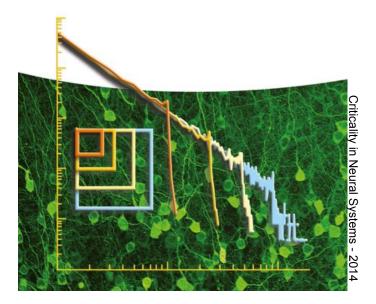
# Hipótese do cérebro crítico:

assinaturas de criticalidade no córtex cerebral



Renata B. Biazzi

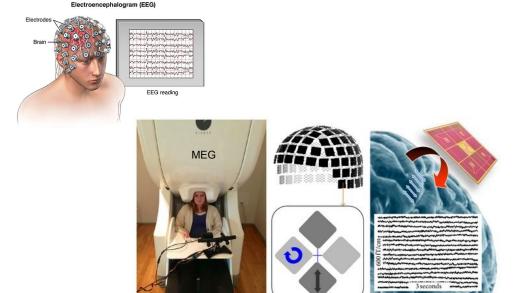
Tópicos de Mecânica Estatística - Transições de Fase IFUSP 2020 - Prof. Silvio Salinas

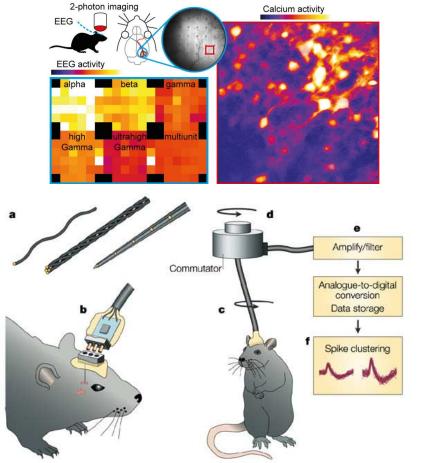
#### Organização do seminário

- Critical Brain Hypothesis
- Debate: controvérsia na área
- Respondendo a controvérsia: resultados do artigo "Criticality between Cortical States" PRL, 2019.
- Conclusões e perspectivas na área

#### Neurociência: contexto

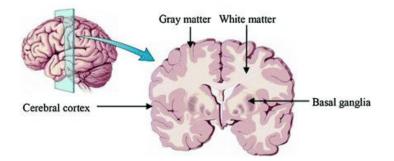
- Revolução dos equipamentos de medição
- "Neuronal Avalanches"
   National Institute of Mental Health, 2001





- Algumas áreas operam na transição de fase: "entre ordem e caos"
- Otimizações, regime saudável
- Área em debate

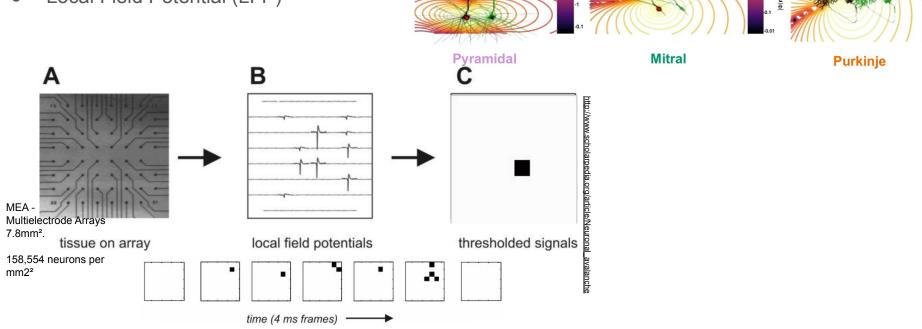




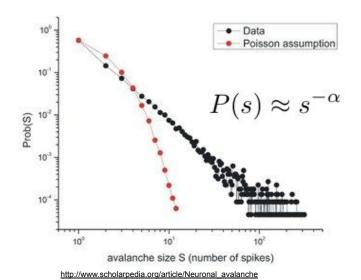


Ex: terremotos, incêndios florestais, panes em redes elétricas e redes neuronais

- Avalanches Neuronais
- Local Field Potential (LFP)



- Avalanches Neuronais
- Leis de Potência



Expoentes conforme classe de universalidade

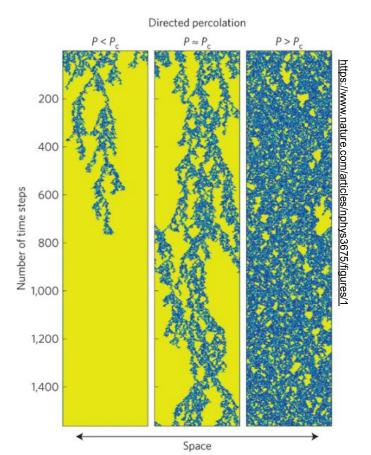
MF-Directed Percolation com d = 4

$$P(s) \approx s^{-\alpha}$$

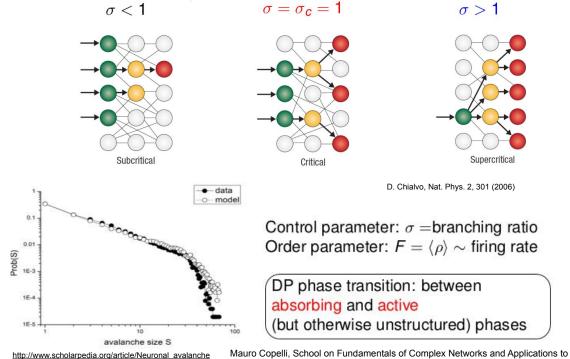
$$\alpha = 3/2$$

$$P(T) \sim T^{-\tau_T}$$

$$\tau_t = 2.0$$



Branching process (Galton-Watson model, 1874):

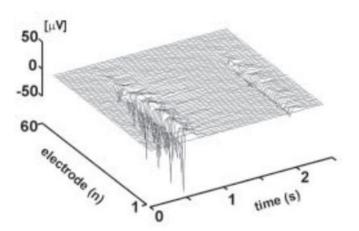


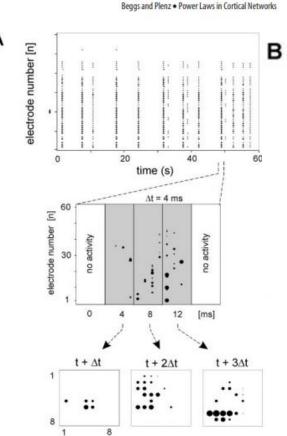
Mauro Copelli, School on Fundamentals of Complex Networks and Applications to Neuroscience, ICTP- SAIFR, 2015

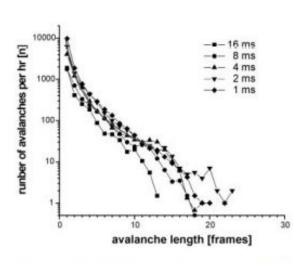
Beggs and Plenz, 2003

atividade sincronizada

culturas de células corticais







#### Sincronicidade dos disparos

#### Oscilações lentas do LFP com anestesia

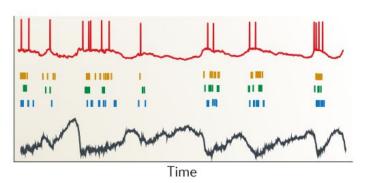
Power-law size distributions

Córtex de ratos, gatos e macacos anestesiados

## Oscilações rápidas do LFP em ratos se movendo

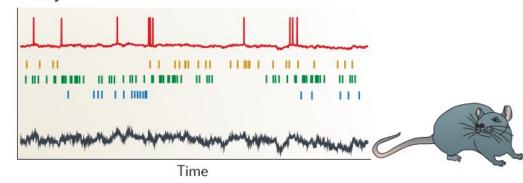
Correlações temporais de longo alcance (só em ratos sem anestesia)

#### a Sychronized state





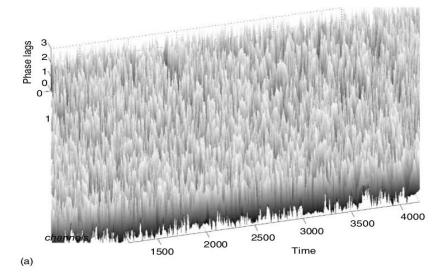
#### **b** Desychronized state

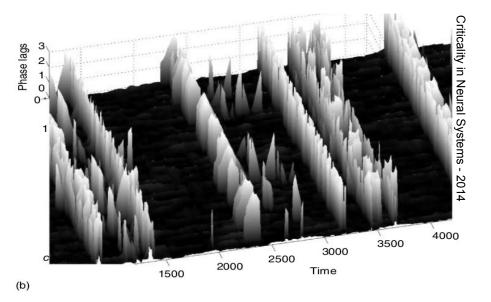


#### Controvérsia

Assinaturas de criticalidade dependem do nível de

sincronização?





Oscilações não são previstas na percolação direcionada:

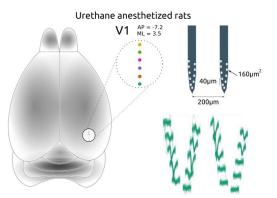
vai de estado absorvente para estado completamente ativado

#### Criticality between Cortical States

PHYSICAL REVIEW LETTERS 122, 208101 (2019)

**Criticality between Cortical States** 





Antonio J. Fontenele,<sup>1,\*</sup> Nivaldo A. P. de Vasconcelos, <sup>1,2,3,4,\*</sup> Thaís Feliciano, <sup>1</sup> Leandro A. A. Aguiar, <sup>1,5</sup> Carina Soares-Cunha, <sup>3,4</sup> Bárbara Coimbra, <sup>3,4</sup> Leonardo Dalla Porta, <sup>1,6</sup> Sidarta Ribeiro, <sup>7</sup> Ana João Rodrigues, <sup>3,4</sup> Nuno Sousa, <sup>3,4</sup> Pedro V. Carelli, <sup>1,†</sup> and Mauro Copelli <sup>1,‡</sup> 

<sup>1</sup> Physics Department, Federal University of Pernambuco (UFPE), Recife, PE 50670-901, Brazil 

<sup>2</sup> Department of Biomedical Engineering, Federal University of Pernambuco, Recife, PE 50670-901, Brazil 

<sup>3</sup> Life and Health Sciences Research Institute (ICVS), School of Medicine, University of Minho, Braga 4710-057, Portugal 

<sup>4</sup> ICVS/3Bs—PT Government Associate Laboratory, 4806-909, Braga/Guimarães, Portugal 

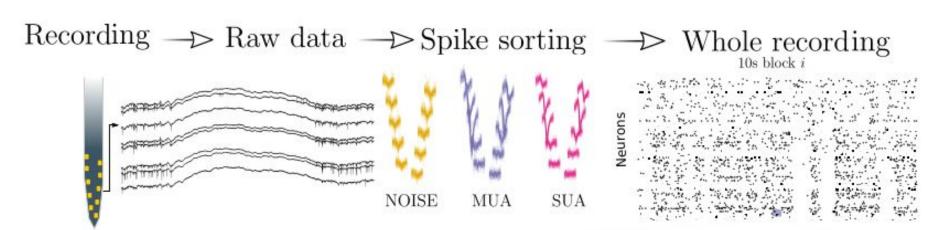
<sup>5</sup> Departamento de Morfologia e Fisiologia Animal, Universidade Federal Rural de Pernambuco (UFRPE),

Recife, PE 52171-900, Brazil

<sup>6</sup>Systems Neuroscience, Institut dInvestigacions Biomèdiques August Pi i Sunyer (IDIBAPS), 08036, Barcelona, Spain

<sup>7</sup>Brain Institute, Federal University of Rio Grande do Norte (UFRN), Natal, RN 59056-450, Brazil

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Featured in Physics

## Coeficiente de Variação (CV)



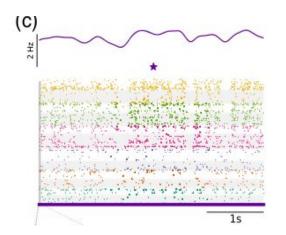
$$r(t) = \frac{1}{\Delta T} \int_{t}^{t+\Delta T} \rho(\tau) d\tau$$

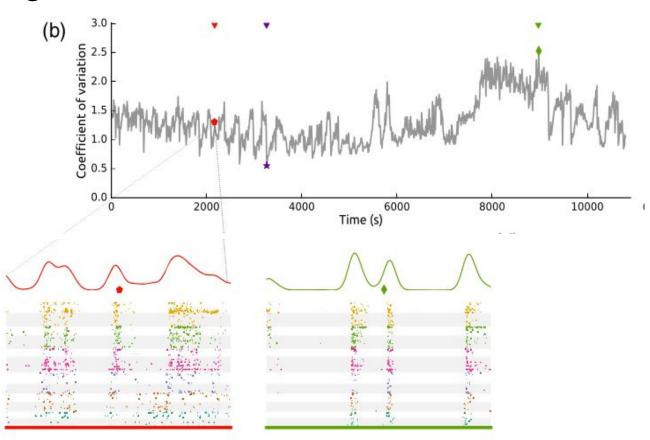
$$\Delta t_i = \langle ISI \rangle_i \sim 2 - 4 \text{ ms}$$
 spike count  $u_{ij}$ 

 $\Delta T = 50 \text{ ms}$  firing rate  $r_{ik}$ 

CV: proxy da sincronização

$$CV_i = \frac{\sigma_i}{\mu_i}$$





## Tamanho (S) e vida (T) das avalanches



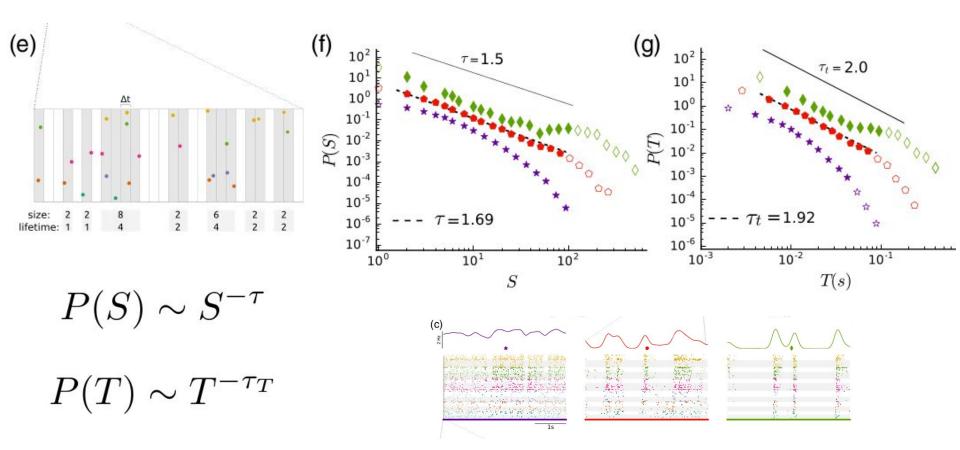
$$\Delta t_i = \langle ISI \rangle_i \sim 2 - 4 \text{ ms}$$
 spike count  $u_{ij}$ 

 $\Delta T = 50 \text{ ms}$  firing rate  $r_{ik}$ 

```
\blacktriangleright u_{ij} = 0 in between avalanches

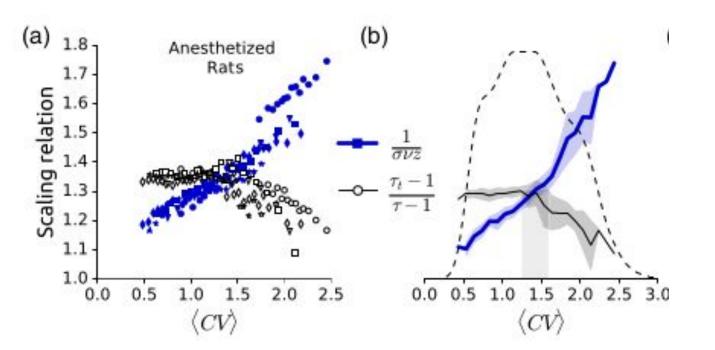
Count
\{S_{i1}, ..., S_{in_i}\} \equiv S_i
\{T_{i1}, ..., T_{in_i}\} \equiv T_i

tempo de vida
```



Relação que deve valer somente na região crítica:

$$\frac{\tau_t - 1}{\tau - 1} = \frac{1}{\sigma \nu z}$$



$$\langle S \rangle (T) \sim T^{\frac{1}{\sigma \nu z}}$$

**DFA (detrended fluctuation analysis)** -> mede auto-afinidade das séries temporais em diferentes escalas de tempo

Correlações temporais de longo alcance (  $\alpha = 1$ )

Memória

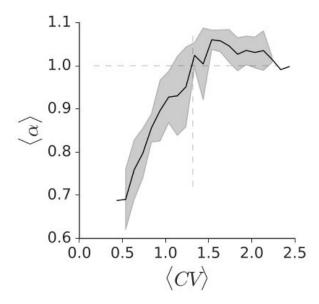
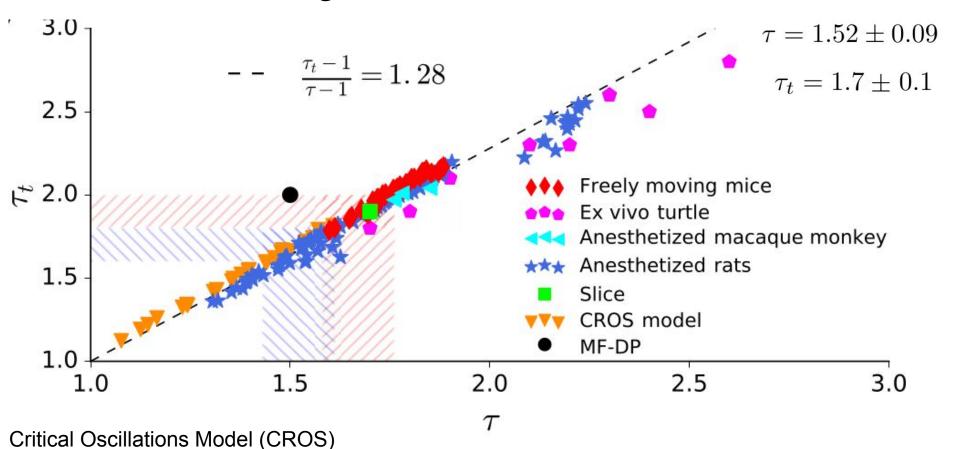
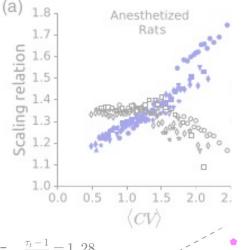


FIG. S13. Long-range time correlations across different levels of spiking variability. DFA exponent  $\alpha$  versus  $\langle CV \rangle$  for Group data B.



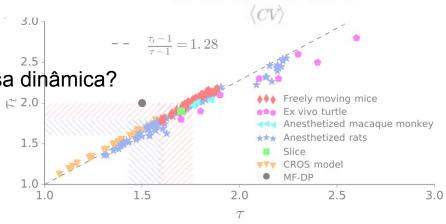
#### Conclusões

- Assinaturas de criticalidade consistentes em animais anestesiados e se movendo livremente
- Ponto crítico está em uma valor intermediário de <CV>
- Incompatibilidade com MF-DP (paradigma da área)
- Relação linear entre  $\tau$  e  $\tau_t$  reprodutível pelo CROS model



#### Questões em aberto

- Que modelo mínimo explica esses resultados?
- Quais são os mecanismos responsáveis por essa dinâmica?
- Ponto crítico como bioindicador?



#### Referências

- Criticality between Cortical States, PHYSICAL REVIEW LETTERS 122, 208101 (2019)
- Criticality in Neural Systems-Wiley-VCH (2014), Dietmar Plenz, Ernst Niebur, Heinz Georg Schuster (Annual Reviews of Nonlinear Dynamics and Complexity (VCH)
- Neuronal avalanche dynamics indicates different universality classes in neuronal cultures, Nature, (2018) 8:3417
- Neuronal avalanches and time-frequency representations in stimulus-evoked activity, Nature, (2019) 9:13319
- Self-organized criticality as a fundamental property of neural systems, Hesse and Gross, Frontiers in Systems Neuroscience, September 2014
- Criticality in the brain: A synthesis of neurobiology, models and cognition, Cocchi et al. 1
- Cortical state and attention, Kenneth D. Harris and Alexander Thiele, Nature 2011
- Cortical State Fluctuations across Layers of V1 during Visual Spatial Perception, Speed et al., 2019, Cell Reports 26, 2868–2874
- Inference, Models and Simulation for Complex Systems, Lectures 2, Prof. Aaron Clauset
- Long-Range Temporal Correlations and Scaling Behavior in Human Brain Oscillations, R. J. Ilmoniemi et.al, The Journal of Neuroscience, February 15, 2001
- Dethroning the Fano Factor: A Flexible, Model-Based Approach to Partitioning Neural Variability, Neural Computation 30, 1012–1045 (2018)
- Adaptation to sensory input tunes visual cortex to criticality, NATURE PHYSICS | VOL 11 | AUGUST 2015
- Universal Critical Dynamics in High Resolution Neuronal Avalanche Data, PRL 108, 208102 (2012)
- Analysis of Power Laws, Shape Collapses, and Neural Complexity: New Techniques and MATLAB Support via the NCC Toolbox, Frontiers in Physiology
- Modeling neuronal avalanches and long-range temporal correlations at the emergence of collective oscillations: Continuously varying exponents mimic M/EEG results, Leonardo Dalla Porta, Mauro Copelli, PLOS Computational Biology
- Cortical state and attention, Kenneth D. Harris and Alexander Thiele, NATURE REVIEWS | NEUROSCIENCE
- The Asynchronous State in Cortical Circuits, Alfonso Renart et al. Science 327, 587 (2010);
- Schölvinck et al., Cortical State and Response Variability, J. Neurosci., January 7, 2015
- Coupled variability in primary sensory areas and the hippocampus during spontaneous activity, Nature Reports
- Phase transitions and self-organized criticality in networks of stochastic spiking neurons, L. Brochini et.al
- Optimization by Self-Organized Criticality, Heiko Hoffmann & David W. Payton, Nature Scientific Reports
- Cell and neuron densities in the primary motor cortex of primates, Nicole A. Young, Christine E. Collins and Jon H. Kaas, Front. Neural Circuits, 27
  February 2013
- Optimal dynamical range of excitable networks at criticality, Osame Kinouchi & Mauro Copelli, Nature 2006