

# Modelling $\text{Ca}^{2+}$ -dependent proteins in the spine - challenges and solutions

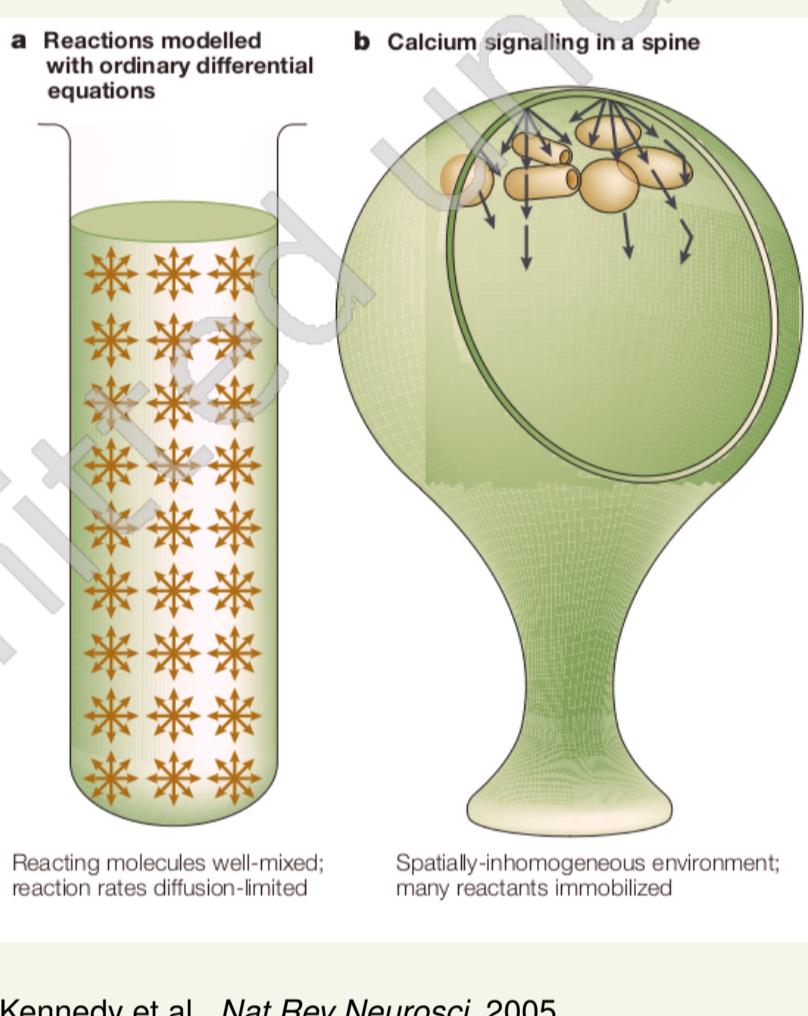
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## Biology

- $\text{Ca}^{2+}$ /calmodulin-dependent protein kinase II (CaMKII) is important in LTP induction and memory formation.
- $\text{Ca}^{2+}$  entering through NMDA receptors activates CaMKII through calmodulin.
- CaMKII is necessary for normal synaptic plasticity and activates many downstream pathways.
- CaMKII function is fine-tuned through interaction with other proteins, autophosphorylation, and inter-subunit regulation.
- We combine computational modelling and simulations with biochemical experiments in order to understand CaMKII regulation.
- Modelling synaptic proteins poses three kinds of problems: Small molecule numbers, large numbers of possible states, and complex geometries.

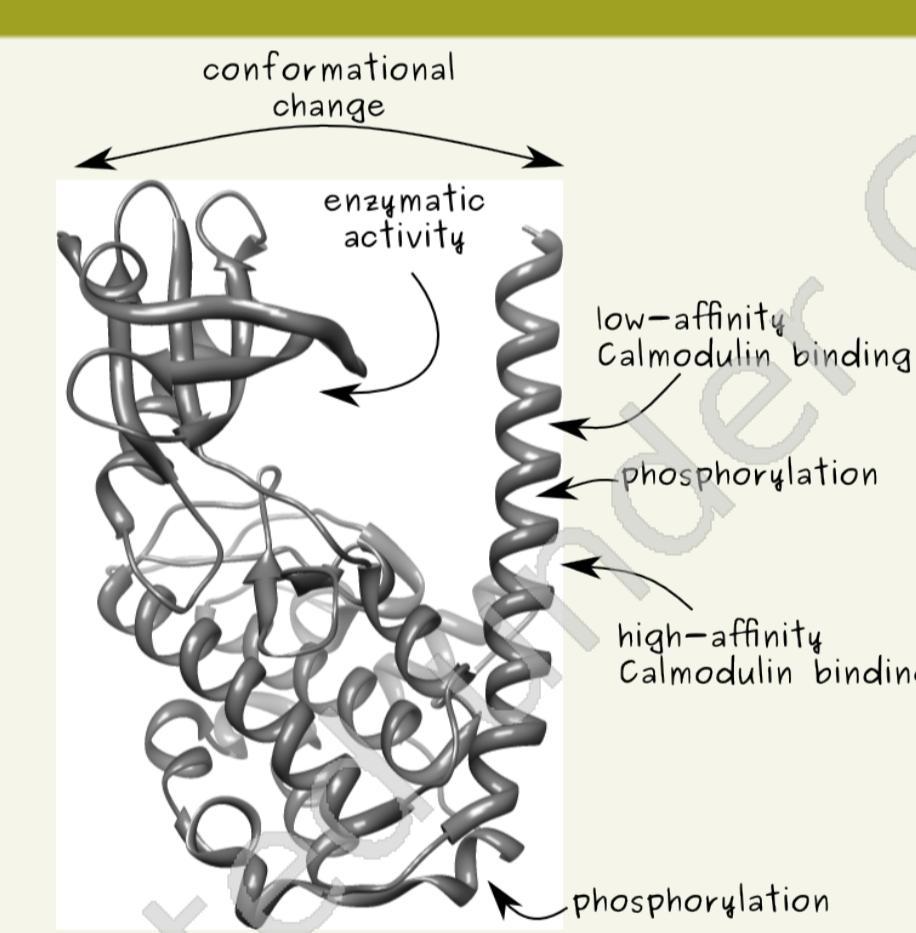
## Small molecule numbers



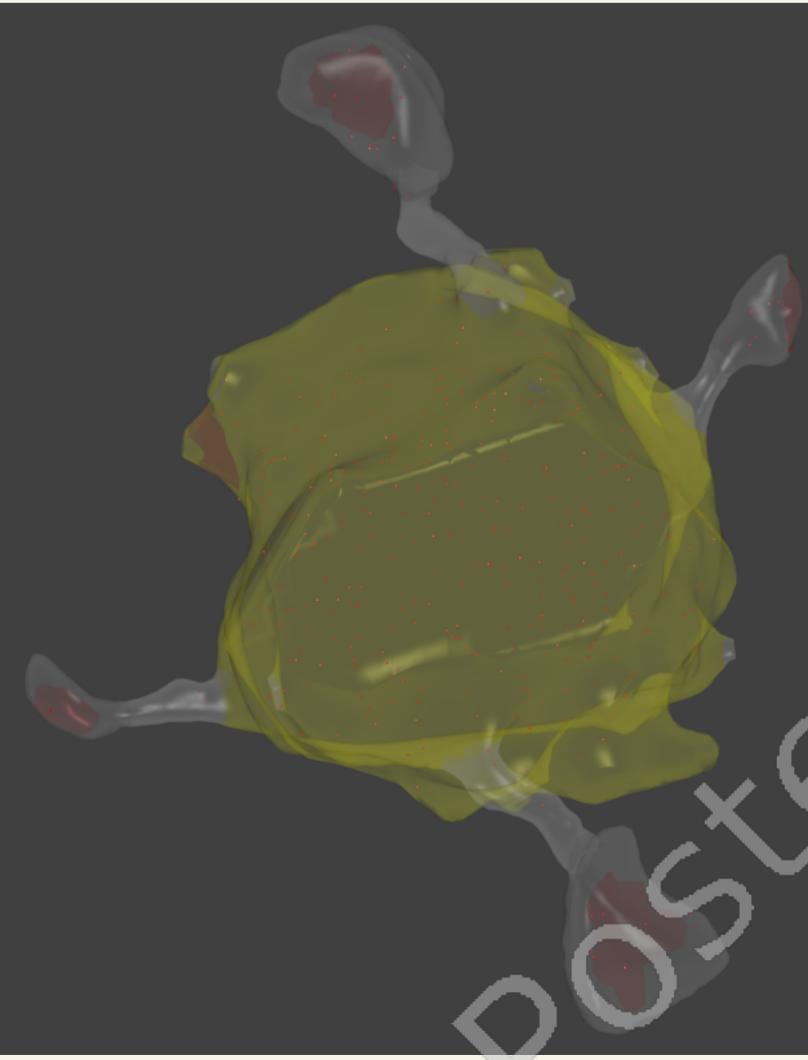
- In small biological compartments, absolute molecule numbers are low
- This makes reactions stochastic and changes discrete
- Biological reaction systems are spatially heterogeneous
- ODEs are designed for well-mixed, continuous, deterministic systems and are therefore not well suited to model such systems

## Large numbers of possible states

- Proteins like CaMKII can be modified by post-translational modifications, ligand binding, conformational change, complex formation, subcellular location etc.
- This results in a wide variety of possible functionally different states
- Enumerating all these states can be tedious or, for larger systems, impossible

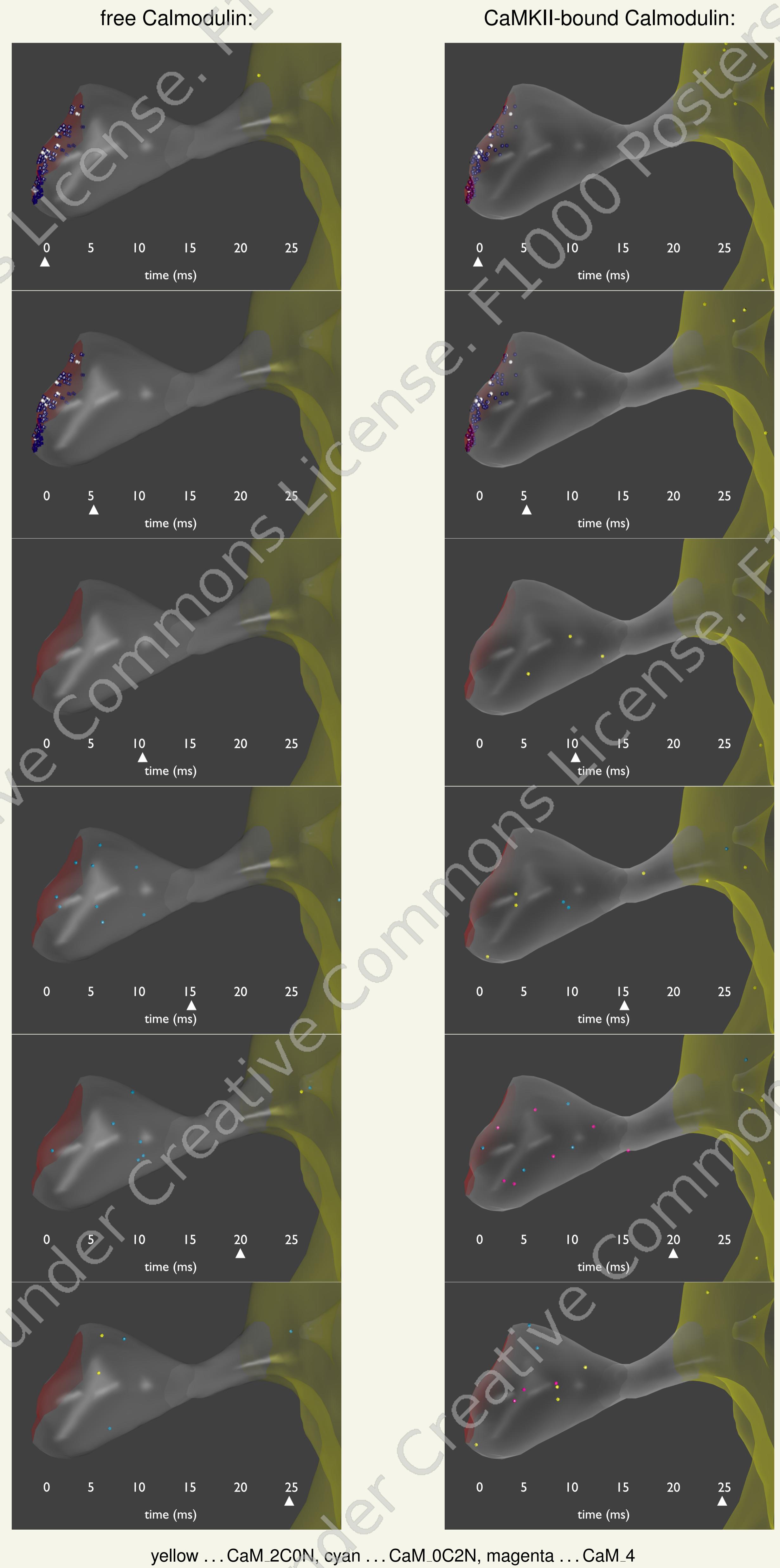


## Complex geometries

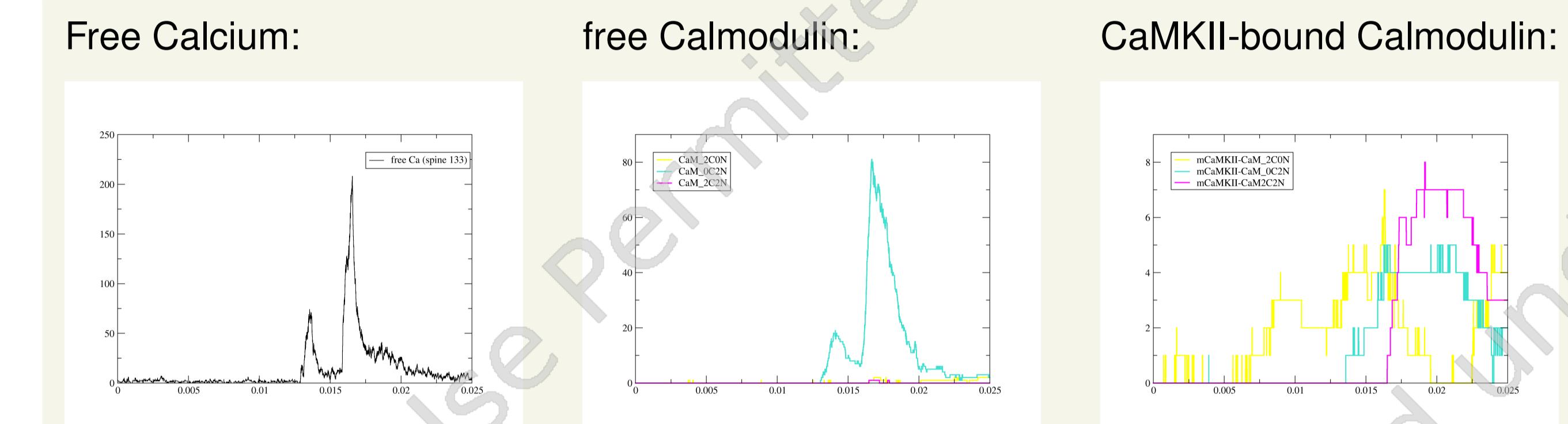


- Biological compartments have complex geometries
- This affects diffusion and protein access to small molecules, to targets and to modulators
- In the spine, CaMKII competes with other proteins for access to calcium and regulation by calmodulin
- Spatial models are necessary in order to understand events in signalling micro-domains

## Target effects on Calcium binding to Calmodulin



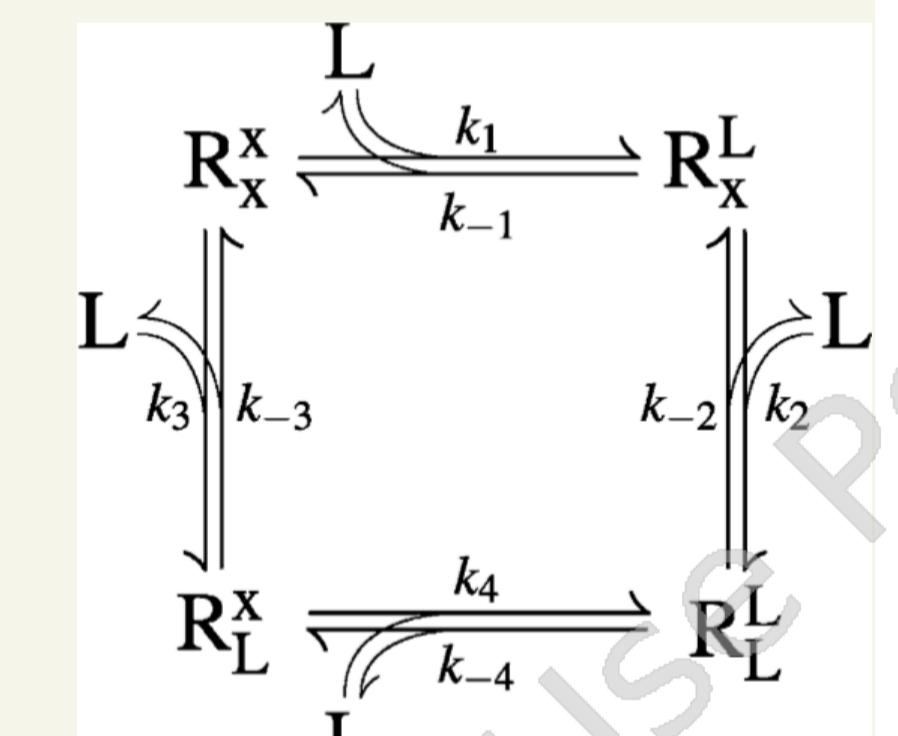
## Target effects on Calcium binding to Calmodulin



- In the absence of CaMKII binding, CaM\_0C2N is the dominant species, and there is hardly any fully saturated calmodulin
- Binding to CaMKII increases the probability of Calcium binding to the C-terminus and of calmodulin becoming fully saturated
- This has been shown before (Stefan et al, PNAS, 2008), but our present study adds dynamic effects and spatial resolution

## Methods

- MCell (Kerr et al, SIAM J Sci Comput, 2008) is an agent-based, spatial Monte-Carlo simulator
- It allows for stochastic modelling of multi-state proteins in arbitrarily complex geometries
- MCell integrates with the animation software blender to visualise simulation results
- MCell files can be converted to SBML to allow for model sharing and integration with other modelling platforms (Tolnay et al., submitted)
- Parameter determination involves performing experimental assays, mining the literature and applying biophysical considerations (e.g. microscopic reversibility)



(N. Le Novère, ed); Springer, 2012.

## Conclusions

- Modelling signal transduction in the dendritic spine can help us uncover the molecular basis of learning and memory
- The spine signalling machinery presents three problems often encountered in biochemical modelling: small total molecule numbers, large numbers of possible states, and complex geometrical arrangements
- MCell is a stochastic, agent-based, spatial simulator that solves all three of these problems and allows results to be animated using blender
- We can look at dynamic phenomena such as target effects on calmodulin during a Calcium signal, and track single molecules in time and space.

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