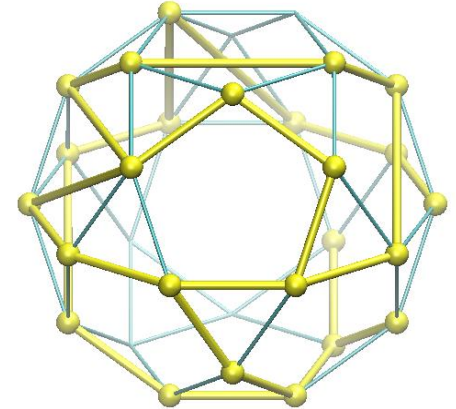
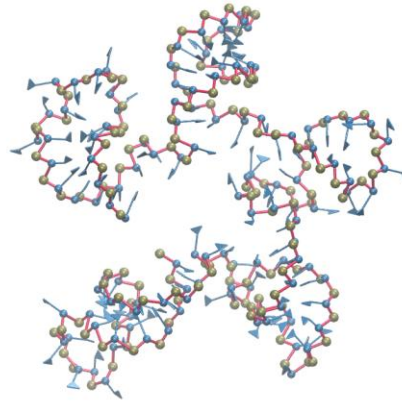
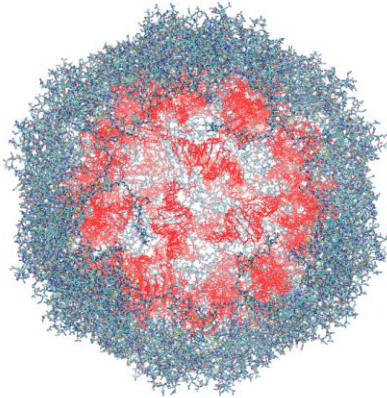


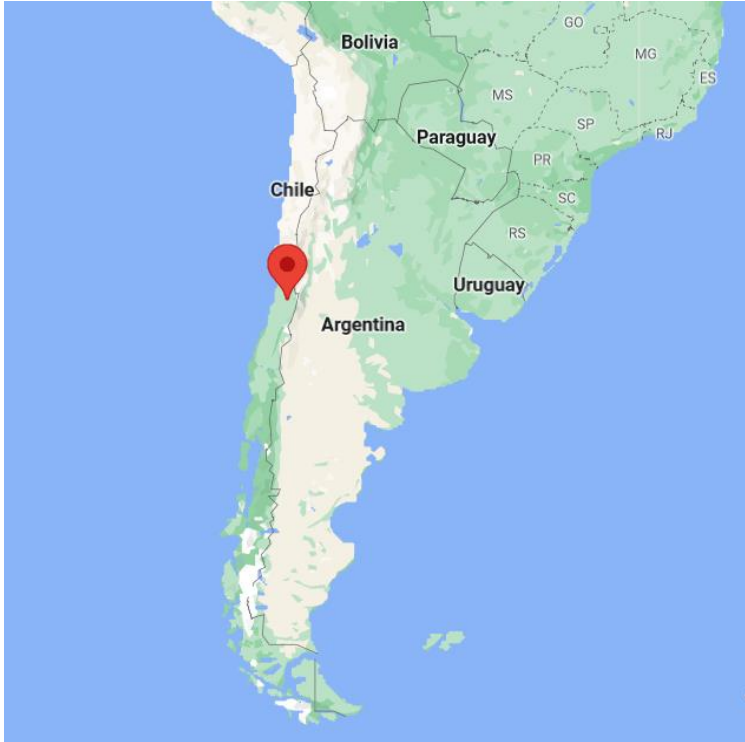
Modeling RNA structure using multiscale simulations



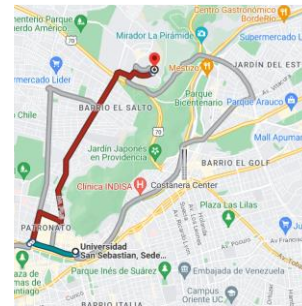
Simón Poblete



Fundación Ciencia y Vida – Universidad San Sebastián - Chile
Seminar on Mechanics, Institute of Fundamental Technological Research
Polish Academy of Sciences. Warsaw, Poland, 2023.

A bit of my working place



Fundación Ciencia y Vida / Universidad San Sebastián



 9:46 AM—10:26 AM 40 min
red 503 > red 116
9:47 AM from PC1081-Parada 2 / Facultad De Derecho
CLP 700  5 min every 15 min

Outline

- Introduction : computational modelling
- RNA and its complex structure
- The SPQR model
- Fixing structures
- Viral modeling

Computational modeling

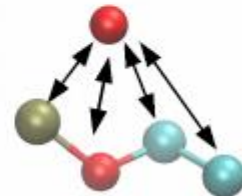
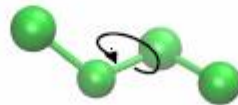
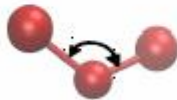
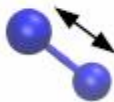
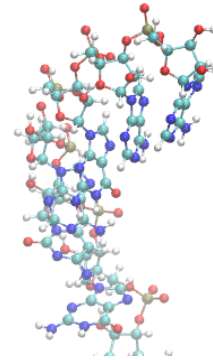
Molecular Dynamics simulations : accurate, detailed

$$m_i \ddot{\vec{r}}_i = \sum_j F_{ij}$$

$$F_i = -\nabla_i U(\vec{r}_1, \vec{r}_2, \dots, \vec{r}_N)$$

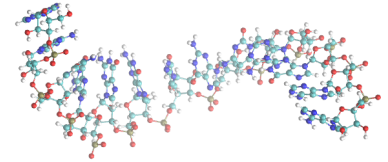
$$U(\vec{r}_1, \vec{r}_2, \dots, \vec{r}_N) =$$

$$\sum_{\text{bonds}} k_b (l - l_0)^2 + \sum_{\text{angles}} k_a (\theta - \theta_0)^2 + \sum_{\text{torsions}} \sum_n \frac{1}{2} U_n [1 + \cos(n\omega - \gamma)] + \sum_{j=1}^{N-1} \sum_{i=j+1}^N f_{ij} \left\{ \epsilon_{ij} \left[\left(\frac{r_{0ij}}{r_{ij}} \right)^{12} - 2 \left(\frac{r_{0ij}}{r_{ij}} \right)^6 \right] \right\} + \frac{q_i q_j}{4\pi\epsilon_0 r_{ij}}$$



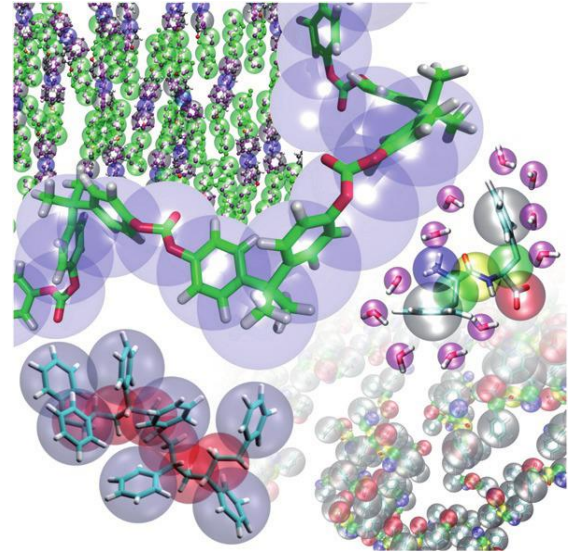
Computational modeling

Molecular Dynamics simulations : accurate, detailed



COARSE-GRAINED MODELS:

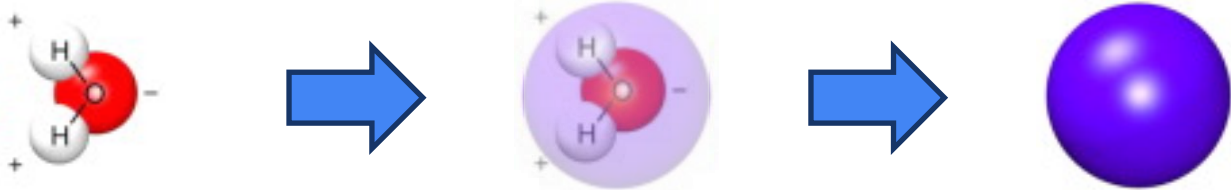
Faster, more generic, tailored for a specific problem.



Computational modeling

COARSE-GRAINED MODELS:

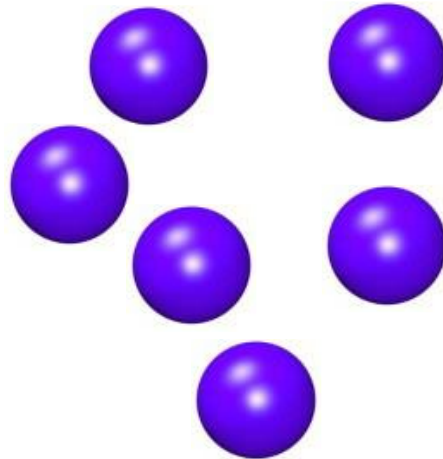
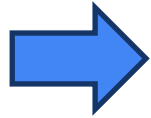
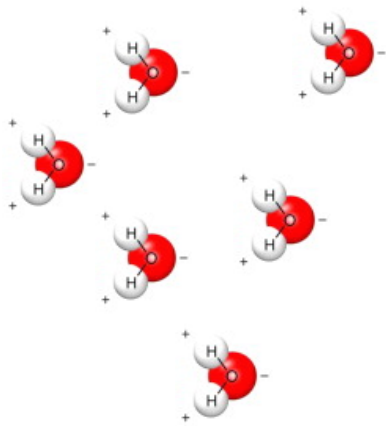
Faster, more generic, tailored for a specific problem.
e.g. a water molecule



Computational modeling

COARSE-GRAINED MODELS:

Faster, more generic, tailored for a specific problem.
e.g. a water molecule

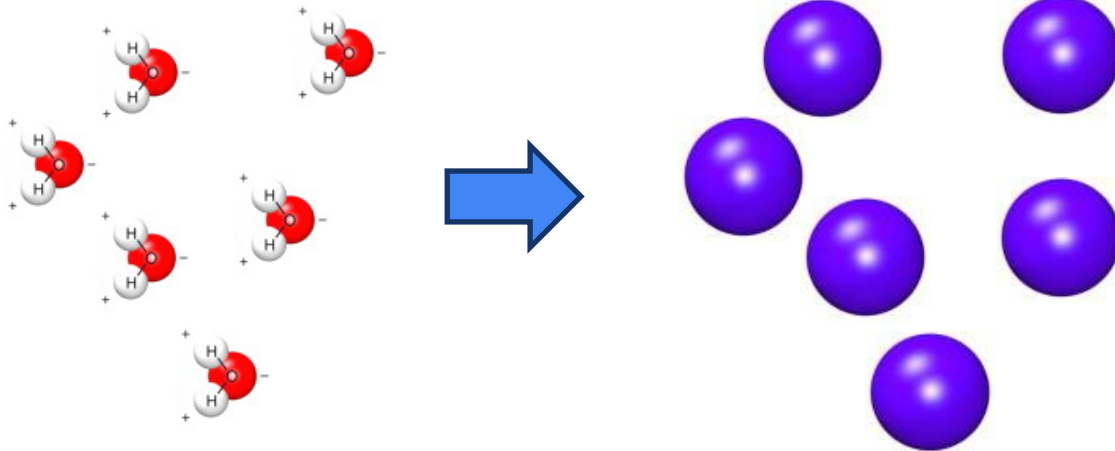


Is this water??

Computational modeling

COARSE-GRAINED MODELS:

Faster, more generic, tailored for a specific problem.
e.g. a water molecule



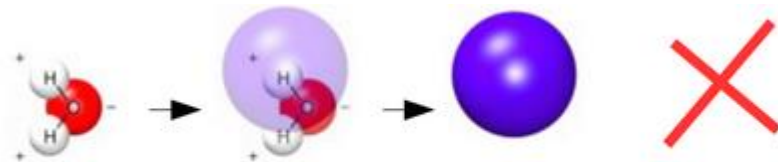
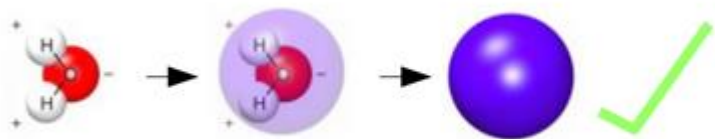
Is this water??

We must develop interactions accordingly : diffusion, structure, thermodynamics, etc.

Coarse-grained simulations

Reduction of number of degrees of freedom

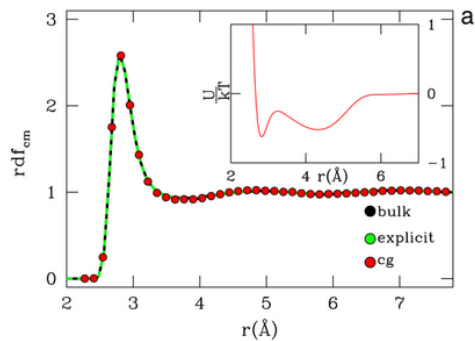
How to map the system?



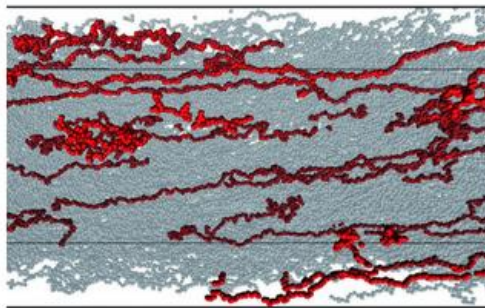
Coarse-grained simulations

Reduction of number of degrees of freedom

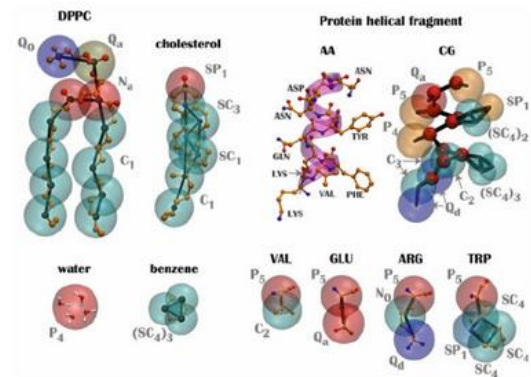
How to define the interactions?



Structure (constant T)



Transport

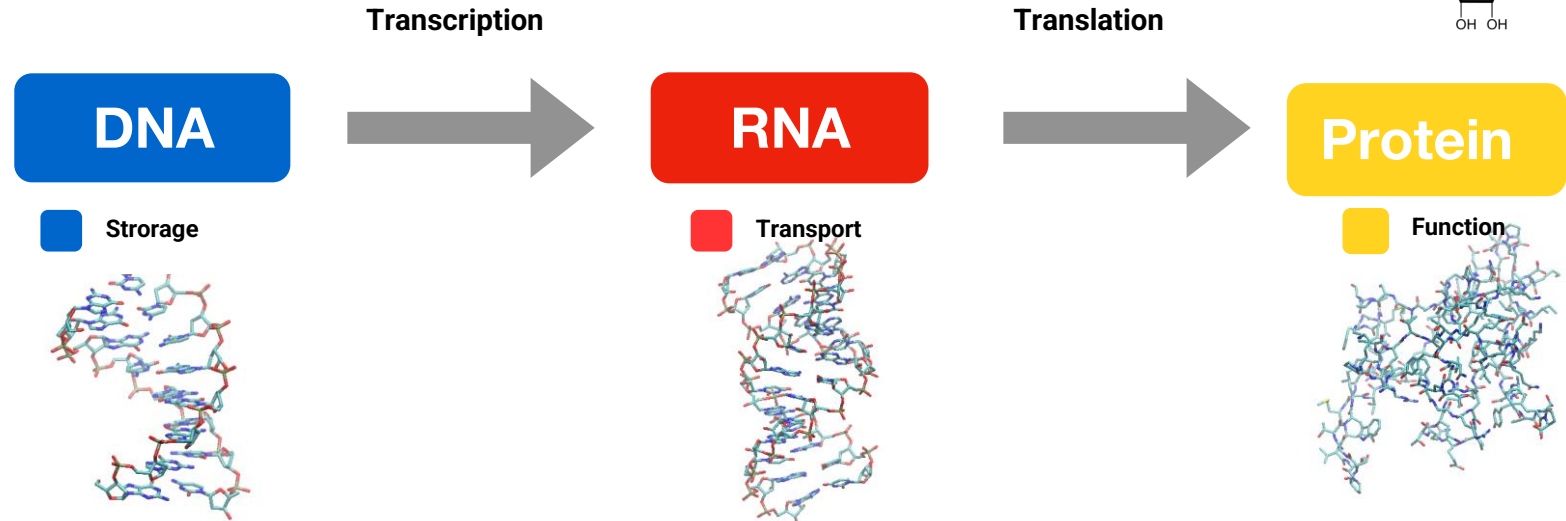
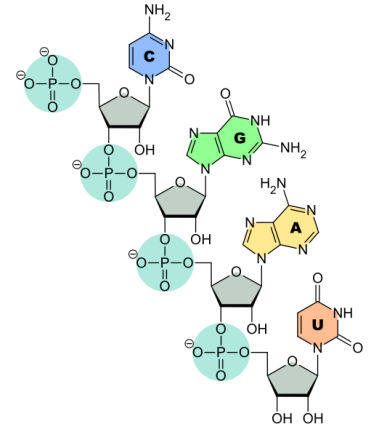


Thermodynamics

Etc...PROBLEM DEPENDENT

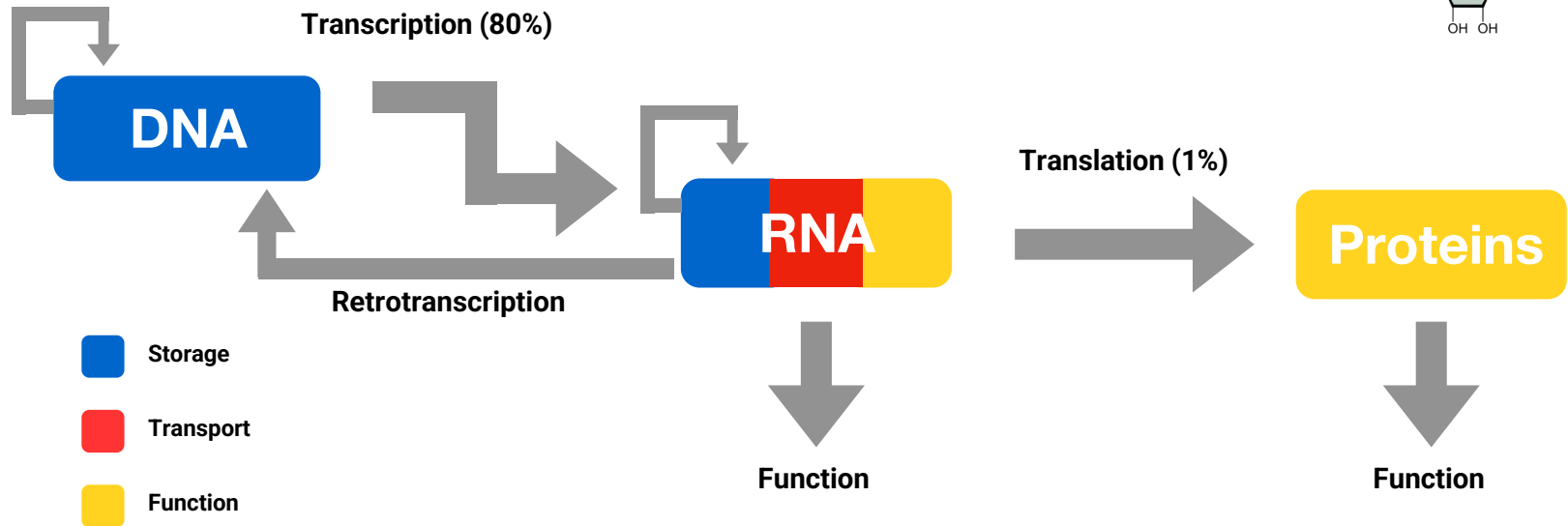
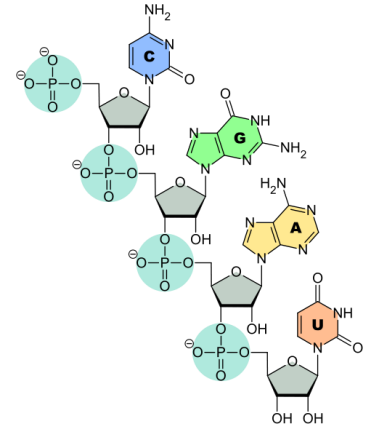
What is RNA?

- Biopolymer(ribose,phosphate,nitrogenous base)
- 4 letter alphabet: A, C, G, U



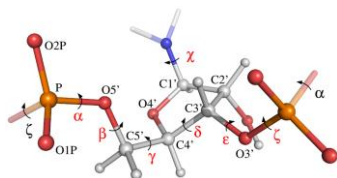
What is RNA?

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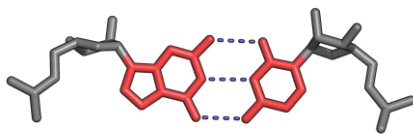


What is RNA?

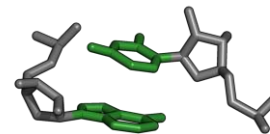
Structural Complexity



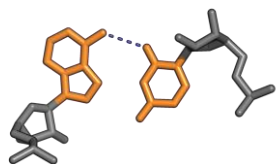
7 dihedrals



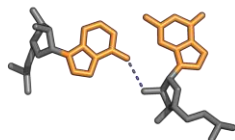
Canonical pair
A-U, C-G



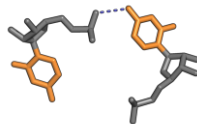
Stacking



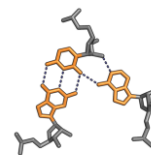
Non-canonical



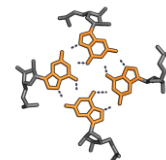
Base-ribose



Base-phosphate



Triplex

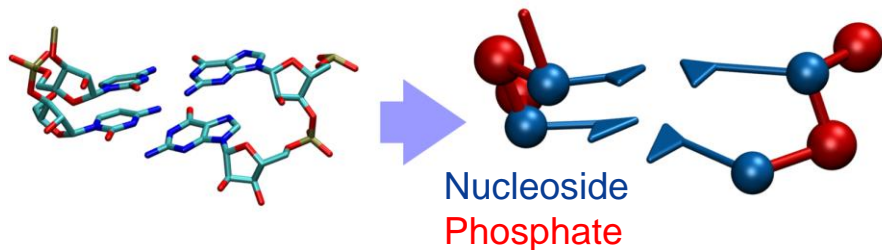


Quadruplex

Coarse-grained model

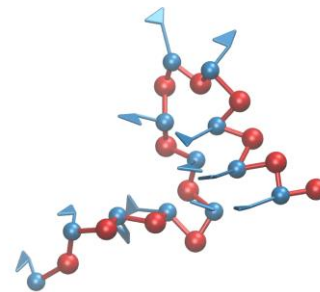
SPlit and conQueR (SPQR)

Nucleotide-level representation



Essential conformations and interactions:
stacking, EV, base pairing, base-phosphate

GGGCGCAAGCCU

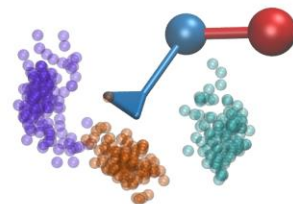
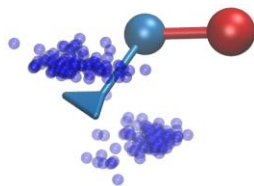
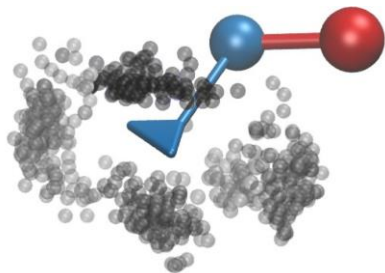


Monte Carlo simulation.
Developed for structure
prediction

Coarse-grained model

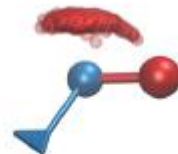
SPlit and conQueR (SPQR)

Sampling from a large structure database

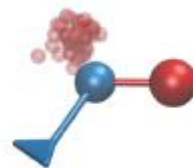


Identify stacking and base pairs...

...and backbone conformations.



Pucker C3', endo



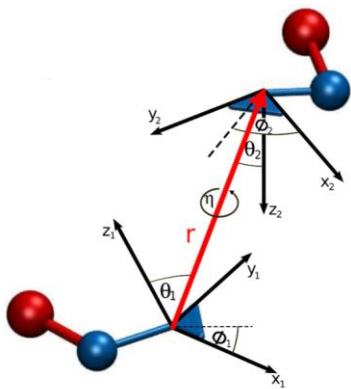
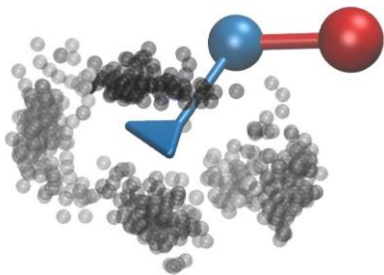
Pucker C2', endo



Pucker C3', syn

Coarse-grained model

SPLit and conQueR (SPQR)

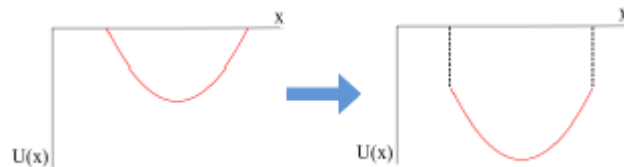


$$U(\vec{r}) = -k_B \log P(\vec{r})$$

$P(r)$ sampled from Structural Database *

$$P(r, \theta_1, \phi_1, \theta_2, \phi_2, \eta) \approx r^2 P_\eta(\eta) \frac{P_1^\mathcal{E}(r, \theta_1, \phi_1) P_2^\mathcal{E}(r, \theta_2, \phi_2)}{P_r(r)}$$

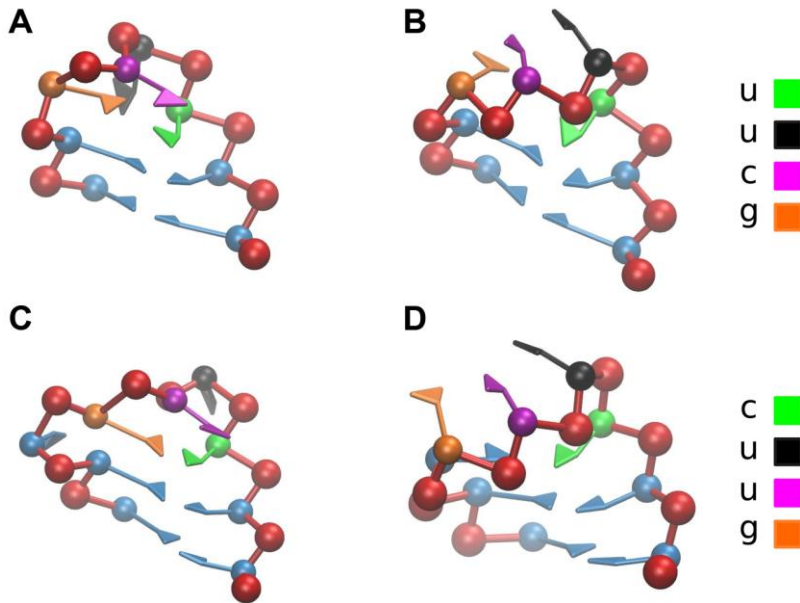
$$U_a(\vec{r}) \rightarrow U_a(\vec{r}) - \epsilon_a$$
$$U_{pb}(\vec{r}) \rightarrow U_{pb}(\vec{r}) - \epsilon_{pb}$$



Coarse-grained model

SPlit and conQueR (SPQR)

Loops require freedom on pucker and glycosidic bond angle to adopt correct structure.



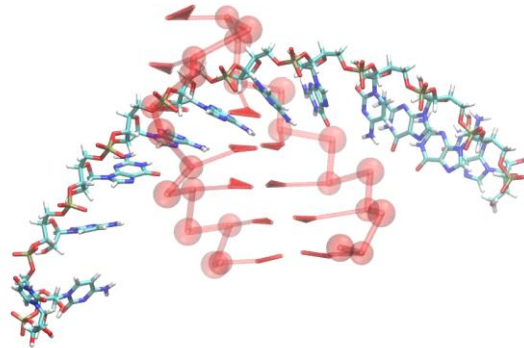
Coarse-grained model

SPlit and conQueR (SPQR)

ERMSD steering : minimize the ERMSD distance between predicted and all-atom structure.

ERMSD depends both on relative positions and orientations of nucleobases.

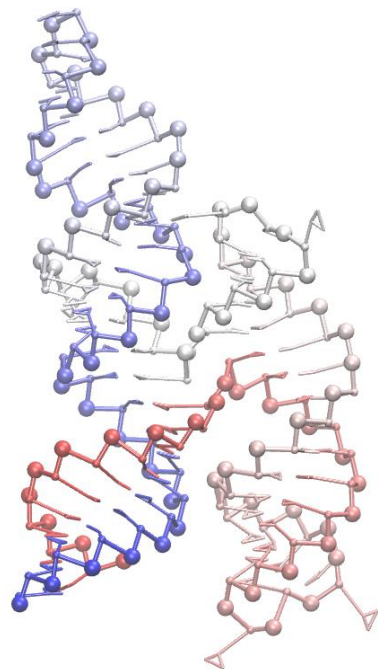
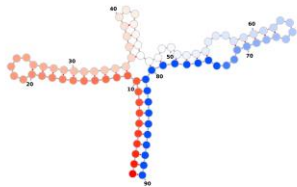
$$U = \frac{1}{2} K (ERMSD)^2$$



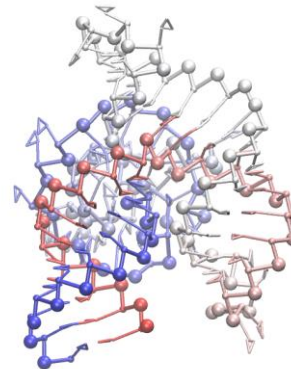
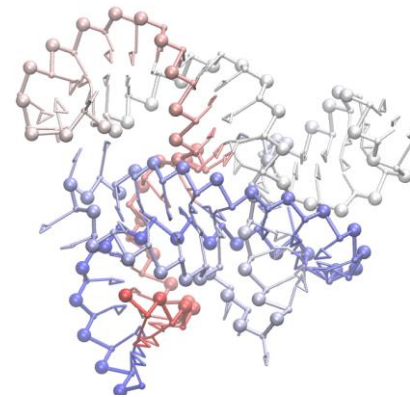
Structure prediction

Sampling orientations of stems

Example : PZ39



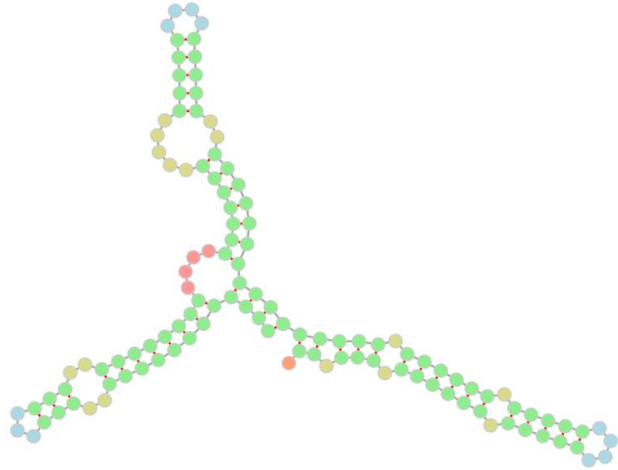
TARGET



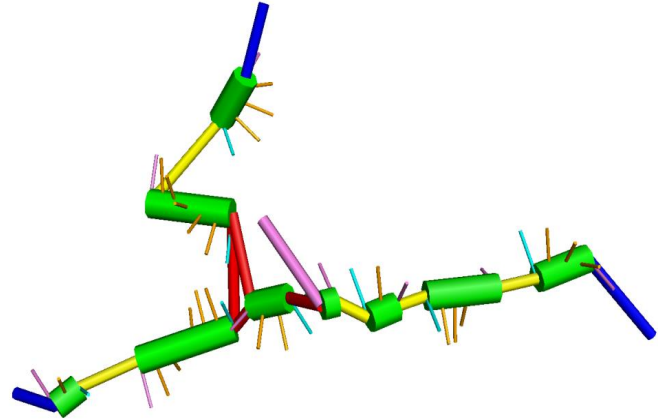
SAMPLES

Structure prediction

Ernwin

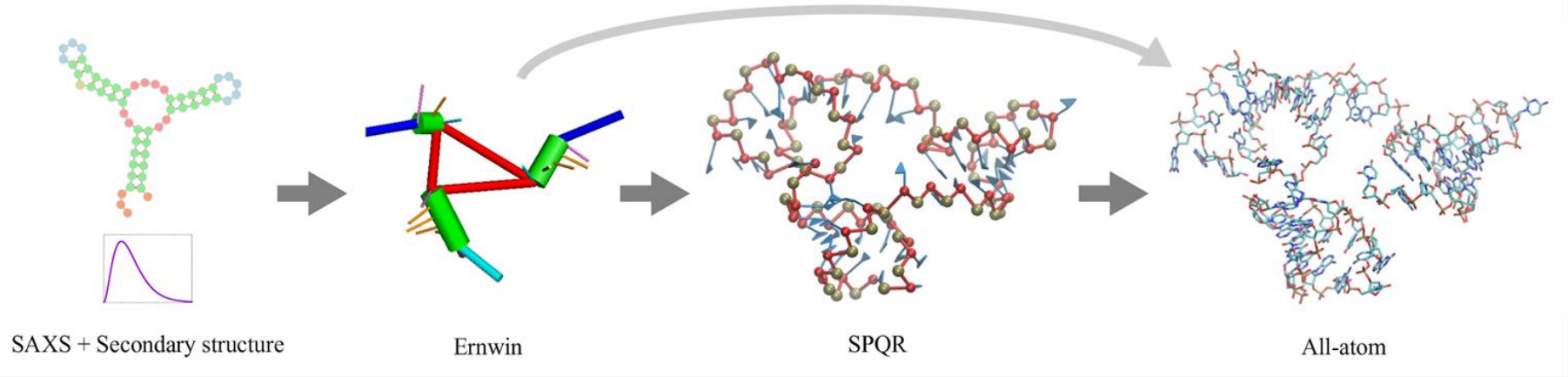


Secondary structure elements.
Knowledge-based interactions.
A-minors and minimize radius of gyration.



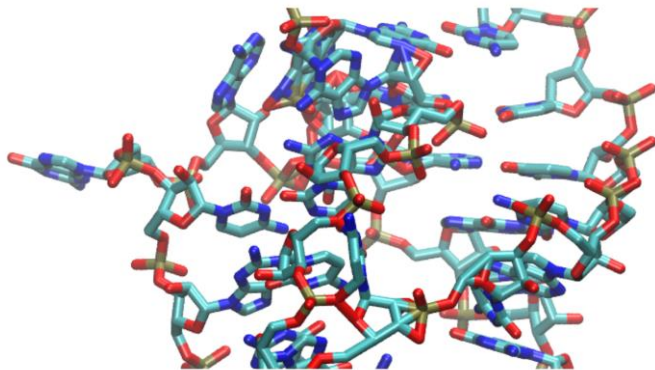
Structure prediction

Multiscale modeling



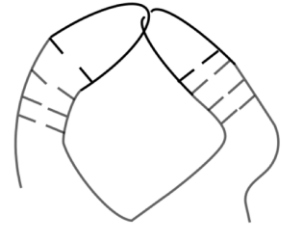
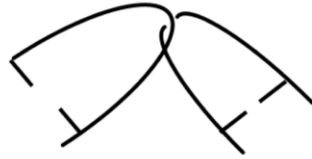
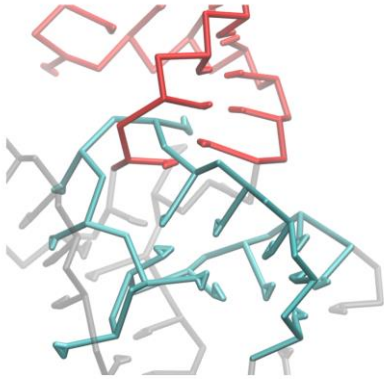
Structure prediction

Fragment assembly produces clashes!



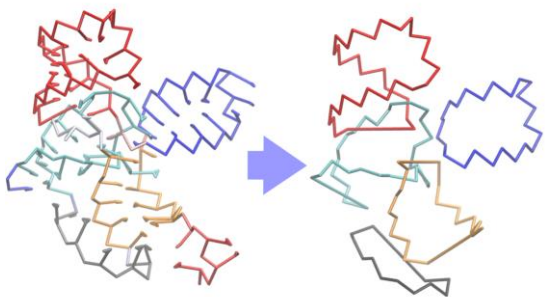
Structure prediction

Links between secondary structure elements!

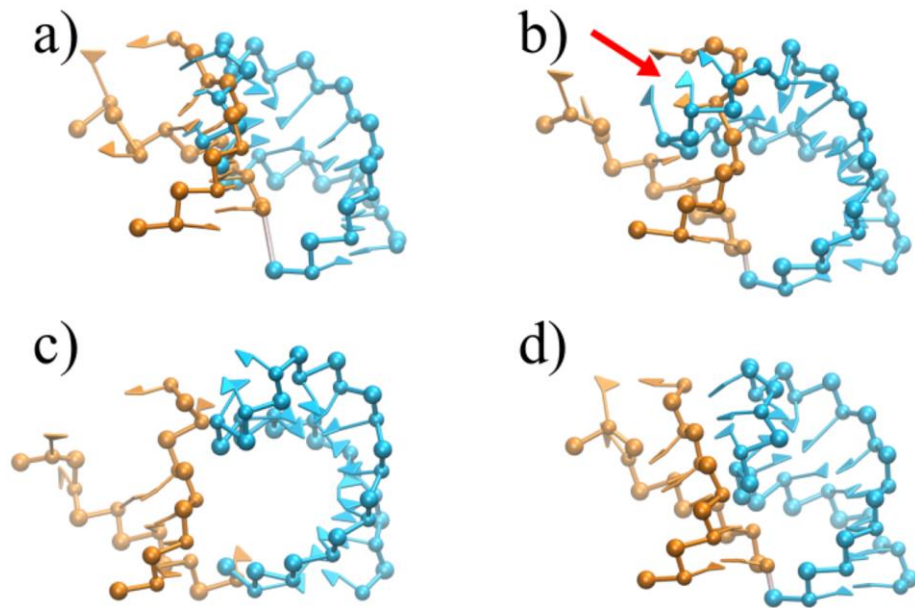


Structure prediction

Energy and topology refinement



$$L_N(c_i, c_j) = \frac{1}{4\pi} \oint_{c_i} \oint_{c_j} \frac{\mathbf{r}_i - \mathbf{r}_j}{|\mathbf{r}_i - \mathbf{r}_j|^3} \cdot (d\mathbf{r}_i \times d\mathbf{r}_j)$$



Structure prediction

Test on 4 deposited structures and one SAXS profile. 30 decoys each.

Structure	Length	Linked	RMSD (A)*	Contacts	Clash Score
1L9A	126	12	3.2 ± 0.9	30/95	128/5
2R8S	120	23	4.3 ± 1.1	69/128	128/7
3R4F	66	7	2.0 ± 0.2	0/0	90/4
4PQV	68	16	2.5 ± 0.8	5/13	118/6
SASDK34*	118	10	2.0 ± 0.8	-	115/6

Refinement does not affect significantly the SAXS profile agreement.

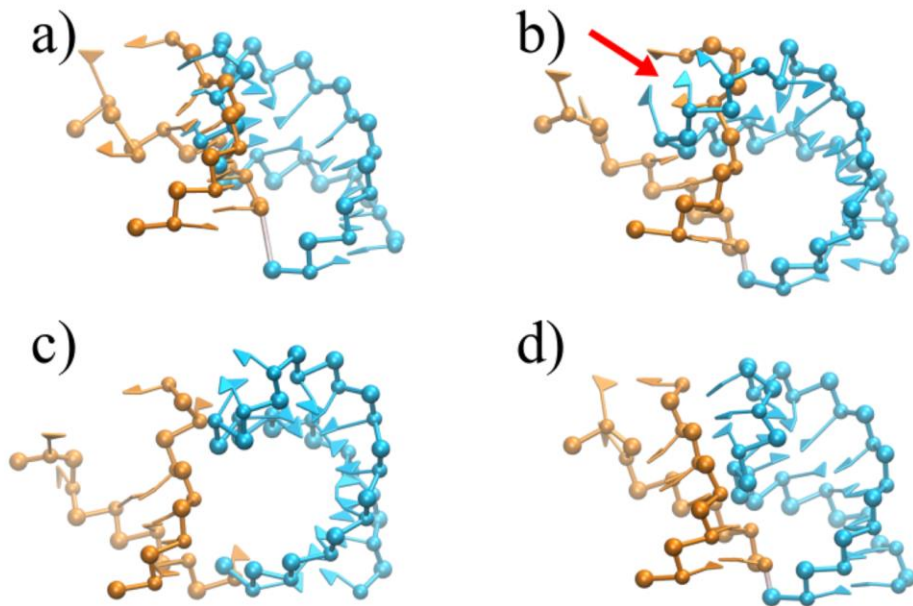
Refinement procedure

- Energy minimization.
- Link removal
- ERMSD steering towards initial structure
- Energy minimization
- MD energy minimization

Install SPQR (Mac or Linux).

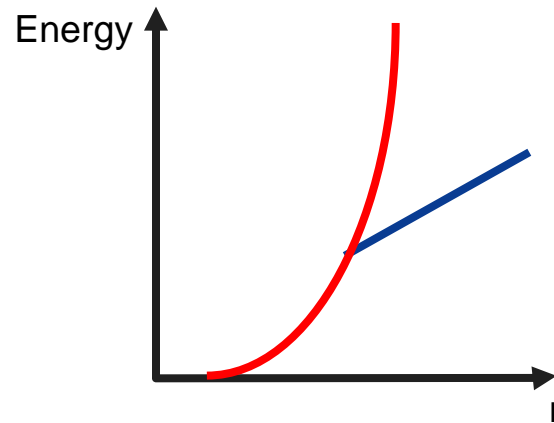
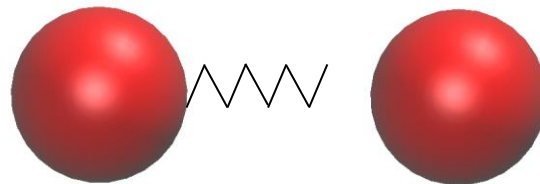
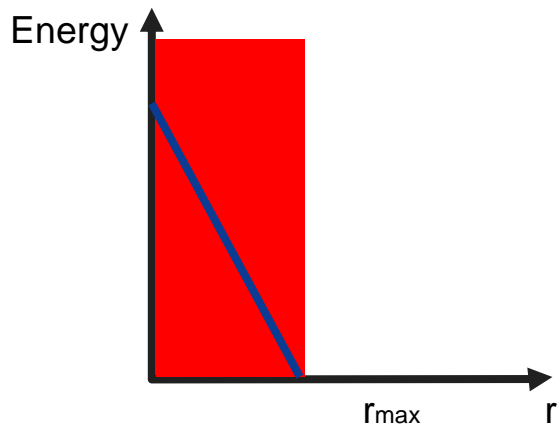
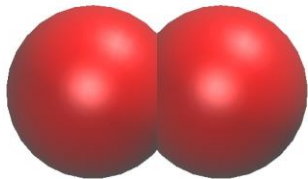
Run

```
./SPQR_REFINE -t ss.fa -i struct.pdb
```



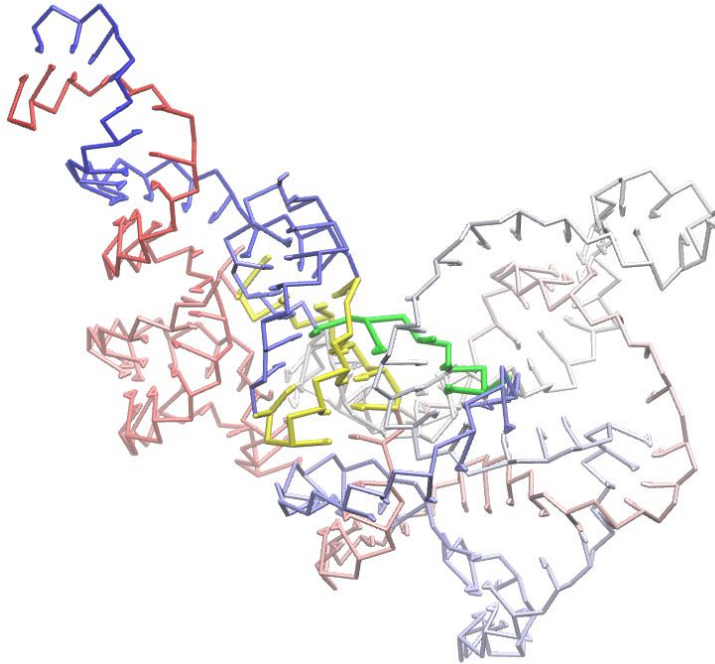
Energy minimization

Clashes and broken bonds

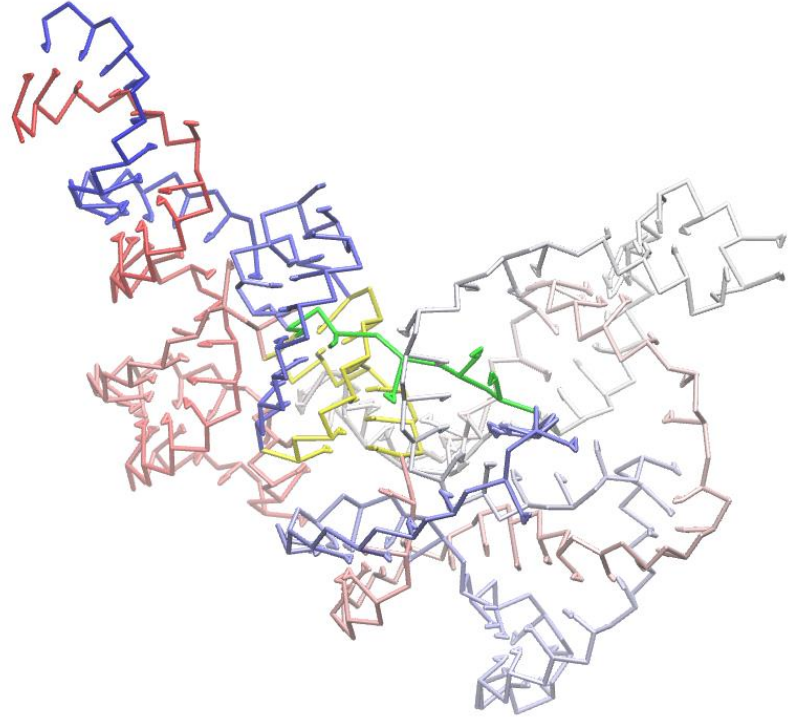


Link removal

In RNA puzzles : PZ05A1



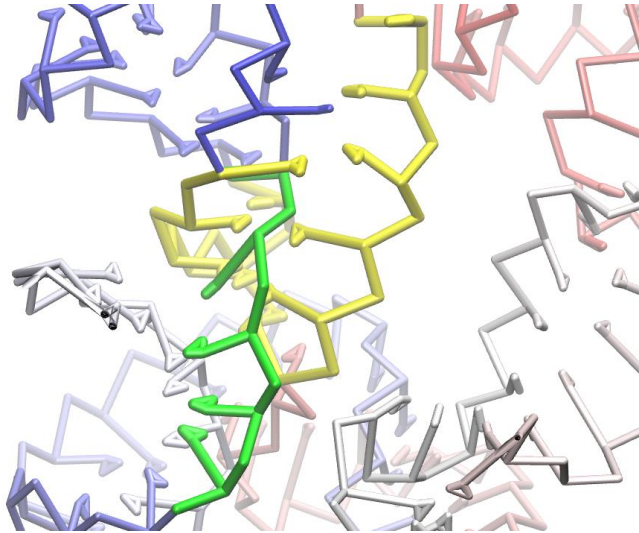
Linked



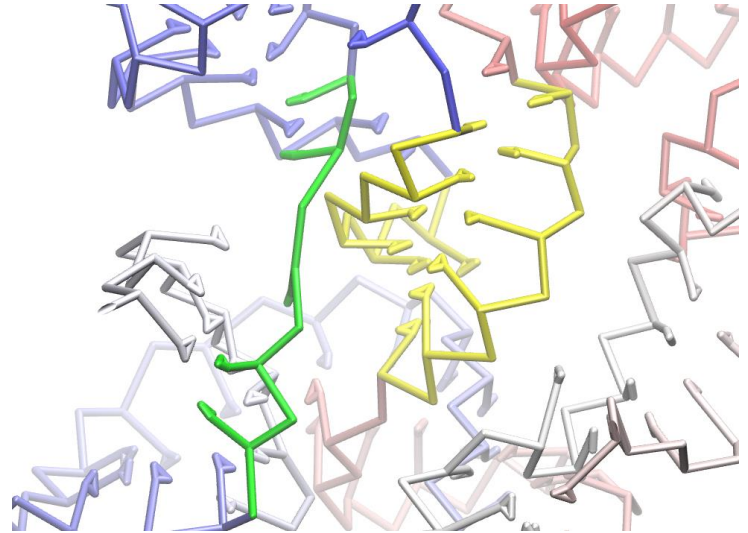
Unlinked

Link removal

In RNA puzzles : PZ05A1



Linked

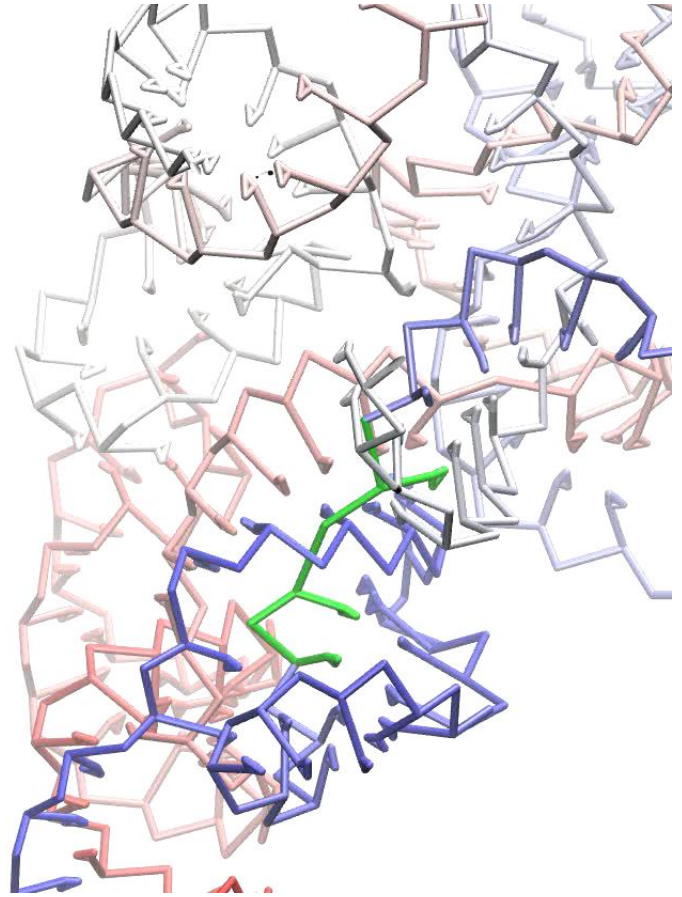


Unlinked

Link removal

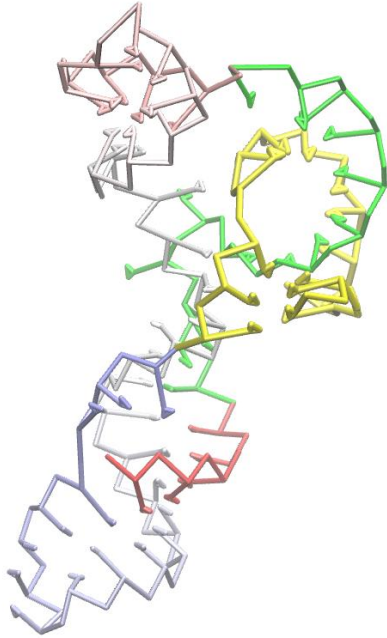
In RNA puzzles : PZ05A1

(most relevant part highlighted)

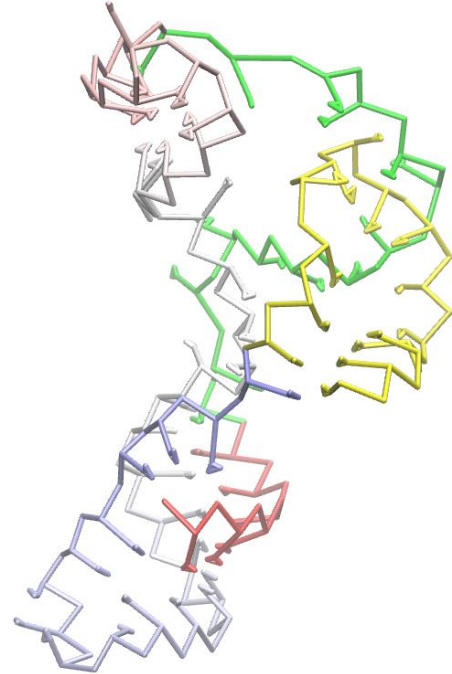


Link removal

In RNA puzzles : PZ13D8



Linked

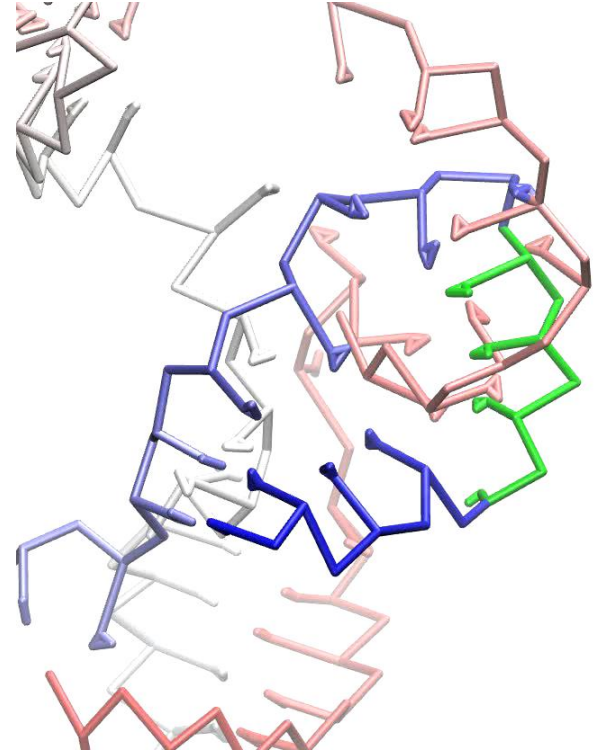


Unlinked

Link removal

In RNA puzzles : PZ13D8

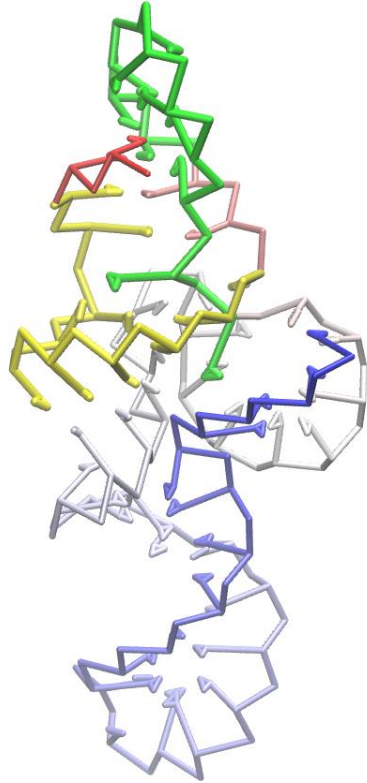
(most relevant part highlighted)



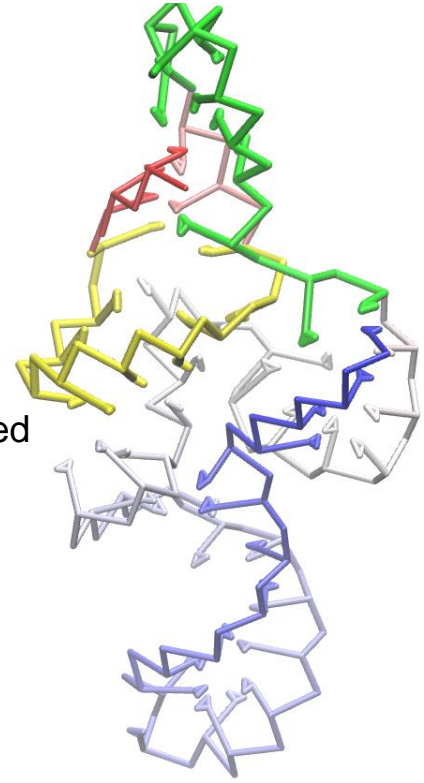
Link removal

In RNA puzzles : PZ17C5

Linked



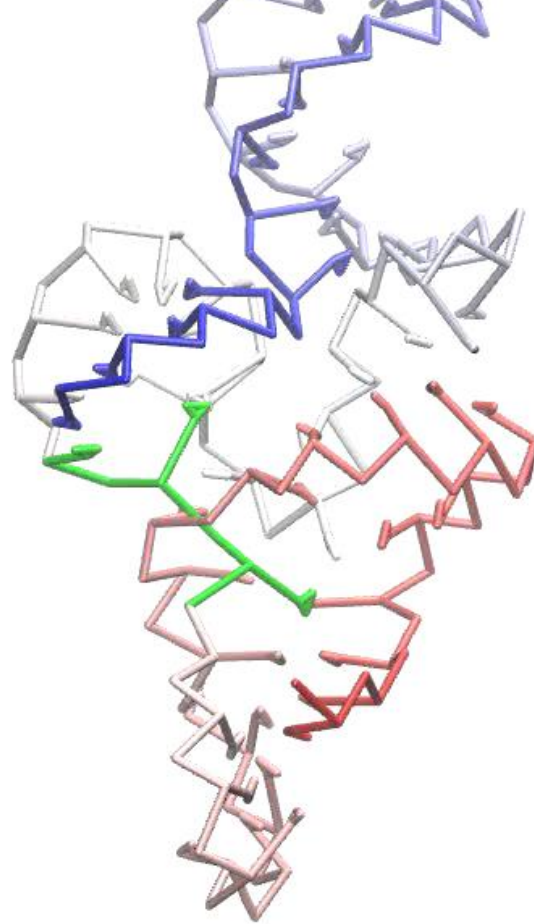
Unlinked



Link removal

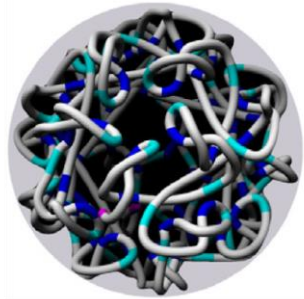
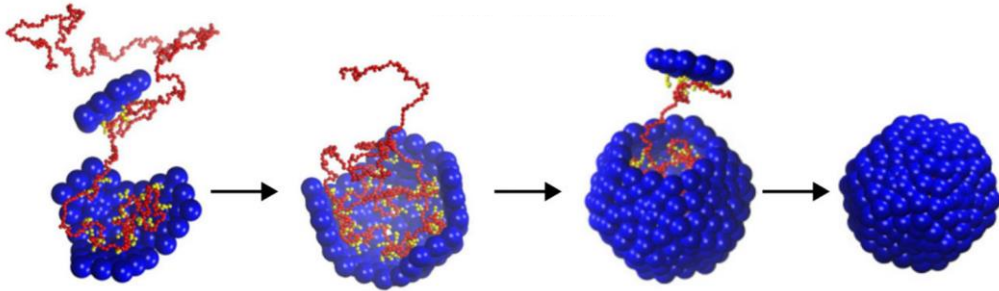
In RNA puzzles : PZ17C5

(most relevant part highlighted)



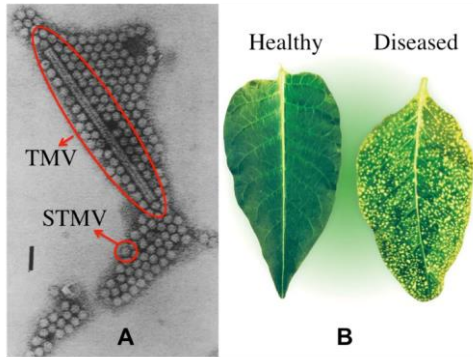
Viral genome modelling

- dsDNA : double strand pumped inside
- ssRNA: Collaborative process.



Viral genome modelling

SATELLITE TOBACCO MOSAIC VIRUS (STMV)

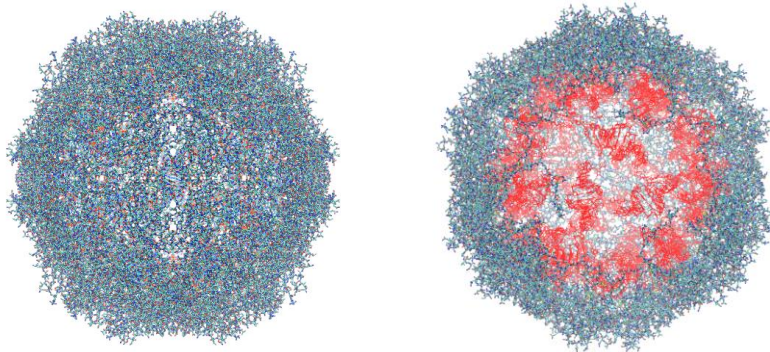


Small virus (17 nm, 1058 nt)

Known genome

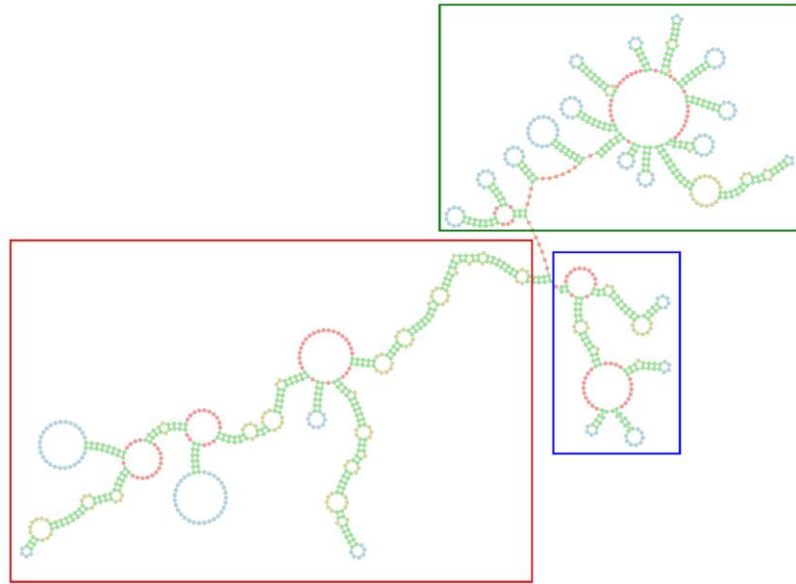
Secondary structure determined both in virio and in vitro.

60% of its structure known by X-ray spectroscopy - 30 double helices of 9 base pairs



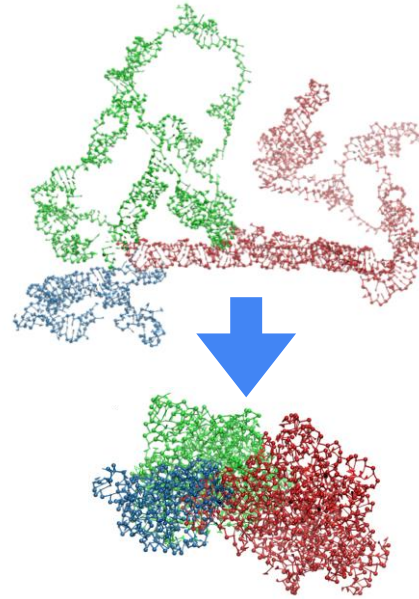
Viral genome modelling

Modelling a structured system



Secondary structure

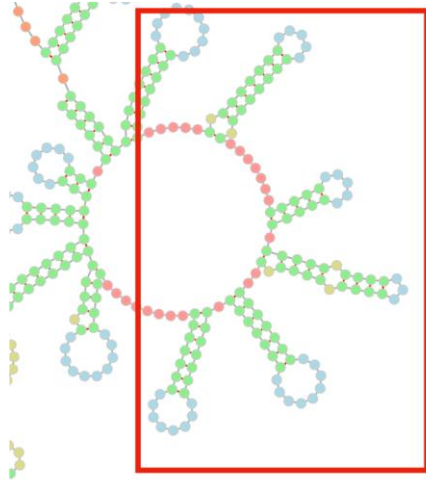
Brute-force compression



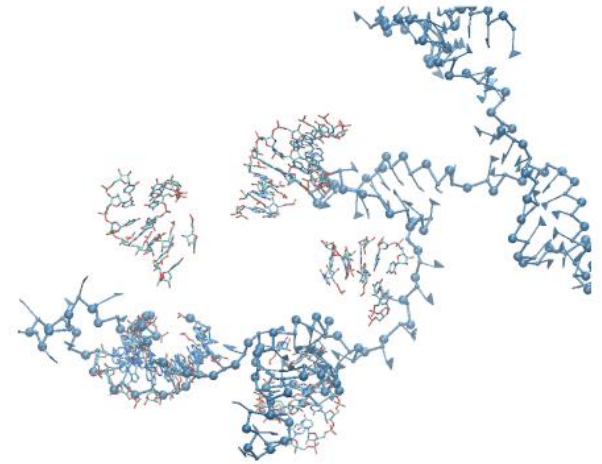
Nucleotide representation

Viral genome modelling

Modelling a structured system



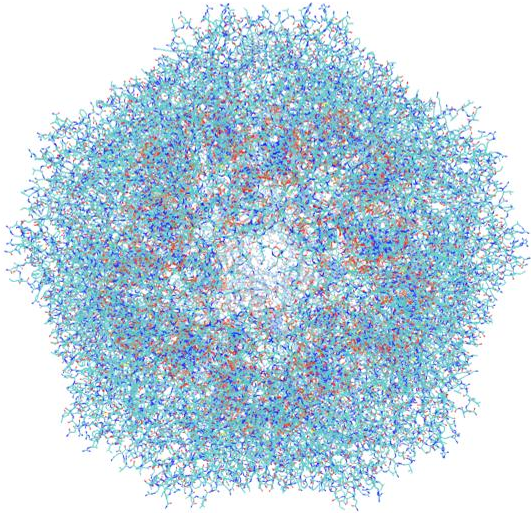
Secondary structure



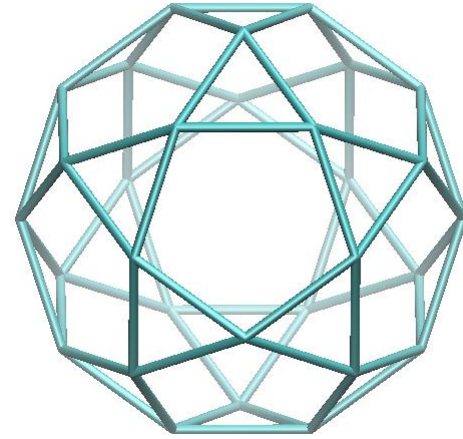
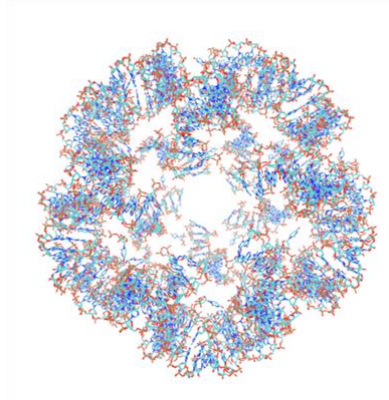
ERMSD pulling

Viral genome modelling

Use X-ray fragments as scaffold



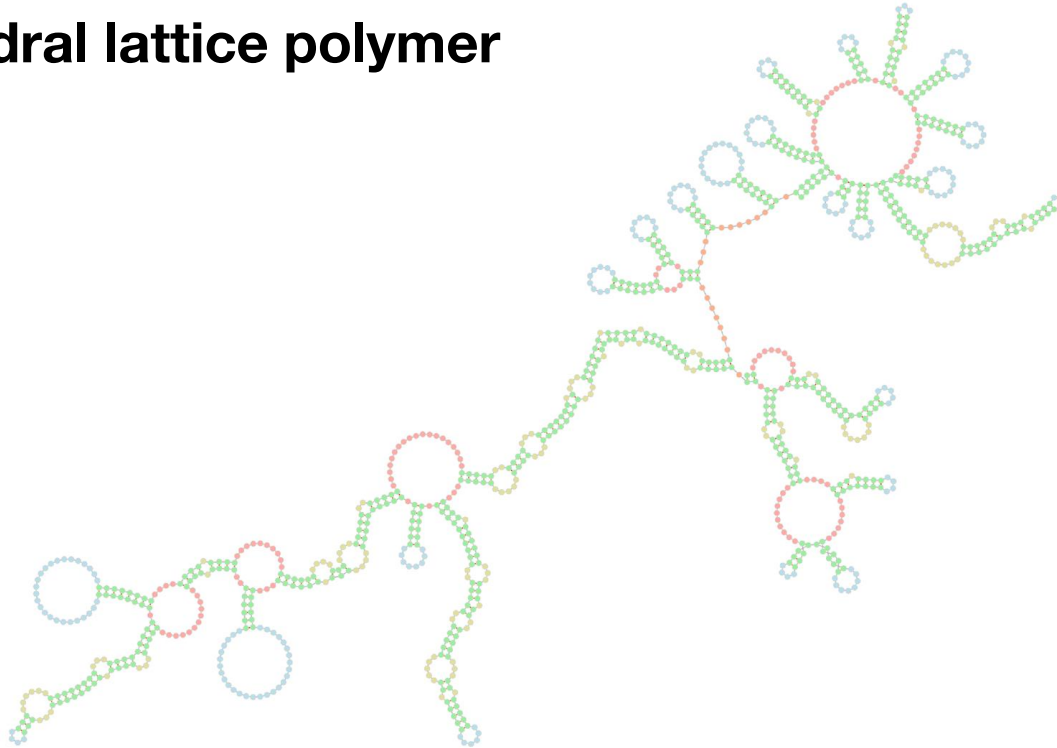
Secondary structure



Lattice polymer

Viral genome modelling

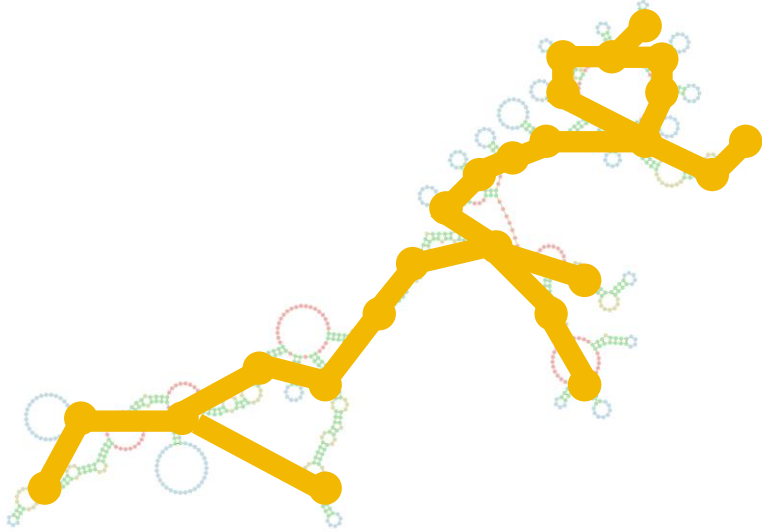
An icosahedral lattice polymer



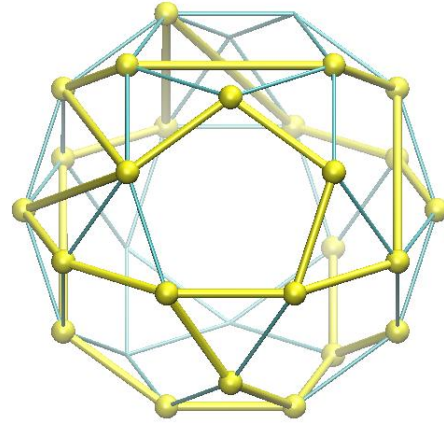
Real secondary structure

Viral genome modelling

An icosahedral lattice polymer



Real secondary structure



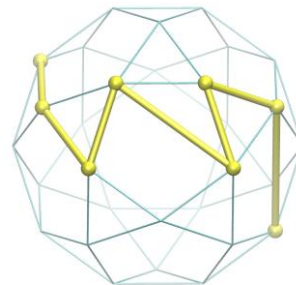
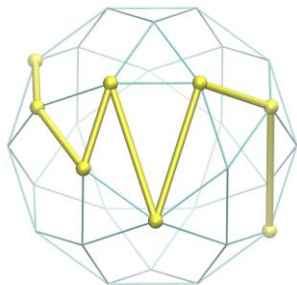
Lattice polymer

Viral genome modelling

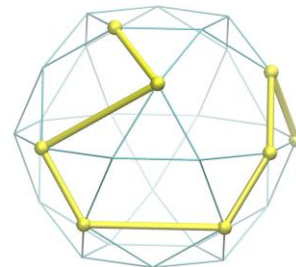
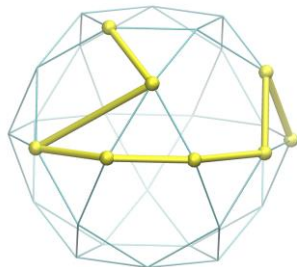
Exploring the conformations

Monte Carlo trial moves

Wedge
(3-body)



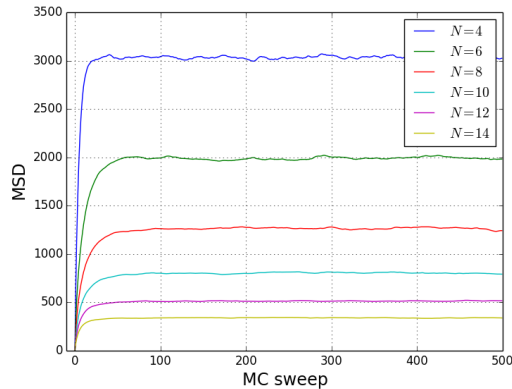
Torsion
(4-body)



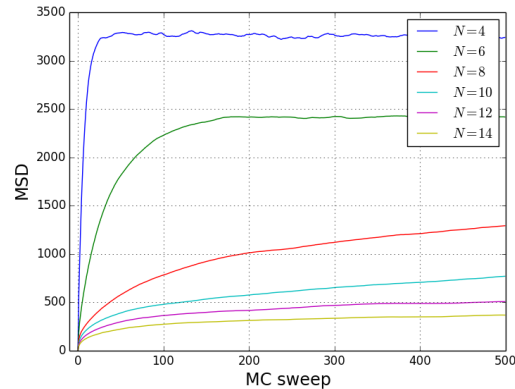
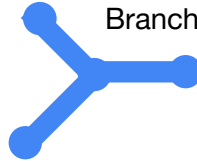
Viral genome modelling

Lattice polymer results, 10000 Monte Carlo sweeps

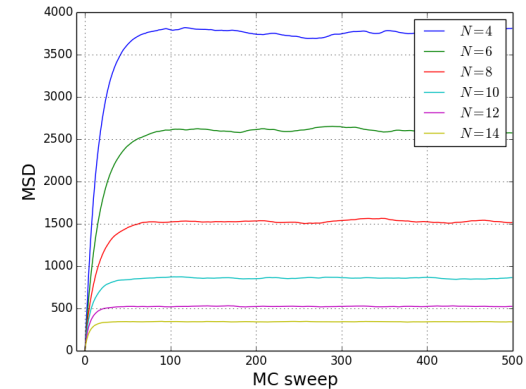
Linear



Branched



Closed

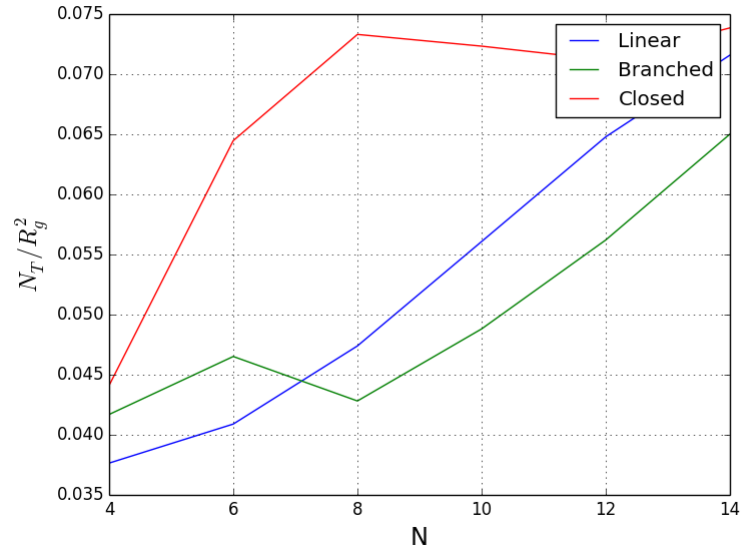
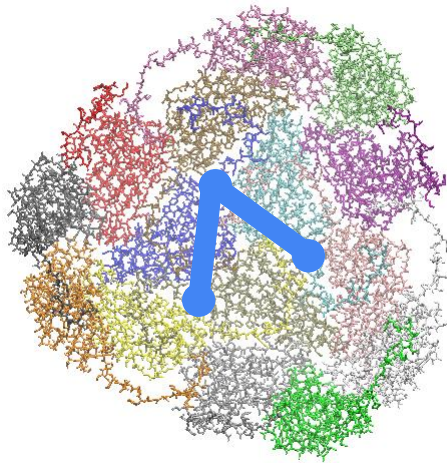


Viral genome modelling

Lattice polymer results, 10000 Monte Carlo sweeps, 6 initial conditions

In the lattice, a 60° angle involves 3 capsid proteins - stable, suitable for guiding capsid assembly

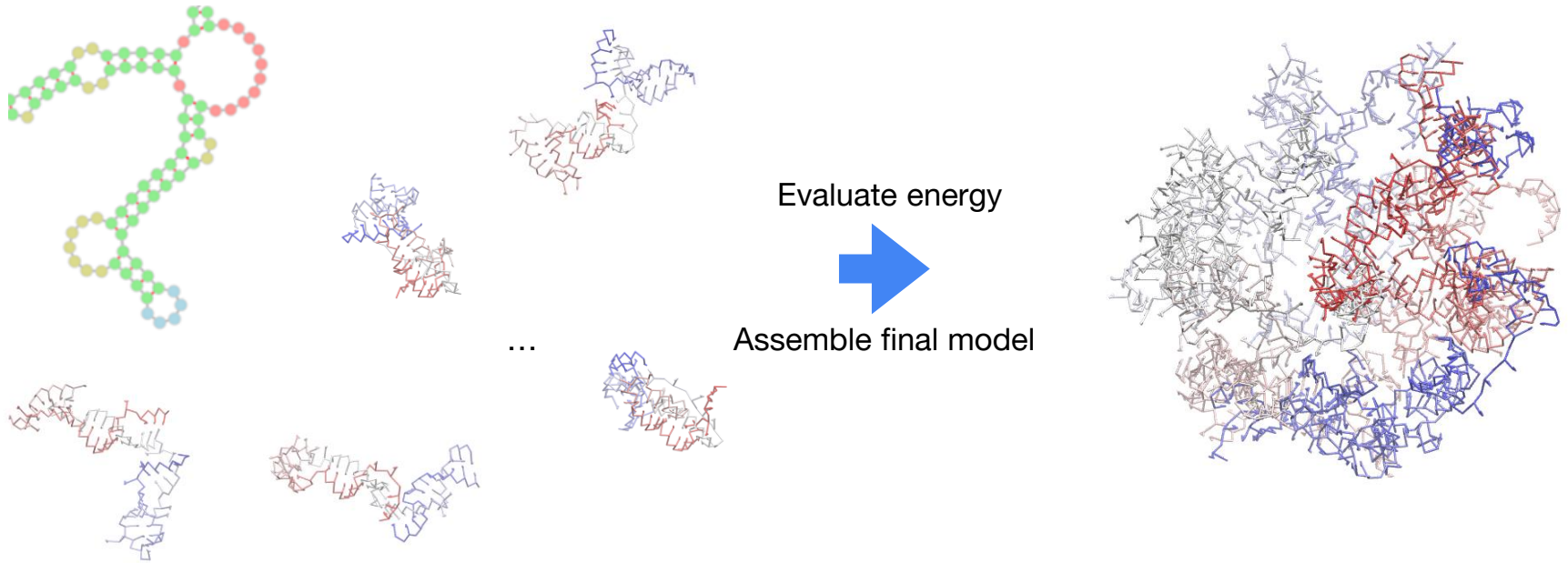
N_T : number of 60° angles



Closed rings stabilize more efficiently

Viral genome modelling

Massive sampling of conformations of each pair of consecutive stems in the lattice

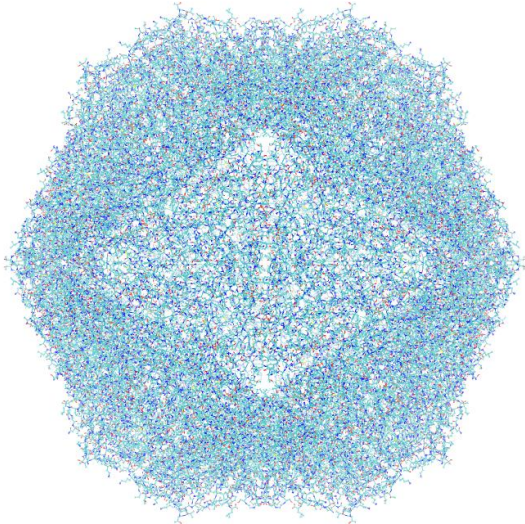


Porcine Circovirus 2 (PCV2)

Collaboration with Prof. Sergio Pantano, Pasteur Institute, Montevideo, Uruguay.

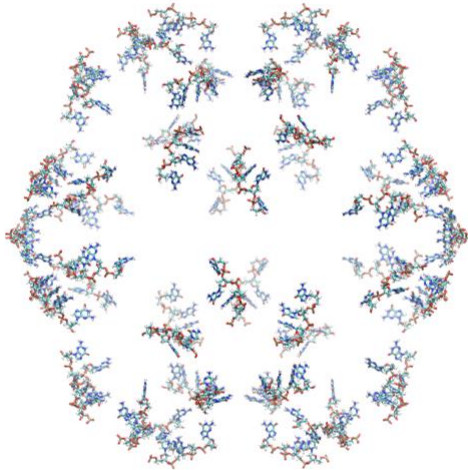
Variant PCV2d of clinical importance. PCV associated disease is responsible for diarrhea, respiratory diseases and death.

Icosahedral DNA virus. **Unstructured genome.**



Viral genome modelling

X-ray structure contains fragments, but which ones? Sequence RRY Y

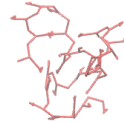
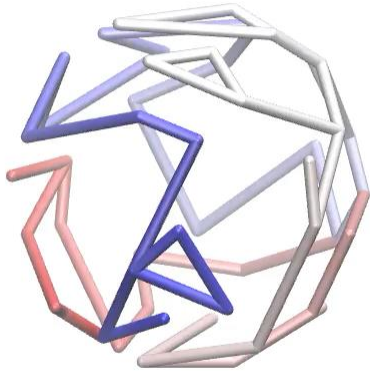


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Select 30 occurrences

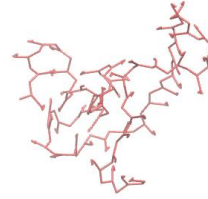
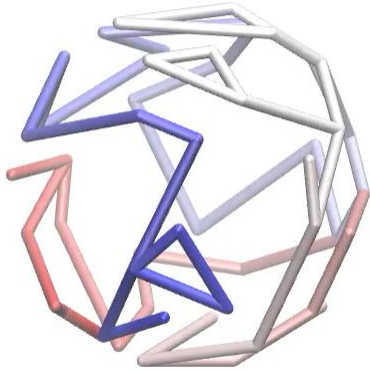
Viral genome modelling

A possible candidate...



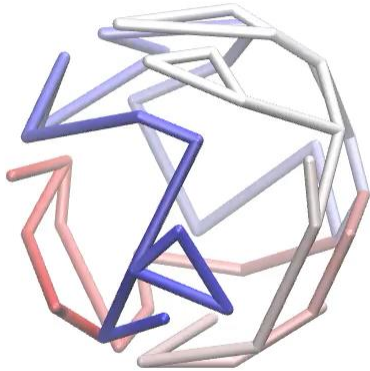
Viral genome modelling

A possible candidate...



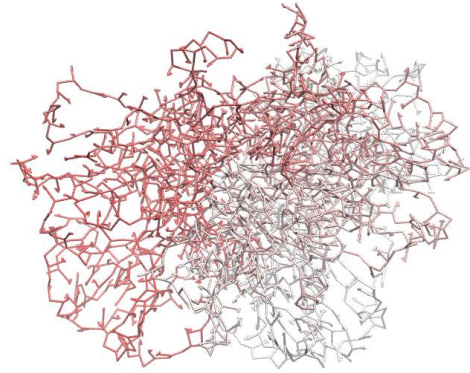
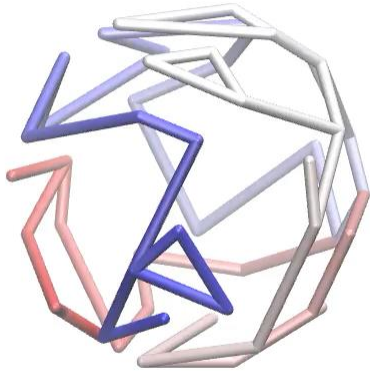
Viral genome modelling

A possible candidate...



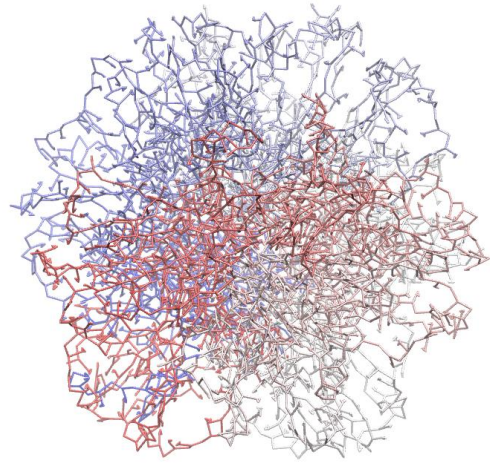
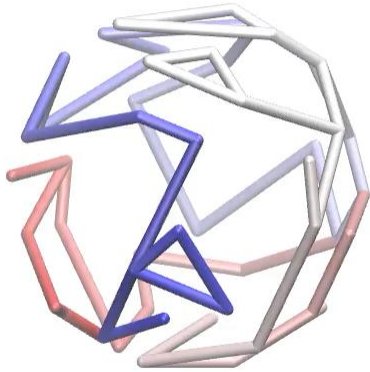
Viral genome modelling

A possible candidate...



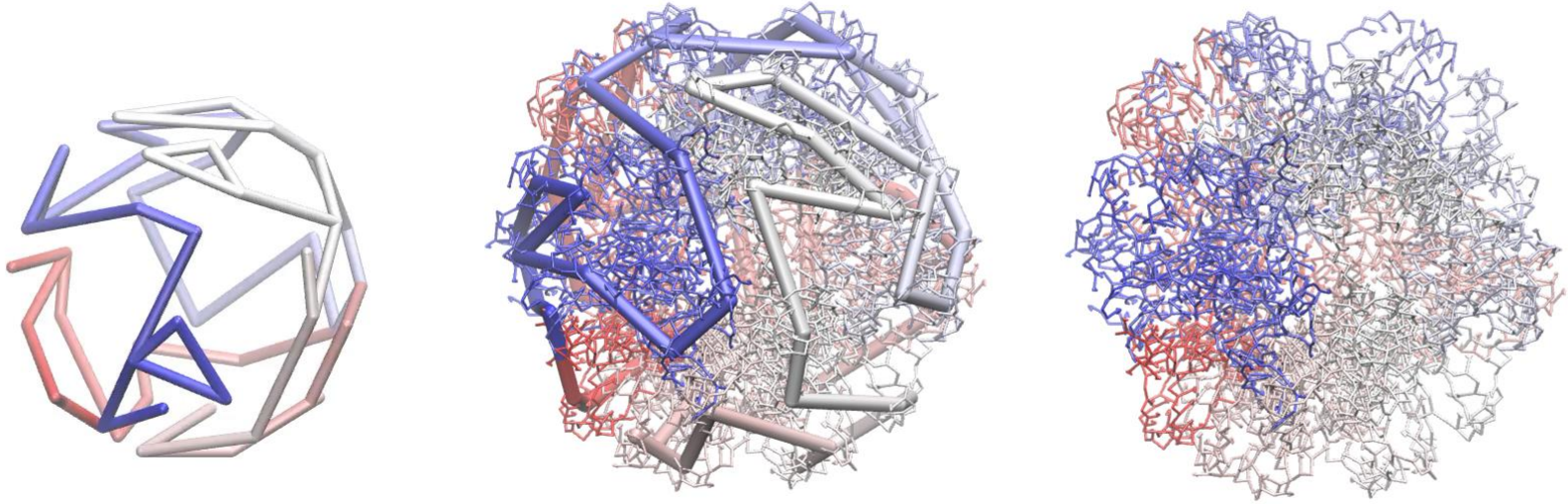
Viral genome modelling

A possible candidate...



Viral genome modelling

A possible candidate...



...which of course, requires an automatic disentanglement.

Conclusions

- Coarse Graining of RNA molecules can greatly help in structure prediction.
- Topological artifacts are relevant for structure design.
- Large structures as viral genomes are prone to be modelled by these means.

Acknowledgements

- Prof. Ivo Hofacker, Bernhard Thiel (Wien Universitaet, Austria)
- Prof. Giovanni Bussi, Prof. Cristian Micheletti (SISSA, Italy)
- Prof. Sergio Pantano (Montevideo Pasteur Institute, Uruguay)
- Dr. Adolfo Poma