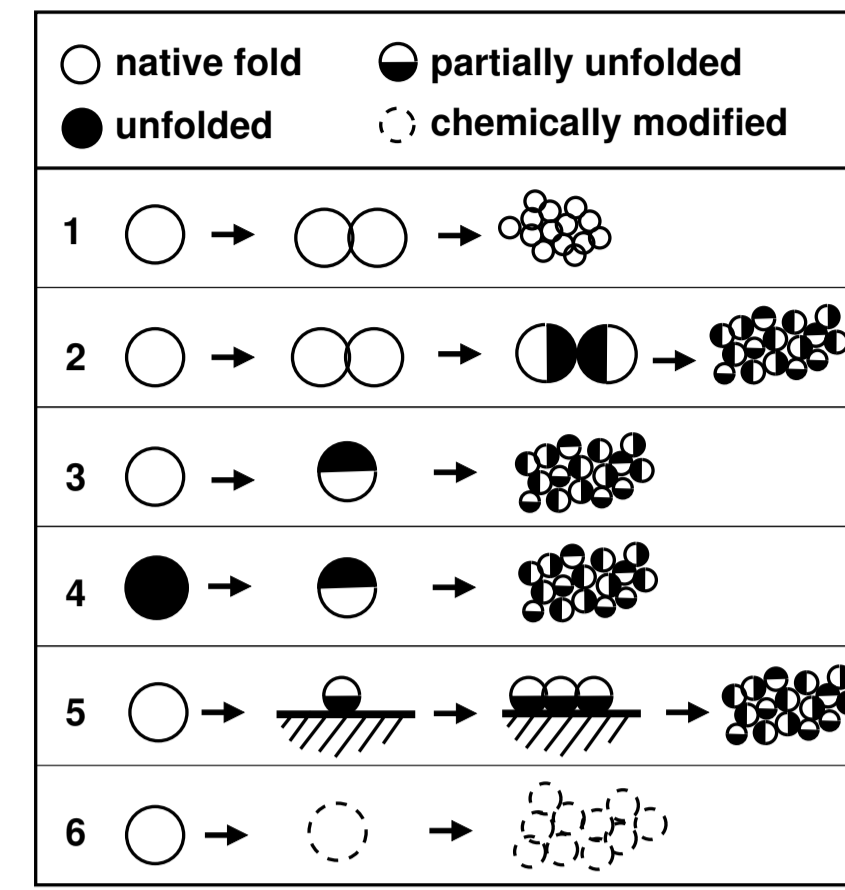
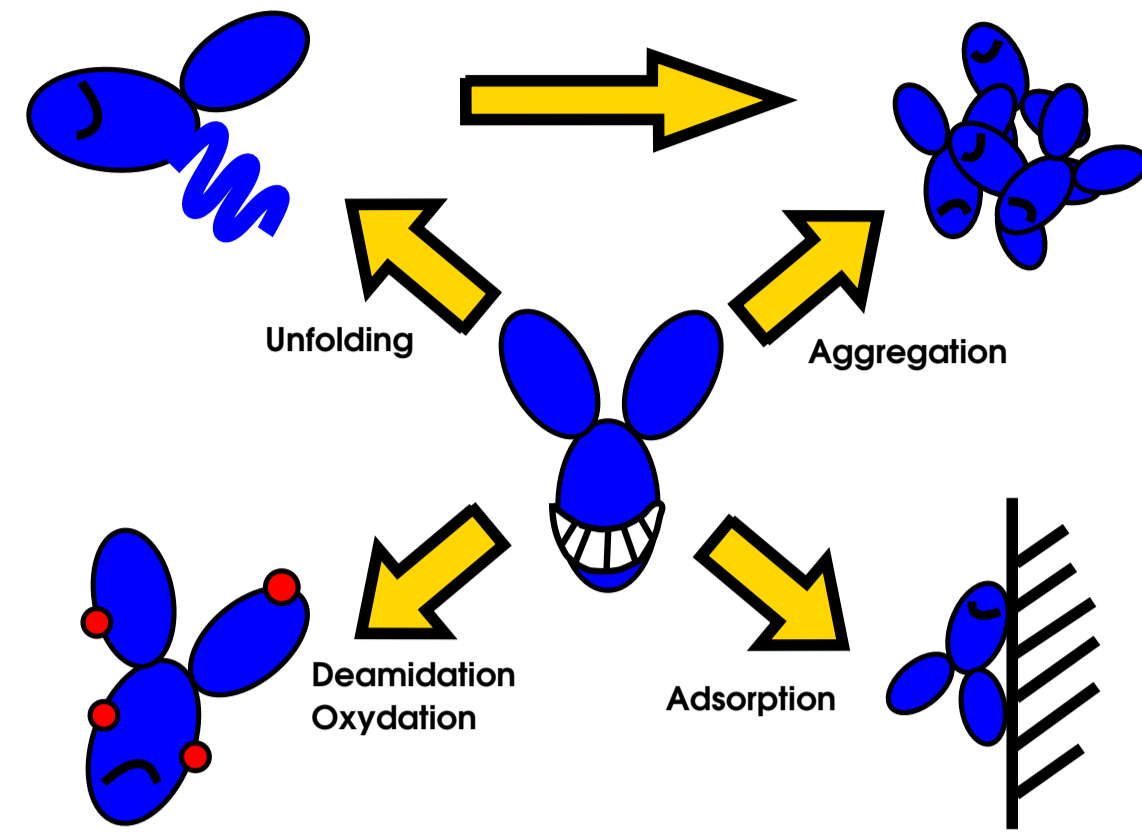
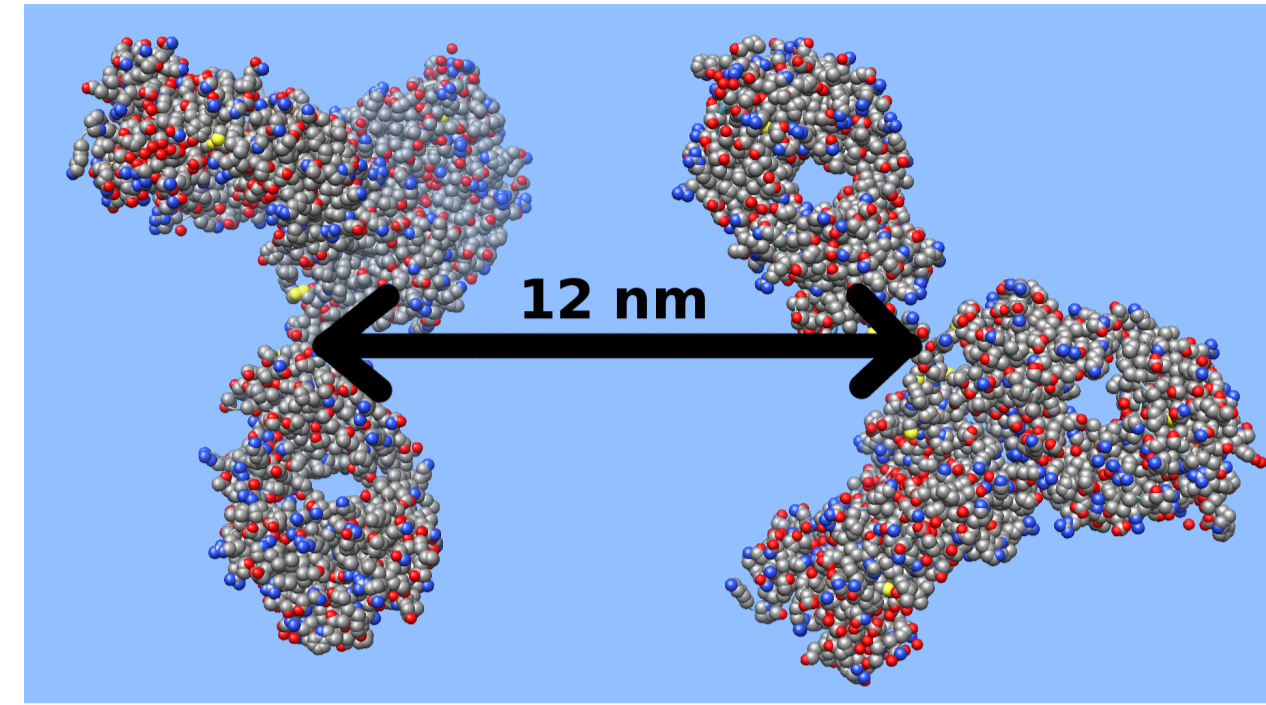


## THE PROBLEM



State of the art formulations of biopharmaceuticals have protein concentrations  $\geq 100$  g/l.

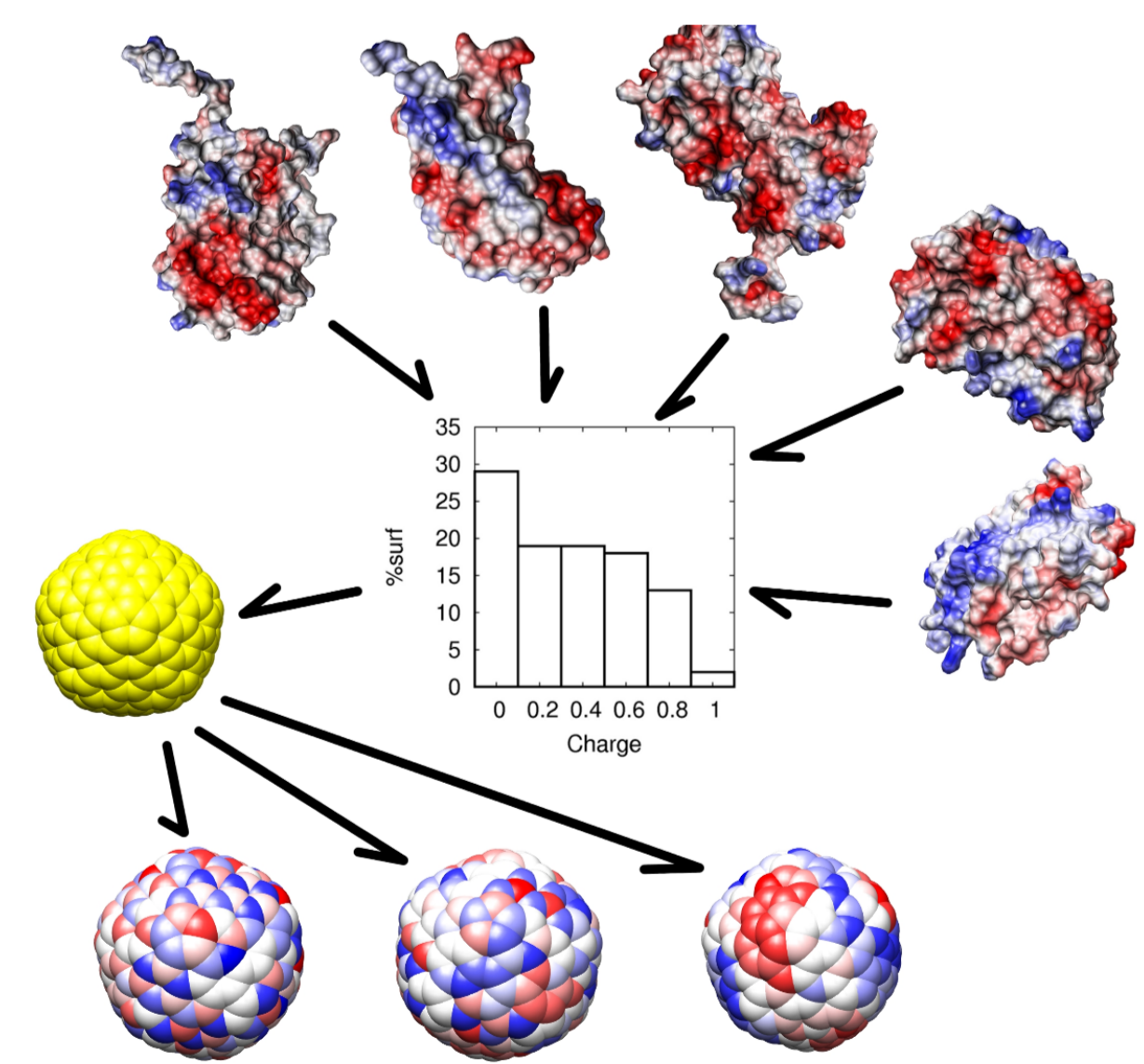
Numerous processes can reduce the shelf-life of concentrated protein solutions.

Aggregation alone can proceed through several mechanisms or combinations thereof.

- pH, ionic strength, buffer-type, concentration and type of osmolytes and surfactants, etc need to be optimized during the development of stable protein formulations.
- Effects of these parameters are complex and inter-dependent: development of formulations is a multi-dimensional optimization problem requiring a large number of expensive and time-consuming experiments.
- A theoretical prediction of aggregation propensities based on simple physico-chemical descriptors would reduce the required experimental effort and/or allow a more targeted exploration of parameter space.
- Algorithms, based on, e.g., net-charge and hydrophobicity (SAP)[1] have been proposed, but not been tested extensively, due to a lack of comparable experimental data in the public domain.

## THE APPROACH

- We developed a simple protein model designed to scrutinize some of the assumptions that existing algorithms for the prediction of aggregation propensities are based upon.
- Molecular Dynamics (MD) simulations were performed to calculate the free energy of association,  $\Delta G(\text{dist})$  (potential of mean force) between two proteins, and determine the relative influence of three descriptors: net-charge, dipole-moment, and hydrophobicity on colloidal interactions between proteins in aqueous solution.



Hydrophobicity (size of hydrophobic patches):

$$QH_i = \left( q_i^2 + \sum_{j, r_{ij} < d_{max}} q_j^2 / r_{ij}^6 \right)^{-1}$$

Surface charge variation (homogeneity of surface charge distribution):

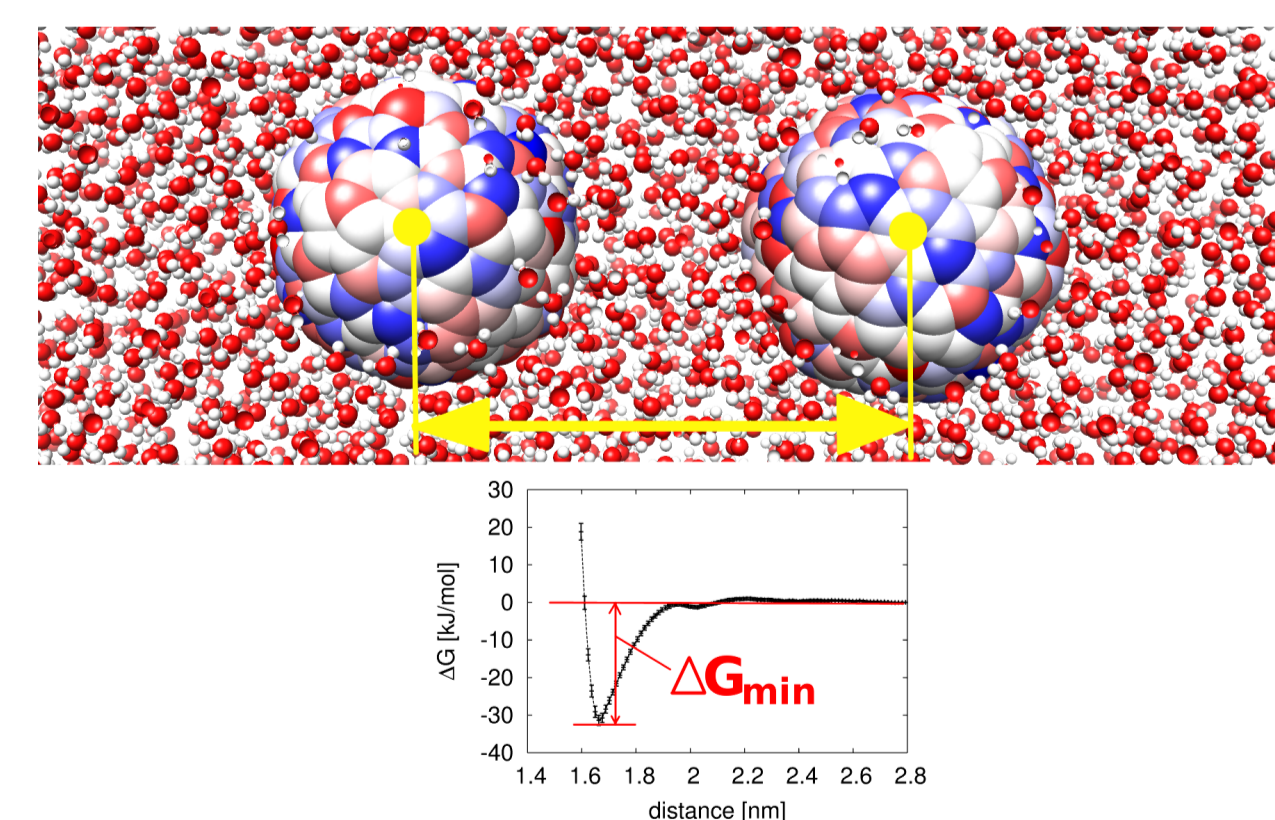
$$SCV = N \left( \sum_i \left[ \sum_{j, r_{ij} < d_{max}} |q_i - q_j| \right] \right)^{-1}$$

Net-charge:

$$q = \sum_i q_i$$

Dipole moment:

$$p = \left( \sum_i q_i r_i \right) - \left( \sum_i q_i \right) r_{COM}$$

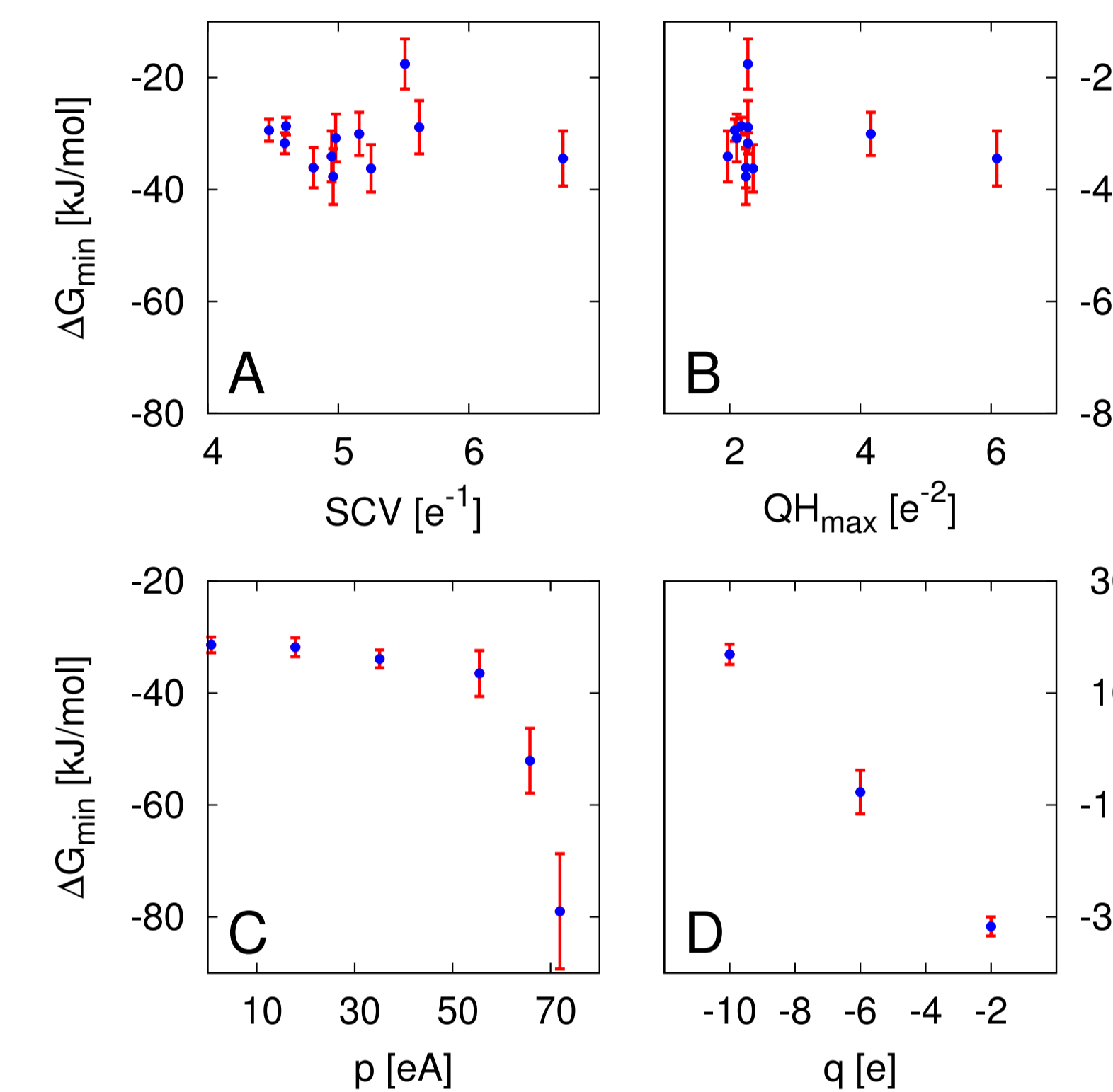
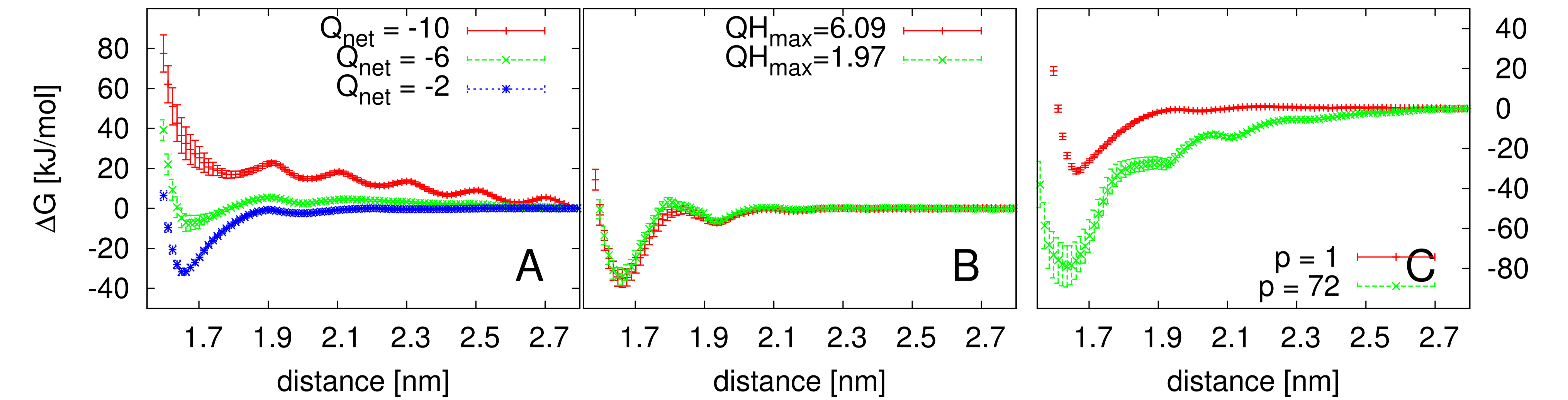


**The model:** Establish the average charge distribution on protein surfaces, assign charges to the atoms of a  $C_{240}$  fullerene  $\rightarrow$  pseudo-proteins, PP.

**The descriptors:** For a large number of PPs calculate the four descriptors and select instances covering a range of values for each descriptor.

**The experiment:** Perform MD simulations to calculate the first minimum of  $\Delta G(\text{dist}) \rightarrow \Delta G_{\min}$ , free energy of association, a measure for colloidal interactions.

## RESULTS



- Consider PPs with
  - $q = -2$  to  $-10$  esu.
  - $p = 1$  to  $72$  eÅ.
  - $QH_{\max} = 2$  to  $6.1$  esu $^{-1}$  (corresponding to hydrophobic patches with approximately 2 – 5 Å radius)
- $\Delta G_{\min}$  shows a strong variation and clear correlation with  $p$  and  $q$ .
- The variation of  $\Delta G_{\min}$  with  $p$  and  $q$  is comparable in size for  $p$  and  $q$  values typical for globular proteins.
- By comparison the variation with  $QH$  (hydrophobic patch-size) is weak, and there is no clear correlation with  $\Delta G_{\min}$ .

## WHAT IT MEANS

- The accuracy of the presented results is un-precedented due to the usage of an explicit water model.
- A proteins dipole-moment and net-charge have effects of similar size on colloidal interactions. For most proteins a single mutation can reduce the dipole moment by 50-100%. In many cases the resulting variation of the attraction between two proteins is comparable to the effect of increasing the net-charge by up to ten elementary charge units. Including the dipole-moment as criterion for mutations is expected to require fewer mutations for the same stabilizing effect, reducing the risk of immunogenetic effects.
- Since hydrophobic patches seem to have a negligible impact on colloidal interactions we speculate that the removal of hydrophobic patches improves thermal, rather than colloidal stability.
- A simple and efficient statistical model for the prediction of aggregation propensities would include as descriptors net-charge and dipole moment, and an additional descriptor for thermal stability.

## REFERENCES

[1] T. Lauer et al. (2012) Developability index: A rapid in silico tool for the screening of antibody aggregation propensity. *Journal of pharmaceutical sciences* 101(1):102-115

Support:

