# The state trajectory of cell using Renyi entropy coefficients



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AIM: Cell behavior analysis based on time-lapse microscopy. Objective and automatic construction of the state trajectory of living cell by using only image analysis.

Elementary model of intracellular (or intra-organellar) pattern formation: Belousov – Zhabotinsky reaction in a Petri dish.

The Belousov – Zhabotinsky reaction (Belousov 1958) was devised as a primitive model of citric acid cycle. To the surprise of the authors, it brought about the phenomenon of chemical clock (in mixed systems) or spontaneous pattern formation (in still compartments). We use it as primitive model for testing of our analysis of experiment for the purpose of determination of macroscopic state space. The distinct feature of the BZ reaction is that although it in fact consists of 80 chemical reactions (György et al. 1990), relatively simple patterns arise and may be modeled by approaches such as cellular automata (numerous demonstrations may be found on the web), ODEs etc.. We decided to search the phase space on the basis of the experiment. Fortunately, the distribution of point numbers between color channels is rather distinct and gives chance to map the state space.



#### **Constructing and clustering of state trajectory**



□State coordinates – RGB images  $\rightarrow$  RGB state space □Expertomica Entropy Calculator  $\rightarrow$  Information Entropy Transformation images

- Pseudo colored image color describes how much information the point carries
- Lower alpha parameter enhance rare points
- □ Higher alpha parameter enhance bigger areas
- Rényi entropy



□Point Information Gain (PIG)

$$\Delta I_{x, y, \alpha} = I_{\alpha} - I_{x, y, \alpha}$$



Two computing methods – Whole image x Cross

□Whole image – Histogram is constructed from whole image

Cross – Histogram is constructed from cross, more correlated with spatial and structural



# Principal component analysis - Cross





## Principal Component Analysis (PCA)

Objective reduction of multidimensional space

□ For cross – first 3 PCs – 97.25% of original space

PC-1	63.67%
PC-2	92.83%
PC-3	97.25%
PC-4	98.09%
PC-5	98.40%

- information
- $\Box$ 13 alpha parameter ( $\Delta I_{\alpha}$ ) x 3 color channels = 39 dimension of state space

Clustering of trajectory – different algorithms
Hierarchical x K-Means
Number of clusters

Point Information Gain Density *n*=max*level*  $\Delta I_{\alpha} =$ 

n=0

## Alpha Spectra of Principal Components (PC)



- Alpha spectra which parts of image dominates PC
- □ Differences between PCs (upper graph)
- Differences between color channels (right graphs)





- □ For whole image first 5 PCs 94.15%
- $\hfill \square$  Spatially separated parts of state trajectory  $\rightarrow$  easier clustering

## State trajectory of the MG63 cell





MG63 - Clusters in state trajectory

- Manually and subjectively constructed trajectory
- X axis Red channel with  $\alpha$ =0.7
- Y axis Green channel with  $\alpha$ =1.3
- Z axis Blue channel with  $\alpha$ =4
- Number of clusters was only subjectively
- Manually extracted cell from image
- □ Time dependent changes of clusters
- □ Each cluster contains different images
- Need of objectively chosen alpha parameters (coordinates)

estimated – 8 clusters

□ Need of objective number of clusters

#### **Discussion and Conclusions**

□ Algorithms were tested on BZ reaction model under different conditions

The input for these algorithms was only image of BZ reaction without the background and Petri dish

□ Constructing and clustering of state trajectory was successfully done

□ Number of clusters for BZ reaction was objectively determinates by PCA

Application of these algorithms for cells and intracellular object needs some preprocessing
The preprocessing shall include mainly automatic identification of cell and automatic extraction of cell from image

Construction of state trajectory of the cell is possible

### Acknowledgement:

This work was supported and co-financed by the ERDF and made possible by the INTERREG IVC programme, project Innovation 4 Welfare, subproject PICKFIBER; by the South Bohemian Research Center of Aquaculture and Biodiverzity of Hydrocenoses (CZ.1.05/2.1.00/01.0024); by the Ministry of Education, Youth and Sports of the Czech Republic under the grant MSM 6007665808; and by the South Bohemia University grant GA JU 152/2010/Z.

