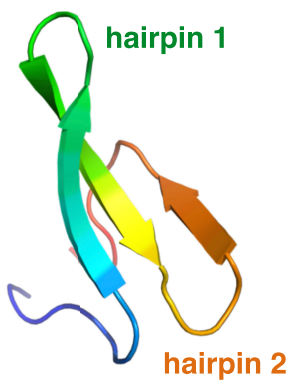




RMSD hairpin 2

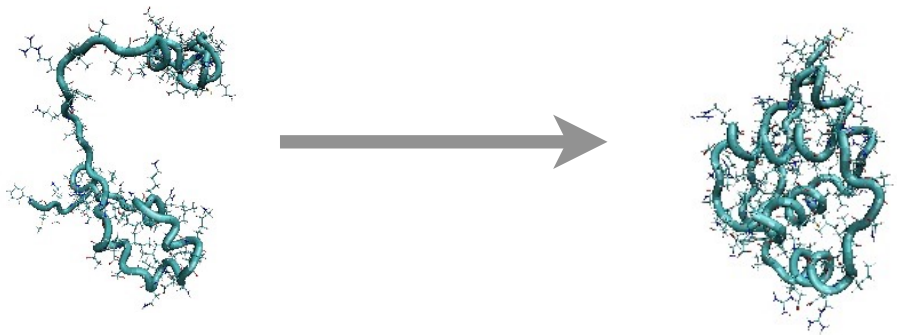
RMSD hairpin1





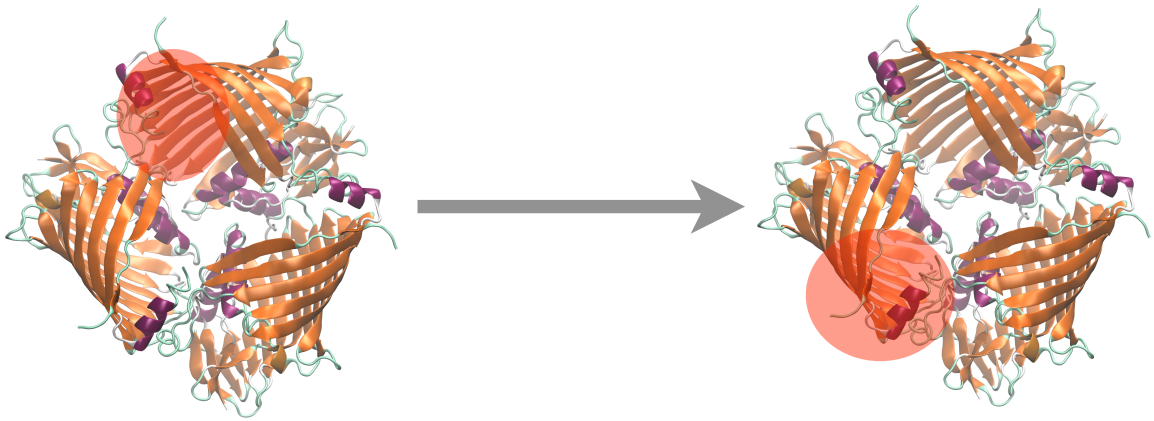
What would we like to know?

Conformational dynamics:



(adiabatic)

Exciton dynamics:

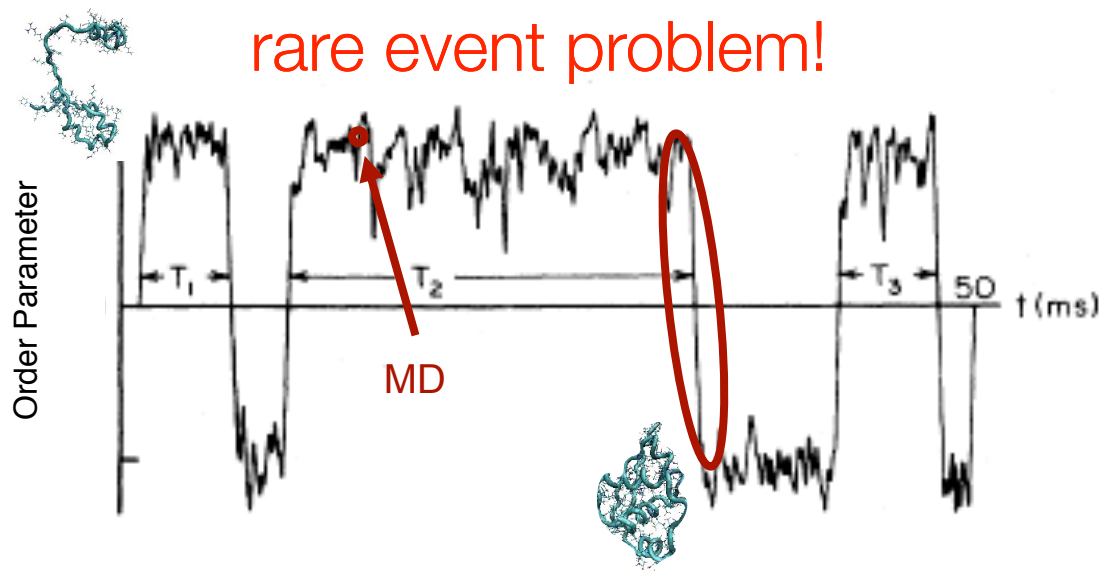


(non-adiabatic)

What are the main theoretical challenges?

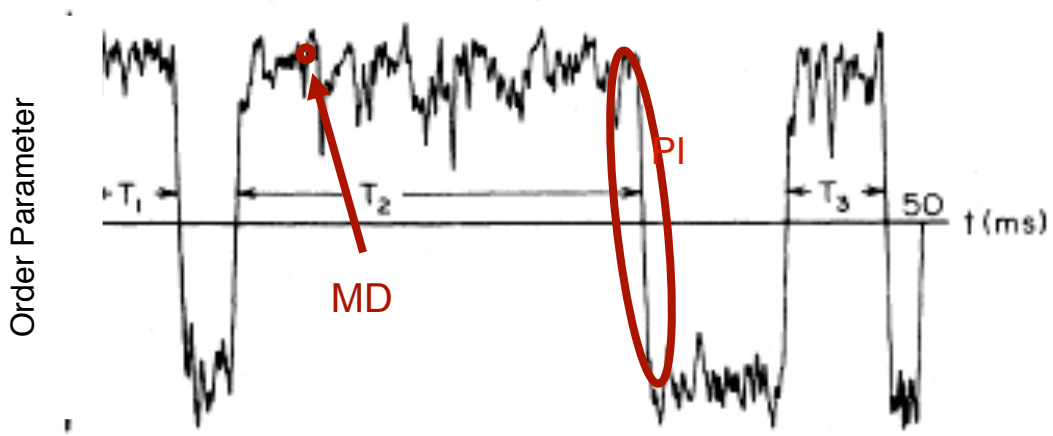
Conformational dynamics:

rare event problem!



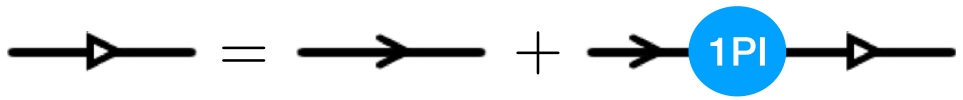
Excitons' dynamics:

Non-equilibrium open quantum system

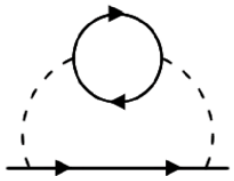


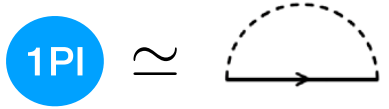
$$k_B, \hbar, t$$

Dynamical Mean Field Approximation

(a) 

$$\boldsymbol{G} = \frac{G_0}{1 - G_0 \Sigma}$$

(b) 

(c) 

In general: Dyson-Schwinger equations

Linear Absorption of Fenna Matthews Olson complex

Microscopic calculation of absorption spectra of macromolecules: An analytic approach

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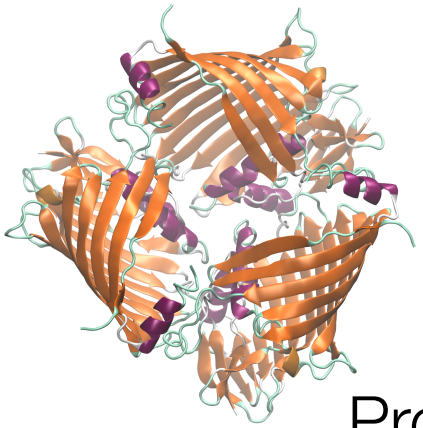
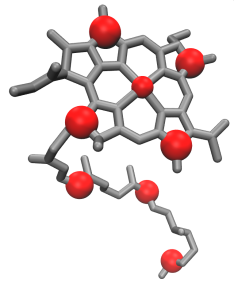
Matteo Carli,[1,2] Michele Turelli,[1,3] and Pietro Faccioli[1,3,a)]



Protein scaffold

Chlorophil



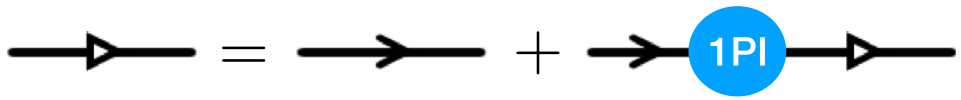
Linear Response theory: $$\kappa_a(\omega) = \frac{4\pi\omega}{n(\omega)} \mathrm{Im}[R^{(1)}(\omega)],$$

Using MQFT

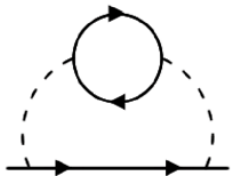
$$R^{(1)}(t) = \frac{i}{\hbar} \sum_{n=1}^{N} \frac{|\mu_{ng}|^2}{Z(t)} \int \mathcal{D}\delta Q \, e^{-S_{OM}[\delta Q] - S_{back}[\delta Q] - \beta H_Q(0)} \times \left[G^f_{\delta Q}(n,t|n,0) - G^b_{\delta Q}(n,0|n,t) \right].$$

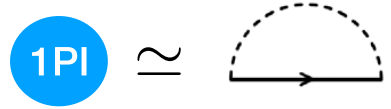
We need to compute dressed exciton propagator

Dynamical Mean Field Approximation

(a) 

$$\boldsymbol{G} = \frac{G_0}{1 - G_0\Sigma}$$

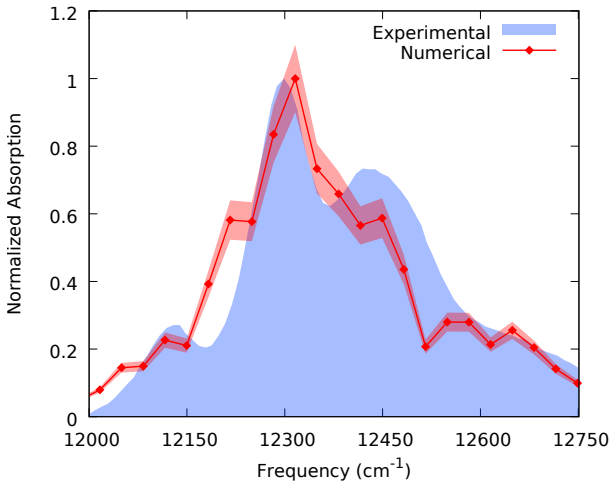
(b) 

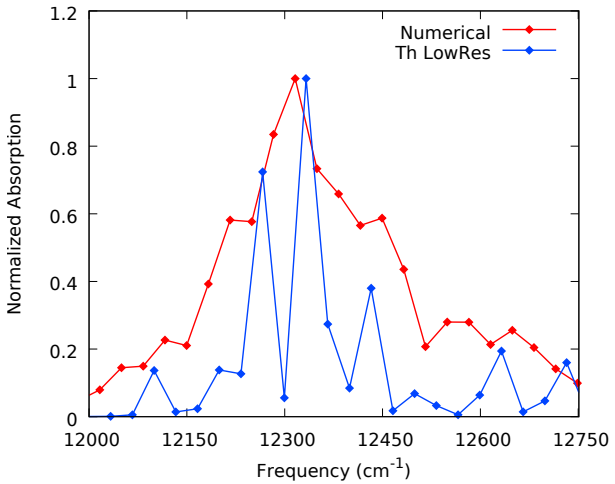
(c) 

$$\mathrm{Im}R(\omega) = -\sum_n \frac{2\mathrm{Re}\Sigma_n^f(\omega)\Big((\omega - E_n)^2 + |\Sigma_n^f(\omega)|^2\Big)}{\Big((\omega - E_n)^2 - |\Sigma_n^f(\omega)|^2\Big)^2 + 4\Big((\omega - E_n)\mathrm{Re}\Sigma_n^f(\omega)\Big)^2}.$$

$$\Sigma_{n\,m}^{f/b}(\omega) \simeq \frac{f_{nm'}^{l}\, U_{lj'}^{\dagger}\, V_{m's}^{\dagger}\big[i(E_s - \omega) \pm \gamma\big] V_{sn'}\, U_{j'h} f_{n'm}^{h}}{\beta M\, \Omega_{j'}^2\big[\Omega_{j'}^2 - (E_s - \omega)(E_s \mp i\gamma - \omega)\big]},$$

Comparting MC and DMFA results against exper.

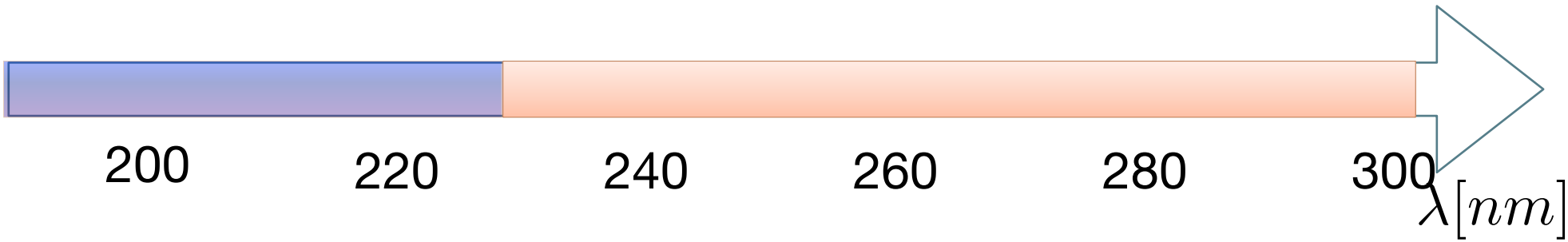




How differences in the molecular vibrational normal modes, bath temperature and viscosity can affect the spectrum

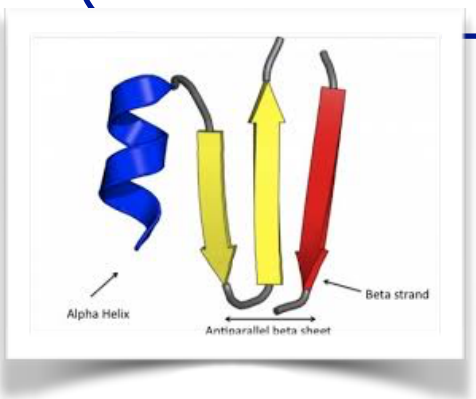
Gateway to rationale to design macromolecules with specific optical properties?

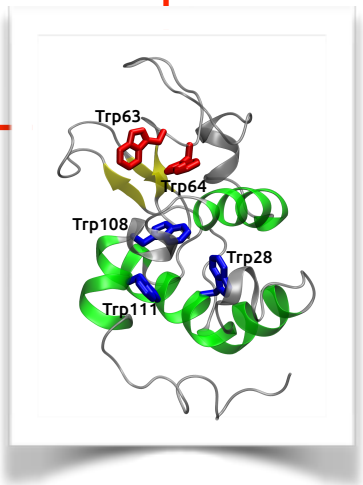
Example: Time resolved **NEAR UV** CD



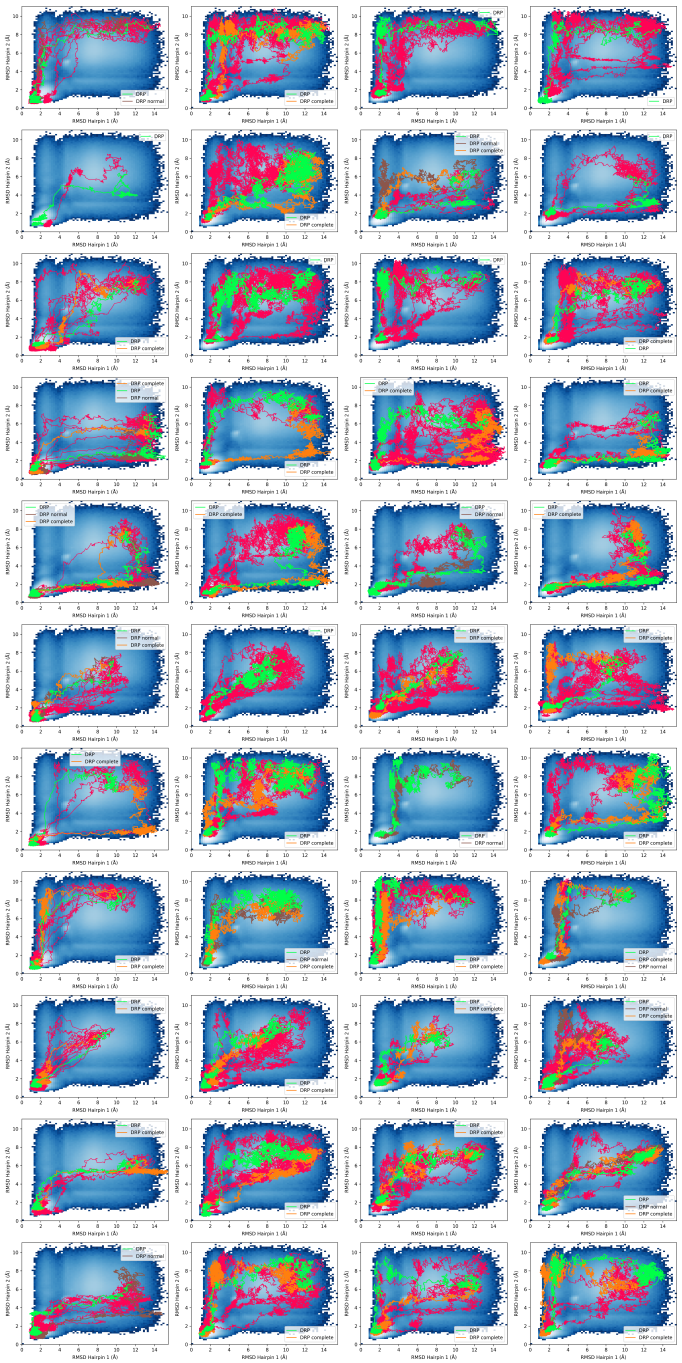
Far UV regime:
signal dominated by secondary structures

Near UV regime:
signal dominated by the coupling between π-π* excitations in aromatic residues





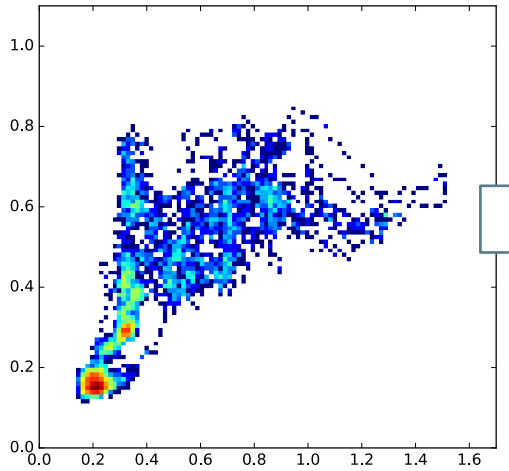
Typical calculation

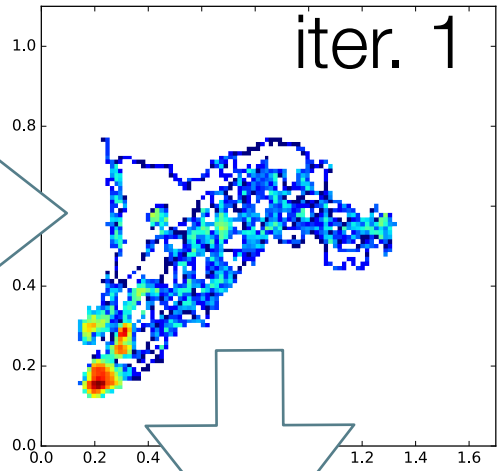


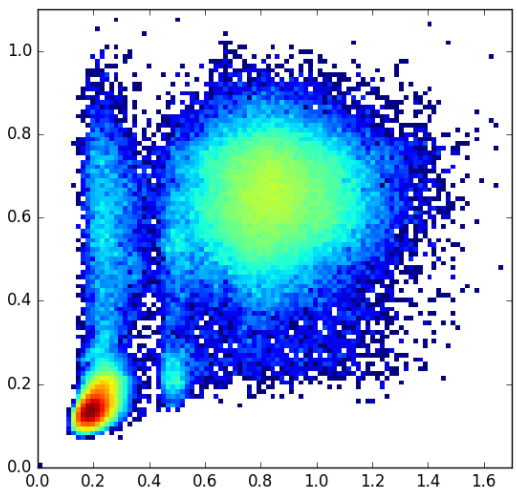
Initial conditions

SCPS iterations

Initial guess of RC

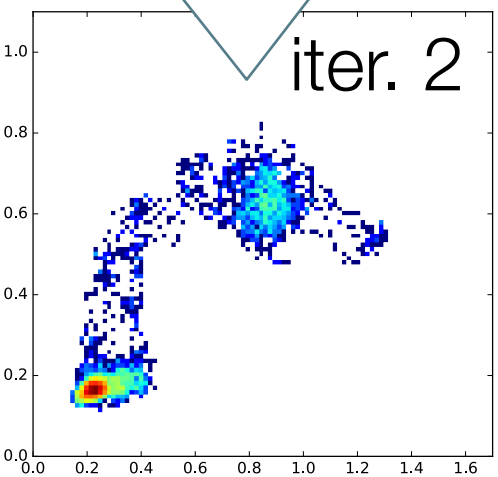


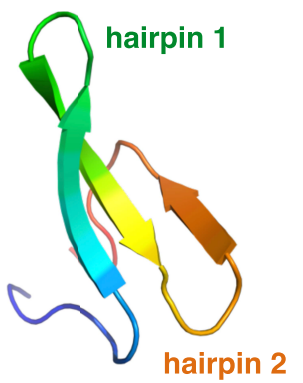




RMSD hairpin 2

RMSD hairpin1





Theoretical foundation

- Formal derivation of SCPS from Langevin dynamics

THE JOURNAL OF CHEMICAL PHYSICS **147**, 064108 (2017)

Self-consistent calculation of protein folding pathways

S. Orioli, S. a Beccara, and P. Faccioli[a)]

- Calculation of the committor function and TPT distributions from SCPS

THE JOURNAL OF CHEMICAL PHYSICS **149**, 072336 (2018)

Transition path theory from biased simulations

G. Bartolucci,[1] S. Orioli,[1,2] and P. Faccioli[1,2]

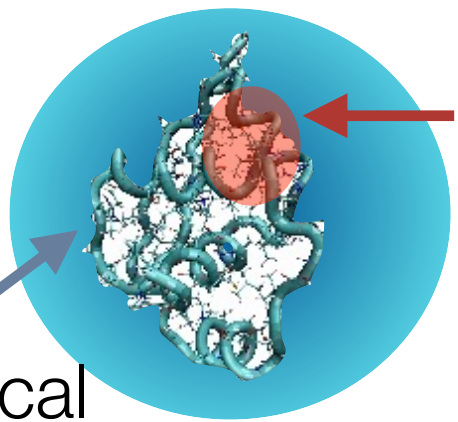
Connections with other approaches

- Self-consistent calculations of tube variables are explored also by **Ensing et al.** within *meta-dynamics*
- SCPS may be viewed as a dynamical variant of the **string method**, which can be applied to reactions as complex as protein folding

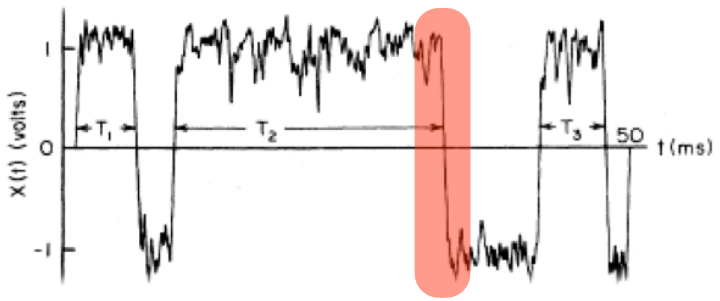
WHY PATH INTEGRALS?

Advantages

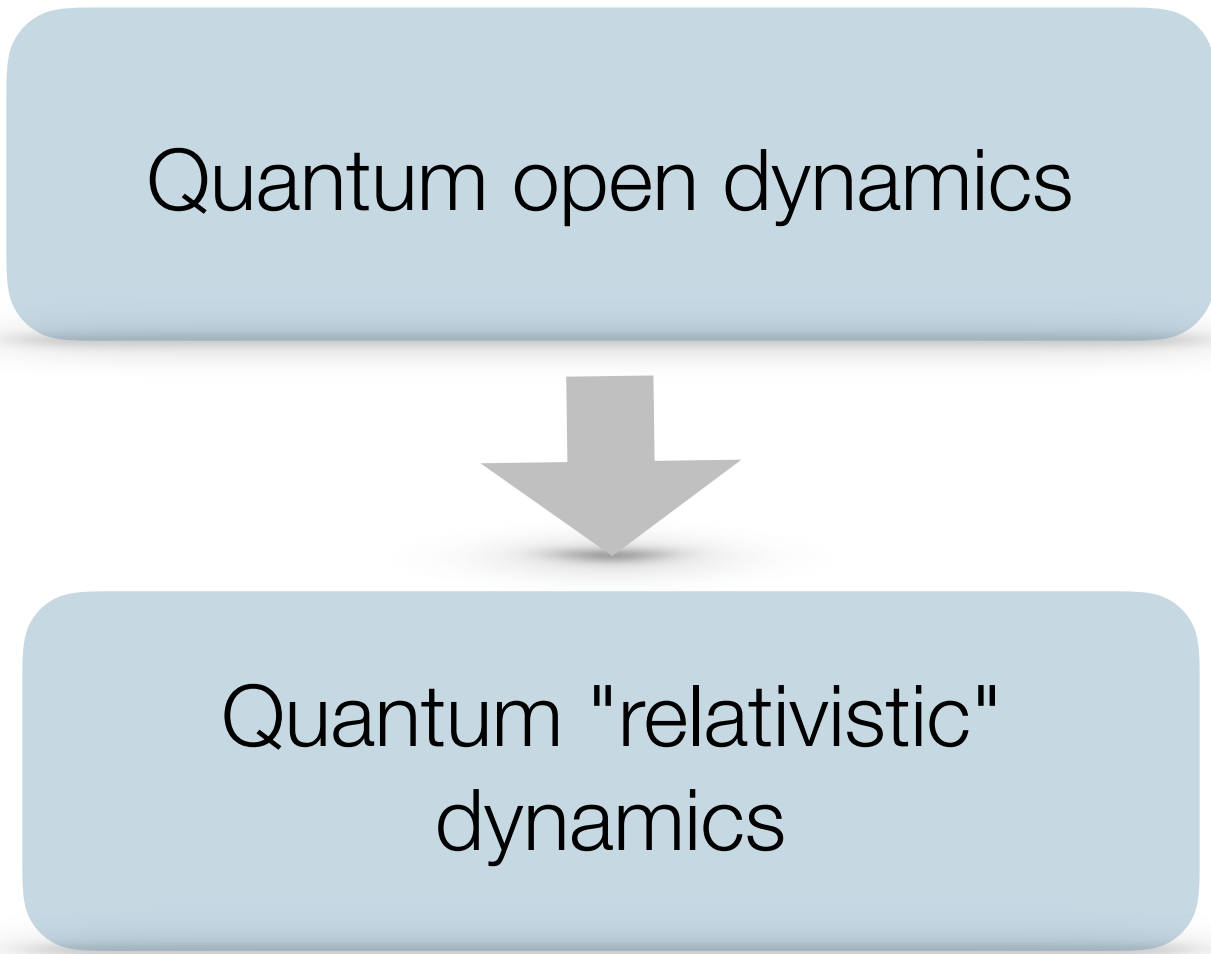
Theoretical

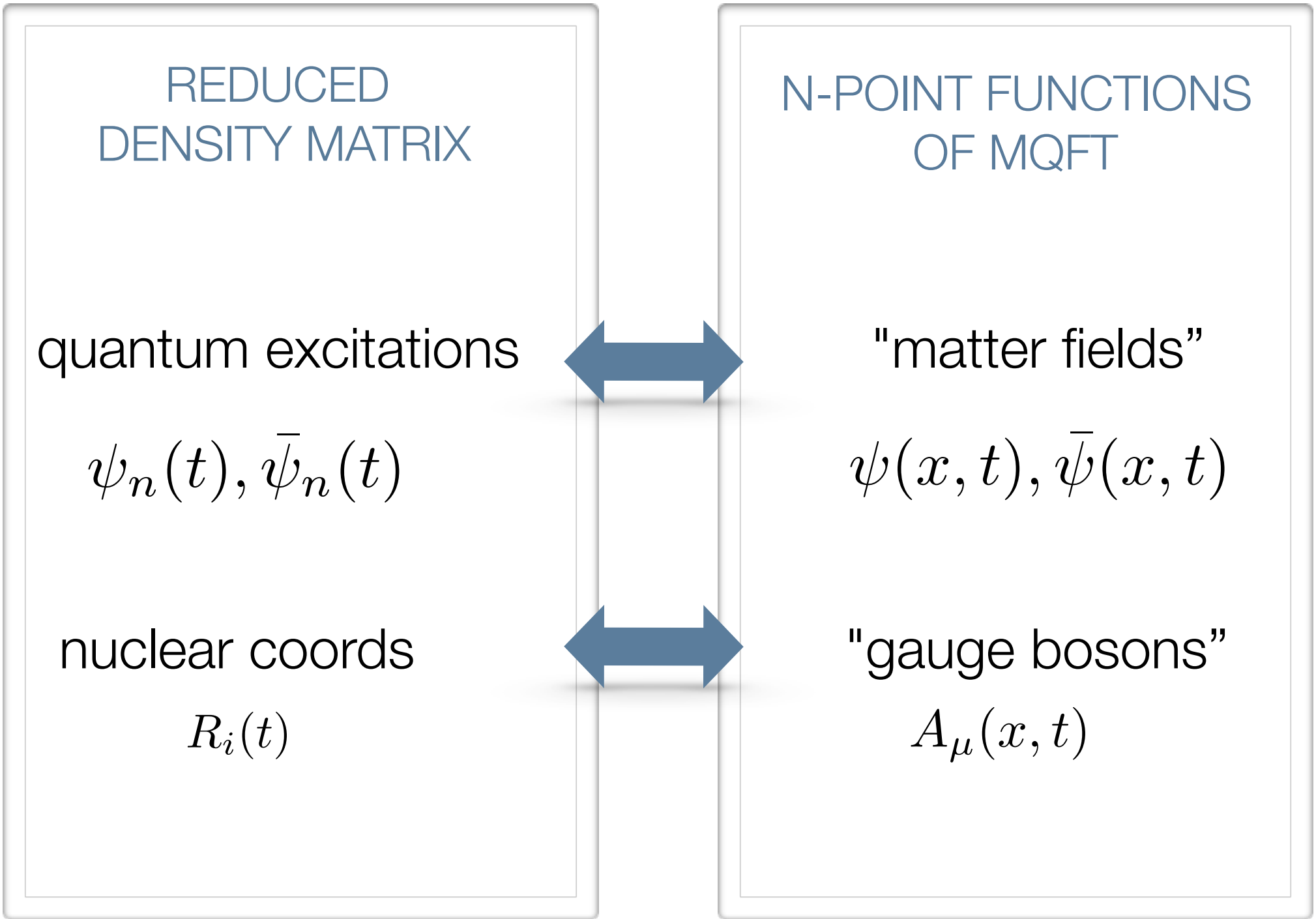


Computational

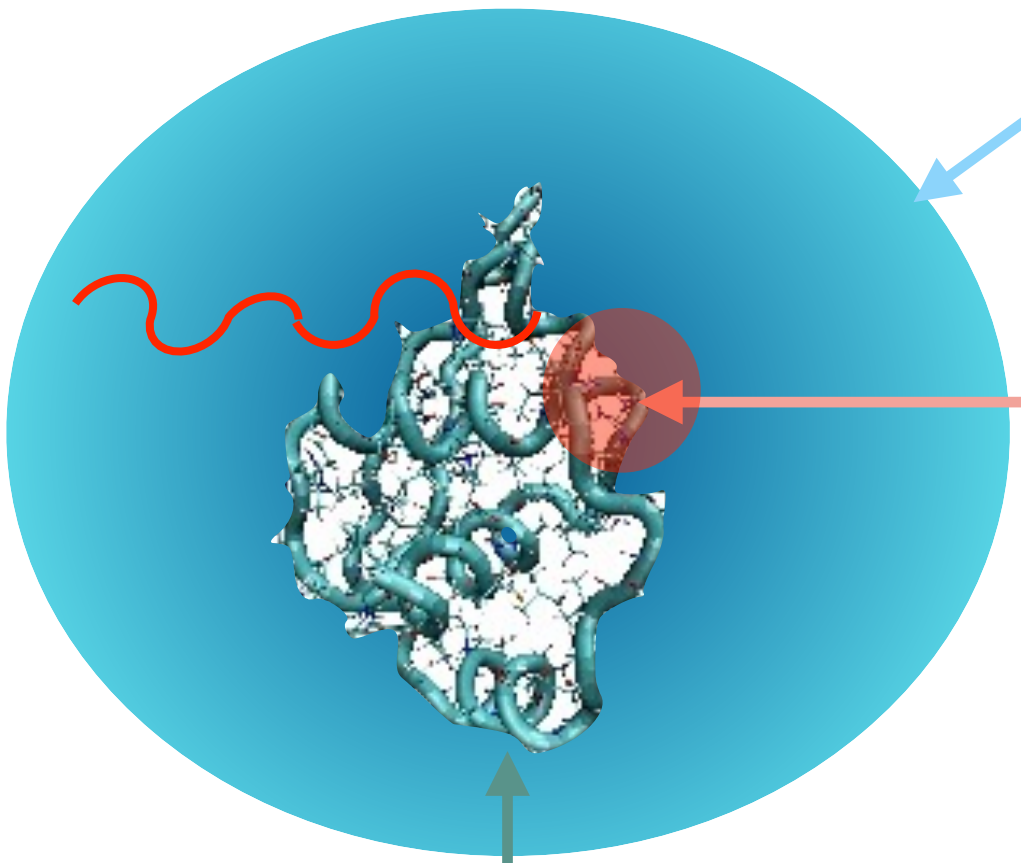


A USEFUL DUALITY




REDUCED
DENSITY MATRIX
N-POINT FUNCTIONS
OF MQFT
quantum excitations
$\psi_n(t), \bar{\psi}_n(t)$
"matter fields"
$\psi(x,t), \bar{\psi}(x,t)$
nuclear coords
$R_i(t)$
"gauge bosons"
$A_\mu(x,t)$

MODEL DEFINITION



Environment
(classical & fast)

Quantum excitation

Atomic nuclei
(classical)

FULLY QUANTUM HAMILTONIAN

$$\hat{H}_{tot} = \hat{H}_{BO} + \hat{H}_{bath} + \hat{H}_{ex.}$$

$$\hat{H}_{BO} = \sum_i \frac{\hat{\mathbf{p}}_i^2}{2m_i} + U_{BO}(\mathbf{q}_1, \ldots, \mathbf{q}_N)$$

Adiabatic dynamics

$$\hat{H}_{bath} = \sum_{i=1}^{3N} \sum_{\alpha=1}^{\infty} \left(\frac{\hat{\pi}_\alpha^2}{2\mu_\alpha} + \frac{1}{2}\mu_\alpha \omega_\alpha^2 \hat{x}_\alpha^2 - c_\alpha \hat{x}_\alpha \hat{q}_i + \frac{c_\alpha^2}{2\mu_\alpha \omega_\alpha^2} \hat{q}_\alpha^2 \right).$$

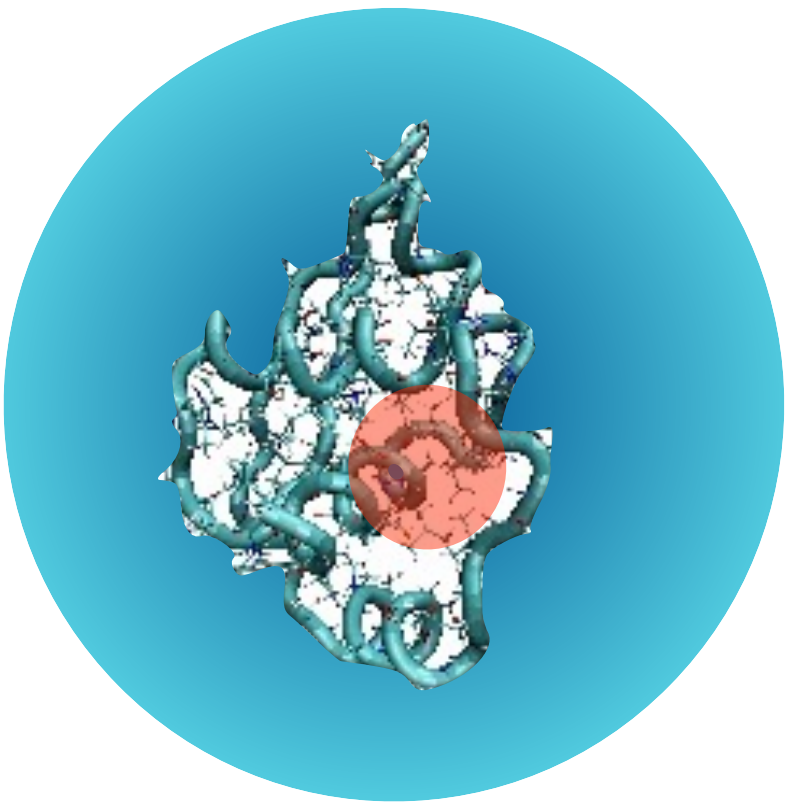
Ohmic bath

$$\hat{H}_{ex.} = \sum_s \sum_{mn} f_{mn}[Q]\ \hat{a}_{m,s}^\dagger \hat{a}_{n,s}$$

$$\langle \phi_m | \hat{\mathcal{H}}_{el} | \phi_n \rangle,$$

Non-adiabatic dynamics

DYNAMICS IN OPEN SYSTEMS

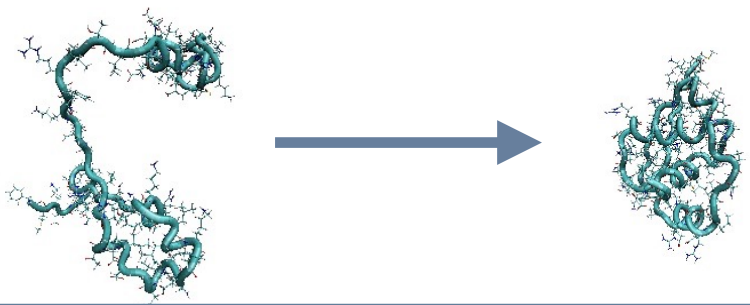


$$\hat{\rho}(t_0) \rightarrow \hat{\rho}(t)$$

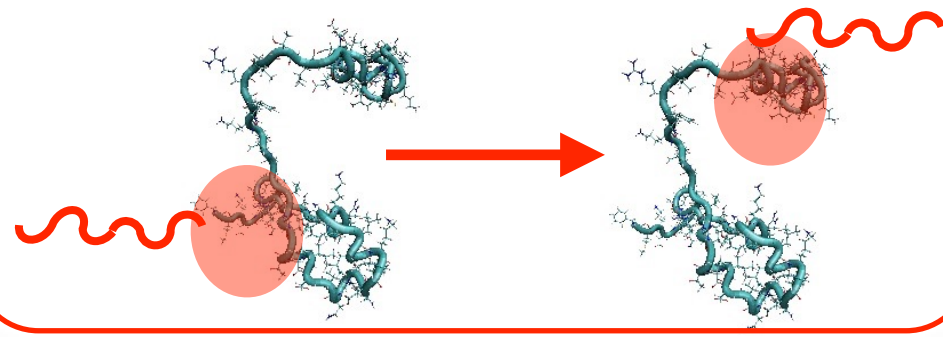
DYNAMICS IN OPEN SYSTEMS

$$\hat{\rho}(t) = \left(\begin{array}{c|ccc|ccc} \rho_{gg} & \rho_{ge_1} & \cdots & \rho_{ge_N} & \rho_{g\alpha_1} & \cdots & \rho_{g\alpha_{N_2}} \\ \hline \rho_{e_1 g} & \rho_{e_1 e_1} & \cdots & \rho_{e_1 e_N} & \rho_{e_1 \alpha_1} & \cdots & \rho_{e_1 \alpha_{N_2}} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \ddots & \vdots \\ \rho_{e_N g} & \rho_{e_N e_1} & \cdots & \rho_{e_N e_N} & \rho_{e_N \alpha_1} & \cdots & \rho_{e_N \alpha_{N_2}} \\ \hline \rho_{\alpha_1 g} & \rho_{\alpha_1 e_1} & \cdots & \rho_{\alpha_1 e_N} & \rho_{\alpha_1 \alpha_1} & \cdots & \rho_{\alpha_1 \alpha_{N_2}} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \ddots & \vdots \\ \rho_{\alpha_{N_2} g} & \rho_{\alpha_{N_2} e_1} & \cdots & \rho_{\alpha_{N_2} e_N} & \rho_{\alpha_{N_2} \alpha_1} & \cdots & \rho_{\alpha_{N_2} \alpha_{N_2}} \end{array}\right)$$

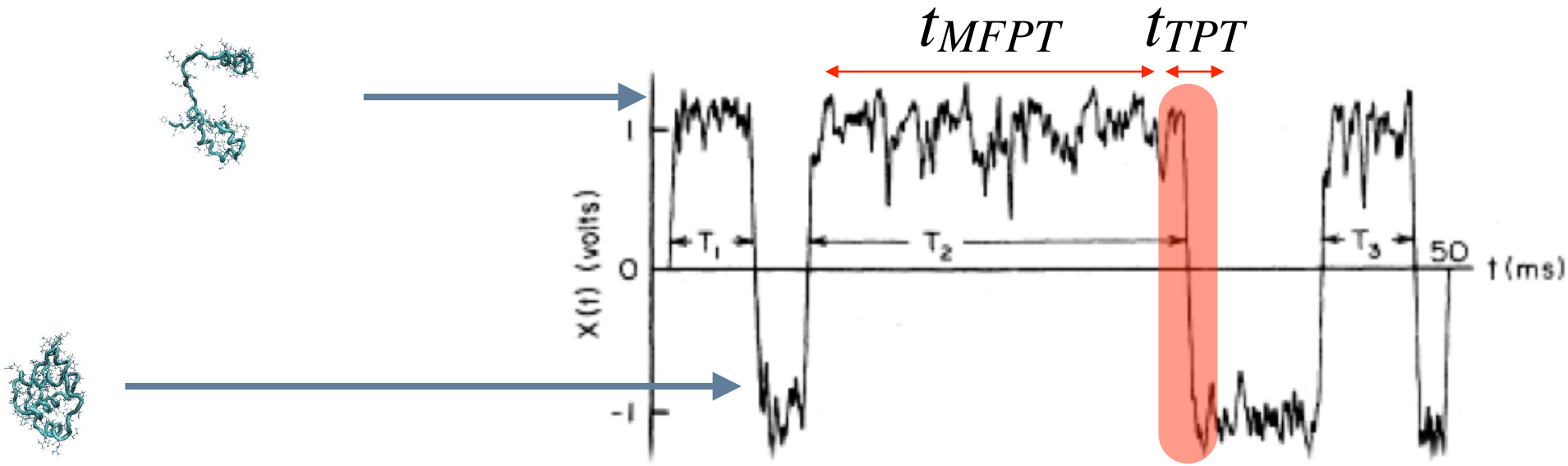
Classical structural dynamics:



Quantum electro-dynamics:



THERMAL ACTIVATION AND RARE EVENTS

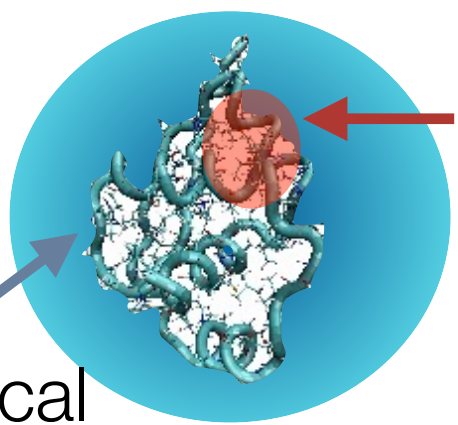


$$t_{TPT} \sim \tau_0 \log\left[\log\left(\frac{t_{MFPT}}{\tau_0}\right)\right]$$

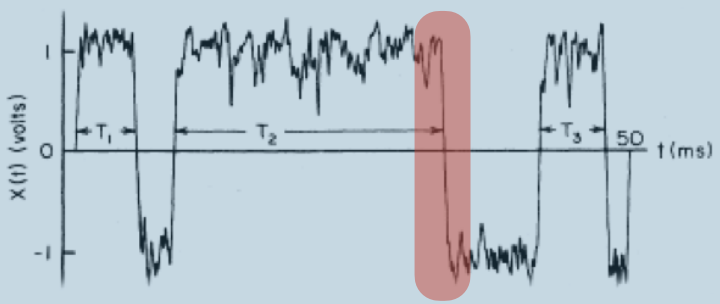
WHY PATH INTEGRALS?

Advantages

Theoretical



Computational



INSTANTON THEORY OF CONFORMATIONAL TRANSITIONS

Thermal activation: $k_B T > 0$

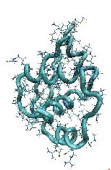
$$P(x_f, t|x_i) = \frac{e^{-\frac{1}{2k_B T}U(x_f)}}{e^{-\frac{1}{2k_B T}U(x_i)}} \int_{x_i}^{x_f} \mathcal{D}Q \; e^{-\frac{1}{k_B T}\int_0^t d\tau \left(\frac{M\gamma}{4}\dot{Q}^2 + V_{eff}(Q)\right)}$$

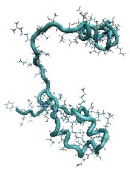
Quantum Tunneling: $\hbar > 0$

$$K(x_f, t|x_i) = \int_{x_i}^{x_f} \mathcal{D}Q \; e^{-\frac{1}{\hbar}\int_0^t d\tau \left(\frac{m}{2}\dot{Q}^2 + U(Q)\right)}$$

STRUCTURAL DYNAMICS IN PATH INTEGRAL FORM

$$\rho = \left(\begin{array}{c|ccc|ccc} \rho_{gg} & \rho_{ge_1} & \cdots & \rho_{ge_N} & \rho_{g\alpha_1} & \cdots & \rho_{g\alpha_{N_2}} \\ \hline \rho_{e_1 g} & \rho_{e_1 e_1} & \cdots & \rho_{e_1 e_N} & \rho_{e_1 \alpha_1} & \cdots & \rho_{e_1 \alpha_{N_2}} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \ddots & \vdots \\ \rho_{e_N g} & \rho_{e_N e_1} & \cdots & \rho_{e_N e_N} & \rho_{e_N \alpha_1} & \cdots & \rho_{e_N \alpha_{N_2}} \\ \hline \rho_{\alpha_1 g} & \rho_{\alpha_1 e_1} & \cdots & \rho_{\alpha_1 e_N} & \rho_{\alpha_1 \alpha_1} & \cdots & \rho_{\alpha_1 \alpha_{N_2}} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \ddots & \vdots \\ \rho_{\alpha_{N_2} g} & \rho_{\alpha_{N_2} e_1} & \cdots & \rho_{\alpha_{N_2} e_N} & \rho_{\alpha_{N_2} \alpha_1} & \cdots & \rho_{\alpha_{N_2} \alpha_{N_2}} \end{array}\right)$$





$$P(R_f, t|R_i, 0) = \int_{R_i}^{R_f} \mathcal{D}R \; e^{-\frac{\beta}{4m\gamma}\int_0^t d\tau (m\ddot{R} + m\gamma\dot{R} + \nabla U)^2}$$

Langevin dynamics: $M\ddot{R} = -\gamma M\dot{R} - \nabla U(R) + \eta$

DENSITY MATRIX IN MQFT

$$\rho = \left(\begin{array}{c|ccc|ccc} \rho_{gg} & \rho_{ge_1} & \cdots & \rho_{ge_N} & \rho_{g\alpha_1} & \cdots & \rho_{g\alpha_{N_2}} \\ \hline \rho_{e_1 g} & \rho_{e_1 e_1} & \cdots & \rho_{e_1 e_N} & \rho_{e_1 \alpha_1} & \cdots & \rho_{e_1 \alpha_{N_2}} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \ddots & \vdots \\ \rho_{e_N g} & \rho_{e_N e_1} & \cdots & \rho_{e_N e_N} & \rho_{e_N \alpha_1} & \cdots & \rho_{e_N \alpha_{N_2}} \\ \hline \rho_{\alpha_1 g} & \rho_{\alpha_1 e_1} & \cdots & \rho_{\alpha_1 e_N} & \rho_{\alpha_1 \alpha_1} & \cdots & \rho_{\alpha_1 \alpha_{N_2}} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \ddots & \vdots \\ \rho_{\alpha_{N_2} g} & \rho_{\alpha_{N_2} e_1} & \cdots & \rho_{\alpha_{N_2} e_N} & \rho_{\alpha_{N_2} \alpha_1} & \cdots & \rho_{\alpha_{N_2} \alpha_{N_2}} \end{array}\right)$$

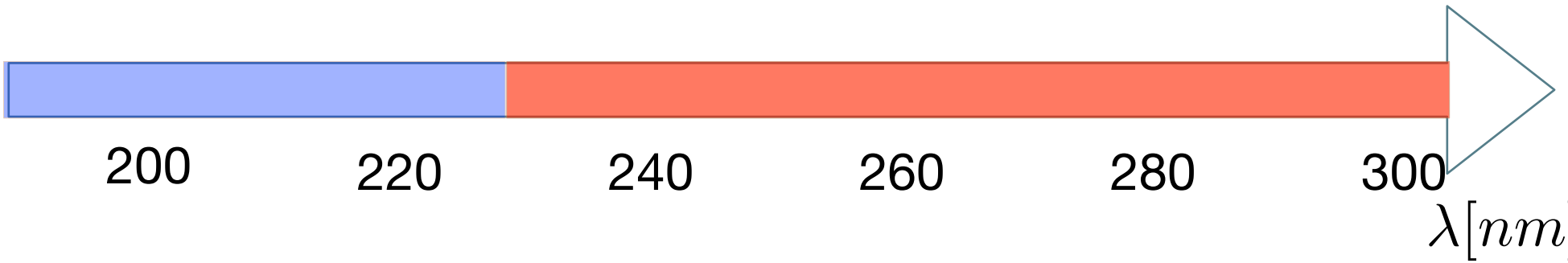
Structural dynamics $\rho_{gg} \propto \int DR e^{-S_{OM}[R]}$

Linear Spectroscopy: $\rho_{e_k g}(t) \propto \int \mathcal{D}\delta R \int \mathcal{D}\psi \mathcal{D}\bar{\psi}\ e^{iS_{tot}}\ \psi(e_l, t)\ \bar{\psi}(e_n, 0)$

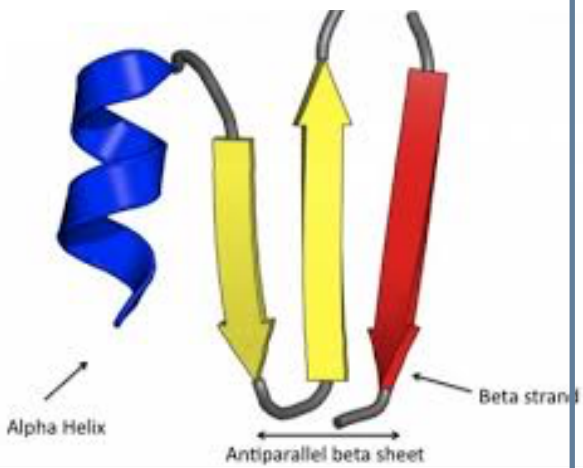
Mobility: $\rho_{e_k e_l}(t) \propto \int \mathcal{D}\delta R \int \mathcal{D}\psi \mathcal{D}\bar{\psi}\ e^{iS_{tot}}\ \bar{\psi}(e_l, t)\gamma_- \gamma_5 \psi(e_k, t)\ \bar{\psi}(e_n, 0)\gamma_+ \gamma_5 \psi(e_m, 0)$

Non-linear spectroscopy: ....

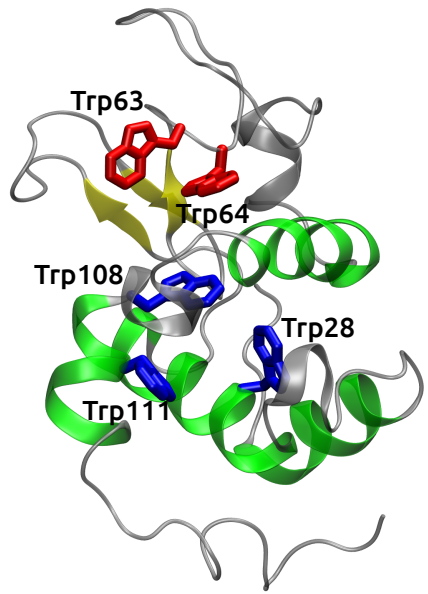
TIME RESOLVED NEAR UV CIRCULAR DICHROISM



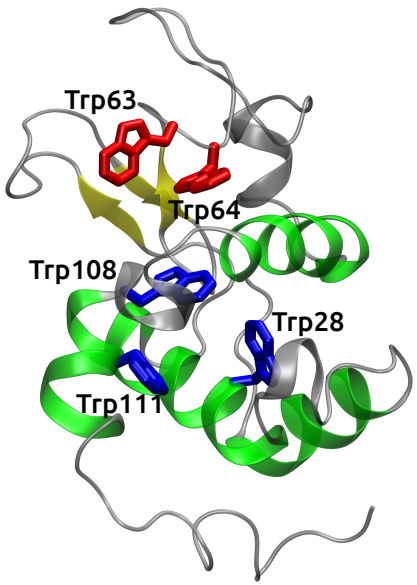
Far UV regime:



Near UV regime:



EXISTING EXPERIMENTS



Biochemistry **2005,** *44,* 6685−6692 6685

Characterization of Kinetic Folding Intermediates of Recombinant Canine Milk Lysozyme by Stopped-Flow Circular Dichroism†

Masaharu Nakao,‡ Kosuke Maki,‡ Munehito Arai,§ Takumi Koshiba,∥,⊥ Katsutoshi Nitta,∥ and Kunihiro Kuwajima*,‡

secondary structures

key tertiary contacts

Unfolded → I-burst → I-second → Native

MICROSCOPIC CALCULATION: STRUCTURAL DYNAMICS

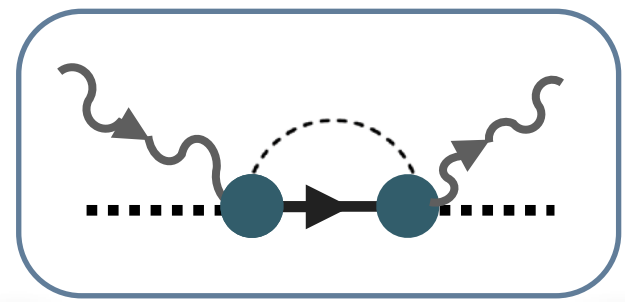
$$\rho = \left(\begin{array}{c|ccc|ccc} \rho_{gg} & \rho_{ge_1} & \cdots & \rho_{ge_N} & \rho_{g\alpha_1} & \cdots & \rho_{g\alpha_{N_2}} \\ \hline \rho_{e_1 g} & \rho_{e_1 e_1} & \cdots & \rho_{e_1 e_N} & \rho_{e_1 \alpha_1} & \cdots & \rho_{e_1 \alpha_{N_2}} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \ddots & \vdots \\ \rho_{e_N g} & \rho_{e_N e_1} & \cdots & \rho_{e_N e_N} & \rho_{e_N \alpha_1} & \cdots & \rho_{e_N \alpha_{N_2}} \\ \hline \rho_{\alpha_1 g} & \rho_{\alpha_1 e_1} & \cdots & \rho_{\alpha_1 e_N} & \rho_{\alpha_1 \alpha_1} & \cdots & \rho_{\alpha_1 \alpha_{N_2}} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \ddots & \vdots \\ \rho_{\alpha_{N_2} g} & \rho_{\alpha_{N_2} e_1} & \cdots & \rho_{\alpha_{N_2} e_N} & \rho_{\alpha_{N_2} \alpha_1} & \cdots & \rho_{\alpha_{N_2} \alpha_{N_2}} \end{array}\right)$$

MICROSCOPIC CALCULATION: QUANTUM DYNAMICS

$$\rho = \left(\begin{array}{c|ccc|ccc} \rho_{gg} & \rho_{ge_1} & \cdots & \rho_{ge_N} & \rho_{g\alpha_1} & \cdots & \rho_{g\alpha_{N_2}} \\ \hline \rho_{e_1 g} & \rho_{e_1 e_1} & \cdots & \rho_{e_1 e_N} & \rho_{e_1 \alpha_1} & \cdots & \rho_{e_1 \alpha_{N_2}} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \ddots & \vdots \\ \rho_{e_N g} & \rho_{e_N e_1} & \cdots & \rho_{e_N e_N} & \rho_{e_N \alpha_1} & \cdots & \rho_{e_N \alpha_{N_2}} \\ \hline \rho_{\alpha_1 g} & \rho_{\alpha_1 e_1} & \cdots & \rho_{\alpha_1 e_N} & \rho_{\alpha_1 \alpha_1} & \cdots & \rho_{\alpha_1 \alpha_{N_2}} \\ \vdots & \vdots & \ddots & \vdots & \vdots & \ddots & \vdots \\ \rho_{\alpha_{N_2} g} & \rho_{\alpha_{N_2} e_1} & \cdots & \rho_{\alpha_{N_2} e_N} & \rho_{\alpha_{N_2} \alpha_1} & \cdots & \rho_{\alpha_{N_2} \alpha_{N_2}} \end{array}\right)$$

Electric moment

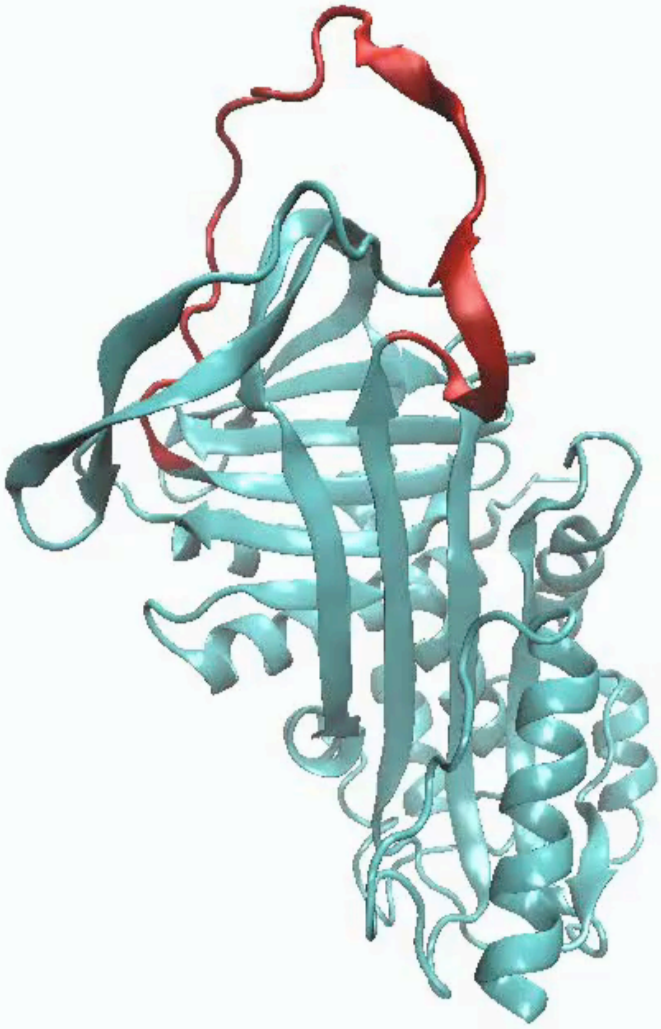
$$R_{0K} = \Im \langle 0 | \hat{\boldsymbol{\mu}} | K \rangle \cdot \langle K | \hat{\mathbf{m}} | 0 \rangle$$

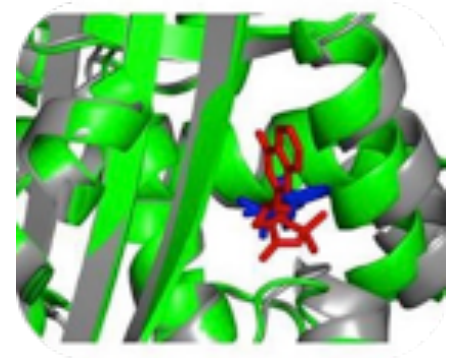


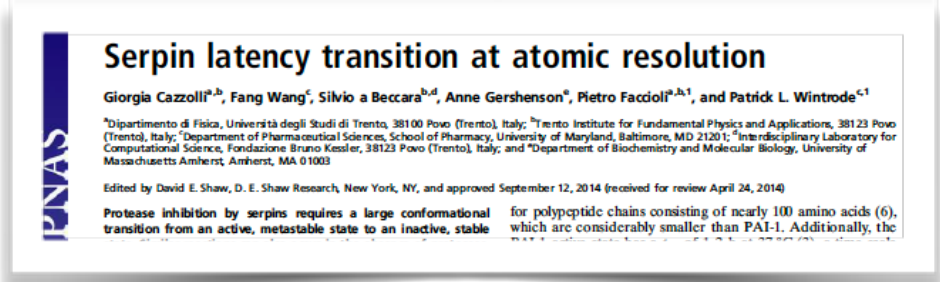
Rotatory strength (vertex)

Magnetic moment

THE SERPIN LATENCY TRANSITION PUZZLE







PNAS

Serpin latency transition at atomic resolution

Giorgia Cazzolli[a,b], Fang Wang[c], Silvio a Beccara[b,d], Anne Gershenson[e], Pietro Faccioli[a,b,1], and Patrick L. Wintrode[c,1]

[a]Dipartimento di Fisica, Università degli Studi di Trento, 38100 Povo (Trento), Italy; [b]Trento Institute for Fundamental Physics and Applications, 38123 Povo (Trento), Italy; [c]Department of Pharmaceutical Sciences, School of Pharmacy, University of Maryland, Baltimore, MD 21201; [d]Interdisciplinary Laboratory for Computational Science, Fondazione Bruno Kessler, 38123 Povo (Trento), Italy; and [e]Department of Biochemistry and Molecular Biology, University of Massachusetts Amherst, Amherst, MA 01003

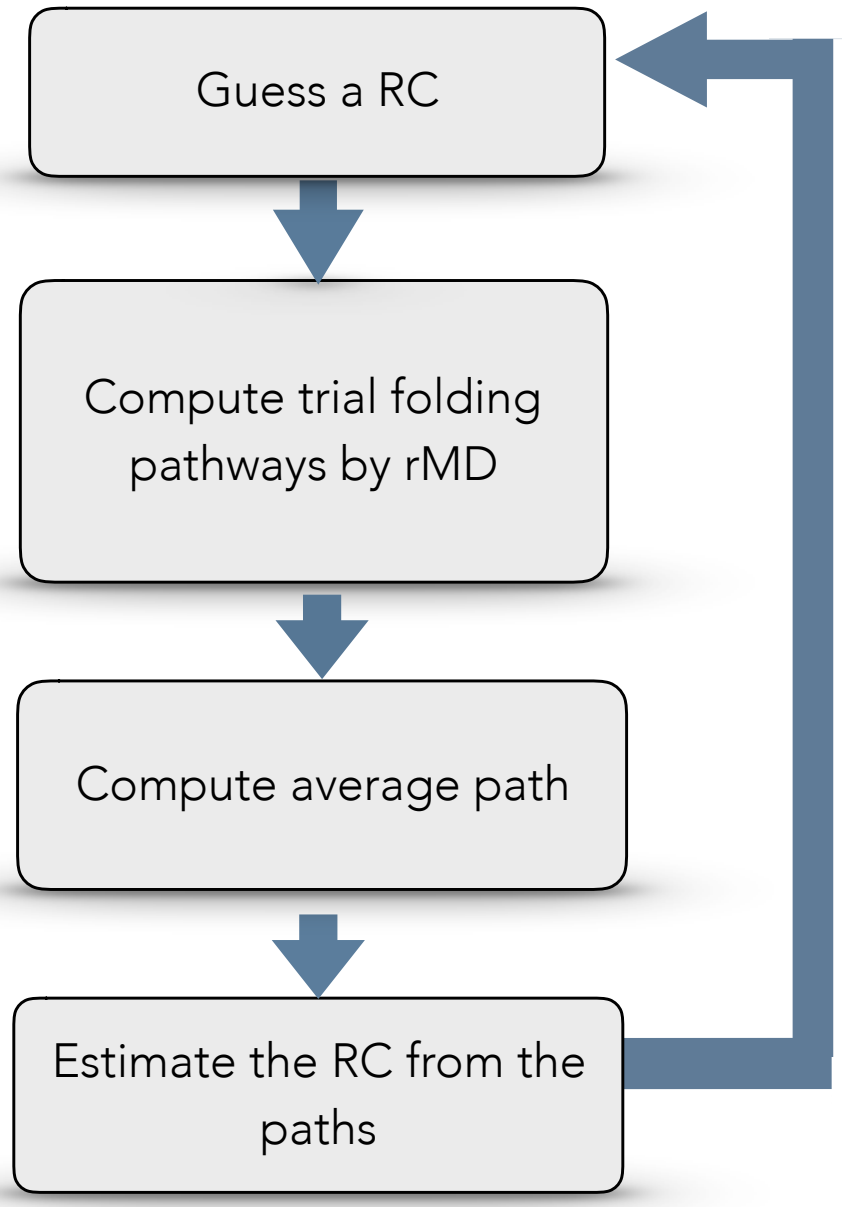
Edited by David E. Shaw, D. E. Shaw Research, New York, NY, and approved September 12, 2014 (received for review April 24, 2014)

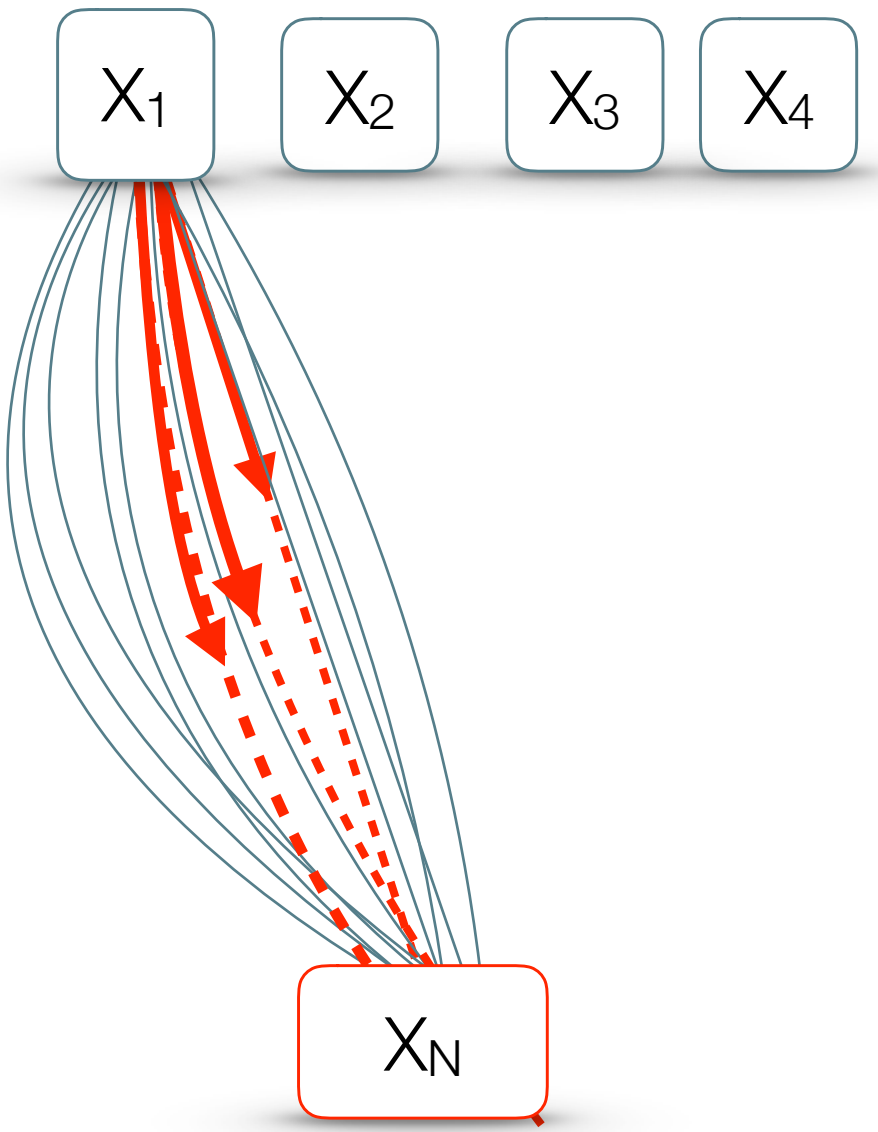
Protease inhibition by serpins requires a large conformational transition from an active, metastable state to an inactive, stable

for polypeptide chains consisting of nearly 100 amino acids (6), which are considerably smaller than PAI-1. Additionally, the

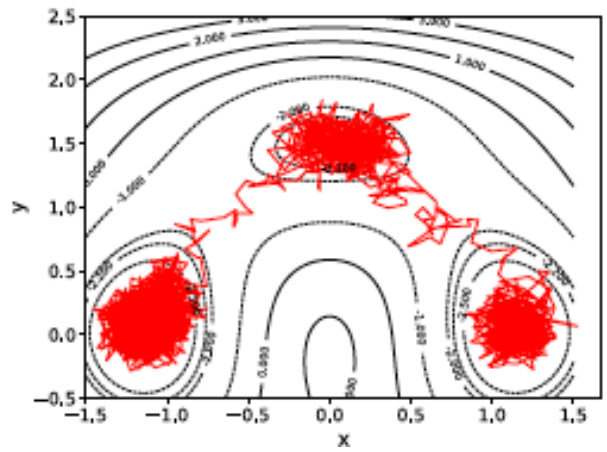
SELF CONSISTENT PATH SAMPLING

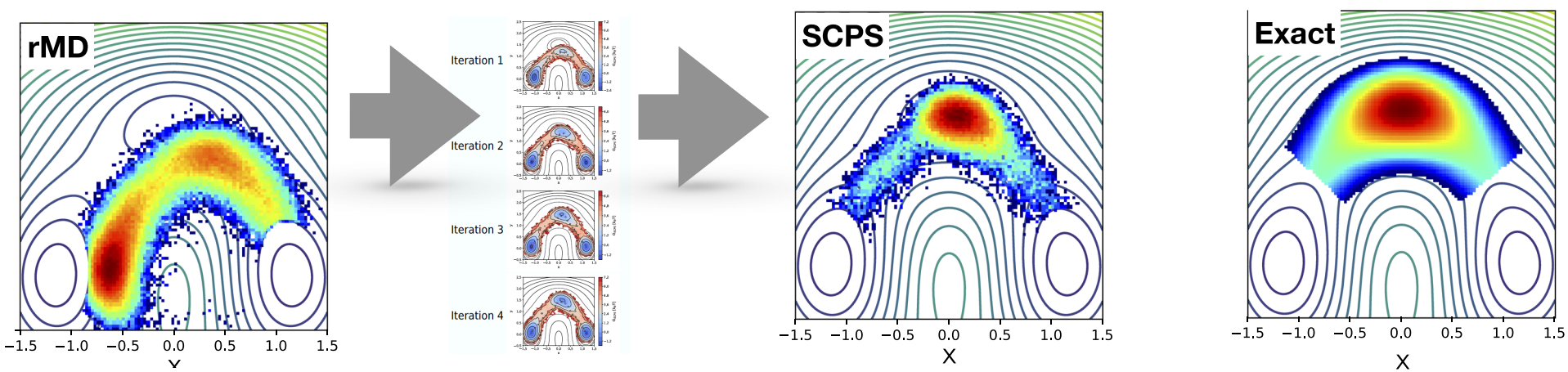
…first discussed in Bressanone…



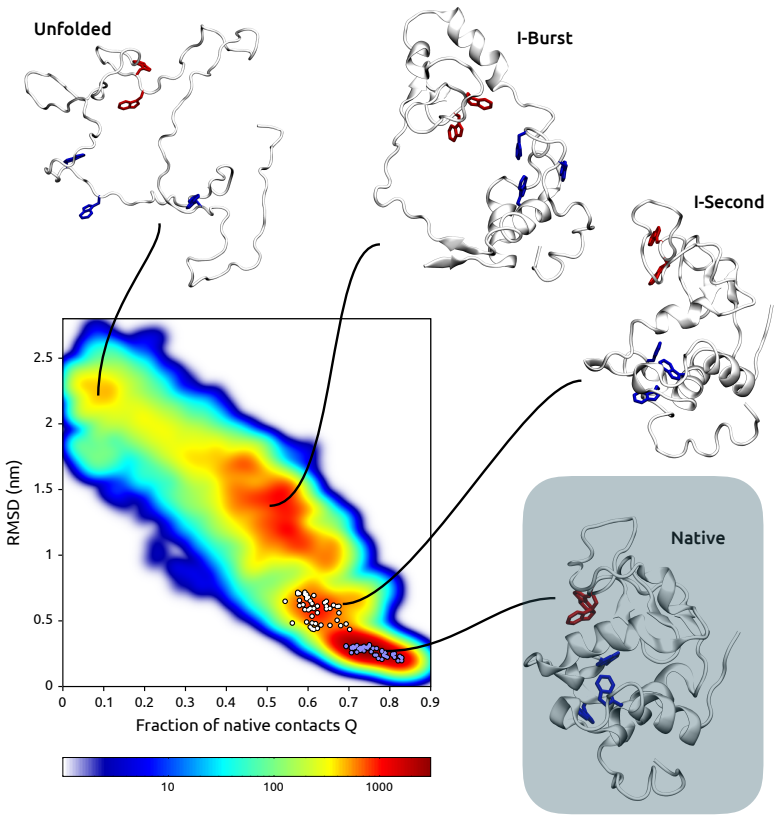


REACHING ACCURACY





IS THIS A FREE LOUNCH?



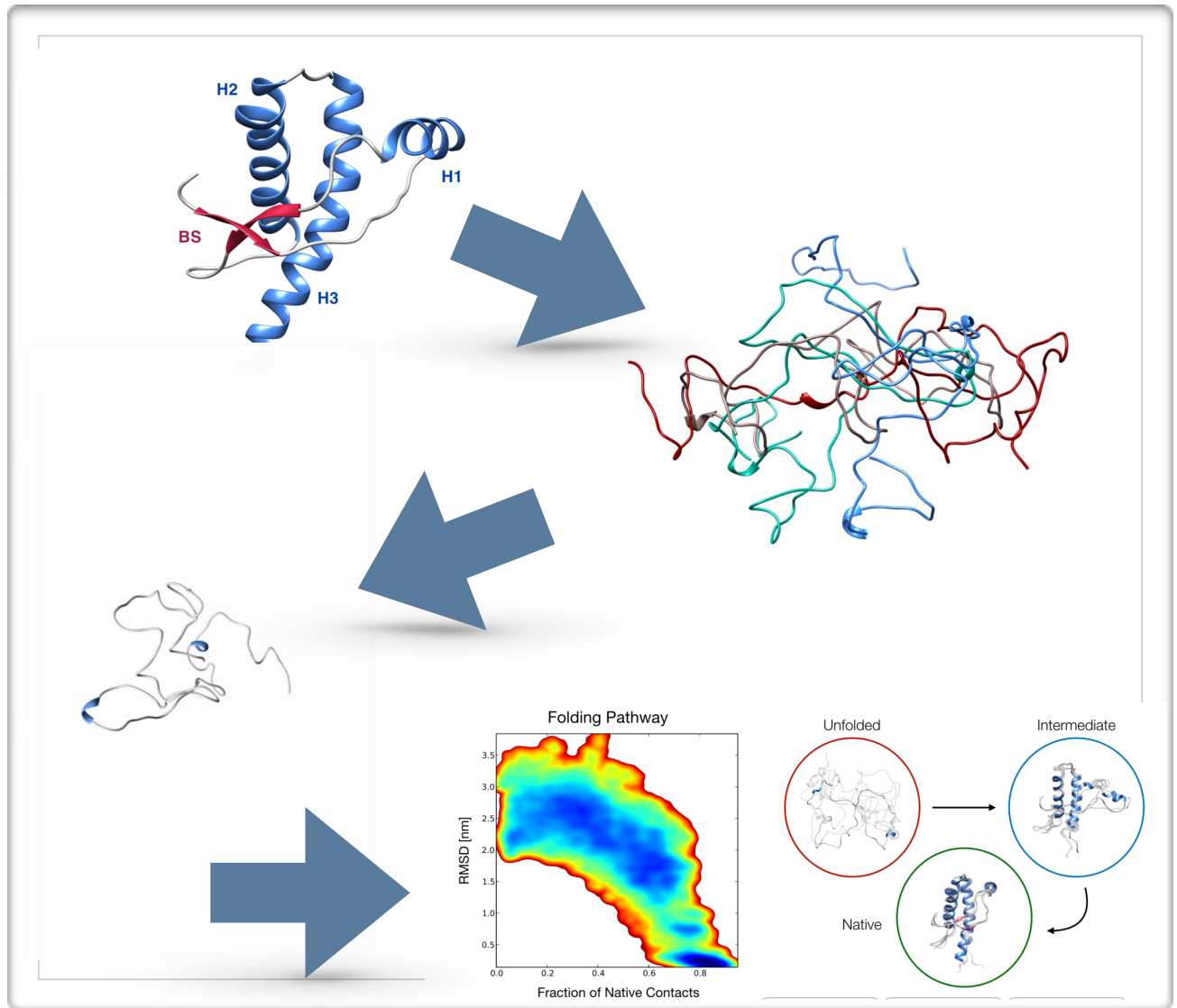
All atom
3D structure of
the native state
are given, not
predicted

PPI-FIT PIPELINE

Folding pathway characterization

Virtual screening on folding Intermediate

Validation



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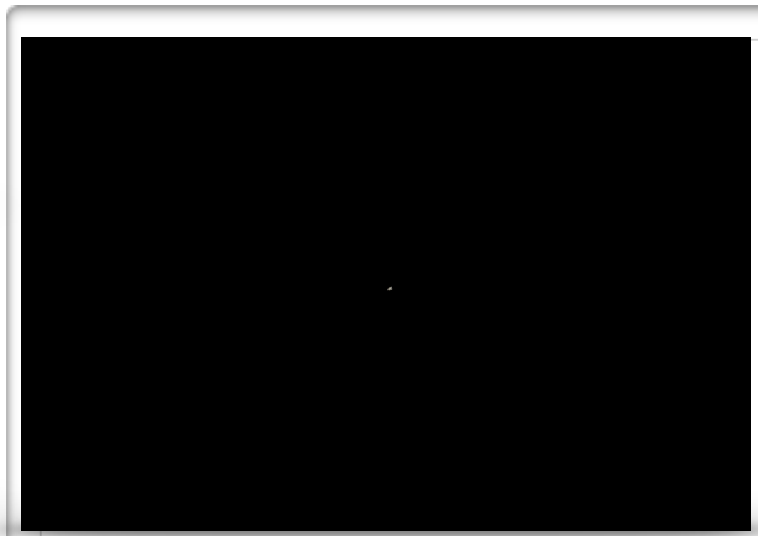

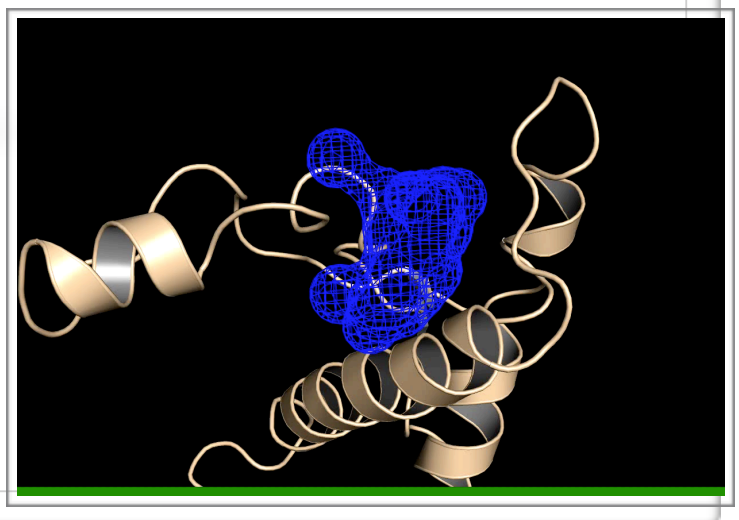

with
L. Barreca's Lab

PPI-FIT PIPELINE

Folding pathway characterization

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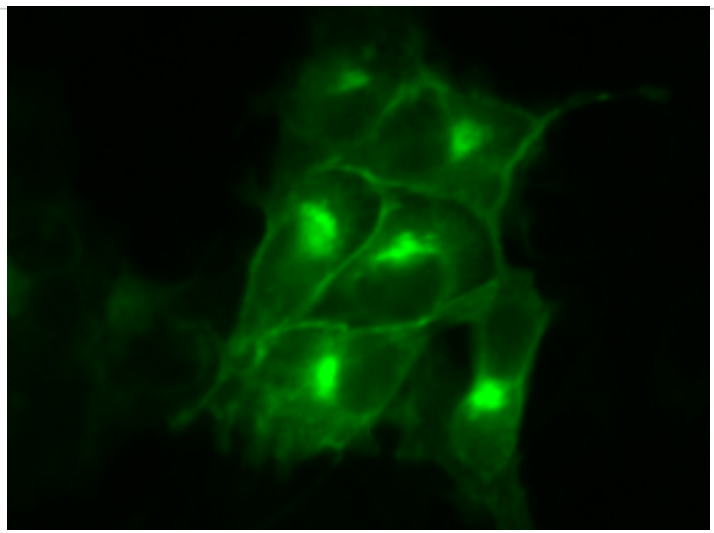
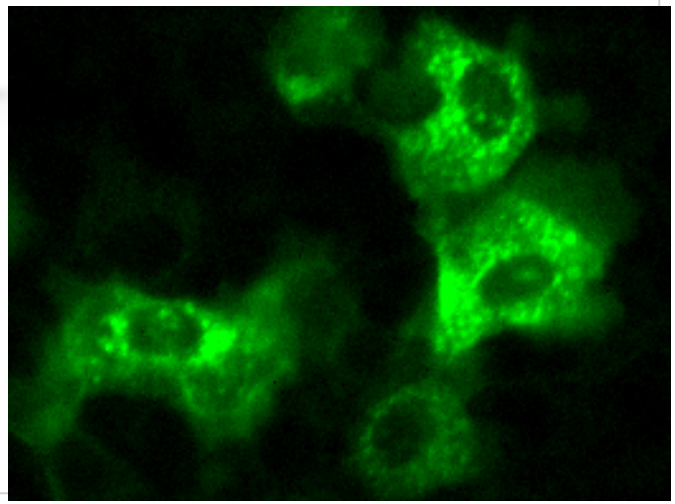


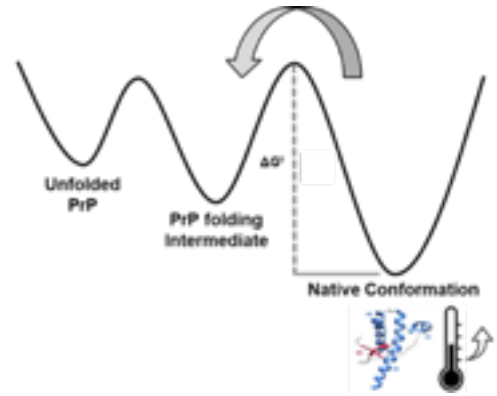


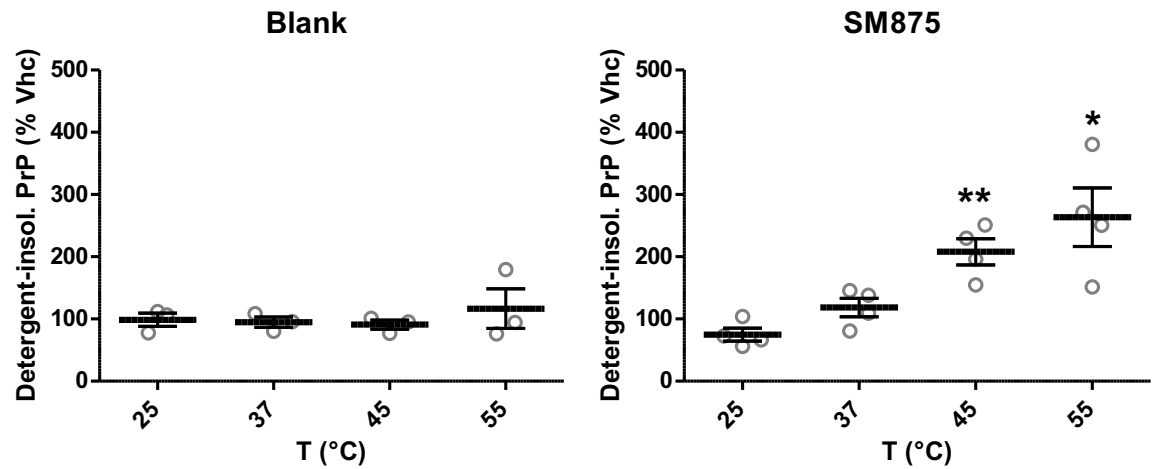
PPI-FIT PIPELINE

Folding pathway characterization

Virtual screening on folding Intermediate

Validation





MOLECULAR QUANTUM FIELD THEORY

$$\rho_{lm}(t) \propto \int \mathcal{D}R \int \mathcal{D}\psi\mathcal{D}\bar{\psi}\; O_{lm}[\psi,\bar{\psi},R]\; e^{\frac{i}{\hbar}\left(i\hbar S_{OM}[R]+S_S[\psi,\bar{\psi}]+S_{int}[R,\psi,\bar{\psi}]\right)}$$

$$S_{OM}[R] = \frac{1}{4M\gamma k_B T}\sum_i \int_0^t d\tau \left(m_i\ddot{\mathbf{r}}_i + m_i\gamma\dot{\mathbf{r}} + \nabla_i U(R)\right)^2$$

$$S_S[\psi,\bar{\psi}] = \sum_{n,m}\int_0^t d\tau \bar{\psi}_n(\tau)\left(i\hbar\partial_t - h^0_{nm}\right)\psi_m(\tau)$$

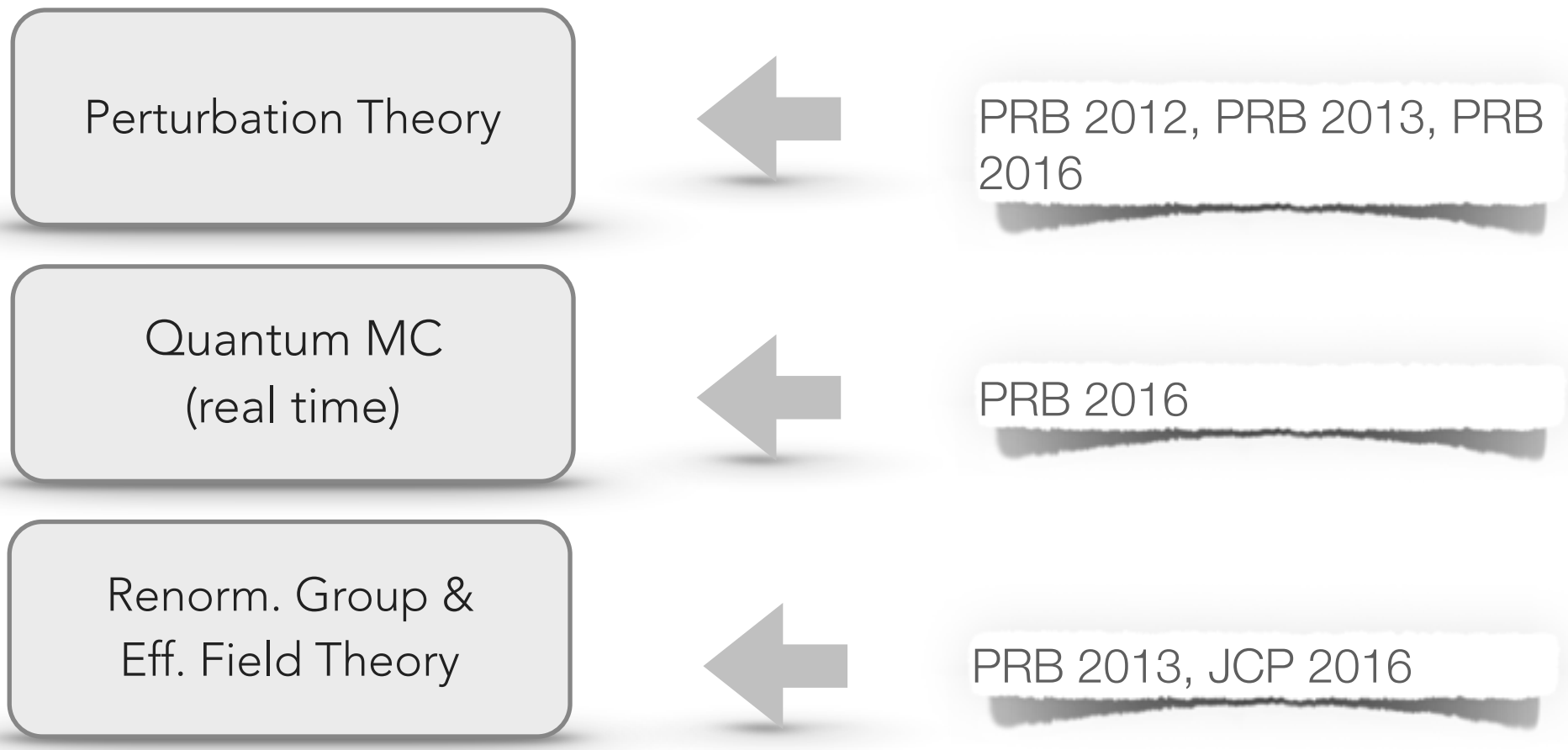
$$S_{int}[R,\psi,\bar{\psi}] = \sum_{nm}\sum_i \int_0^t d\tau\; f^i_{nm}\;\bar{\psi}_n\psi_m\;\delta\mathbf{r}_i$$

Just one time direction!

Irreversible

Microscopic

SOLVING MQFT



PATH INTEGRAL REPRESENTATION

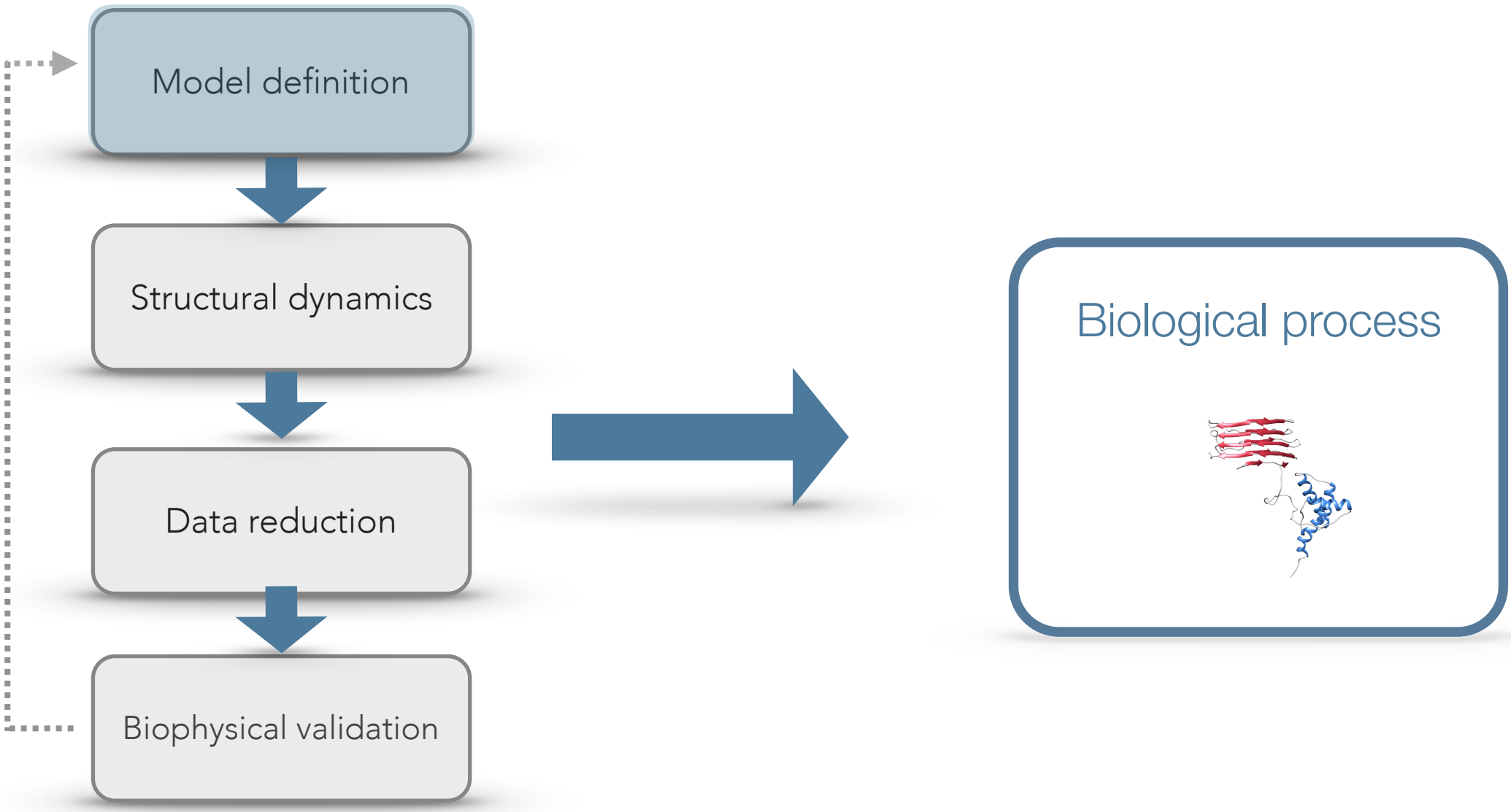
Hamilton's equations

Langevin equations

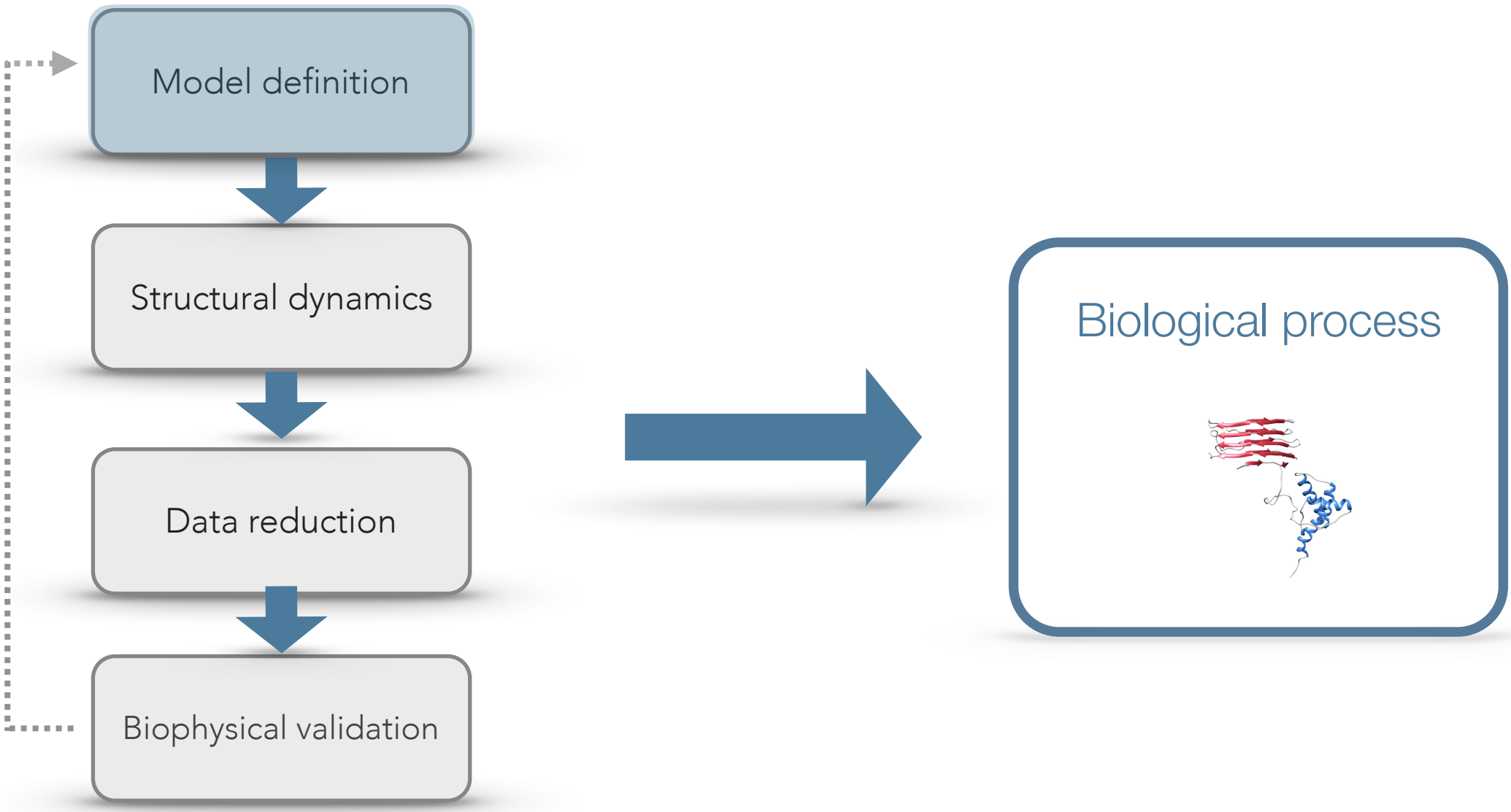
$$M\ddot{\mathbf{r}}_i = -\nabla_i U(\mathbf{R}) - \gamma_i \dot{\mathbf{r}}_i + \eta_i(t)$$

$$P(R_f, t|R_i, 0) = \int \mathcal{D}R \; e^{-\frac{\beta}{4m\gamma}\int_0^t d\tau (m\ddot{R} + m\gamma\dot{R} + \nabla U)^2}$$

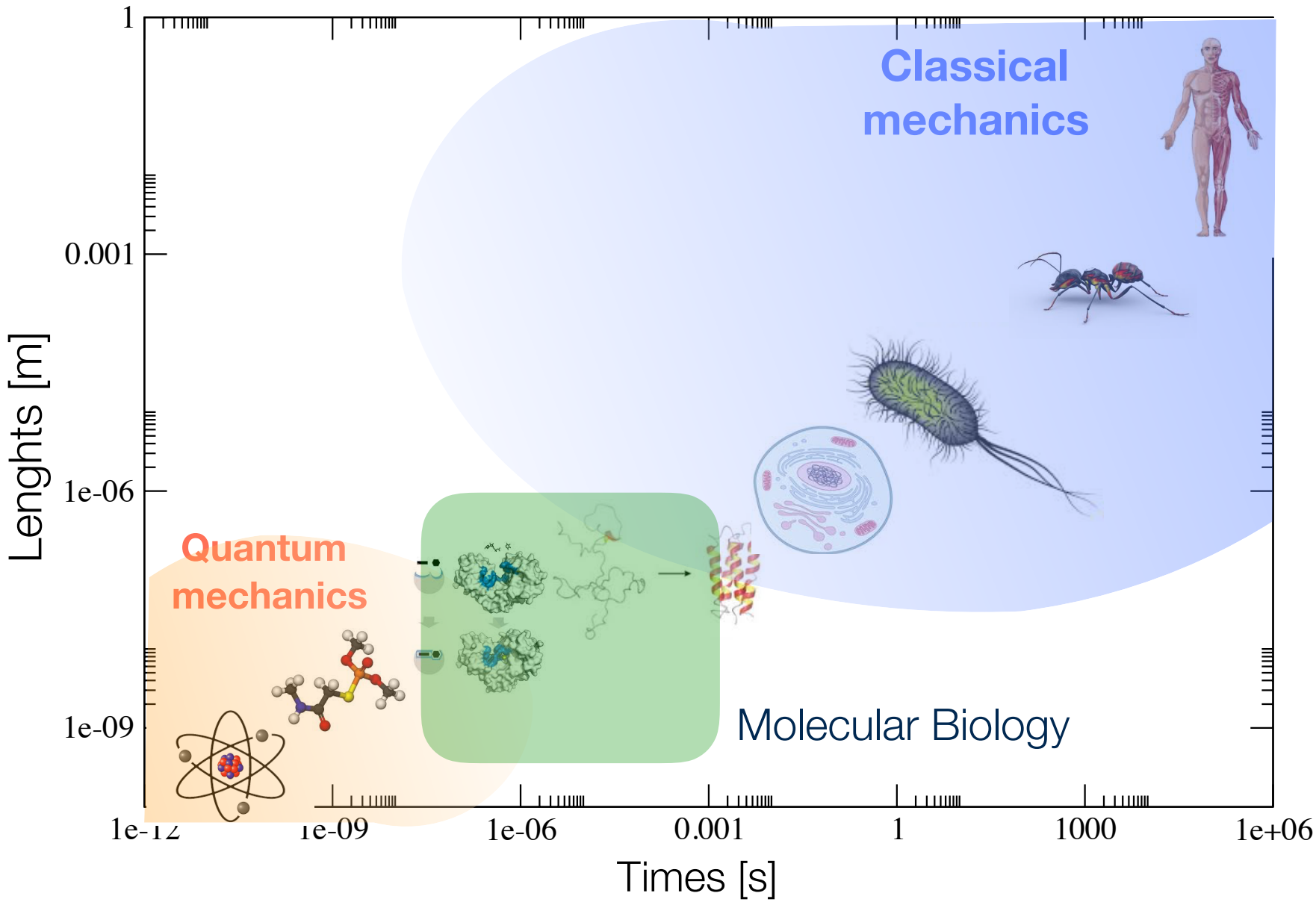
ROADMAP FROM PHYSICS TO MOLECULAR BIOLOGY



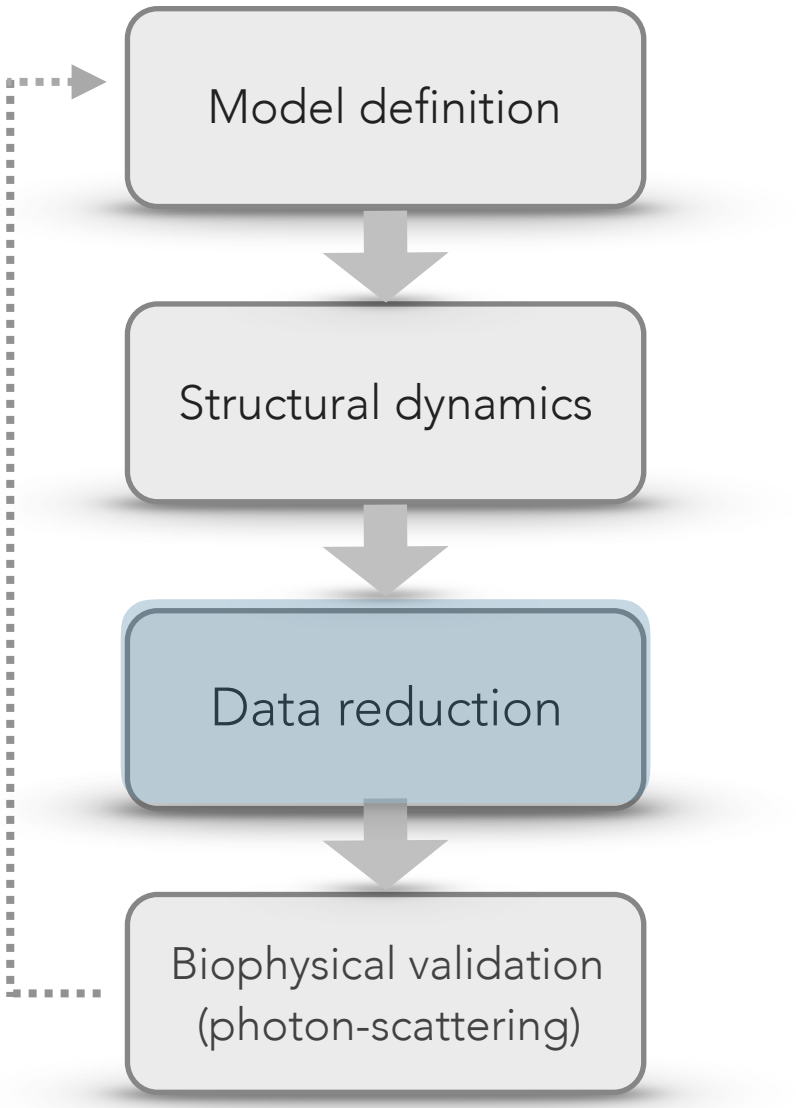
ROADMAP FROM PHYSICS TO MOLECULAR BIOLOGY

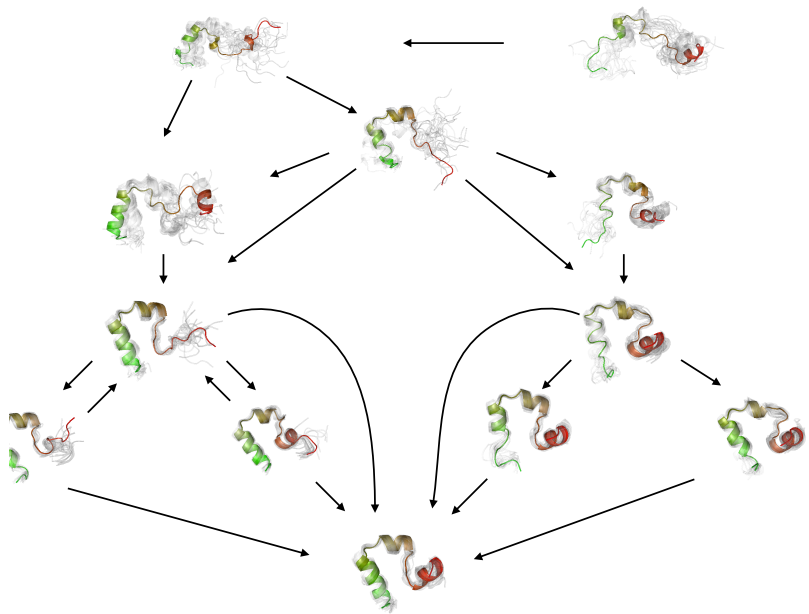


AT THE BORDERLINE BETWEEN TWO REALMS

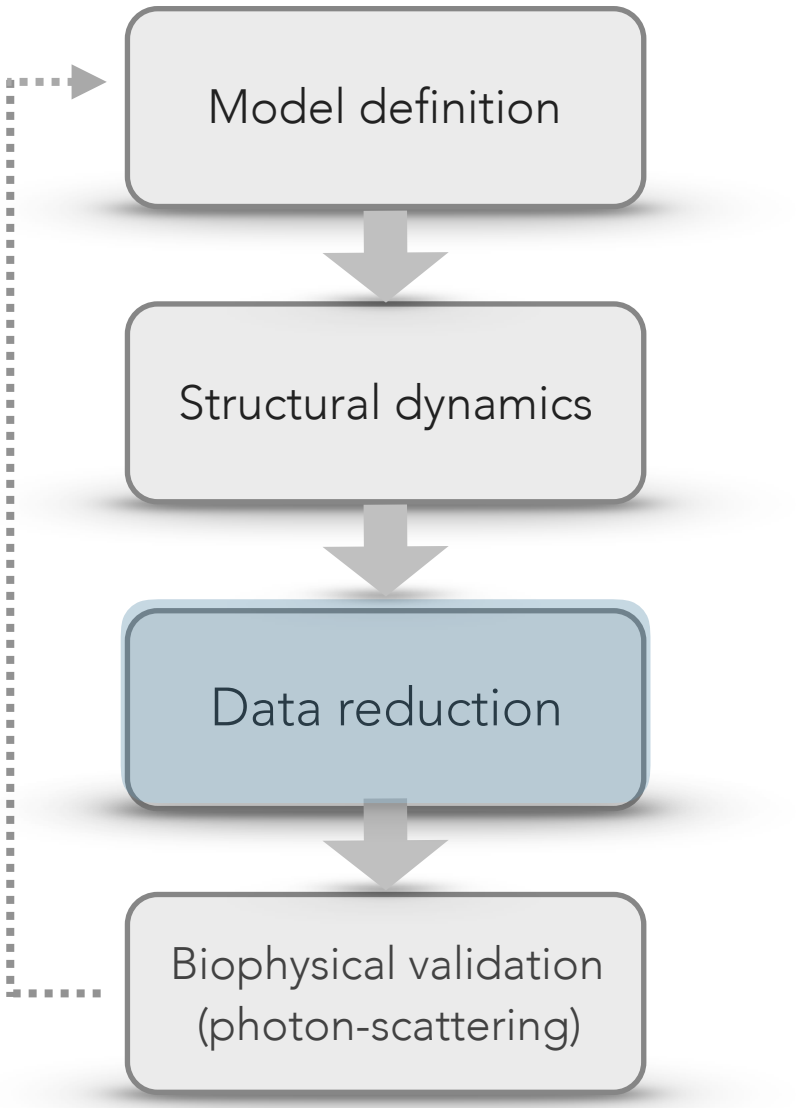


ROADMAP TO MOLECULAR BIOLOGY





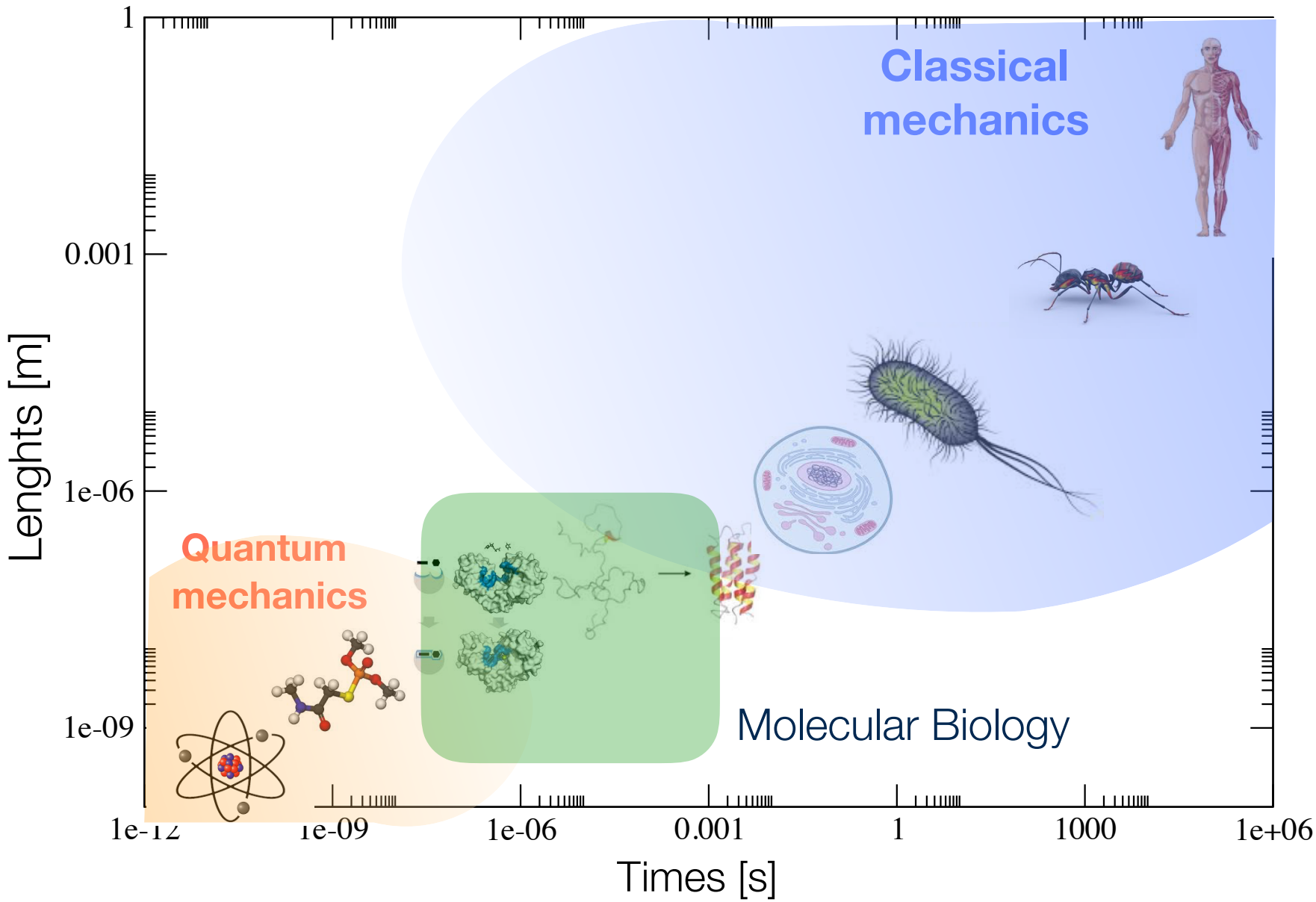
ROADMAP TO MOLECULAR BIOLOGY



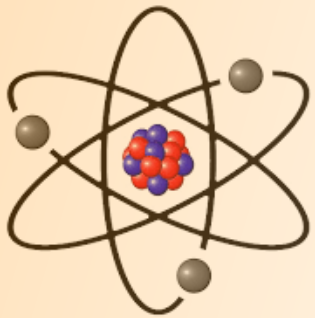
Data Science
+
Statistical computing
+
Renormalization Group
methods

Dimensional reduction of Markov state models from renormalization group theory
S. Orioli and P. Faccioli

AT THE BORDERLINE BETWEEN TWO REALMS

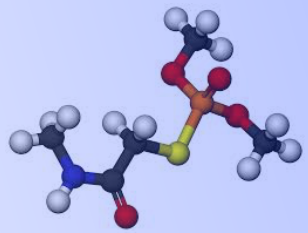


MOLECULAR DYNAMICS



Electronic clouds obey
quantum mechanics

$$i\hbar\frac{\partial}{\partial t}\psi = \hat{H}\psi$$



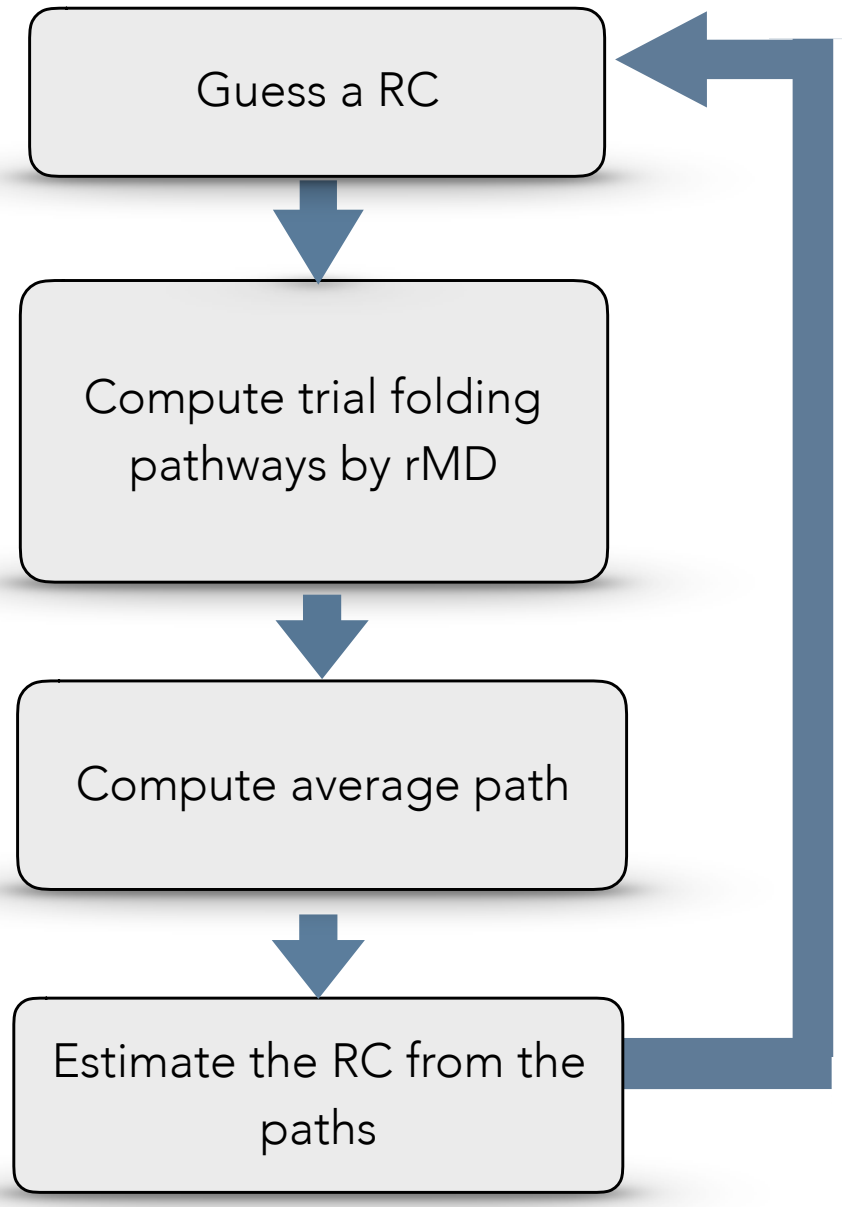
The motion of atomic nuclei obey
classical mechanics

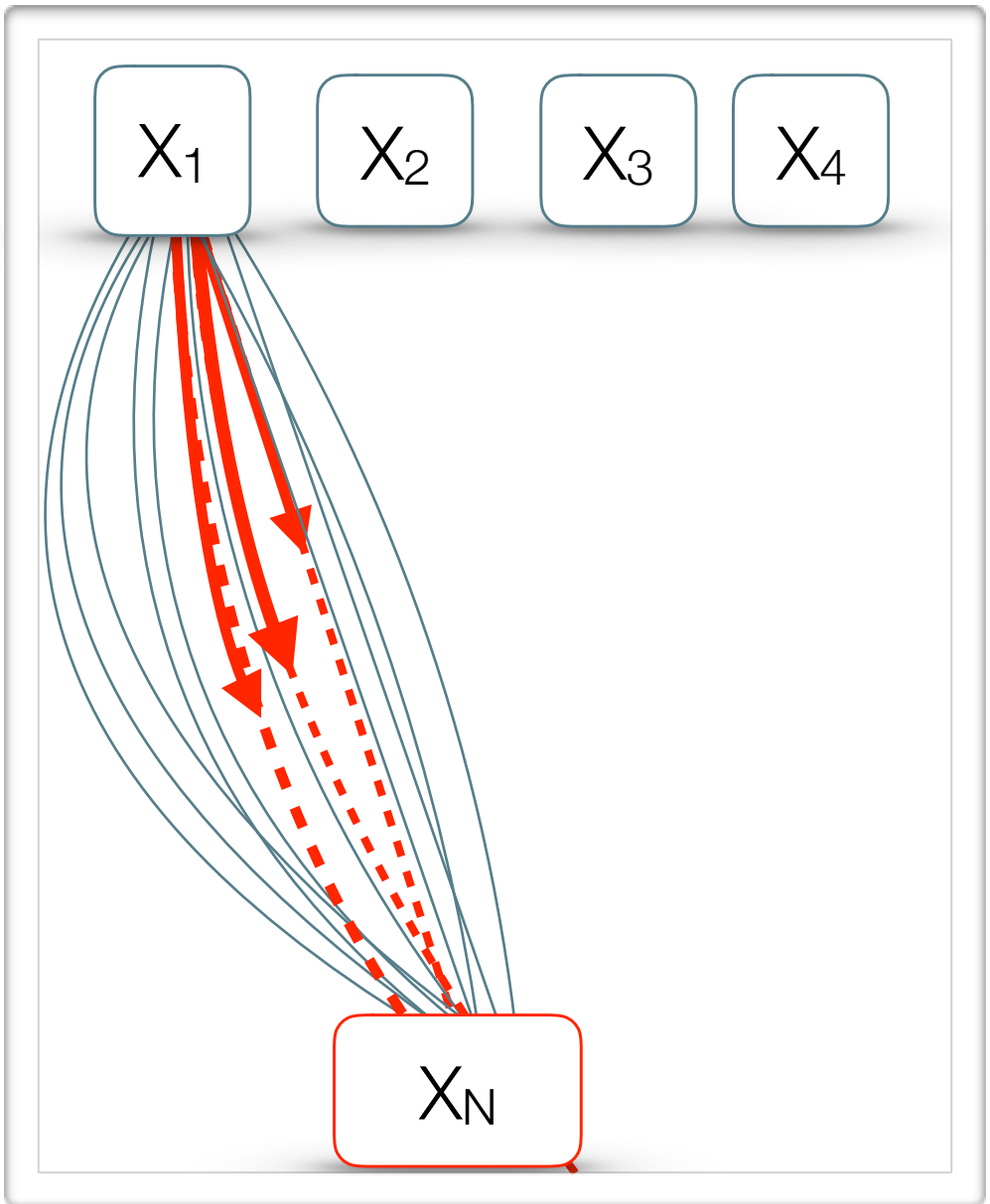
$$\vec{F} = m\vec{a}$$

Multi-scale approach

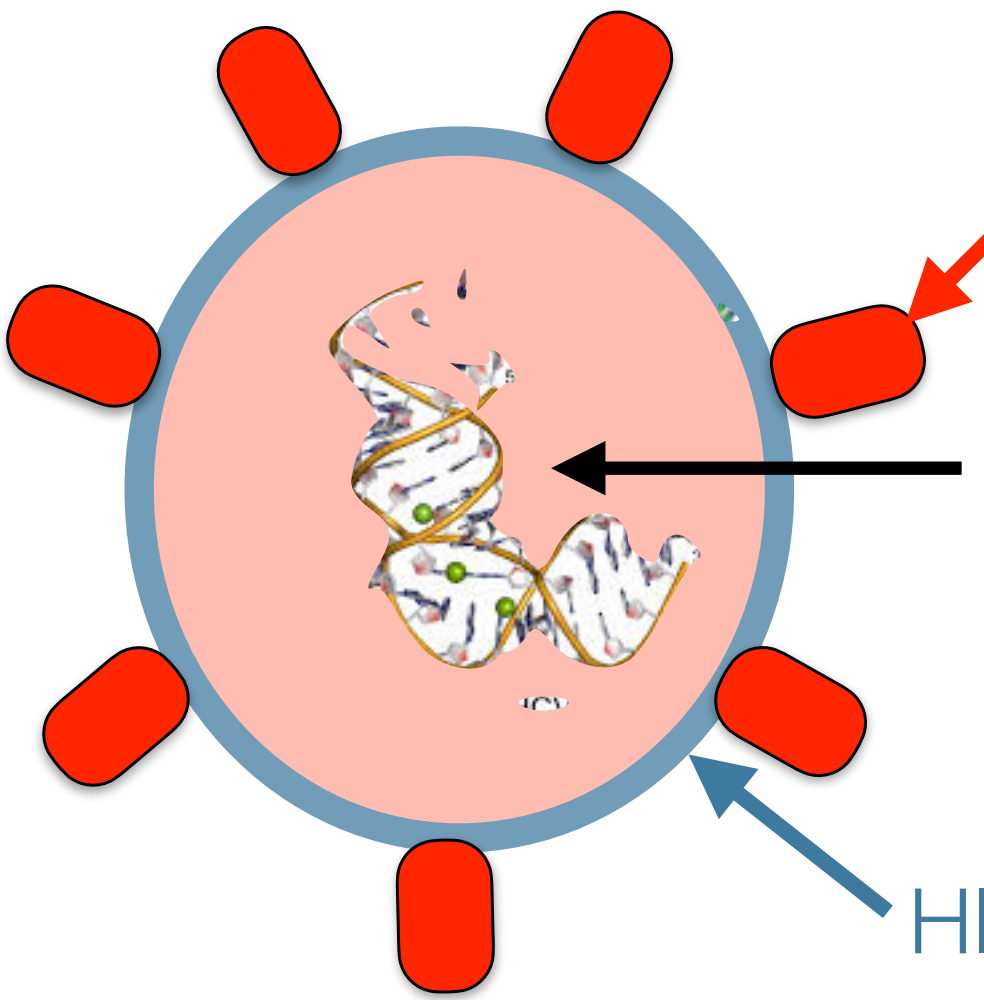
(2013 Nobel prize for chemistry)

SELF CONSISTENT PATH SAMPLING





PSEUDOTYPED RETROVIRAL VECTOR



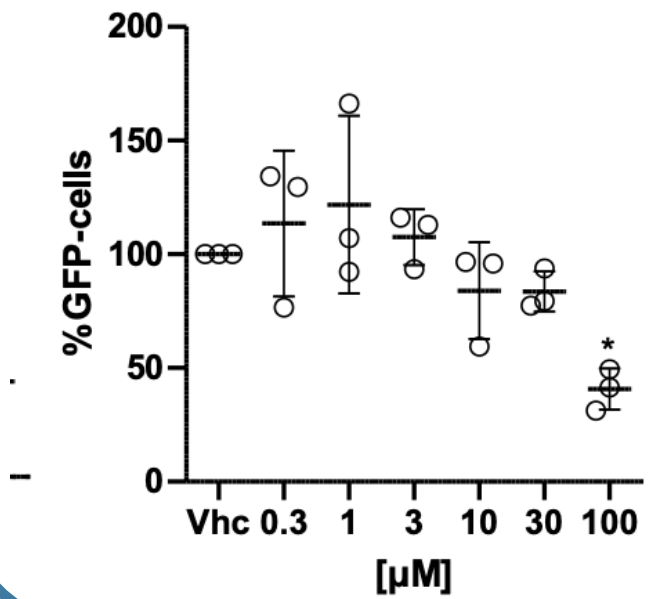
SPIKE protein

MINUS Replication genes
PLUS GFP genes

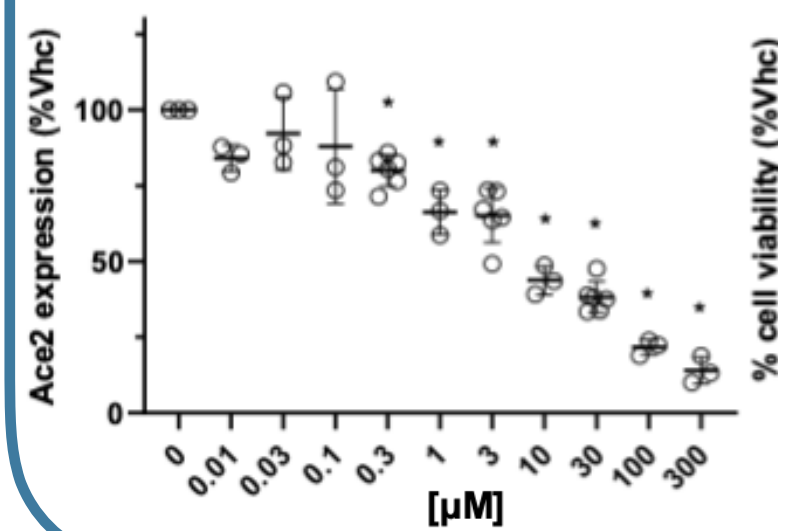
HIV scaffold

ACTION ON A PSEUDOVIRAL VECTOR

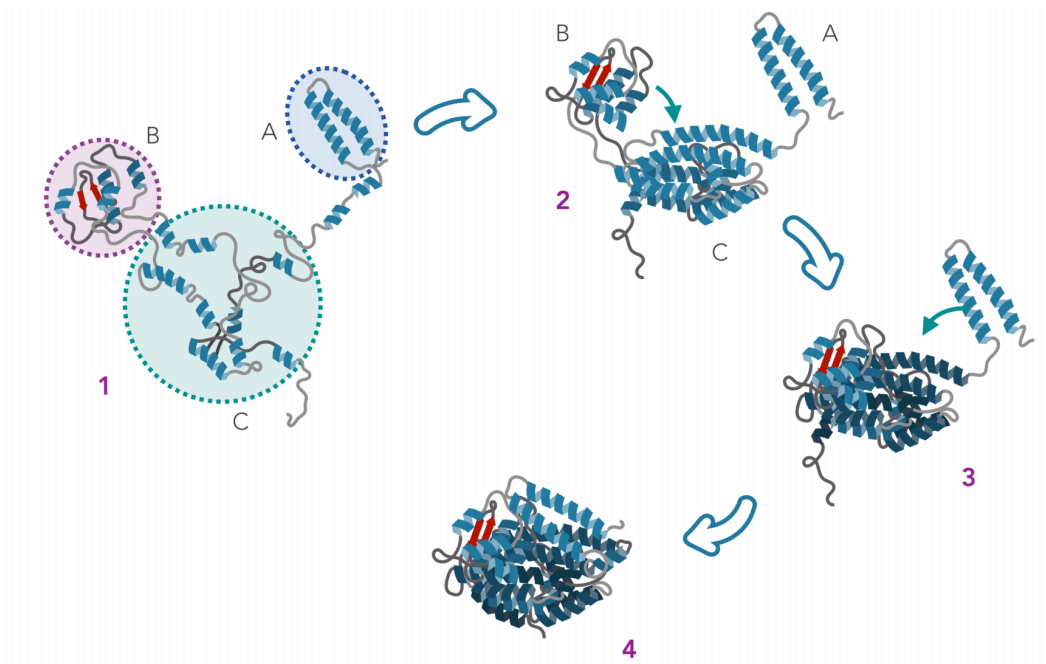
Pseudo-virus Transduction Efficiency



ACE-2 cellular expression level



Results on ACE2



30.000 cores in 8 different data centers were supplied by **INFN** to perform ACE2 folding simulation in 2 weeks.

INFN
Istituto Nazionale di Fisica Nucleare