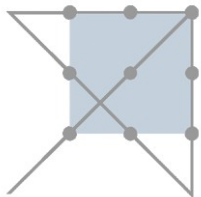


Information transfer in Ca²⁺ signal transduction

ECES 2007



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Research
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Jürgen Pahle and Ursula Kummer

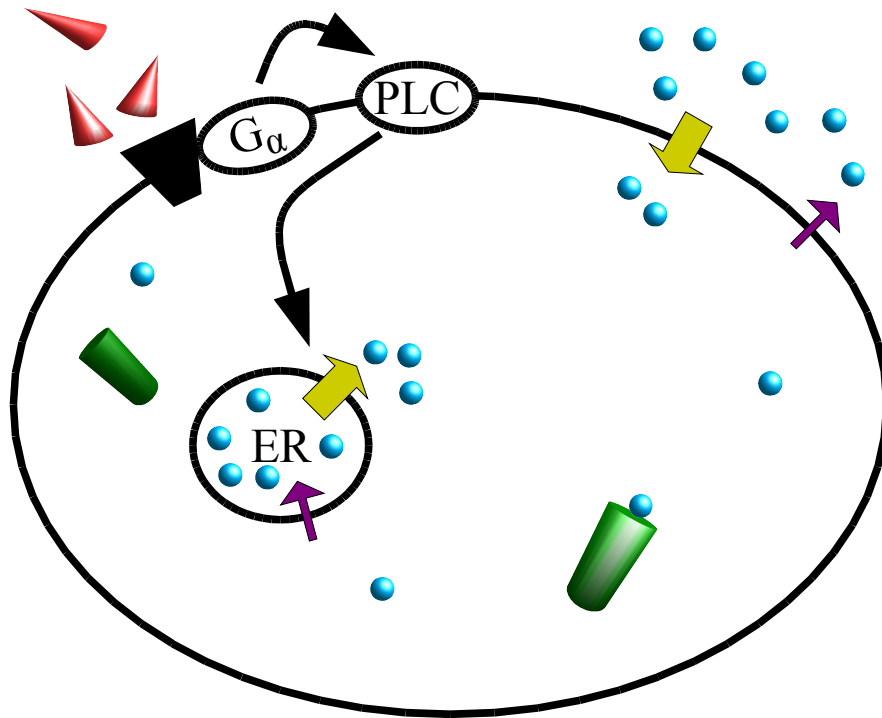
EML Research gGmbH in Heidelberg

Bioquant, University of Heidelberg

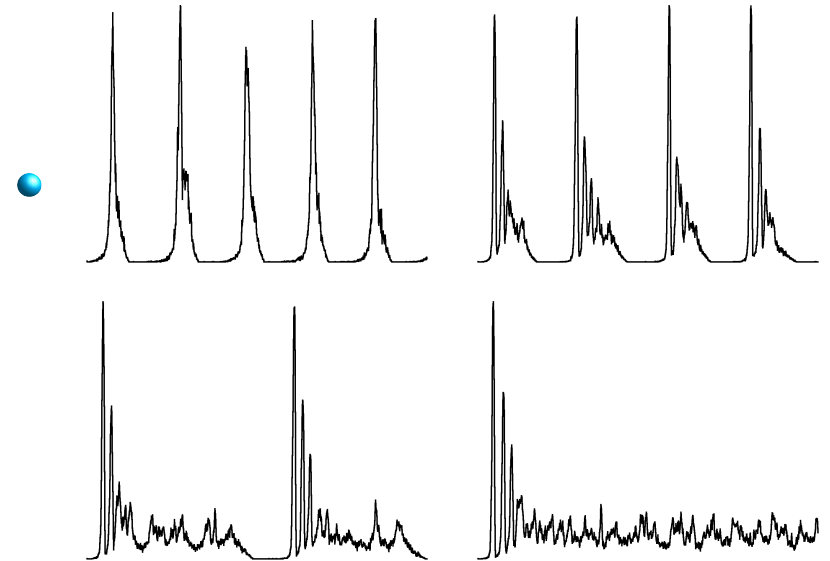
email: juergen.pahle@eml-r.villa-bosch.de

October 1, 2007

Signal transduction via Ca^{2+} -ions



different Ca^{2+} -dynamics:



data:

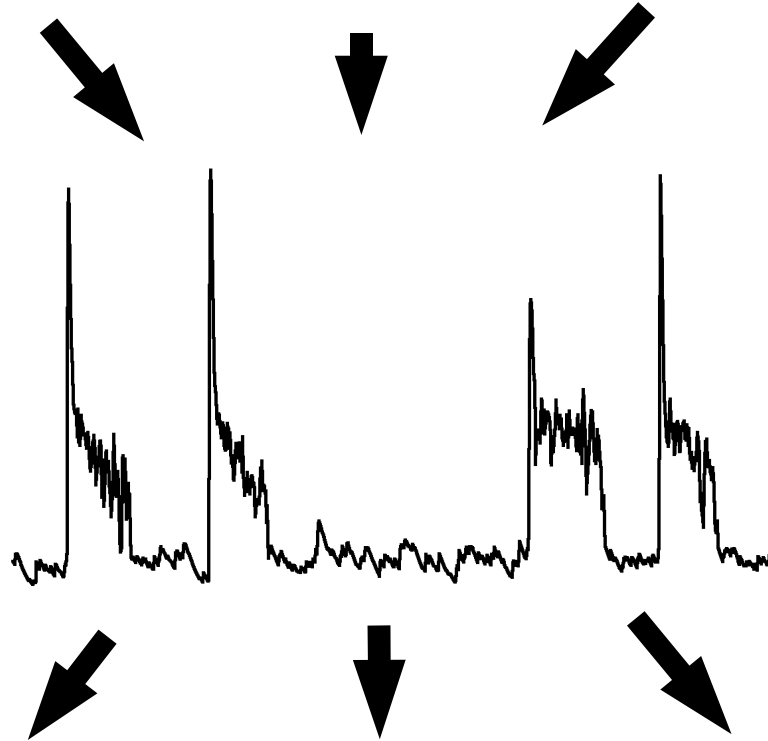
- single-cell measurements using Ca^{2+} -markers (aequorin, etc.) or
- computer simulations using stochastic simulation techniques
 - Ca^{2+} -model (*U. Kummer et al. (2000) Biophys. J., 79:1188-1195*)
 - Stochastic Simulation (*D.T. Gillespie (1976) J. Comp. Phys, 22:403-434*)

Signal transduction via Calcium

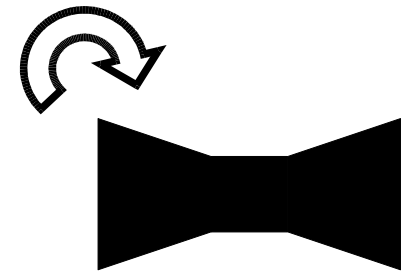
Hormones (Angiotensin II, Vasopressin etc.)

Nucleotides (ATP, UTP)

Ca²⁺-signal



calcium code?



bow tie structure

Target proteins (Calmodulin, Phosphorylase b kinase, etc.)

Transcription factors (NF-κB, etc.)

Transfer Entropy

- Enzyme dynamics is influenced by calcium
How much of the uncertainty about the enzyme dynamics is taken away, if we know the calcium signal?

→ Information transferred from calcium to target enzyme

Kullback-Leibler form (*T. Schreiber (2000) Phys. Rev., 85(2):461-4*)

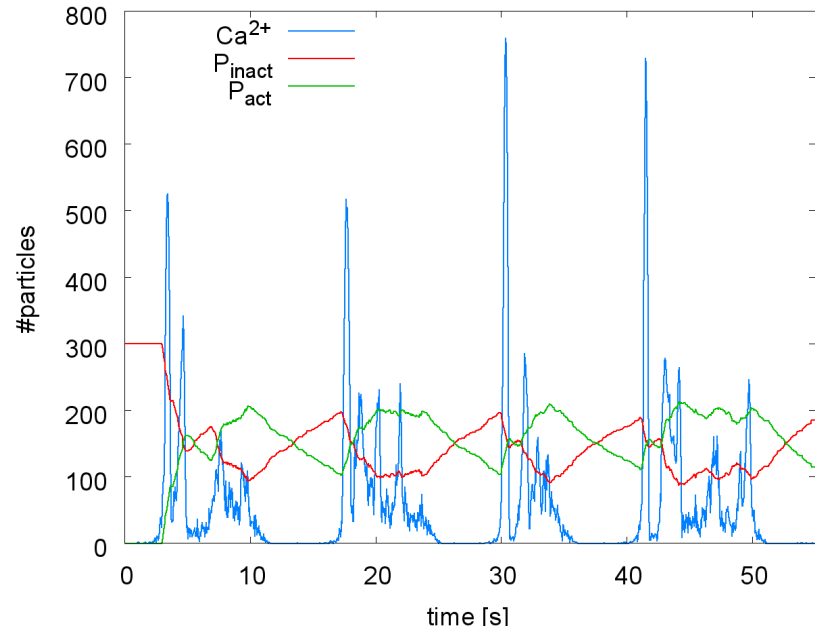
$$T_{J \rightarrow I} = \sum p(i_{n+1}, i_n^{(k)}, j_n^{(l)}) \log \left(\frac{p(i_{n+1} | i_n^{(k)}, j_n^{(l)})}{p(i_{n+1} | i_n^{(k)})} \right)$$

Kernel density estimation (rectangular/gaussian kernel) or
Histogram-based techniques

Coupled enzyme activation



stoch. coupling
with simulated
enzyme

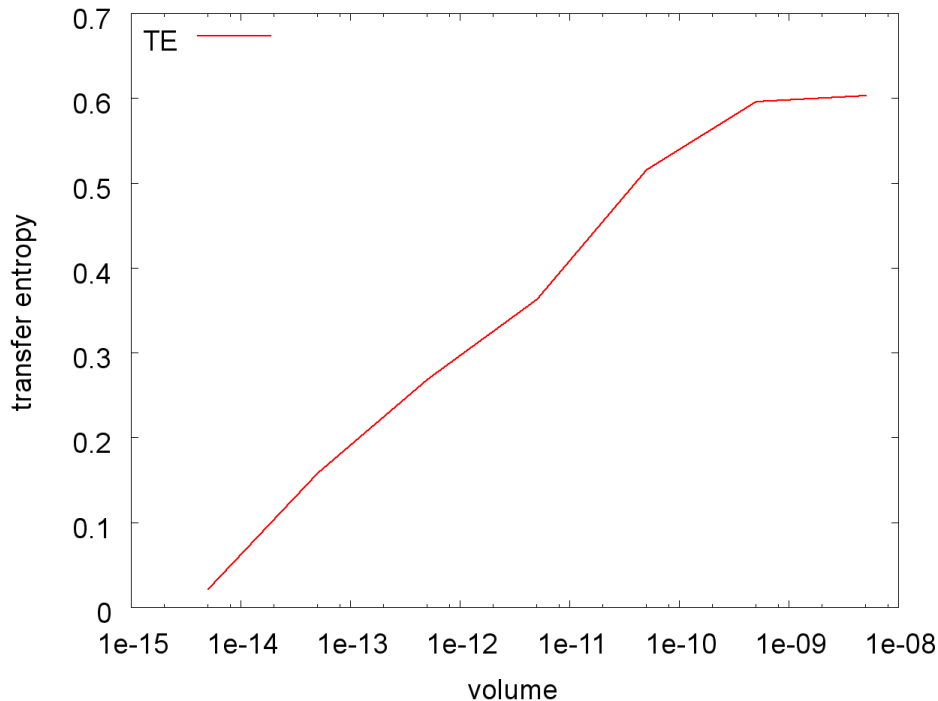


estimation of the transfer entropy

- (box-assisted) kernel density estimation (rectangular or gaussian kernel)
- rank-based adaptive histogram method

implemented in
octave with
dynamically-linked
C++-functions

Results



- The **rate of information transfer increases with increasing volume** (and number of particles) until it reaches a maximum. Bursting: max. rate ~ 0.6 bit/sample
- There is a **slight increase in transfer entropy from spiking to increasingly complex bursting oscillations**. In the case of an (elevated) steady state the TE drops to a very low value.

Stimulus strength (k2)	Dynamic behavior	TE
2	Spiking	0.52
2.5	Bursting	0.59
2.85	Bursting	0.60
3.2	Steady state (overstim.)	0.15

Take-home message

- Ca^{2+} in cells carries information from **hormones**, etc., to different **intracellular targets** (enzymes)
- Specific information is encoded in this calcium signal
→ **calcium code**
- Important step to decrypt this code is to **quantify the information**, which is actually carried under different cellular conditions
- **Information theory** (together with stochastic simulation methods) offers the tools → **Transfer Entropy**

Acknowledgements

- [Klaus Tschira Foundation](#) (KTF) and the [BMBF](#) for funding
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