

Neural activity sequence in prefrontal cortex for sensory-guided decision making

Tomoki Fukai

RIKEN Brain Science Institute

I got a PhD in theoretical particle physics.

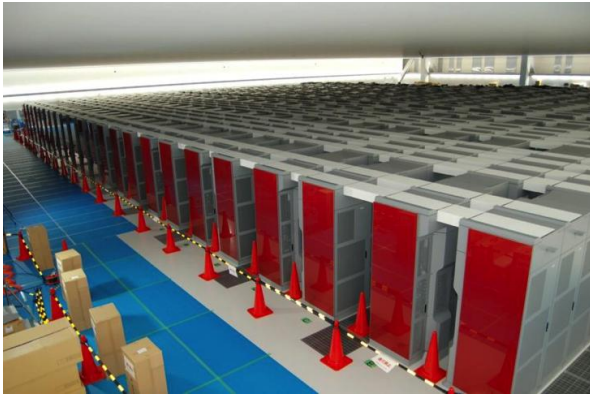
Then, I shifted to statistical physics of Hopfield network model.

Then, I further shifted to more biological network models, and started to collaborate with experimentalists.



Brain computation is probabilistic

Computer versus Brain



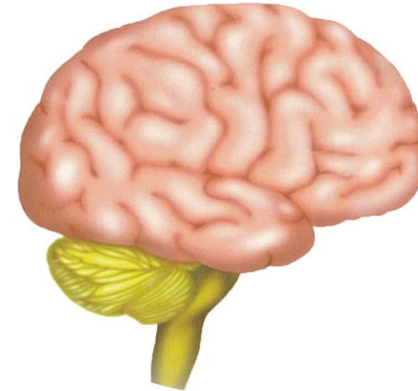
Binary representation

Serial sequential

Deterministic

Execute prescribed programs

High energy consumption



Spike sequences

Parallel Distributed

Probabilistic inference

Reward-based learning

Ecological

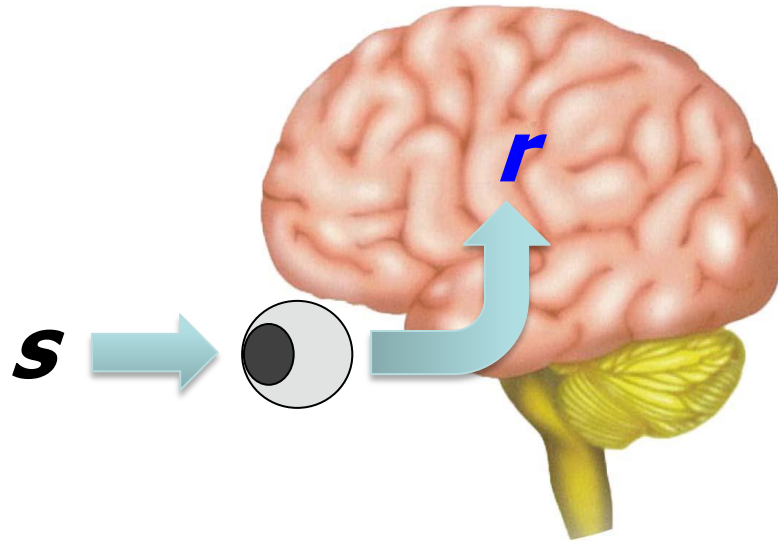
Noise improves visual perception

(Stochastic resonance)



E. Simonotto et al., Phys Rev Lett (1997)

Stochastic sampling by the brain = Bayesian inference



Physical events in the brain :
stimulus $s \rightarrow$ response r

Brain computes :
response $r \rightarrow$ stimulus s

$$P(s | r) = \frac{P(r | s)P(s)}{P(r)}$$

$P(s)$ Prior = Knowledge on possible sensory events

$P(s | r)$ Posterior = Knowledge on sensory events when the response r is known

$$P(r) = P(r | s_1)P(s_1) + P(r | s_2)P(s_2) + \dots = \dot{a}_s P(r | s)P(s)$$

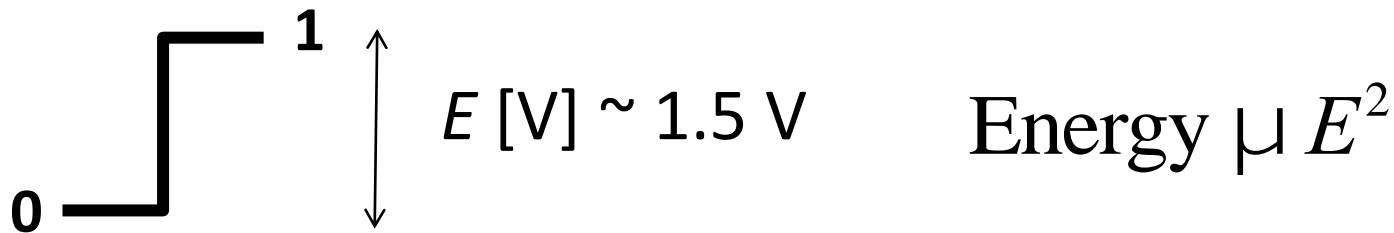
Prior is the internal model of the external world

Spontaneous cortical activity gives a prior (Berkes et al., 2011)

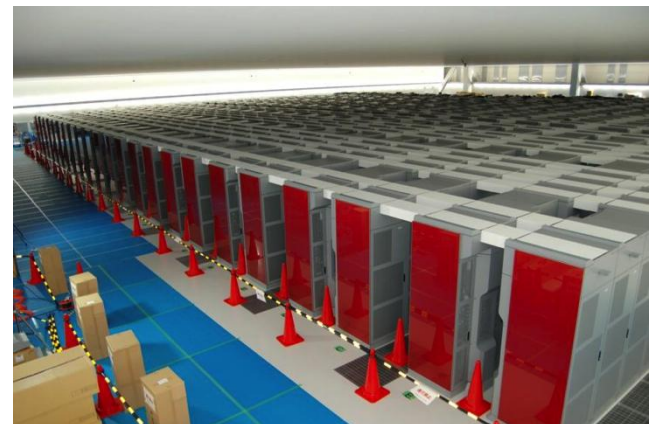
Why is noise interesting?

How does the brain keep energy consumption so low?

Energy consumption vs noise tolerance in electric computers



12.7 MW = 30, 000 families!



1. Neural population dynamics in probabilistic decision-making
2. Mechanism of innate sequence generation in the neocortex and hippocampus

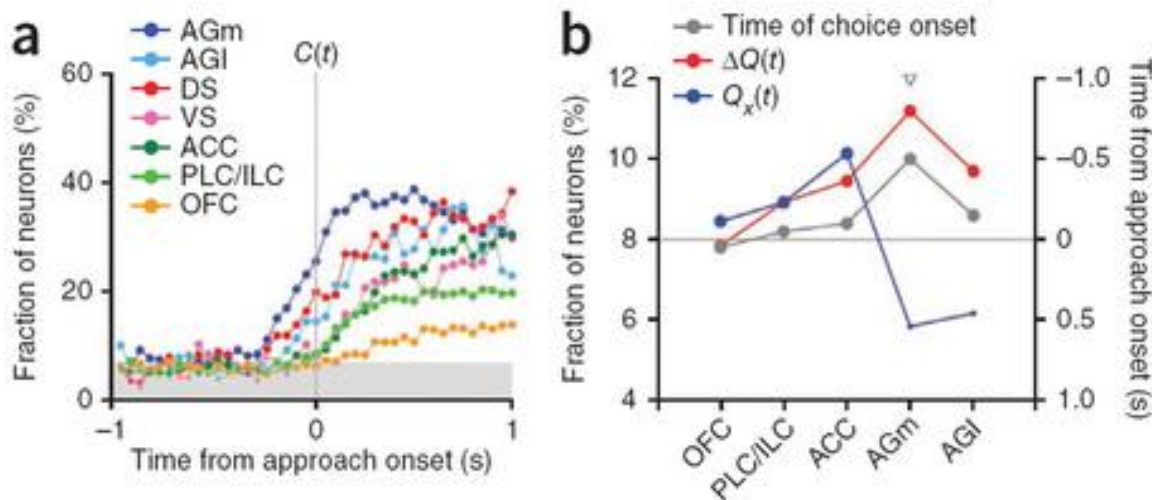
Sensory-guided choices by medial agranular cortex (AGm)

AGm receives afferents from sensory (visual, auditory, somatosensory) cortices and sends efferents to motor areas (M1, spinal cord, and brainstem).

AGm is reciprocally connected with mediodorsal (MD) motor thalamic nucleus (Reep *et al.*, 1984,1987,1990; Conde *et al.*, 1995).

Unilateral inactivation impairs sensory-based movement selection towards contralateral orientation (Crowne and Pathria, 1982; Erlich *et al.*, 2011).

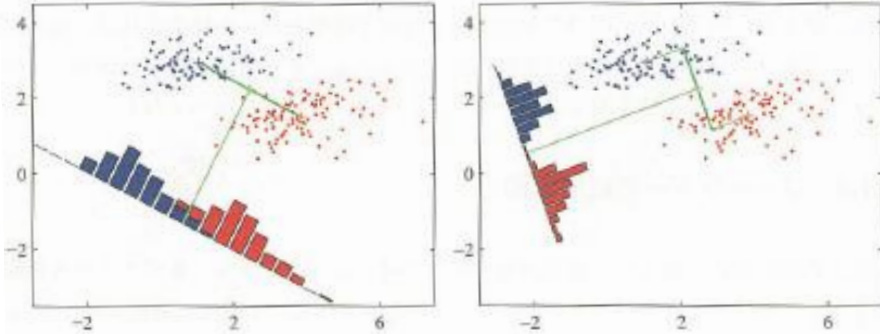
AGm is activated earlier than any other regions of the rat brain (Sul *et al.*, 2011).



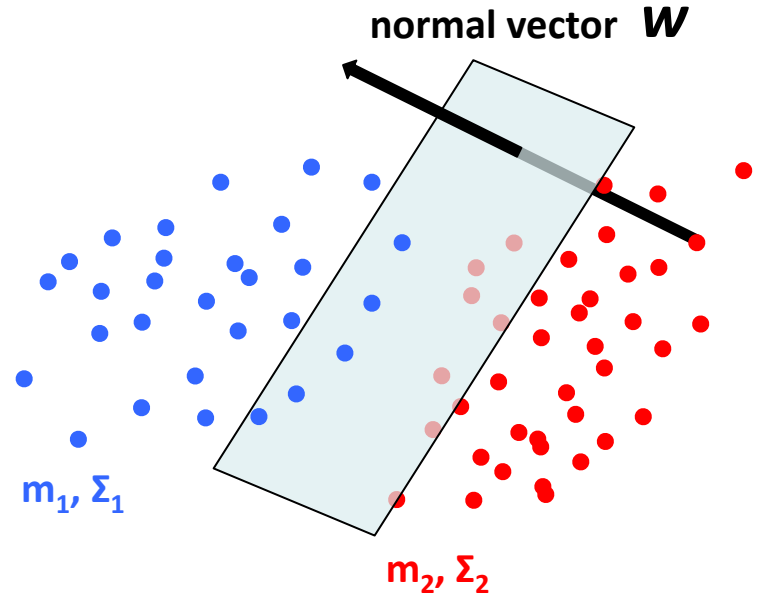
Fisher's linear discriminant

“Bad”

“Good”



(Bishop, “Pattern Recognition and Machine Learning”)



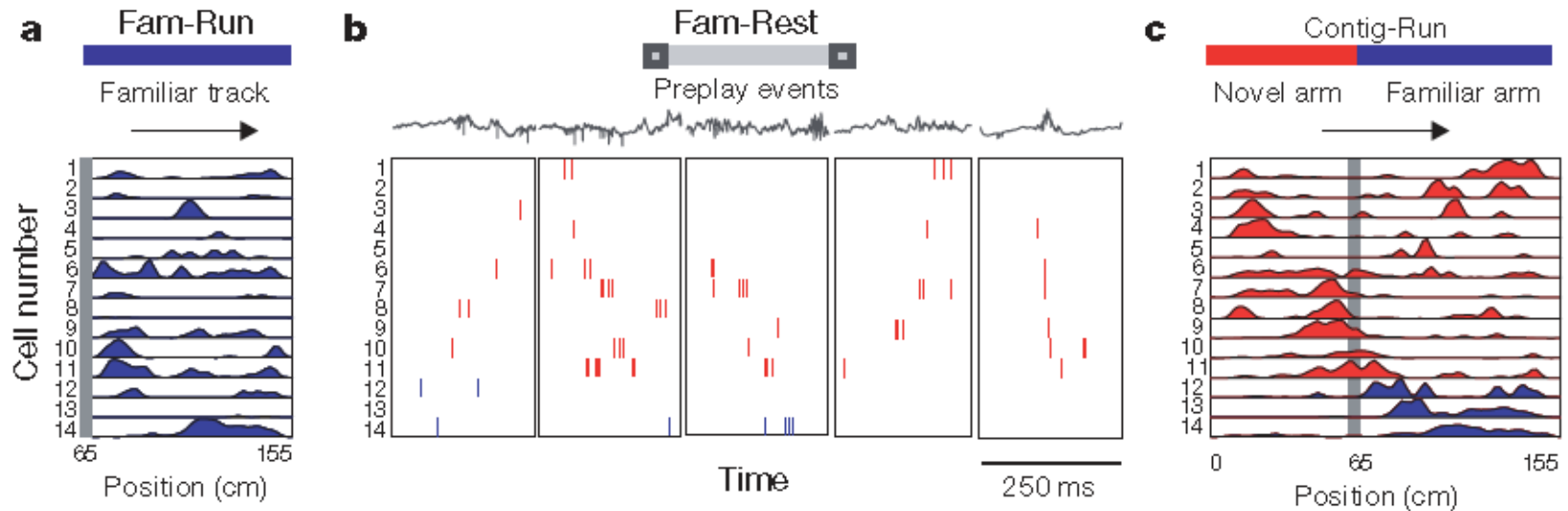
Degree of discrimination

$$S = \frac{(\mathbf{w}^T \mathbf{m}_1 - \mathbf{w}^T \mathbf{m}_2)^2}{\mathbf{w}^T S_t \mathbf{w}} = \frac{\text{between-class variance}}{\text{within-class variance}} = d'^2$$

discriminating vector $\mathbf{w} \propto S_{tot}^{-1} (\mathbf{m}_2 - \mathbf{m}_1)$

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Preplay of future place cell sequences



Hippocampal CA1

(Dragoi and Tonegawa, Nature 2011)

Probably the preplay reflects sequences in CA3

Spontaneous neuronal activity preceding a novel spatial experience may prime and contribute to the formation of new spatial representations via a neuronal ensemble selection process

(Dragoi and Tonegawa, PNAS 2013)

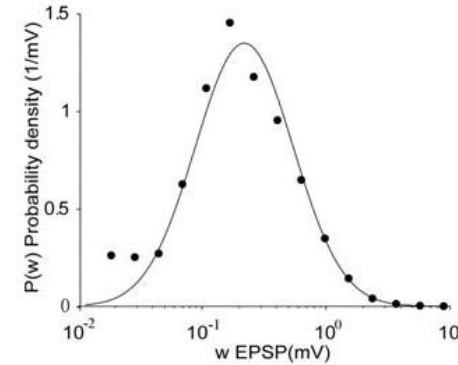
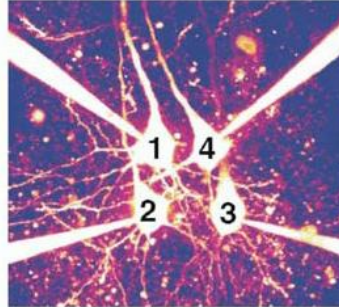
Heavy-tailed EPSP distributions of cortical synapses

Strong-sparse synapses vs. weak-dense synapses

Brain's machinery to generate noise?

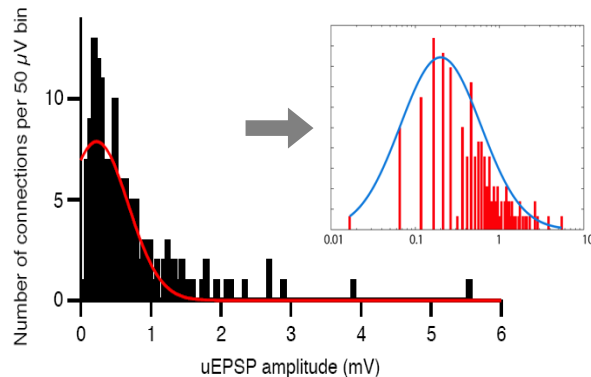
rat visual cortex

Song et al., PLoS Biol (2005)



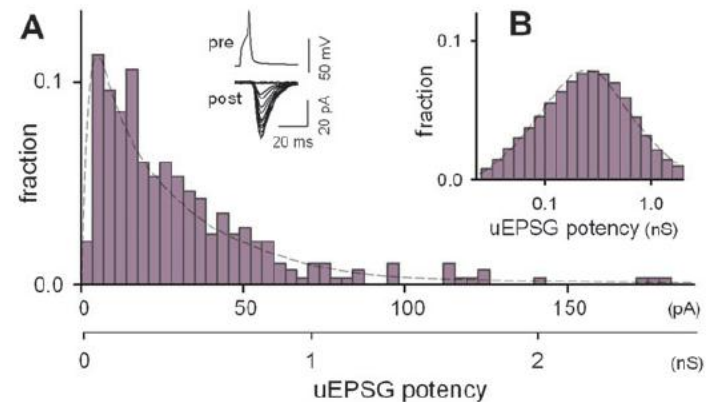
mouse somatosensory cortex

Lefort et al. Neuron (2009)



rat hippocampus

Ikegaya et al., Cereb Cortex (2013)

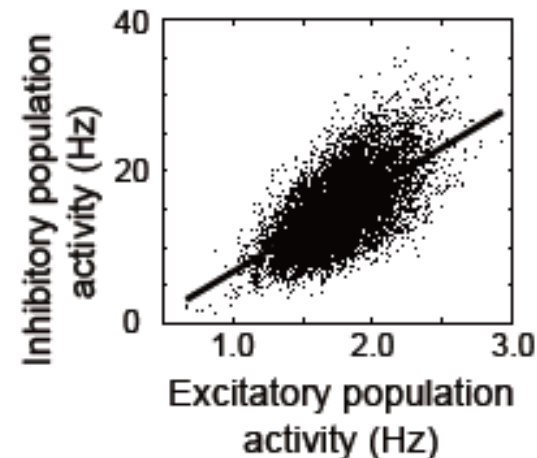
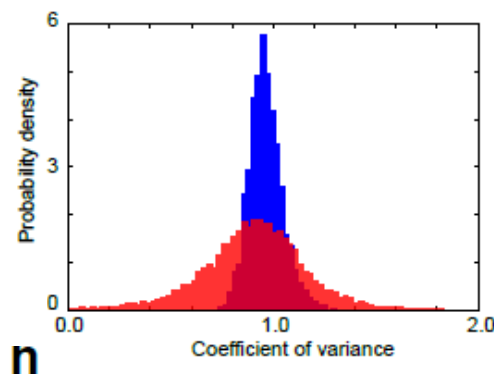
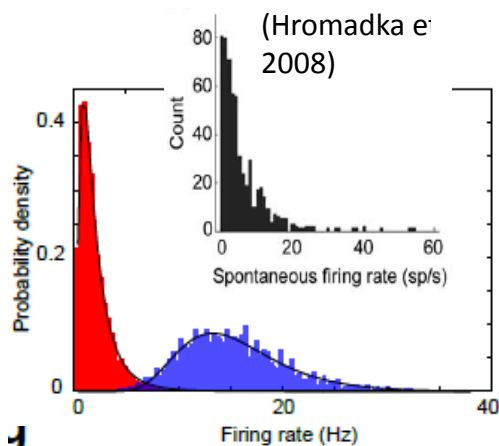
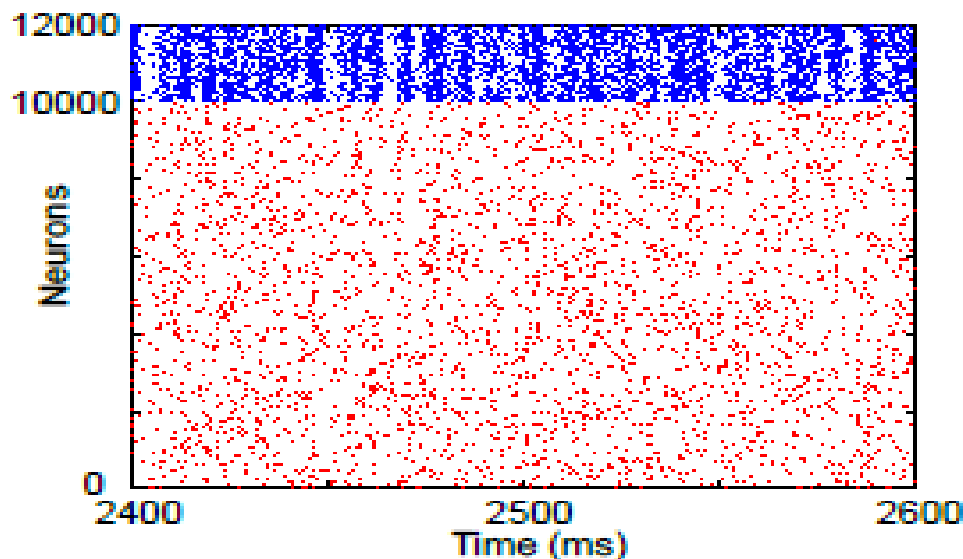
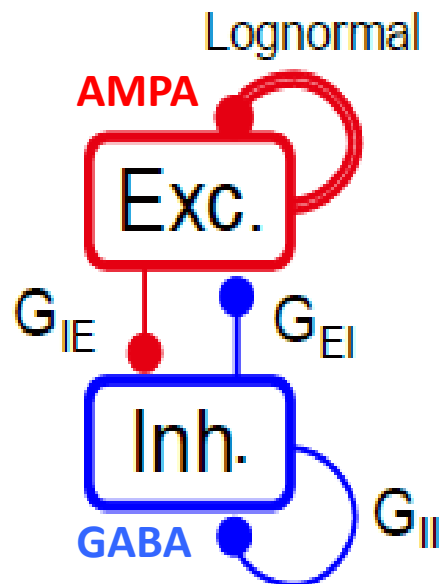


LgN wgt distribution generates spontaneous activity in recurrent networks

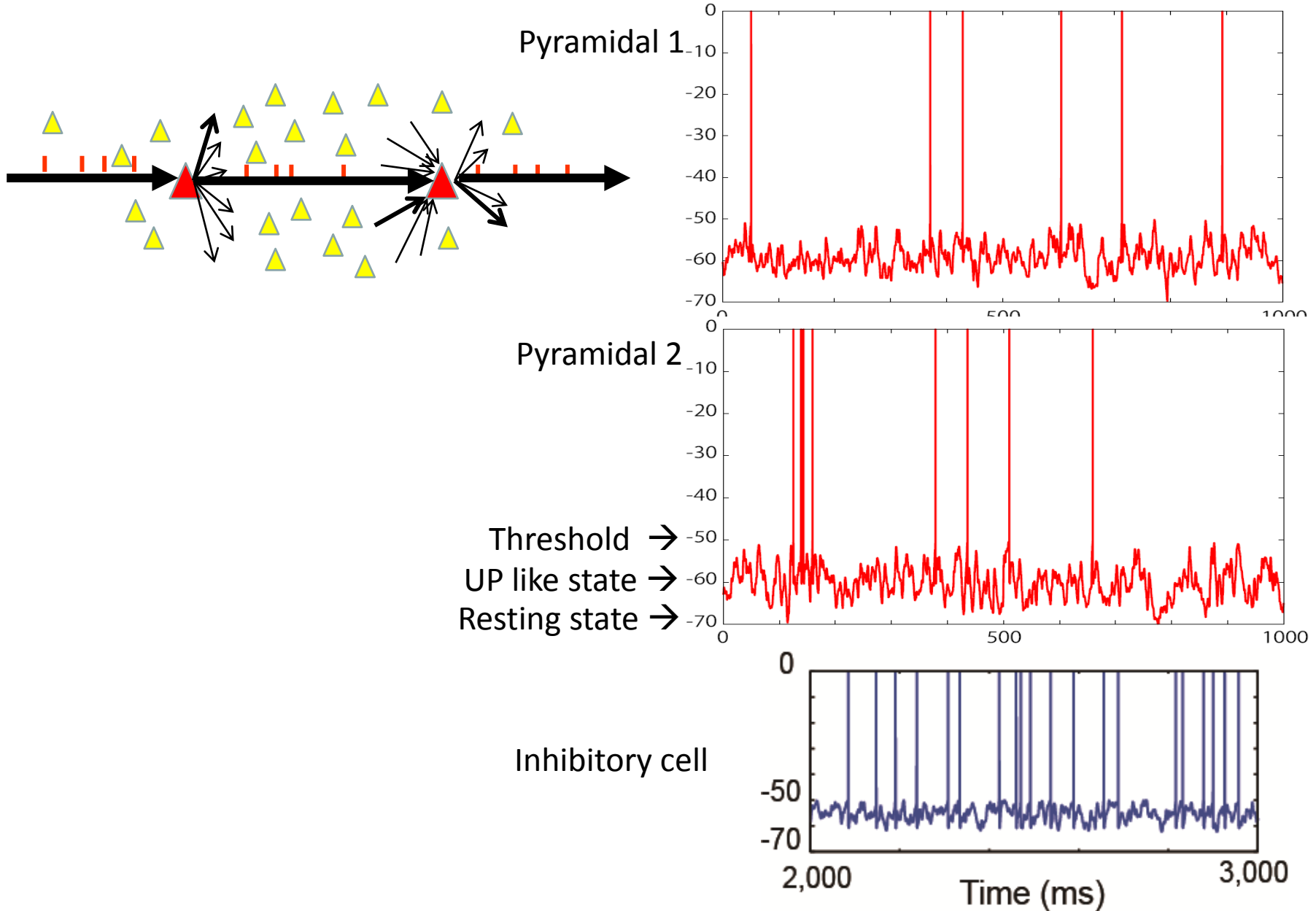


Jun-nosuke Teramae
→ Osaka University

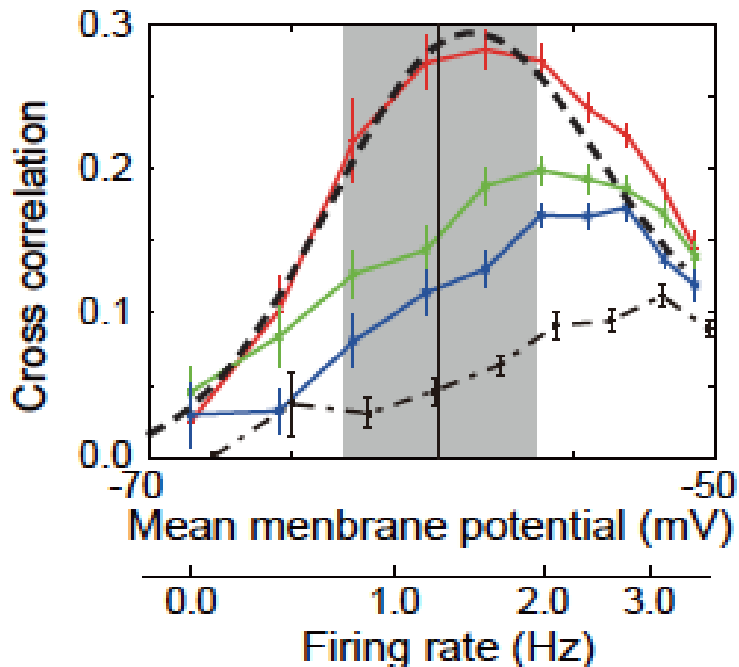
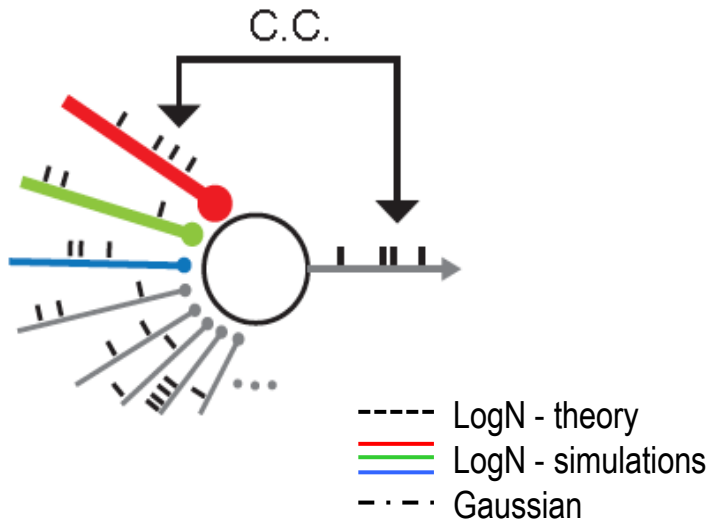
Teramae, Tsubo and Fukai (Sci Rep, 2012)



Membrane potential fluctuates in the optimal range

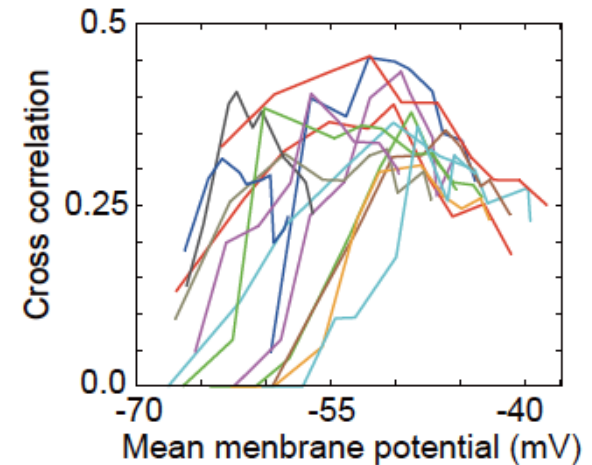
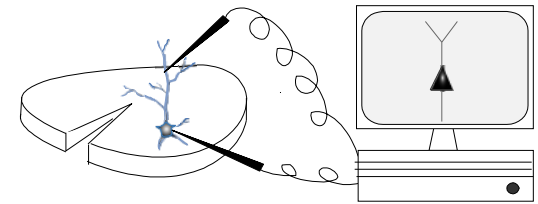


Lognormal (long-tailed) EPSP distributions generate optimal noise



Dynamic clamp

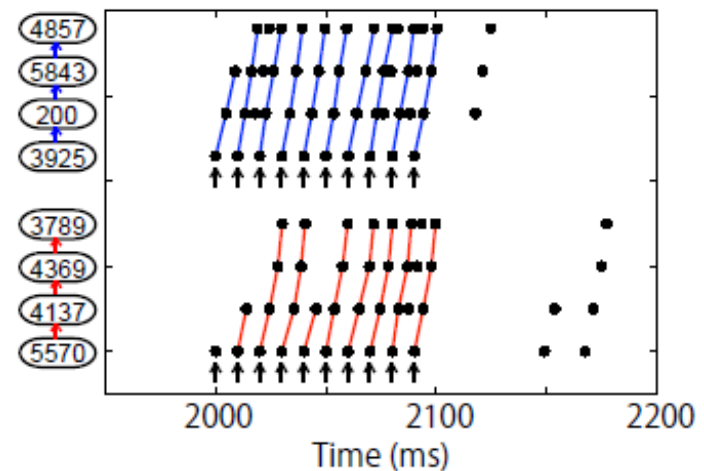
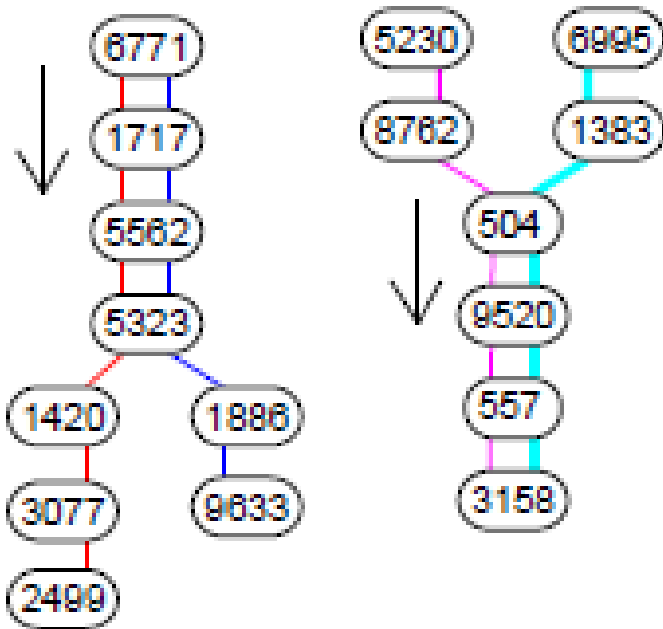
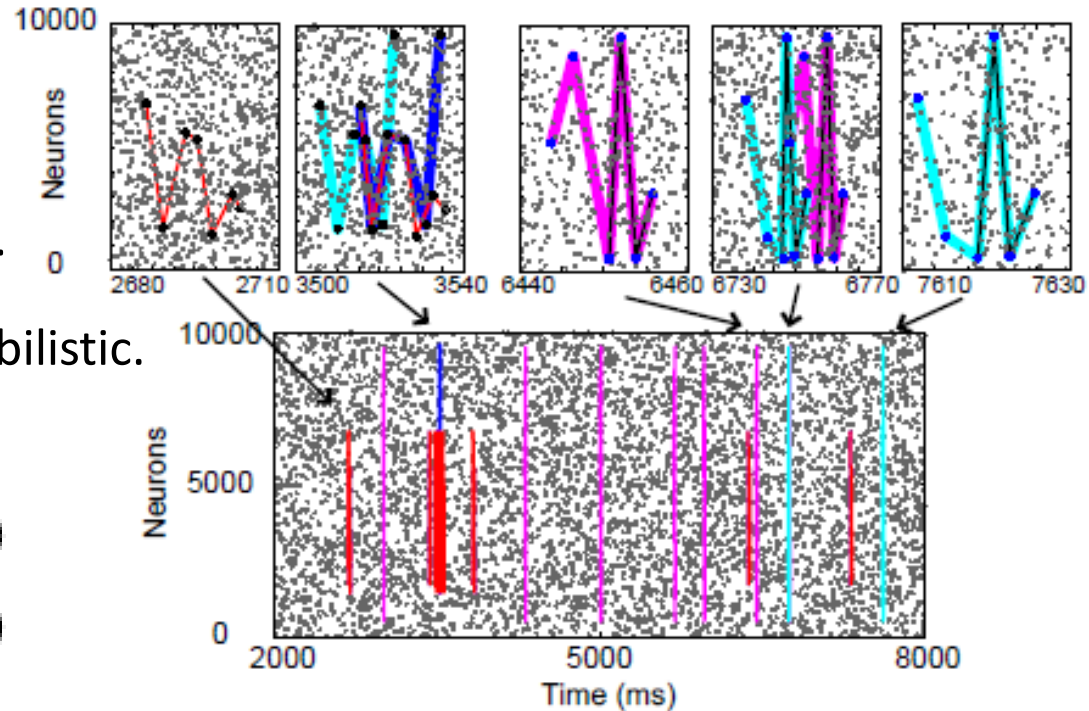
$$I_{\text{syn}}(t) = -\sum_j \dot{a} g_{E,j}(t)(V - E_E) - \sum_j \dot{a} g_{I,j}(t)(V - E_I)$$



Teramae, Tsubo and Fukai (Sci Rep, 2012)

The noisy state consists of many spike sequences

- Sequences can be stretched or compressed.
- Sequences can branch or merge.
- Sequences propagation is probabilistic.



Summary

- Lognormal (long-tailed) EPSP distributions found in the neocortex and hippocampus embed sequences into asynchronous irregular states of cortical circuits.
- Such a distribution generates internal noise for enabling stochastic resonance.