

# Activity Patterns in Purely Excitatory Networks

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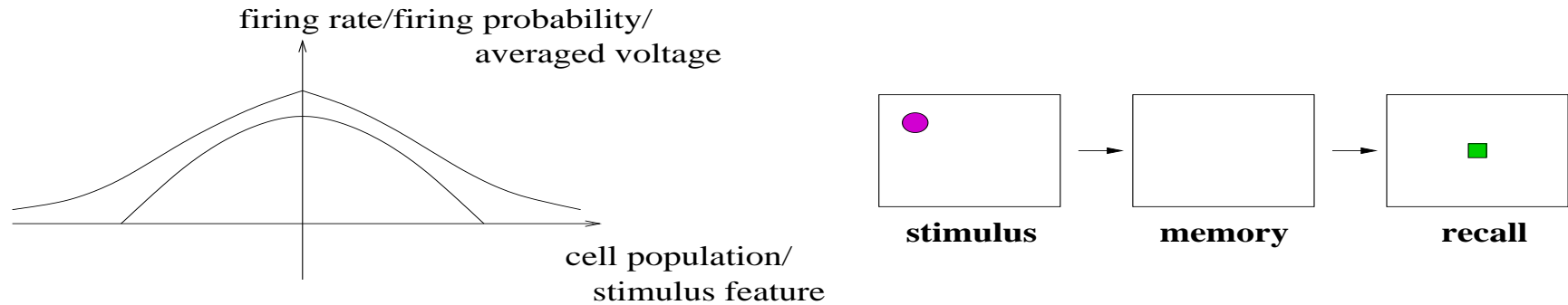
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## MAIN POINTS:

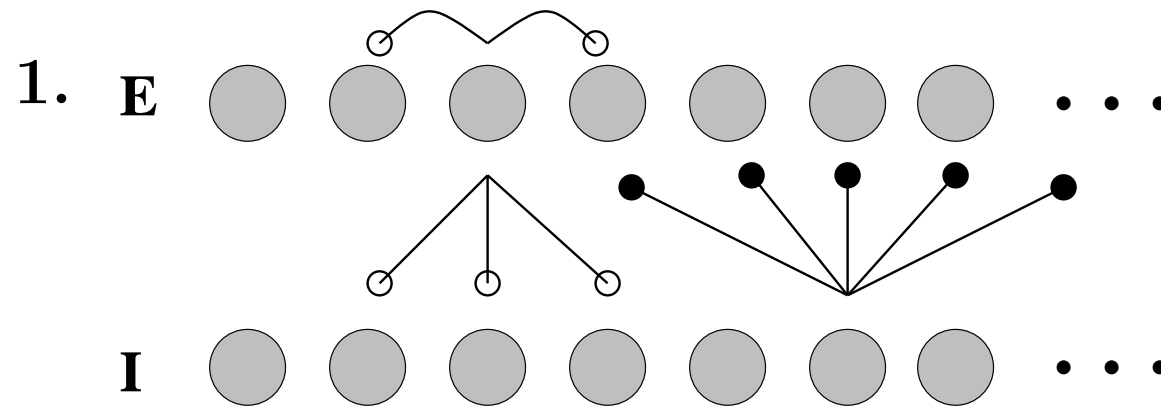
- spatially localized, temporally sustained activity (bumps) can occur in purely excitatory networks
- the **go curve** provides a useful construct for understanding the underlying mechanism and properties

# Bumps: what are they and why do we care?

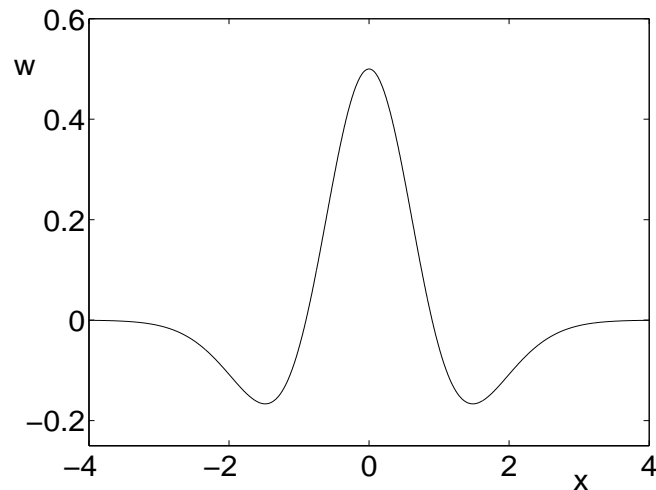


- spatially localized, temporally sustained activity
- which cells are active depends on some external feature
- activity persists without persistent stimulus
- seen in visual system, head direction system, and pre-frontal cortex (working memory):  
stimulus shown, subject must later recall position;  
localized group of cells fire until recall

# Recipes for bumps



e.g. Wilson/Cowan/Amari:  $u_t(x, t) = h - \sigma u(x, t) + \int_{-\infty}^{\infty} w(x - y) f(u(y, t)) dy$

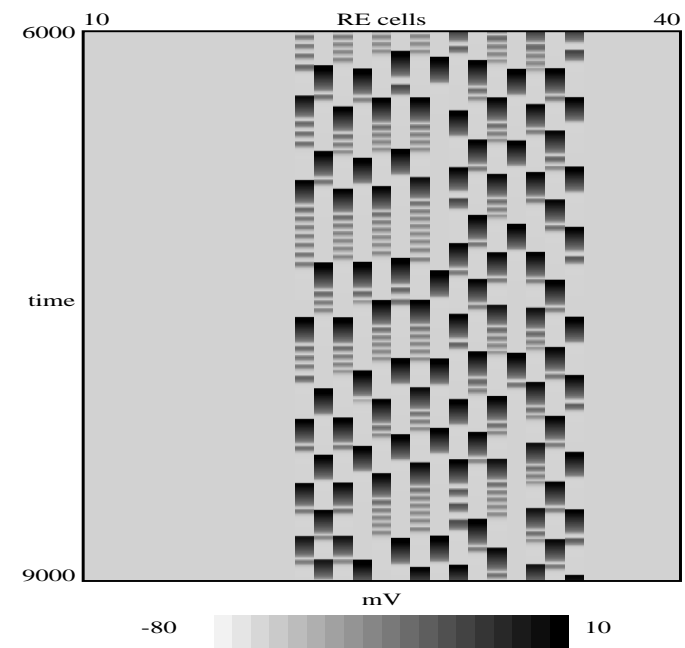
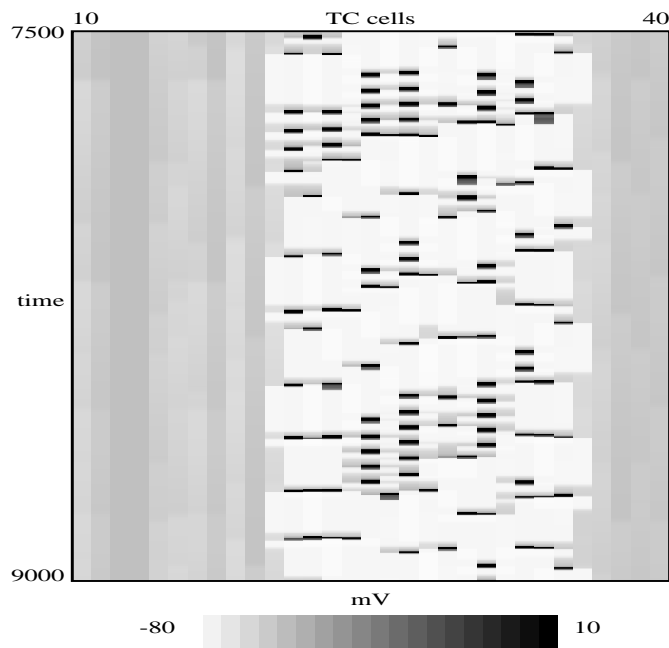
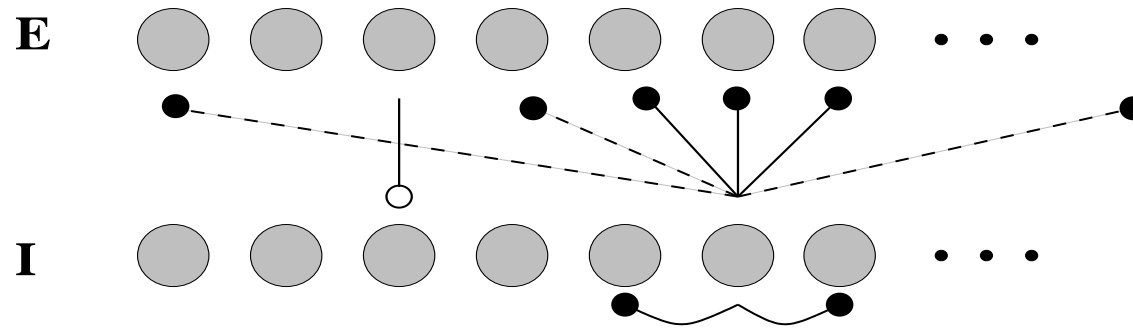


$$\begin{cases} w(x) > 0 \text{ on } (-\bar{x}, \bar{x}) \\ w(-\bar{x}) = w(\bar{x}) = 0 \\ w(x) < 0 \text{ on } (-\infty, -\bar{x}) \cup (\bar{x}, \infty) \end{cases}$$

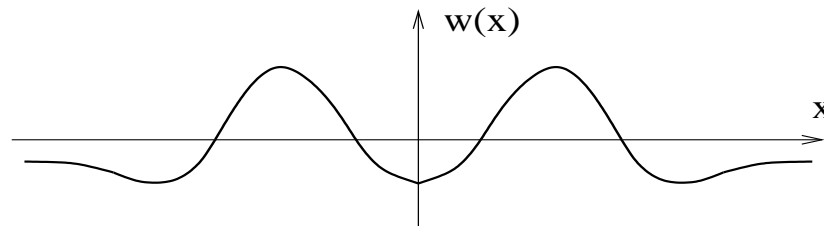
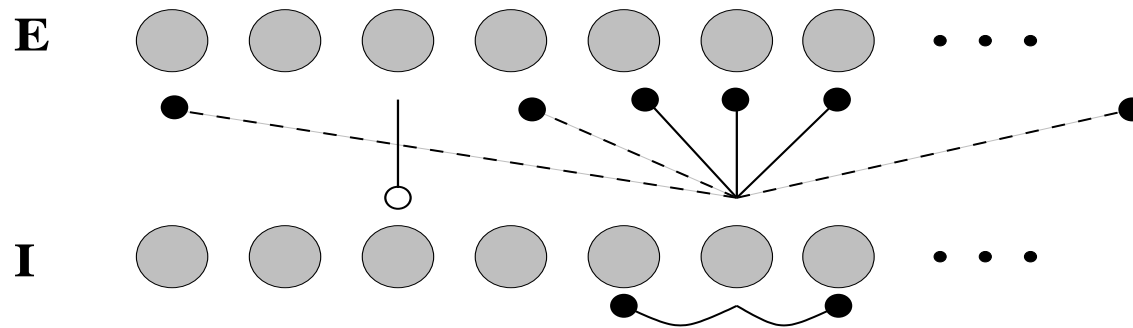
# Bumps in neuroscience models with Mexican hat

- Guo and Chow, 2003
- Coombes, Lord, and Owen, 2003
- Renart, Song, and Wang, 2003
- Laing and Troy, 2002 & 2003
- Laing, Troy, Gutkin, and Ermentrout, 2002
- Gutkin, Laing, Colby, Chow, and Ermentrout, 2001
- Laing and Chow, 2001
- Pinto and Ermentrout, 2001
- Werner and Richter, 2001
- Compte, Brunel, Goldman-Rakic, and Wang, 2000
- Taylor, 1999
- Camperi and Wang, 1998
- Hansel and Sompolinsky, 1998
- Amit and Brunel, 1997
- Kishimoto and Amari, 1979
- Amari, 1977
- Wilson and Cowan, 1972 & 1973

## 2. Rubin, Terman, and Chow, JCNS, 2001: no E-E; PIR



### 3. Rubin and Troy, SIAP, to appear:

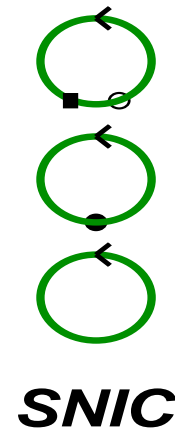
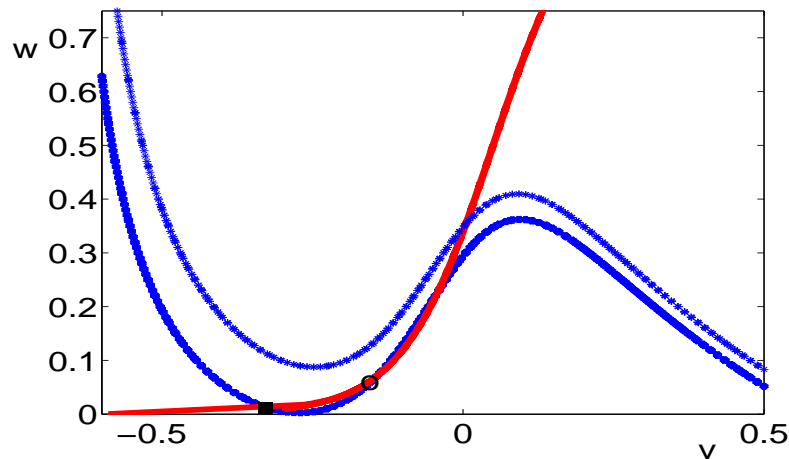


off-center coupling

#### 4. One-layer network with purely excitatory coupling [Drover/Ermentrout, SIAP, 2003; Rubin/Bose, 2004]:

##### Equations

$$\begin{cases} v_i' = f(v_i, w_i) - \bar{g}_{syn}[v_i - E_{syn}] [c_0 s_i + \sum_{j=1}^3 c_j [s_{i-j} + s_{i+j}]] \\ w_i' = [w_\infty(v_i) - w_i] / \tau_w(v_i) \\ s_i' = \alpha [1 - s_i] H(v_i - v_\theta) - \beta s_i \text{ (on a ring)} \end{cases}$$



(movie)



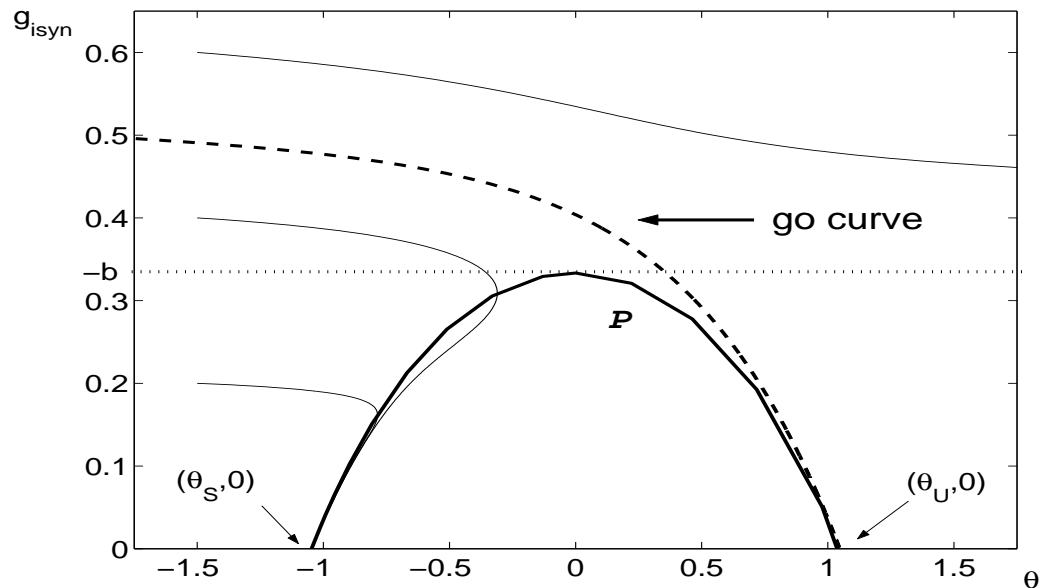
## Geometry - $\theta$ model:

$$\begin{cases} \theta'_i = 1 - \cos \theta_i + (1 + \cos \theta_i)(b + g_{i_{syn}}) \\ g_{i_{syn}} = \bar{g}_{syn} \left[ c_0 s_i + \sum_{j=1}^3 c_j (s_{i-j} + s_{i+j}) \right] \\ s'_j = \alpha [1 - s_j] e^{-\gamma(1 + \cos \theta_j)} - \beta s_j, \quad j = i - 3, \dots, i + 3 \end{cases}$$

with  $\alpha, \gamma$  large

synaptic decay  
dynamics:

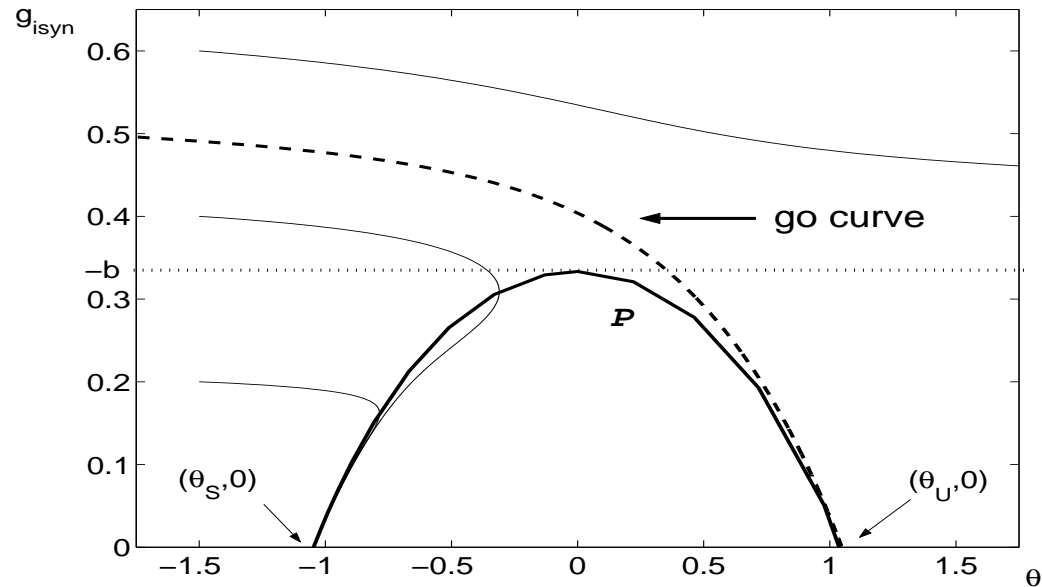
$$\begin{cases} \theta' = f(\theta, g_{i_{syn}}), \\ g'_{i_{syn}} = -\beta g_{i_{syn}} \end{cases}$$



## Geometry - $\theta$ model - (2):

synaptic decay  
dynamics:

$$\begin{cases} \theta' &= f(\theta, g_{i_{syn}}), \\ g'_{i_{syn}} &= -\beta g_{i_{syn}} \end{cases}$$



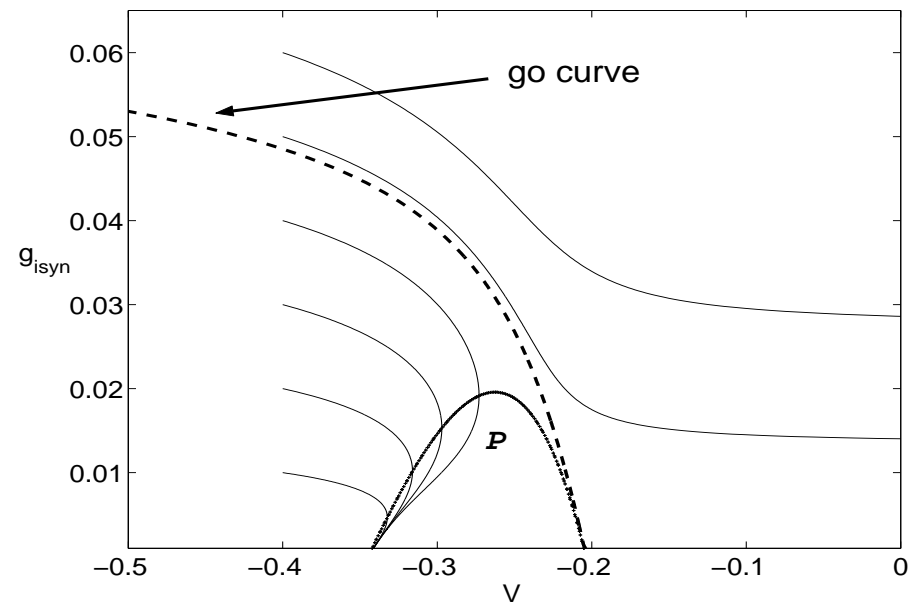
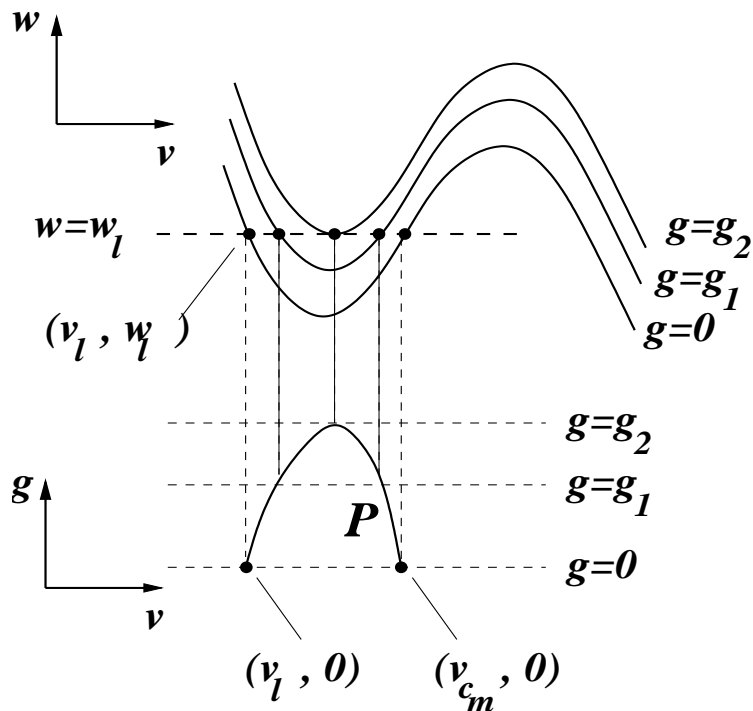
main ingredients:

- threshold of **synaptic decay dynamics** determines result of stimulation
- delay to firing depends on proximity to threshold
- variable delays desynchronize and stop spread

## Geometry - Morris-Lecar with $w' = 0$ :

$$\begin{cases} v' = f(v, w) - g_{i_{syn}}(v - E_{syn}) \\ w' = 0 \\ s'_i = \alpha[1 - s_i]H(v_i - v_\theta) - \beta s_i \end{cases}$$

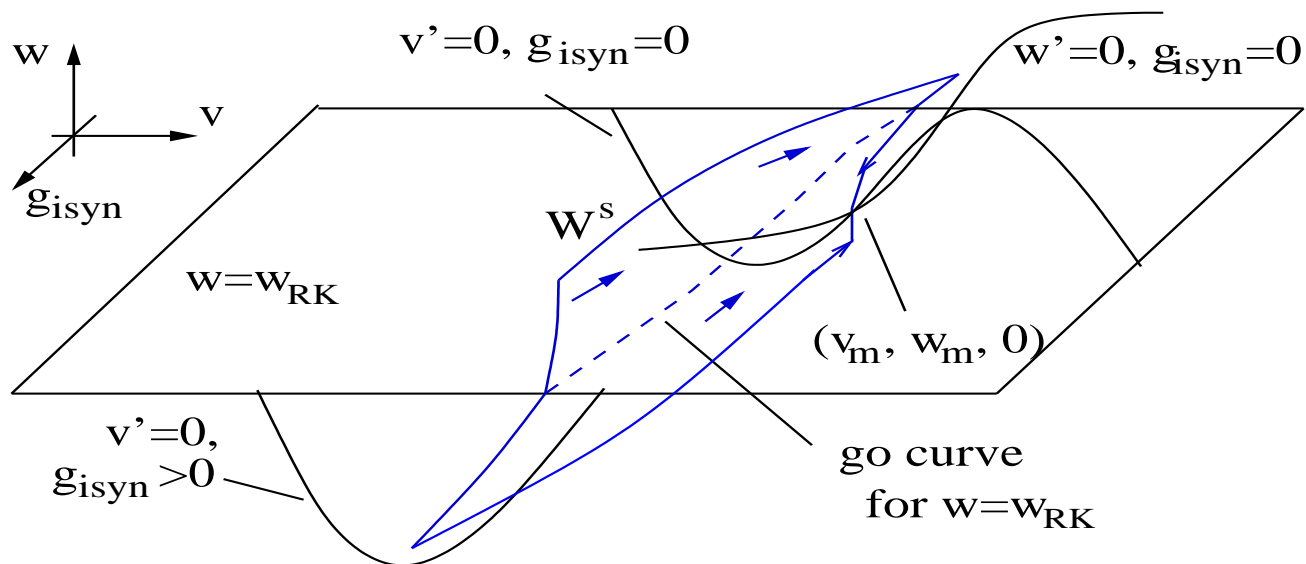
decay dynamics: replace  $s_i$ -equations with  $g'_{i_{syn}} = -\beta g_{i_{syn}}$



## Geometry - Morris-Lecar full system:

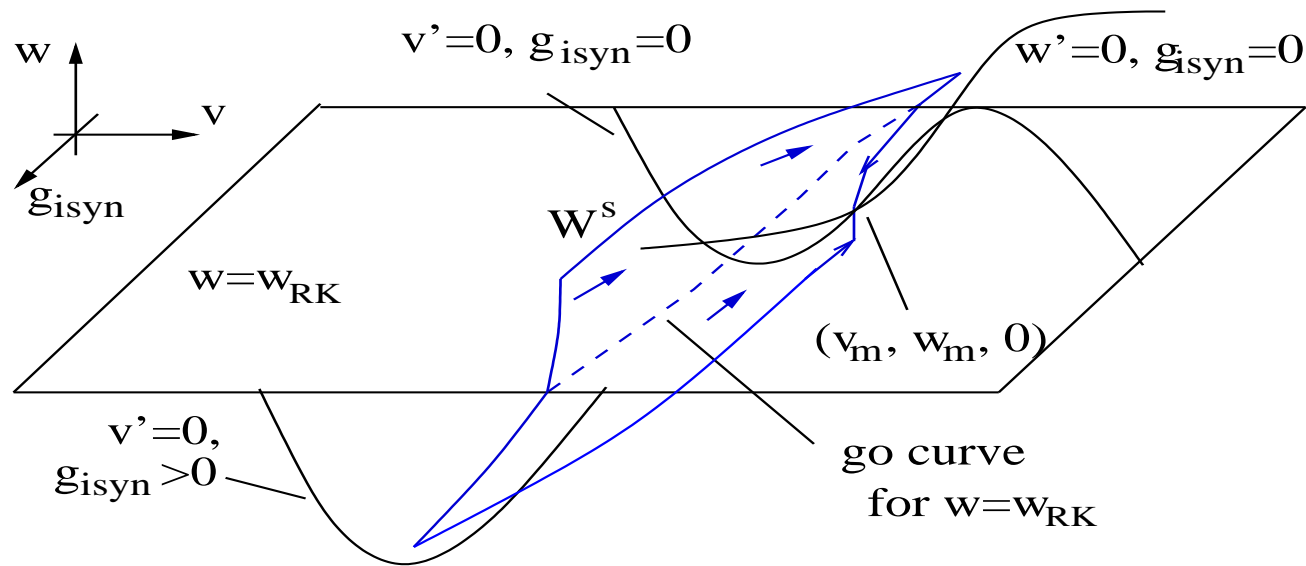
$$\begin{cases} v' = f(v, w) - g_{i_{syn}}(v - E_{syn}) \\ w' = g(v, w) \\ s_i' = \alpha[1 - s_i]H(v_i - v_\theta) - \beta s_i \end{cases}$$

decay again: replace  $s_i$ -equations with  $g_{i_{syn}}' = -\beta g_{i_{syn}}$



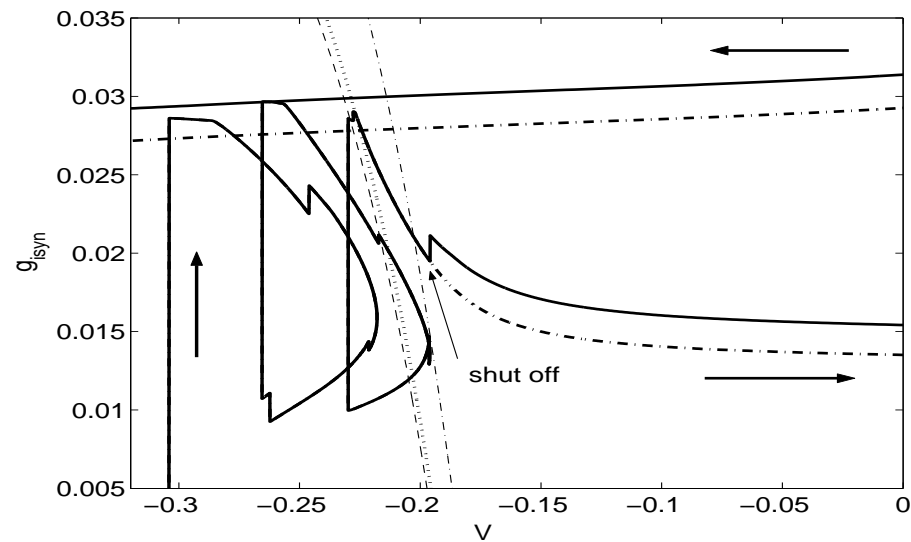
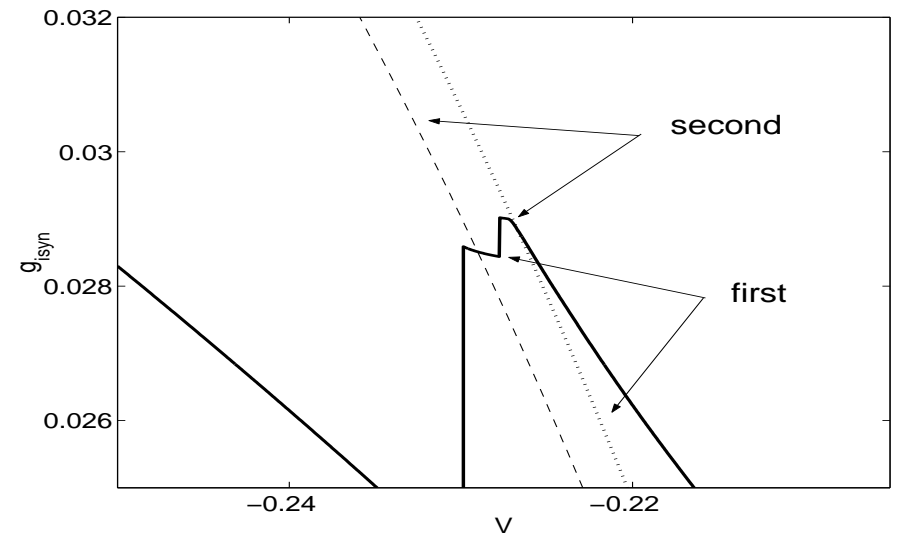
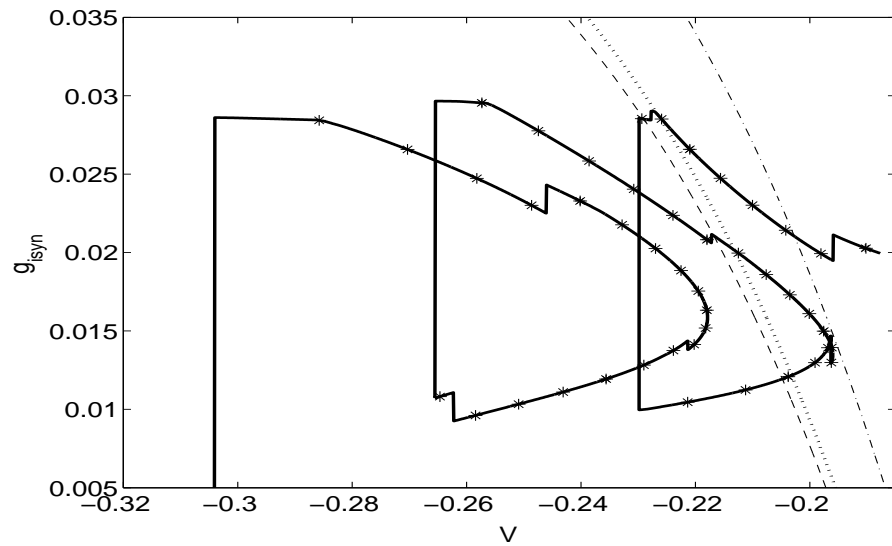
note: can still project into  $(v, g_{i_{syn}})$  phase plane!

## Analysis: who jumps?

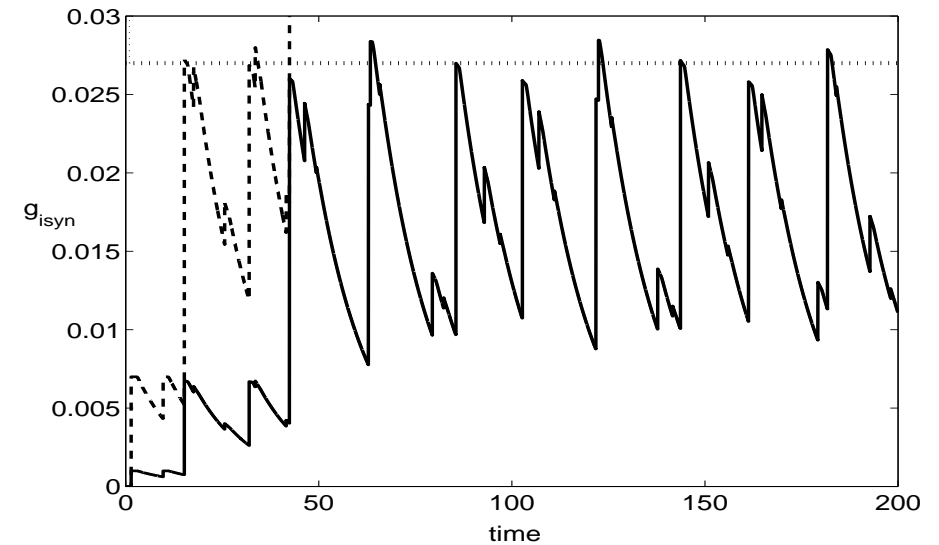
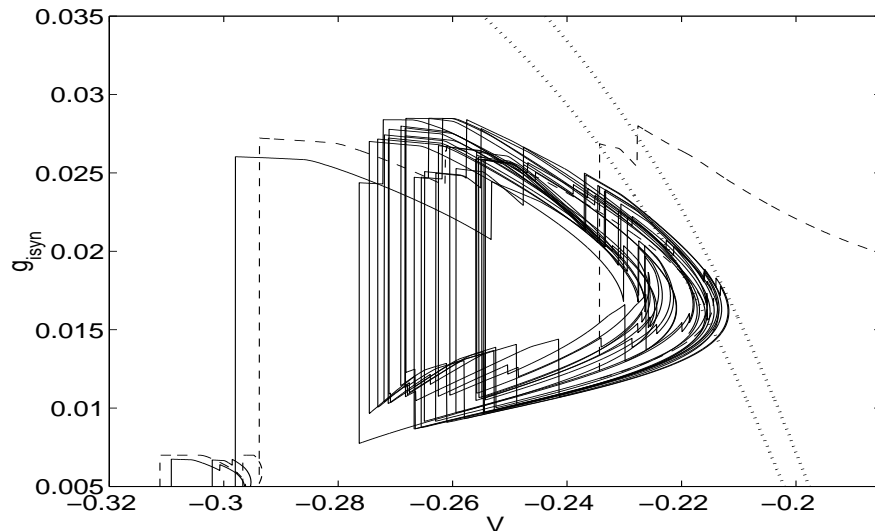


- suppose that cell  $i$  gets a synaptic input from cell  $j$
- check the projected  $(v, g_{i_{syn}})$  phase plane for cell  $i$  at the moment cell  $j$  falls down through  $v_{thresh}$
- position of cell  $i$  relative to **go curve** determines recruitment

# Implications - identify recruitment



# Implications - recruitment depends on more than $|g_{i_{syn}}|$



- also, faster synaptic decay hurts in two ways...
- ...and bump size is non-unique and nonrobust

## Bump formation:

- recruitment as above; initial synchrony helps
  - start near same rest state
  - common input overrules synaptic coupling
- localization via desynchronization after shock (delayed escape from go surface)
- sustainment via self-coupling (not sufficient!) and asynchrony

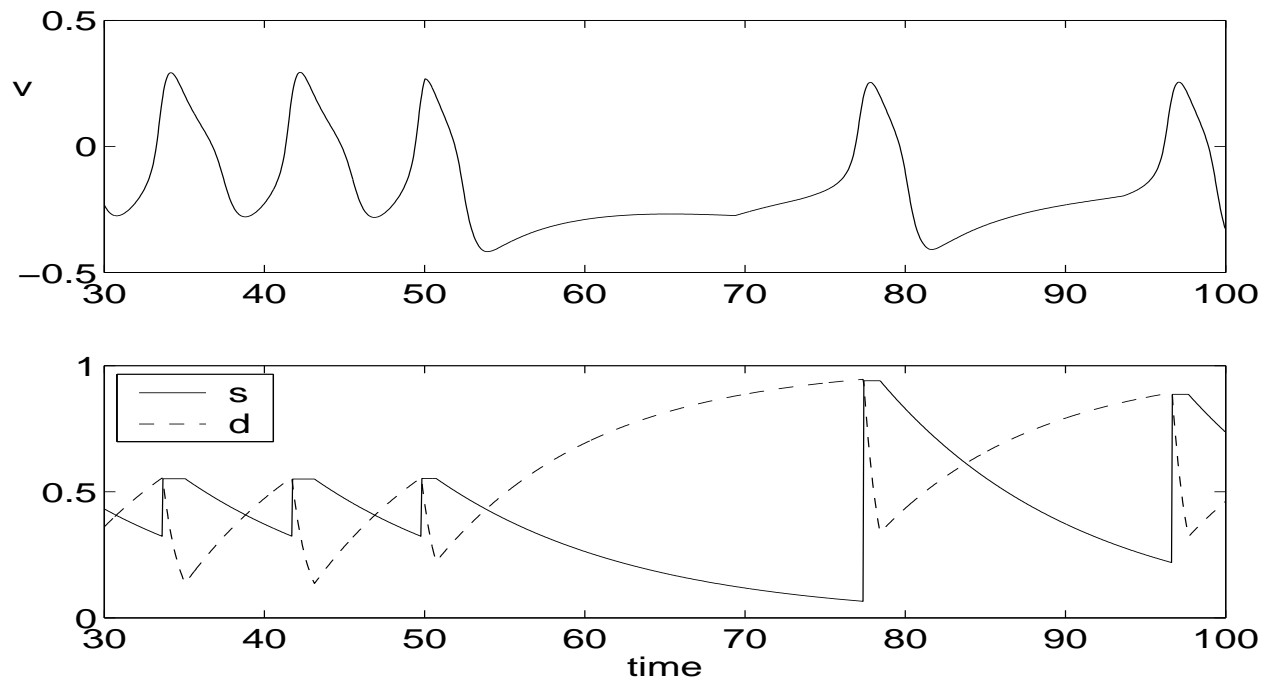


## Synaptic depression:

Bose et al., SIAP, 2001:

$$s' = \alpha[d - s]H(v - v_{thresh}) - \beta s$$

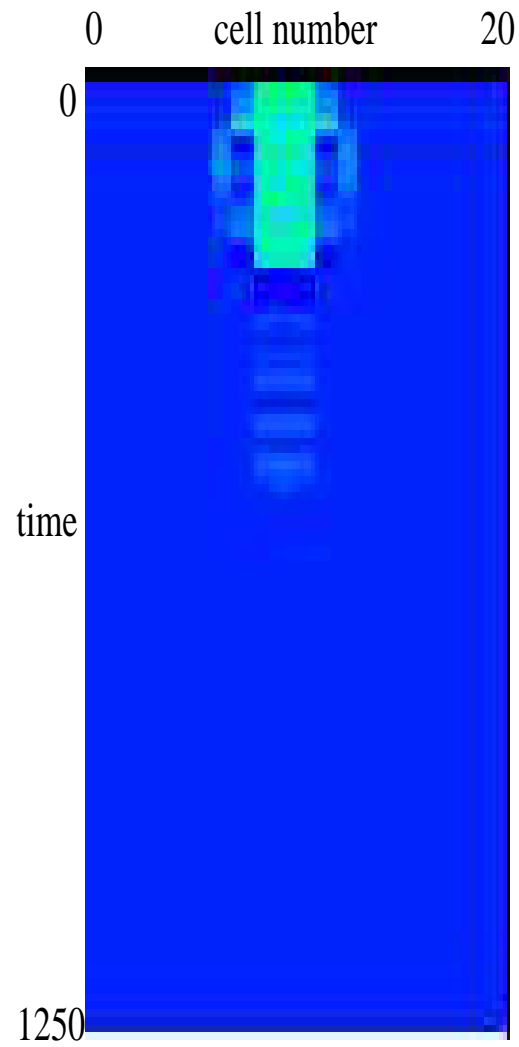
$$d' = ([1 - d]/\tau_\gamma)H(v_{thresh} - v) - (d/\tau_\eta)H(v - v_{thresh})$$



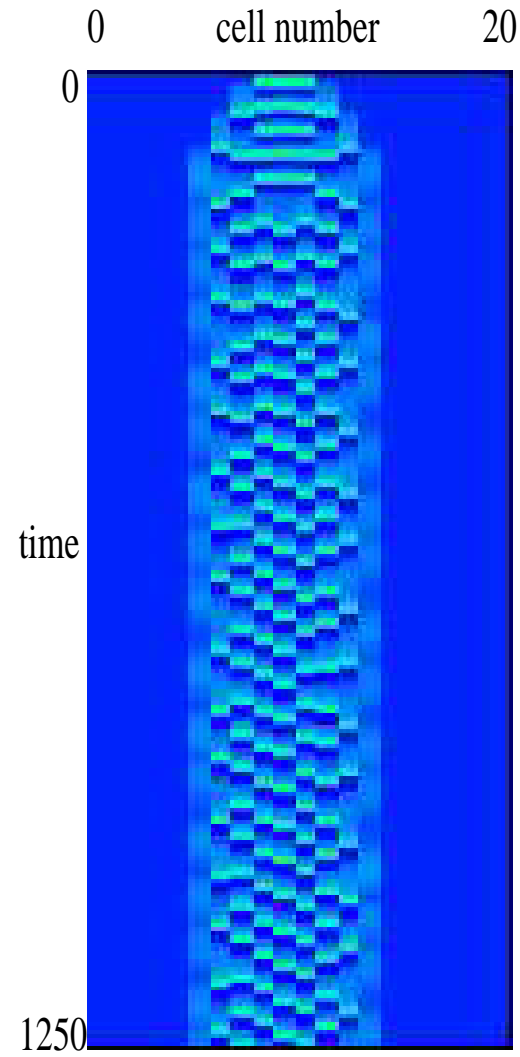
Results: *filtering* and *toggling*

Filtering:

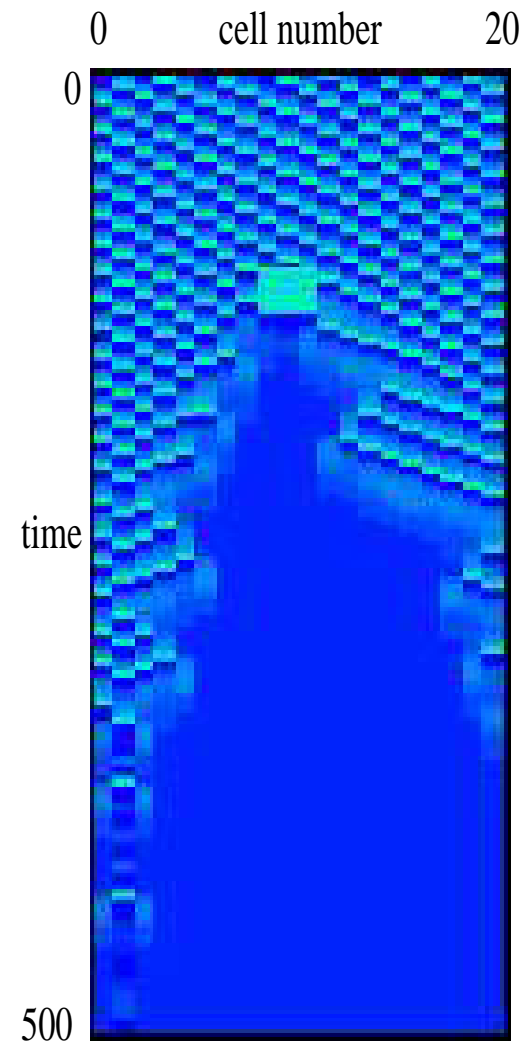
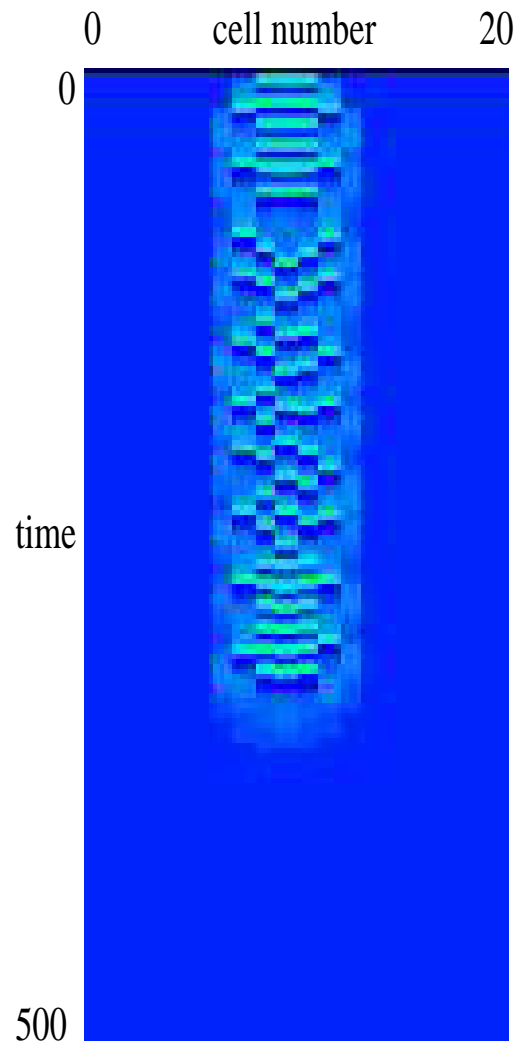
strong input



moderate input



# Toggling:



## Discussion

- bumps can exist in purely excitatory networks - **inhibition is not necessary**
  - initiated by transient input
  - **go curve** forms recruitment threshold
  - localized by desynchronization (**Type I dynamics**)
  - sustained by self-coupling (or e.g.  $I_{CaL}$ ) and desynchronization
- bump details are sensitive to parameters
- synaptic depression  $\Rightarrow$  band-pass filter, toggling
- OPEN: rigorous analysis, role of short-term spike frequency changes, bump mechanism for Type II (D/E)
- IDEA: **go curve/surface** is useful for predicting the impact of transient inputs
- IDEA: intrinsic dynamics can be important, and excitatory networks can do interesting things

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