

# **Modeling Oscillatory Activity of Endocrine Cells**

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# Coworkers and Collaborators

## Pancreatic Islets

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Matthew Merrins (U. Michigan)

Craig Nunemaker (U. Virginia)

Bernard Fendler (Cold Spring Harbor Lab)

## Pituitary Cells

Joël Tabak (FSU)

Arturo Gonzalez-Iglesias (FSU)

Maurizio Tomaiuolo (U. Penn)

Lorin S. Milesco (U. Missouri)

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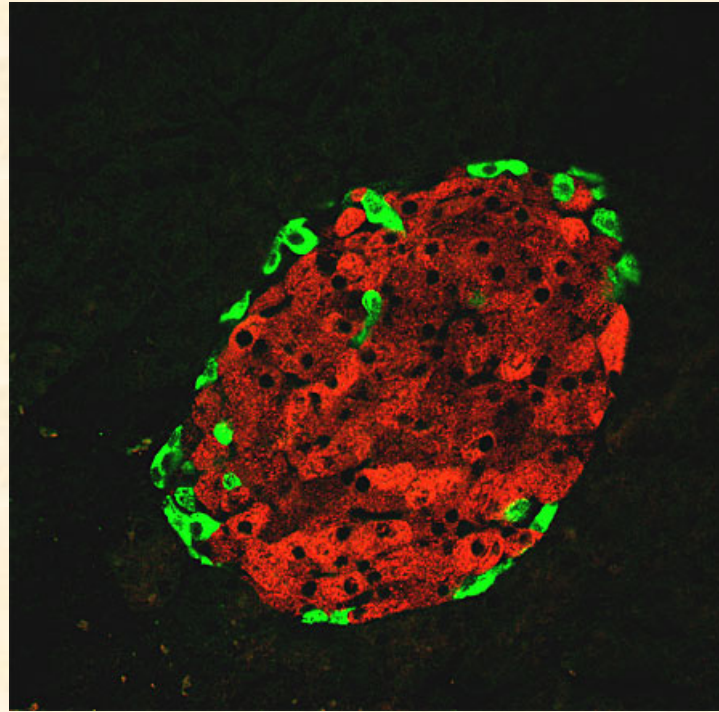
## Why use mathematical modeling?

1. As an aid to the interpretation of experimental data.
2. Integration of multiple sets of experimental results.
3. Great for finding holes in our knowledge.
4. Ideal for making predictions. This is a powerful tool for experimental design.

# Project 1: Pancreatic Islets

# What is an Islet of Langerhans?

Cluster of electrically couple hormone-secreting cells, located throughout the pancreas. The human pancreas has about **1 million islets**.

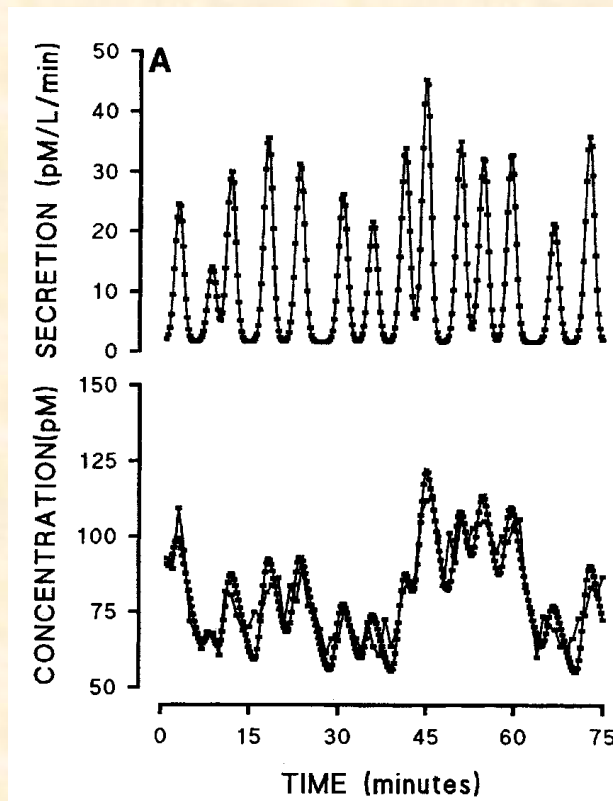


Courtesy of Rohit Kulkarni

Immunostained for glucagon (green) and insulin (red)

# Insulin Secretion is Pulsatile

Porksen et al.,  
AJP, 273:E908,  
1997



← deconvoluted

← measured

Peripheral insulin measurements in the blood of humans exhibits **oscillations**, suggesting that insulin is secreted in a pulsatile manner.

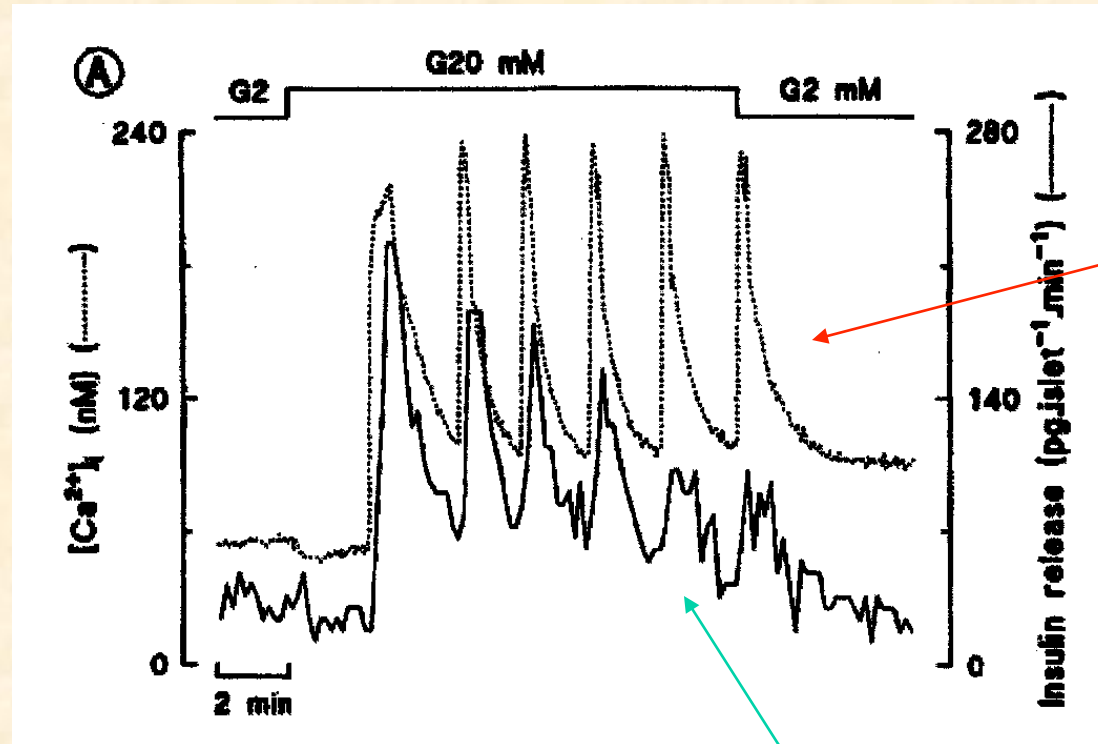
# Central Question:

What is the mechanism for oscillations in insulin secretion from pancreatic  $\beta$ -cells?



# Islets are Electrically Excitable

Islets are like nerve cells in that they produce electrical impulses. During an upstroke of an impulse  $\text{Ca}^{2+}$  enters the cells, causing **insulin** to be released.

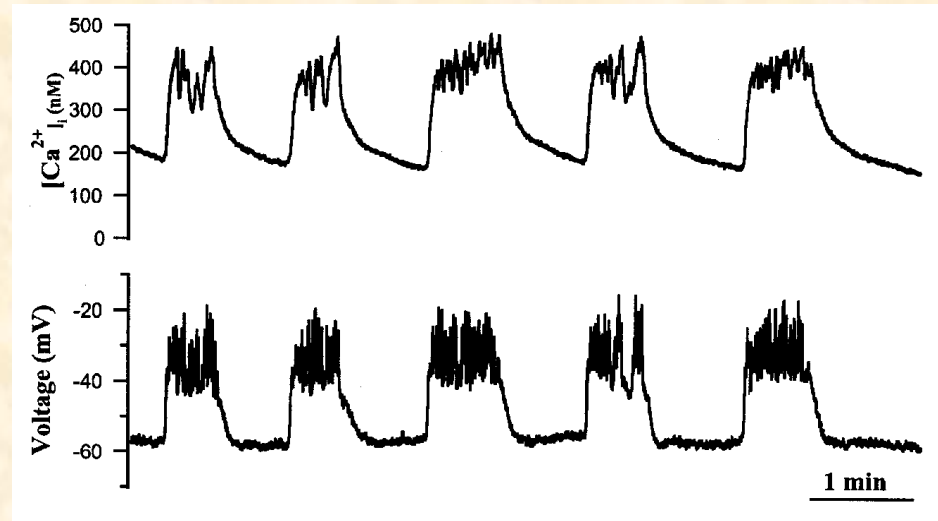


Gilon et al.,  
JBC, 268:22265,  
1993



# Islets Have Characteristic Patterns of Electrical Activity

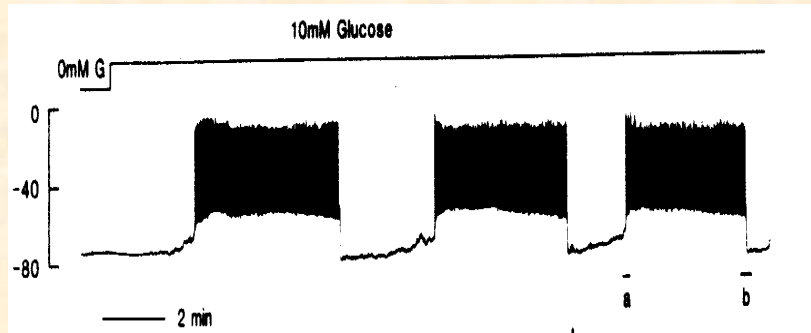
# Fast Bursting Oscillations



Simultaneous fast  $Ca^{2+}$  and voltage measurements from a mouse islet in 11.1 mM glucose. From Zhang et al., *Biophys. J.*, 84:2852, 2003

# Slow Bursting Oscillations

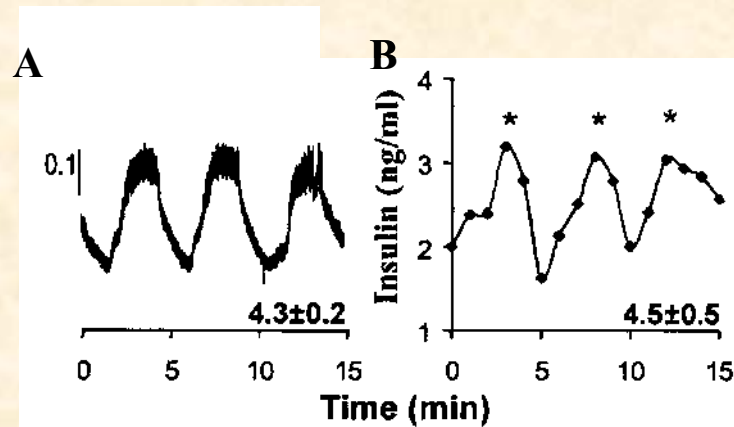
Slow oscillations of  $\text{Ca}^{2+}$  and voltage from an islet...



Smith et al., *FEBS Lett.*, 261-187, 1990

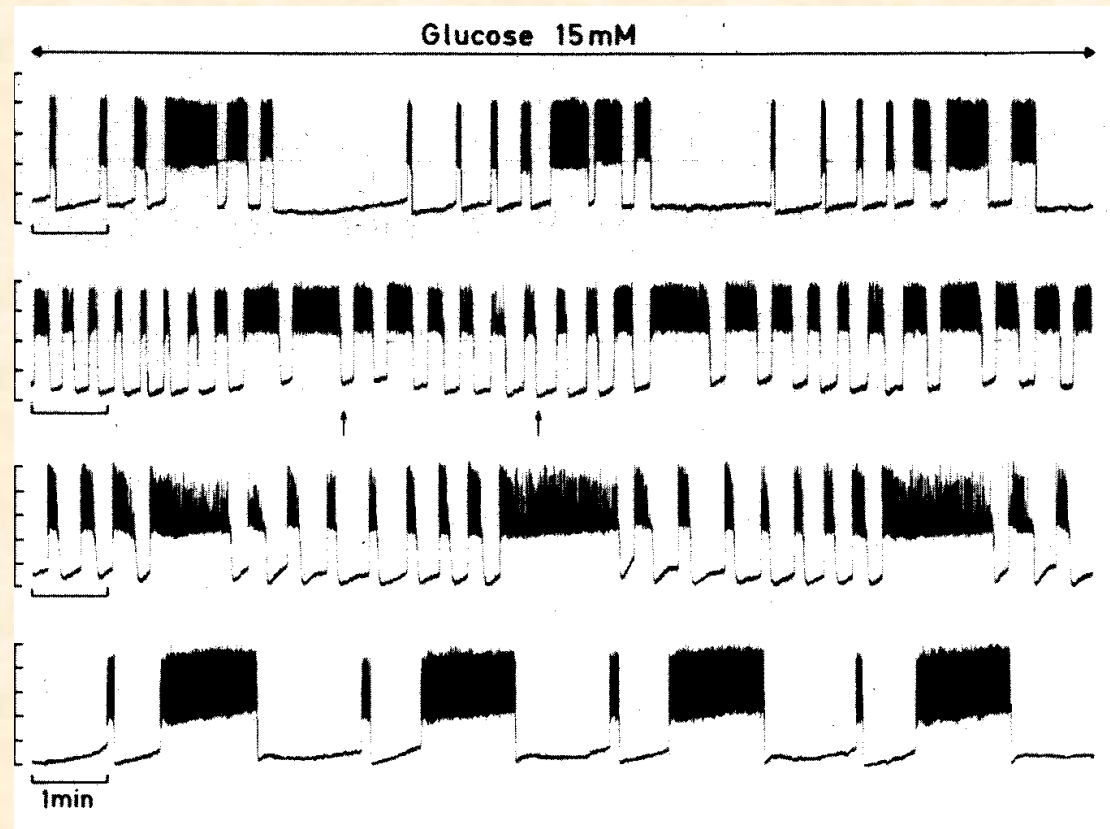


Zhang et al., *Biophys. J.*, 84:2852, 2003



← ...have period similar to slow **insulin** oscillations measured from a mouse in vivo (Nunemaker et al., *Diabetes*, 54:3517, 2005)

# Compound Bursting Oscillations

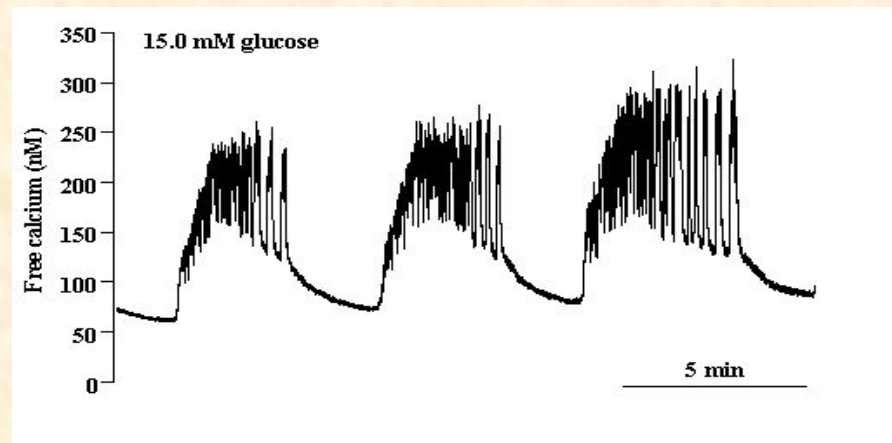


Henquin et al., *Eur. J. Physiol.*, 393:322, 1982

Bursting oscillations superimposed on a slow wave of activity

## More Evidence of Compound Oscillations

Measurements of intracellular  $\text{Ca}^{2+}$  also reveal compound oscillations.



Compound  $\text{Ca}^{2+}$  oscillations in an islet  
(Zhang et al., *Biophys. J.*, 84:2852, 2003)

Goal: Develop a Mathematical Model  
That Can Reproduce the Various  
Patterns of Activity

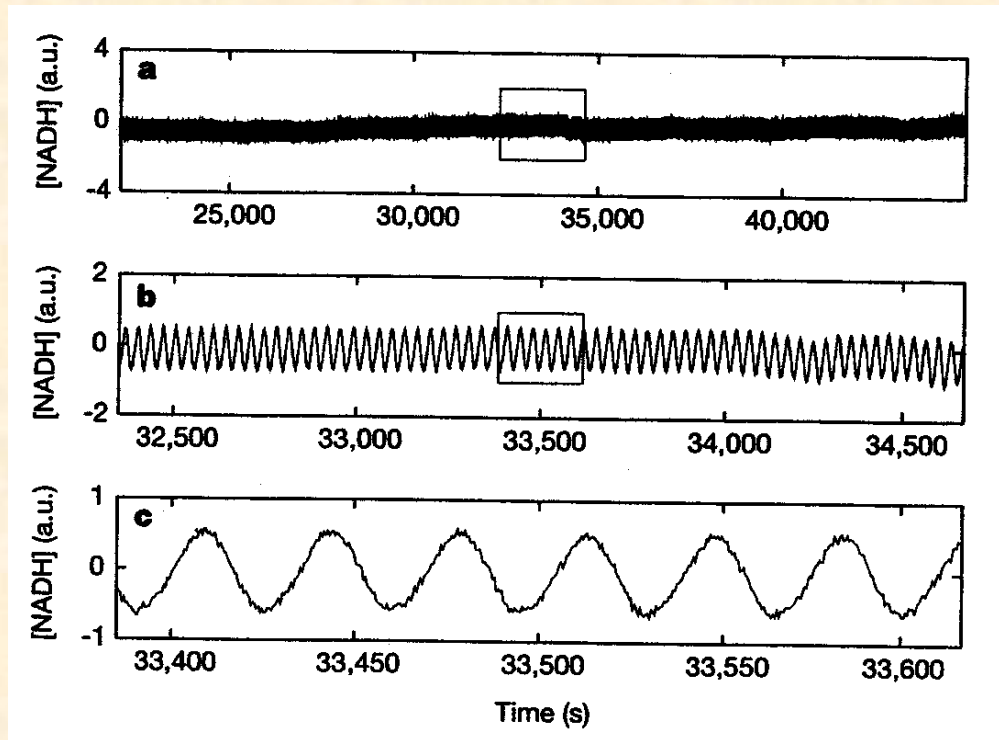
# The Dual Oscillator Model



# Central Hypothesis

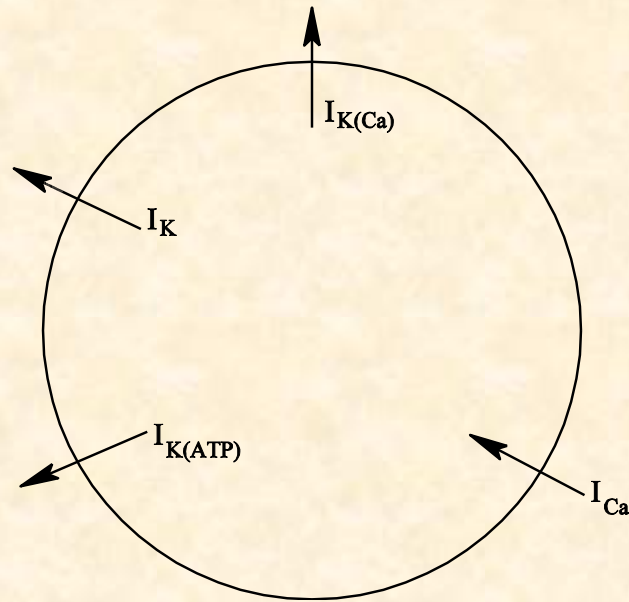
Fast, slow, and compound oscillations can all be produced by a mechanism that includes  $\text{Ca}^{2+}$  feedback onto ion channels (driving the **fast oscillation** consisting of a burst) and glycolytic oscillations (driving the **slow oscillation** that modulates the bursts).

# Glycolytic Oscillations in Yeast



Dano et al., Nature, 402:320-322, 1999

# Electrical Component of the DOM



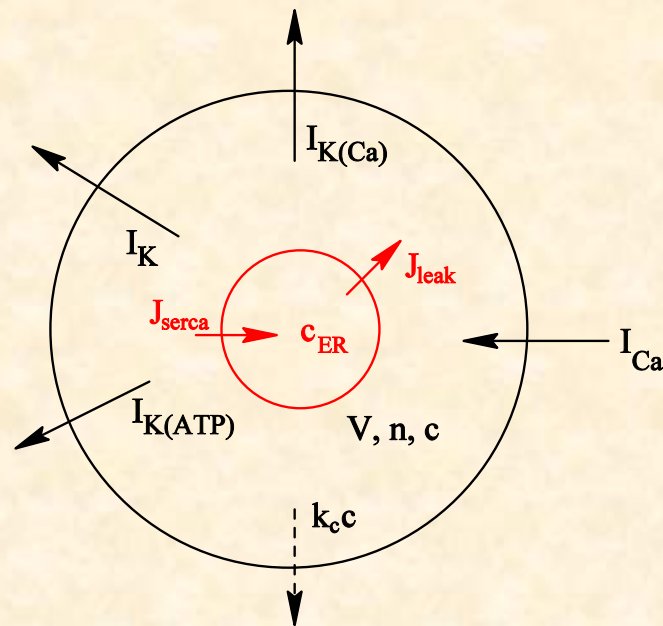
$$\dot{V} = -(I_{Ca} + I_K + I_{K(Ca)} + I_{K(ATP)}) / C_m$$

$$\dot{n} = (n_\infty(V) - n) / \tau_n$$

Voltage equation reflects Kirchoff's current law

Second equation describes dynamics of the  $K^+$  activation variable  $n$ . This depends on the voltage.

# Electrical/Calcium Components of the DOM



$$\dot{V} = -(I_{Ca} + I_K + I_{K(Ca)} + I_{K(ATP)}) / C_m$$

$$\dot{n} = (n_{\infty}(V) - n) / \tau_n$$

$$\dot{c} = f(J_{leak} - J_{serca} - \alpha I_{Ca} - k_c c)$$

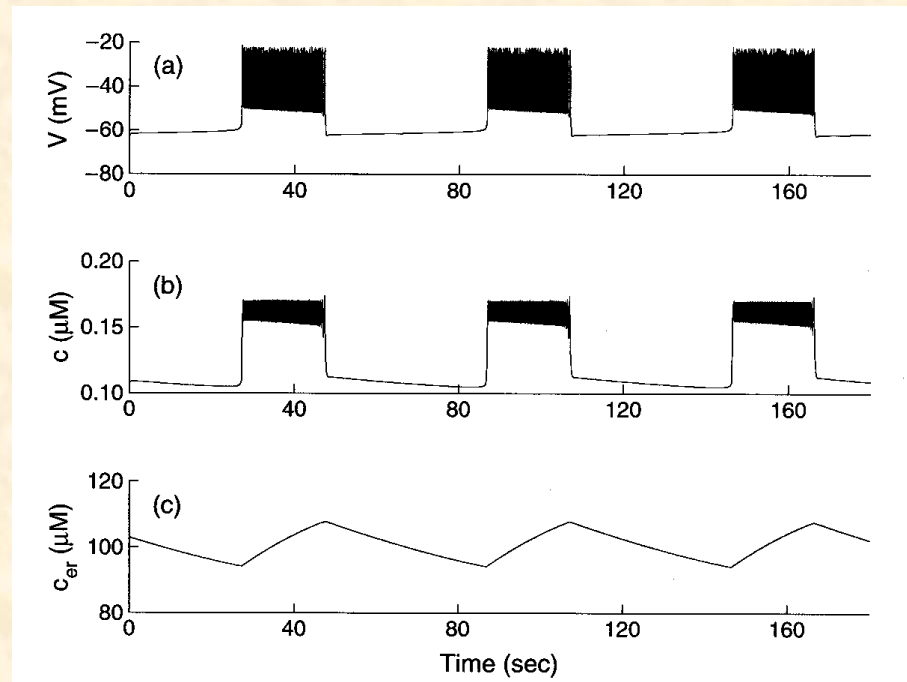
$$\dot{c}_{ER} = f_{ER} \left( V_{cyt} / V_{ER} \right) (J_{serca} - J_{leak})$$

ER is the Endoplasmic Reticulum

$\text{Ca}^{2+}$  enters the cell through L-type  $\text{Ca}^{2+}$  channels. The free cytosolic  $\text{Ca}^{2+}$  activates K(Ca) channels. Thus, there is mutual feedback between the electrical and  $\text{Ca}^{2+}$  components.

# Fast Oscillations with the DOM

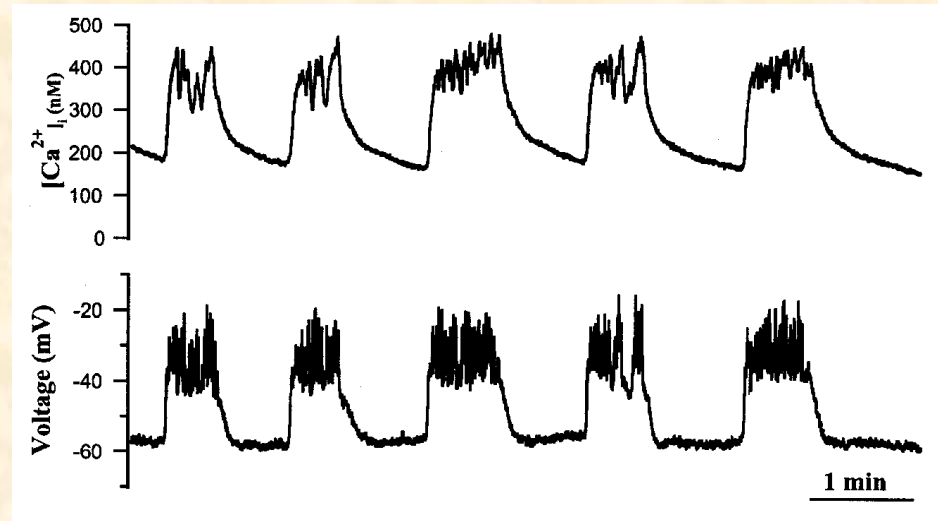
When glycolysis is non-oscillatory, the DOM produces fast bursting oscillations, due to the electrical/calcium components of the model.



Bertram and  
Sherman, BMB,  
66:1313, 2004

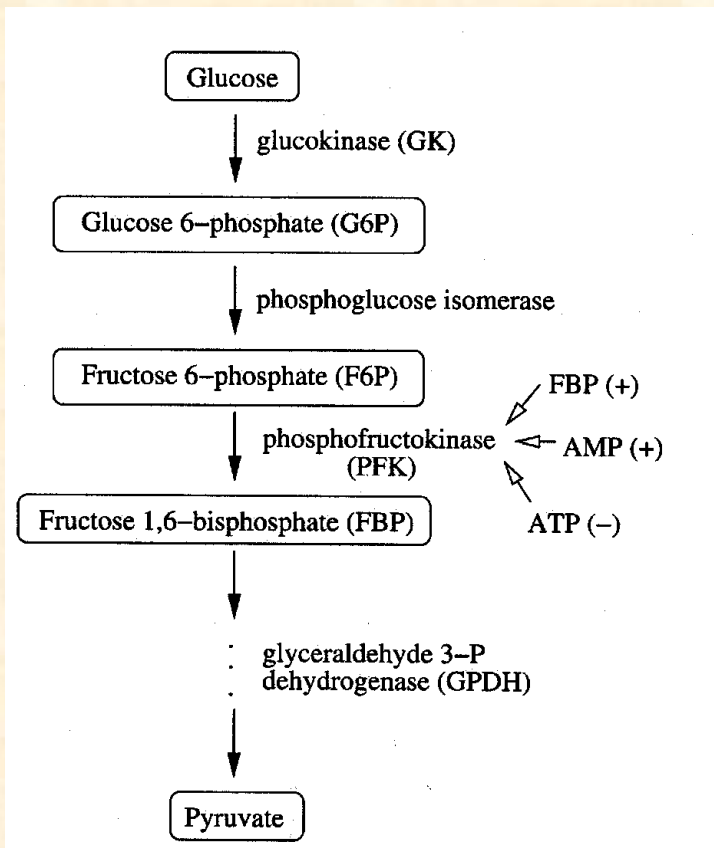
The ER acts as a slow  $\text{Ca}^{2+}$  filter, setting the period of bursting through its interaction with the cytosol.

## Fast Oscillations in Islets



Simultaneous fast  $Ca^{2+}$  and voltage measurements from a mouse islet in 11.1 mM glucose. From Zhang et al., *Biophys. J.*, 84:2852, 2003

# Glycolytic Component of the DOM



$$\frac{d F6P}{d t} = \lambda(J_{GK} - J_{PFK})$$

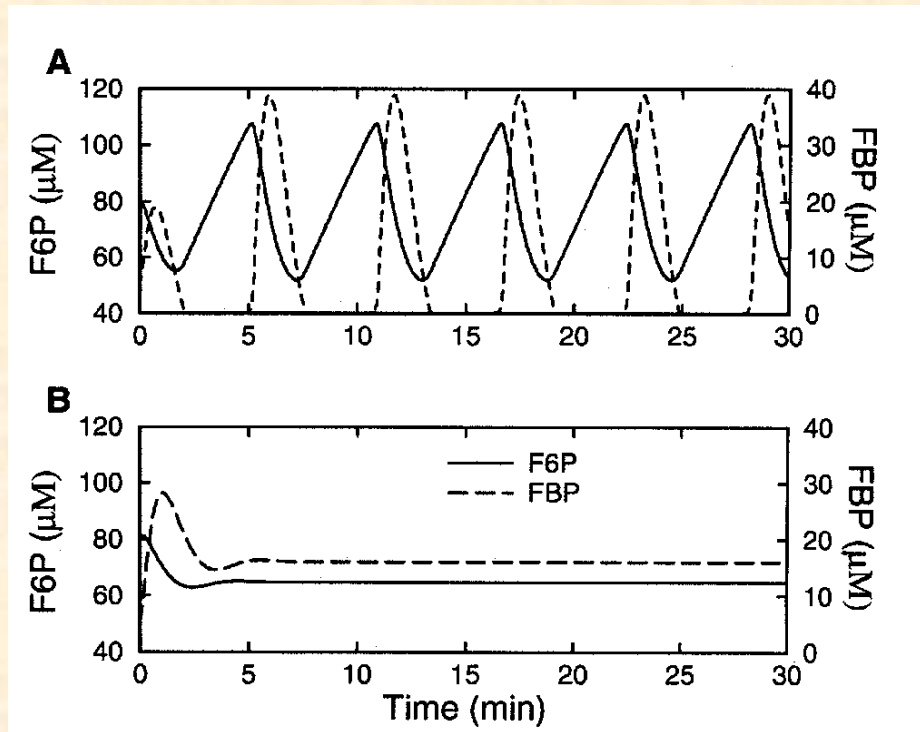
$$\frac{d FBP}{d t} = J_{PFK} - 0.5J_{GPDH}$$

**Key feature:** The product FBP feeds back positively onto the allosteric enzyme PFK (phosphofruktokinase). Leads to oscillations due to substrate depletion.



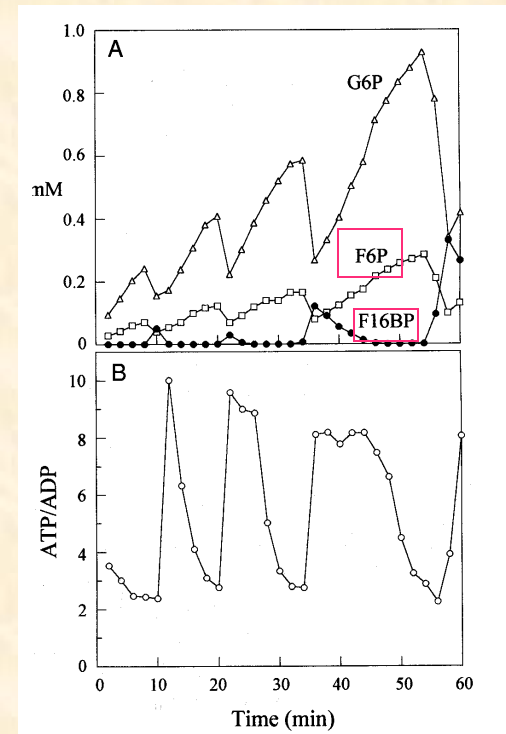
# Glycolytic Oscillations Produced if Glucokinase Rate is in the Right Range

Solid-F6P, Dashed-FBP



(A) Intermediate  $J_{\text{GK}}$   
(B) High  $J_{\text{GK}}$

Bertram et al.,  
BJ, 87:3074, 2004

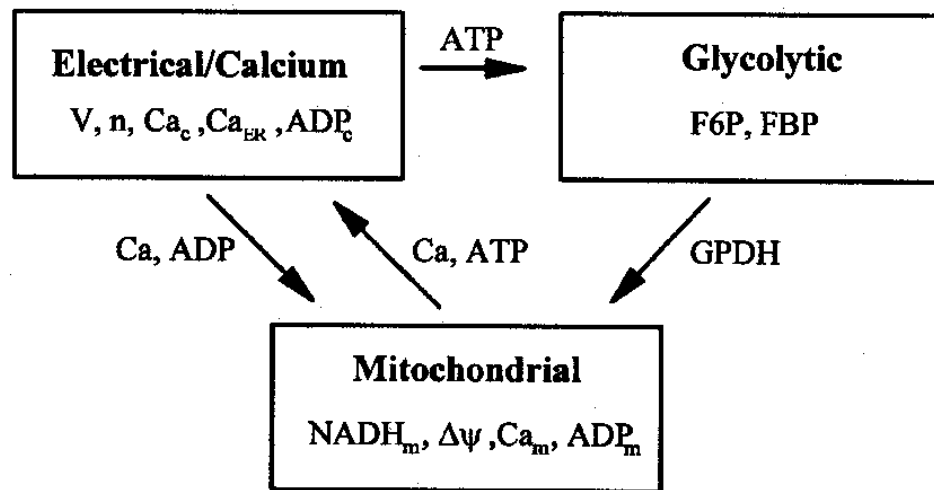


Glycolytic oscillations in muscle extracts (Tornheim, *Diabetes*, 46:1375, 1997)

# Mitochondrial Component

Includes equations for mitochondrial NADH concentration, inner membrane potential,  $\text{Ca}^{2+}$  concentration, and ADP/ATP concentrations.

Final 3-compartment model:



Bertram et al.,  
BJ, 92:1544, 2007

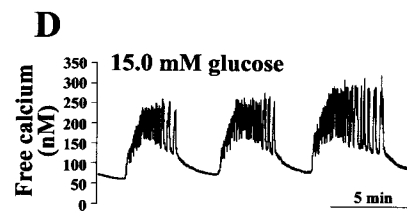
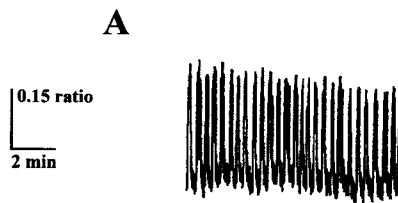
# The Three Types of Activity can be Reproduced by the Model

No glycolytic oscillations

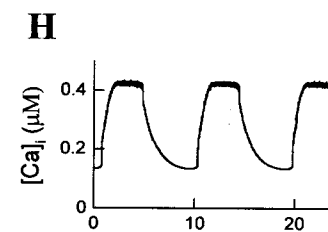
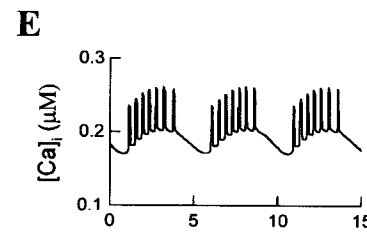
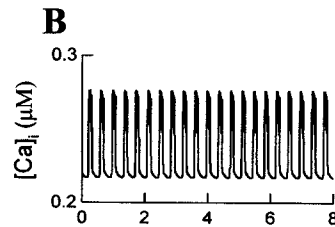
With glycolytic oscillations

With glycolytic oscillations

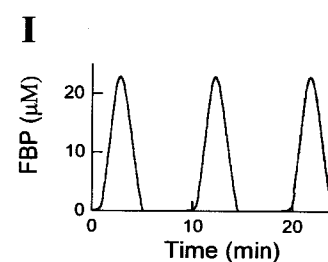
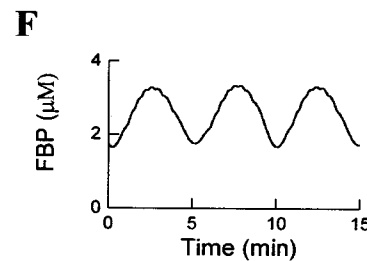
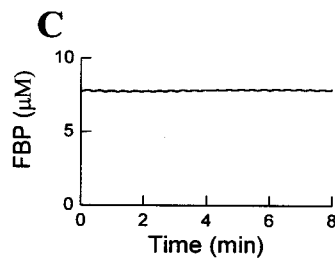
Experiment



Model



Model

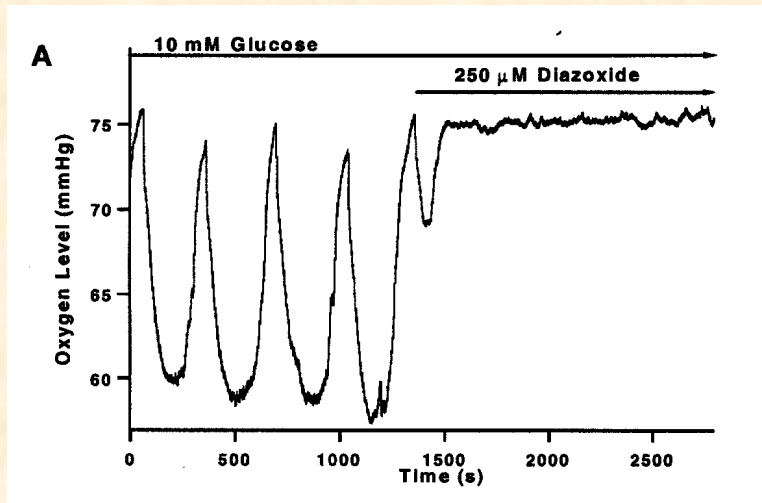


Bertram et al., *Am. J. Physiol.*, 293:E890, 2007

# Who's Driving? Are Metabolic Oscillations the Driver or the Passenger?

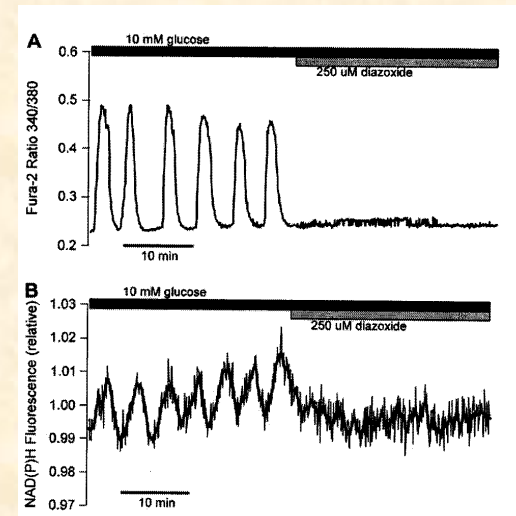
Diazoxide hyperpolarizes the  $\beta$ -cells by activating K(ATP) ion channels, terminating electrical activity.

Oxygen



Kennedy et al.,  
*Diabetes*,  
51:S152, 2002

NADH



Bertram et al., *BJ*,  
92:1544, 2007

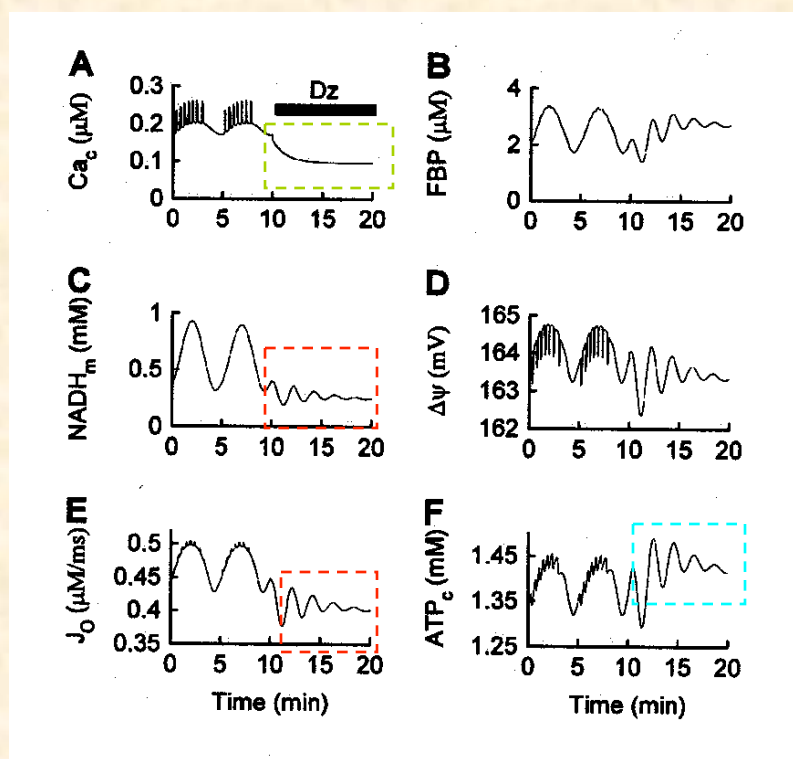
## Kennedy's Conclusion

Slow oscillations in metabolic variables are **driven by  $\text{Ca}^{2+}$  feedback**. That's why they stop when  $\text{Ca}^{2+}$  is constant at a low value. **Metabolic oscillations are the passenger!**

# Kennedy Data Consistent with the DOM; The Hyperpolarization Drains the Fuel!!

Opening K(ATP) channels with diazoxide (Dz) can terminate the oscillations in glycolysis, and thus the metabolic oscillations.

Explains O<sub>2</sub> recordings from Kennedy's lab and our own NAD(P)H data.



1. Dz hyperpolarizes cell

2. Cytosolic Ca<sup>2+</sup> concentration is reduced

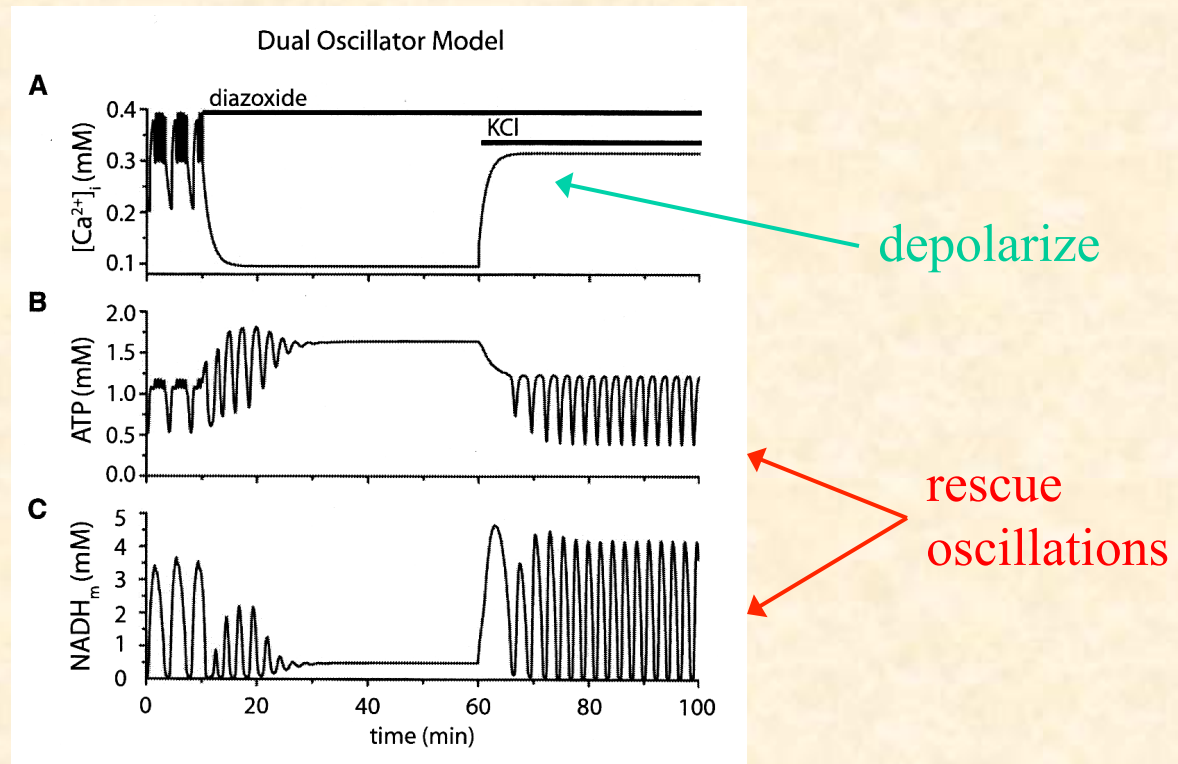
3. Ca<sup>2+</sup> pumps don't need to work as hard, so less ATP is utilized.

4. Cytosolic ATP level increases

5. The ATP inhibits PFK, terminating metabolic oscillations

# The “Killer” Prediction

The DOM, and no other model, predicts that depolarizing the cell can restart metabolic oscillations.

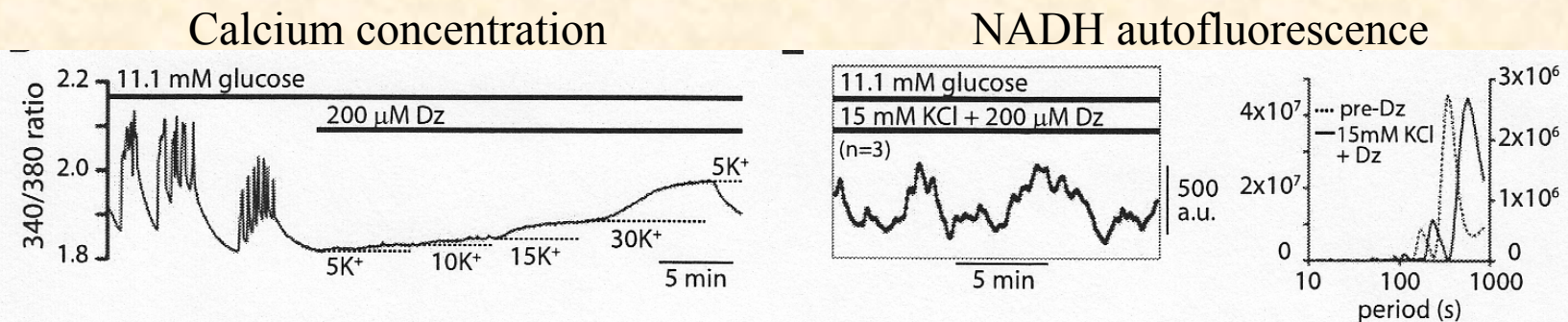


Merrins et al., BJ, 99:76, 2010



# The “Killer” Experiment

After some lobbying, the Satin lab tested the model prediction...



Merrins et al., BJ, 99:76, 2010

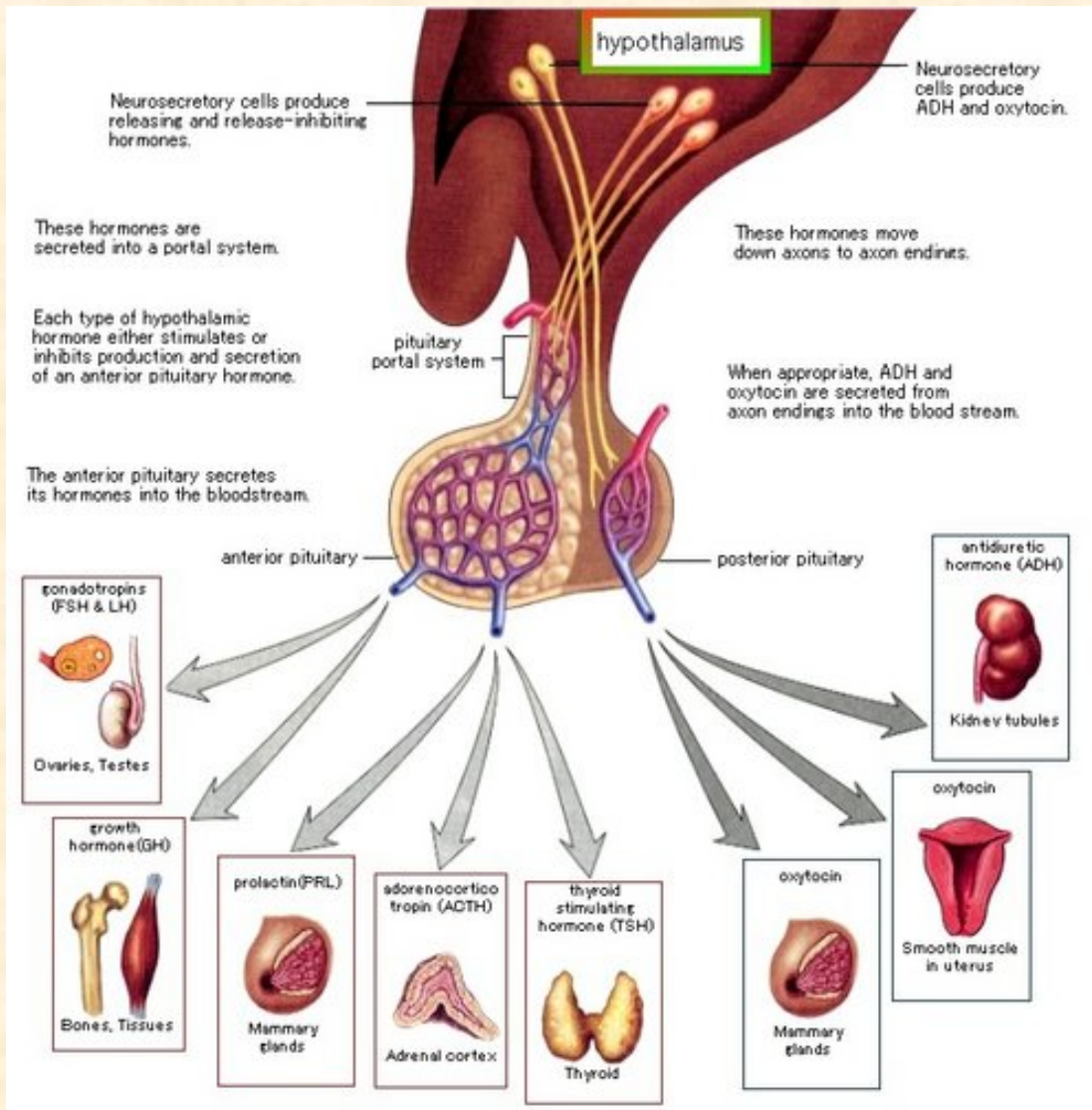
Oscillations in NADH that were eliminated by hyperpolarization with Dz were rescued by depolarization with KCl, **as predicted.**

## Take Home Messages

- 1) A mathematical model can help with the interpretation and **re-interpretation** of experimental data.
- 2) Making predictions and then testing them is a great way to **challenge your model**, and thus your understanding of the system.

# Project 2: Pituitary Cells

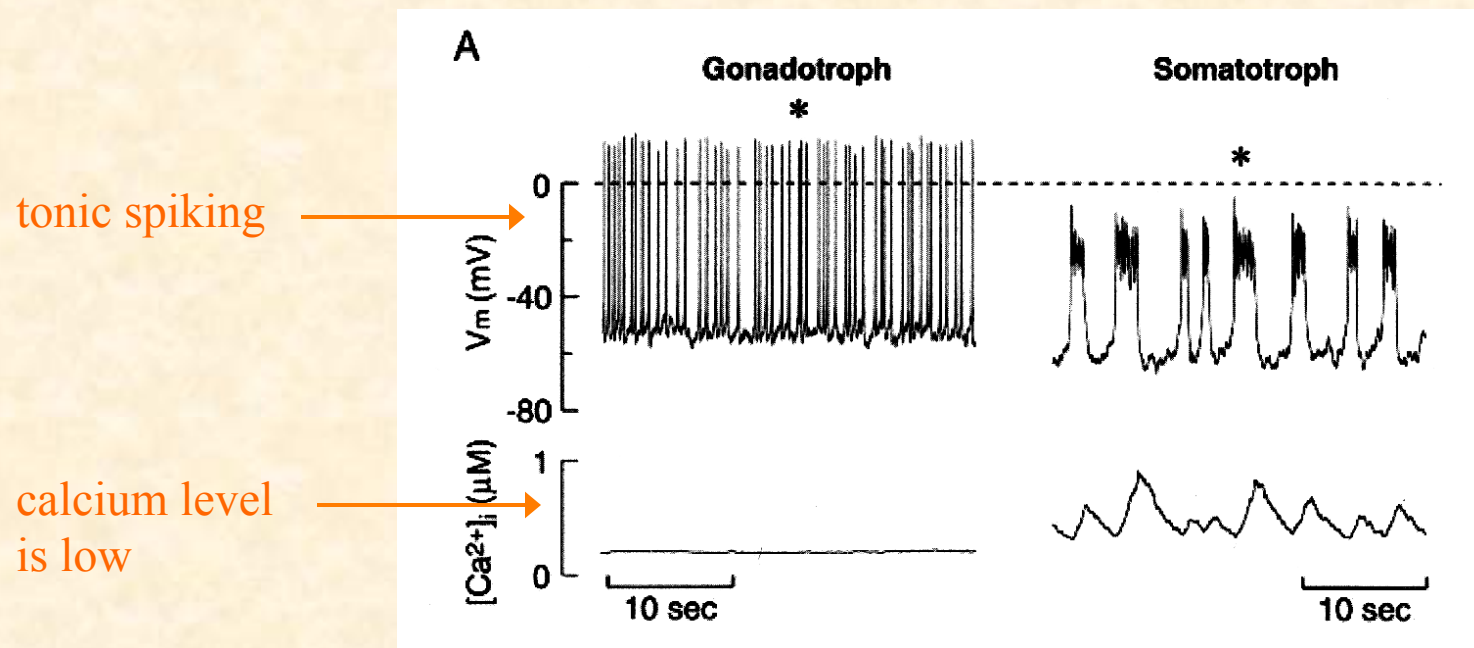
# Hypothalamus and Pituitary



# Pituitary Cells are Electrically Active

## Spontaneous activity of two pituitary cell types

Van Goor et al., J. Neurosci., 2001:5902, 2001

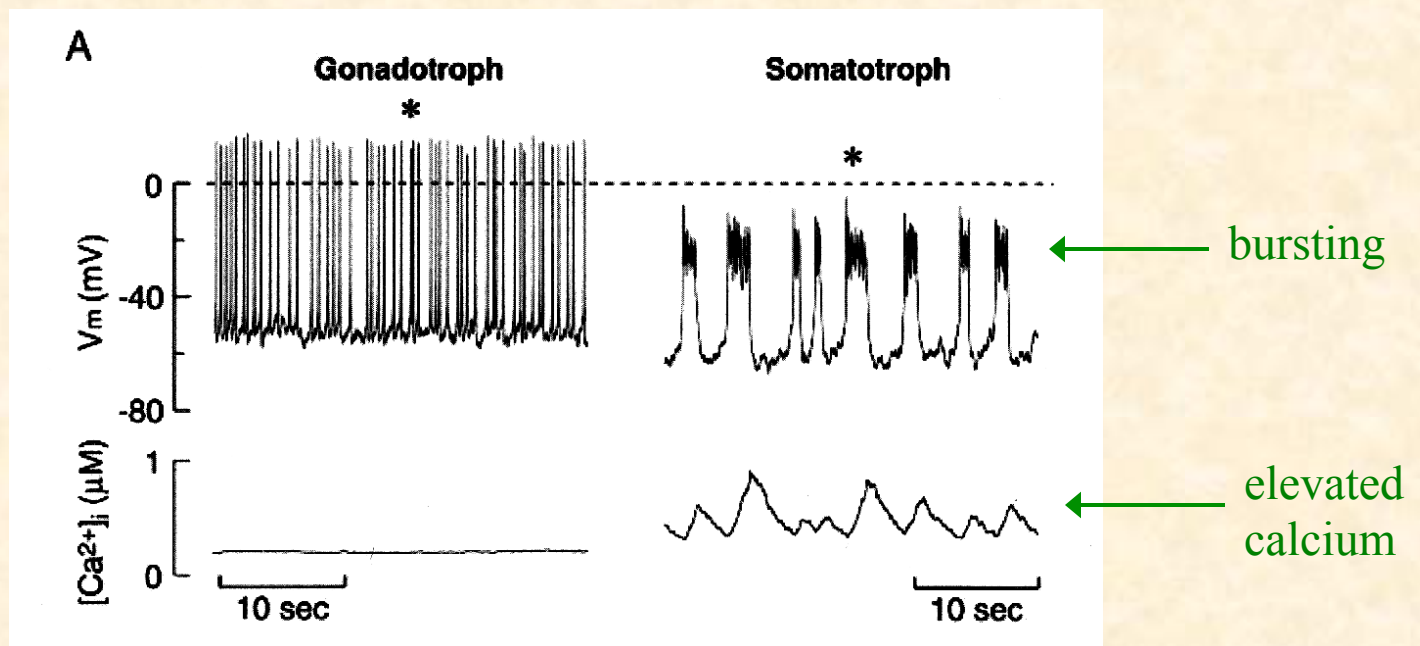


➔ little basal hormone release

# Pituitary Cells are Electrically Active

## Spontaneous activity of two pituitary cell types

Van Goor et al., J. Neurosci., 2001:5902, 2001

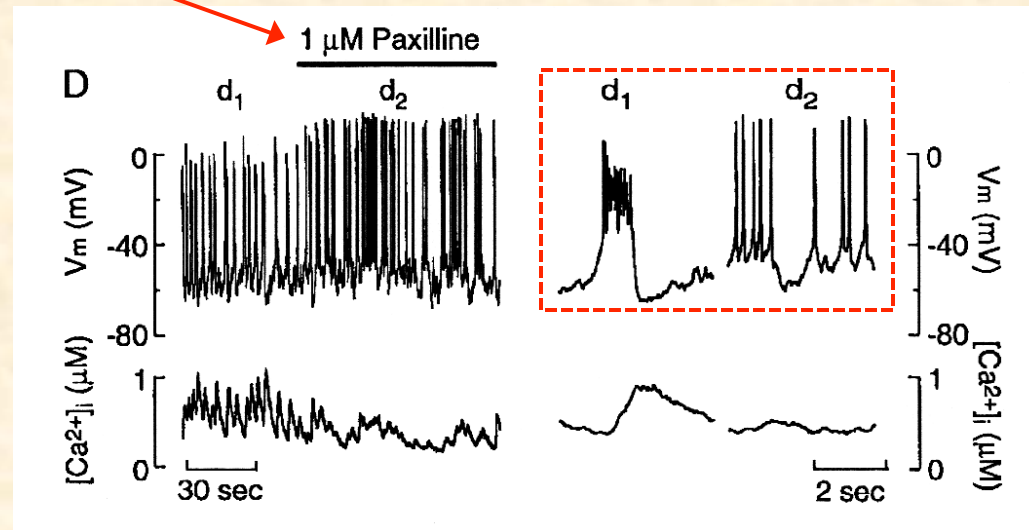


substantial basal hormone release



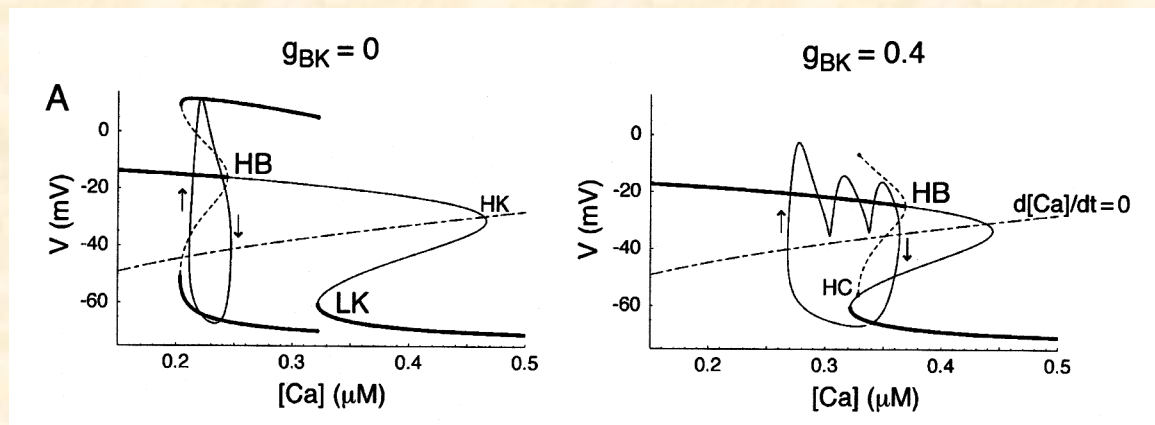
# Blocking Large-Conductance K(Ca) Channels (or BK Channels) Converts Bursting to Spiking

blocker



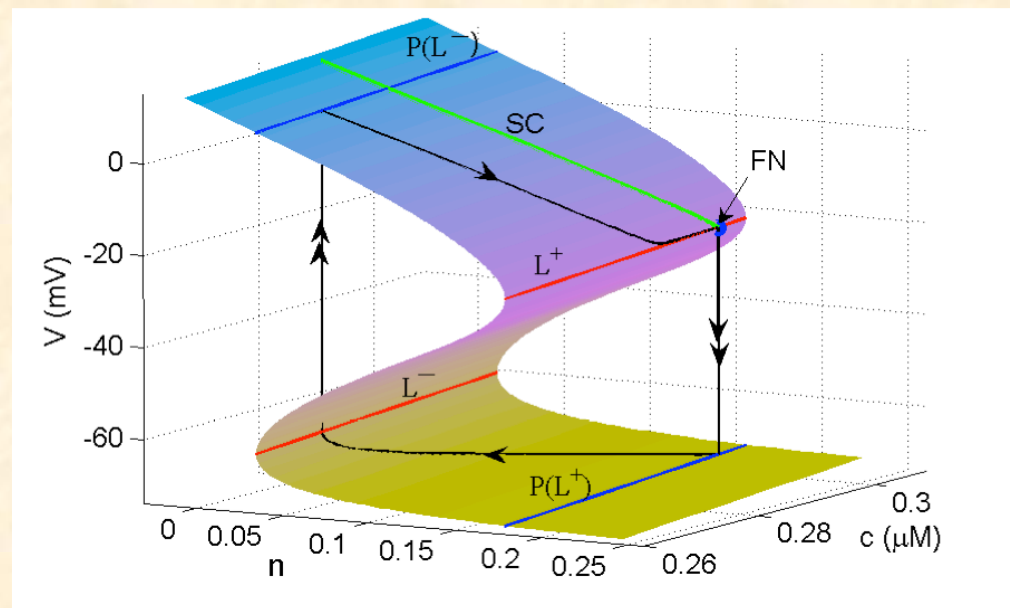
Van Goor et al., J. Neurosci., 2001:5902, 2001

# Why???



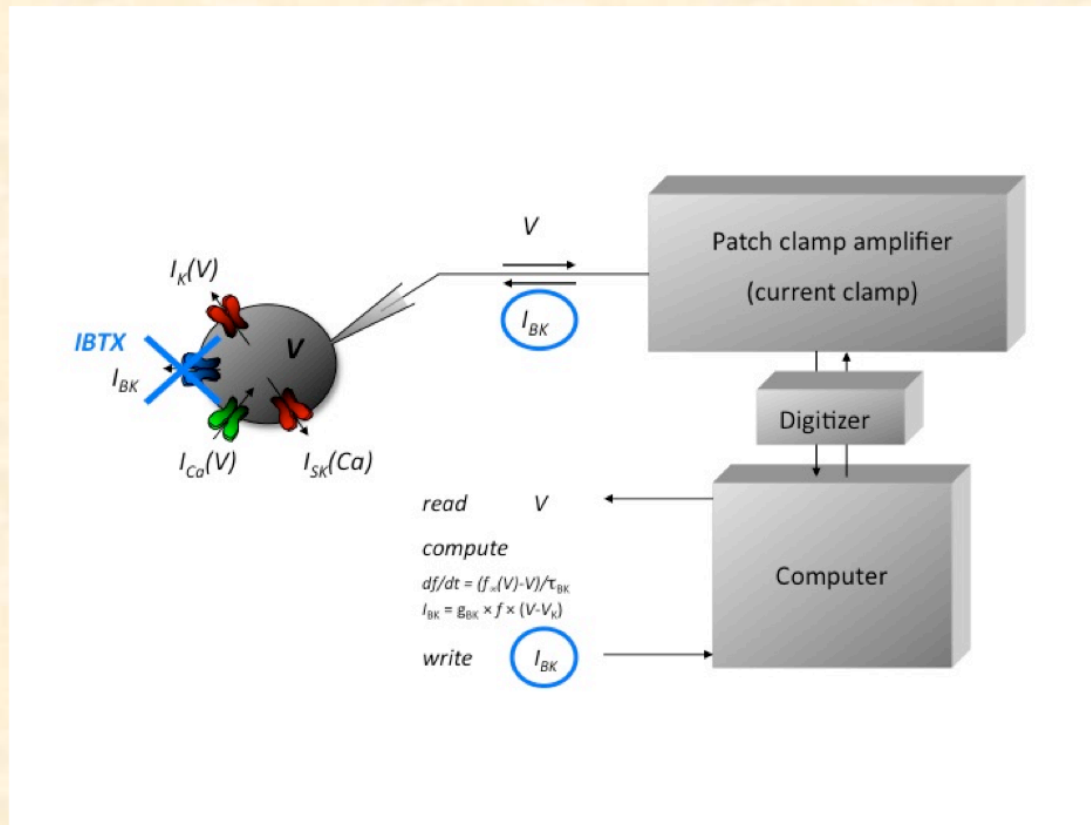
Tabak et al.,  
J. Comp. Neurosci.,  
22:211, 2007

Teka et al.,  
J. Math. Neurosci.,  
1:12, 2011



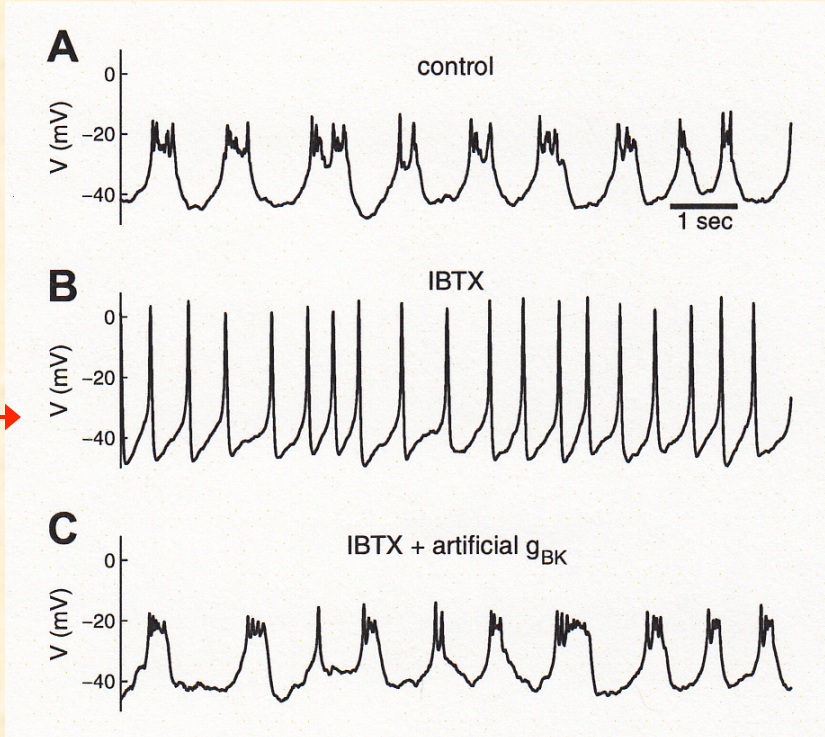


# We Use the Dynamic Clamp to Test our Theories on Pituitary Cells

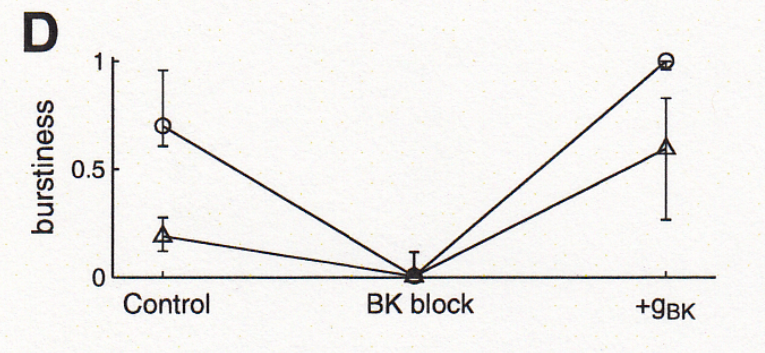


# Blocking BK Current with Iberiotoxin Converts Bursting to Spiking

Block BK  
→



Tabak et al., J. Neurosci., 31:16855, 2011



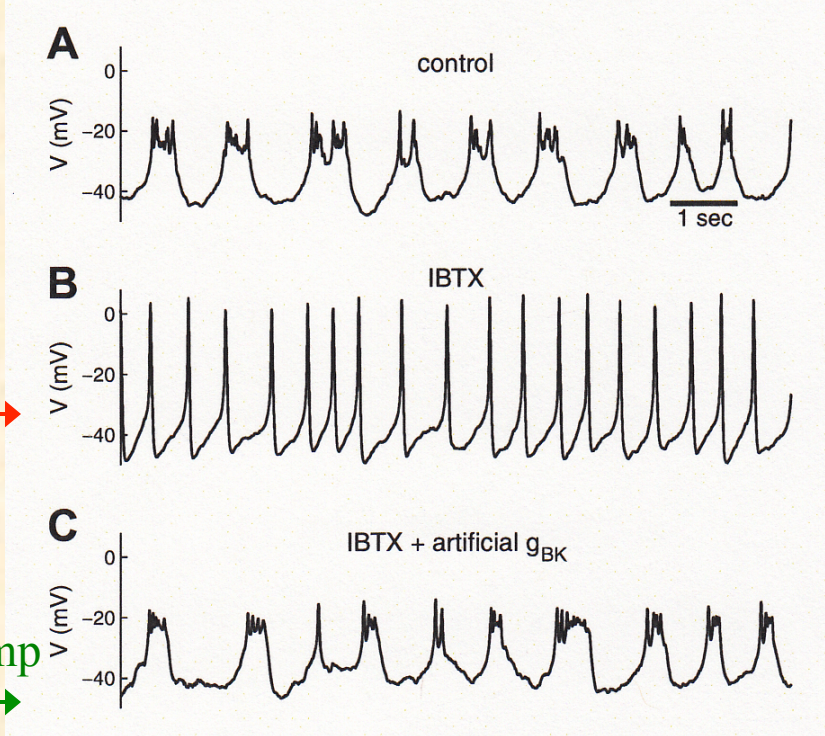
circle: bursters  
triangle: spikers



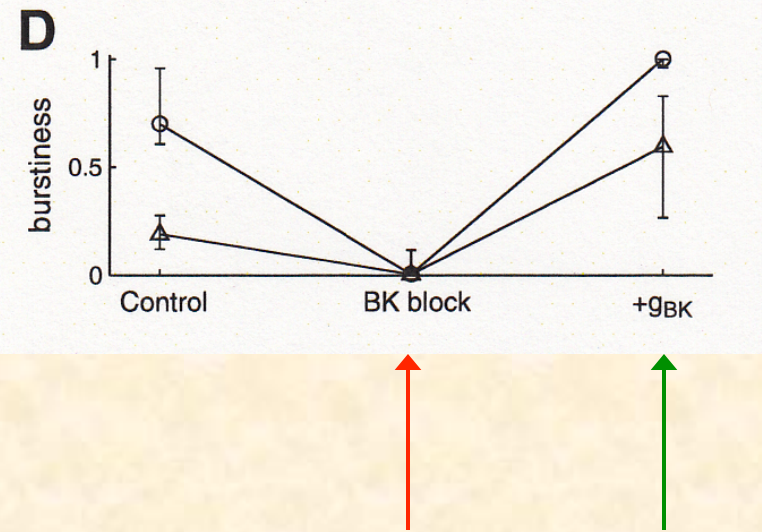
# Adding BK Current with D-Clamp Converts Spiking to Bursting

Block BK  
→

Add BK  
back  
with D-clamp  
→



Tabak et al., J. Neurosci., 31:16855, 2011

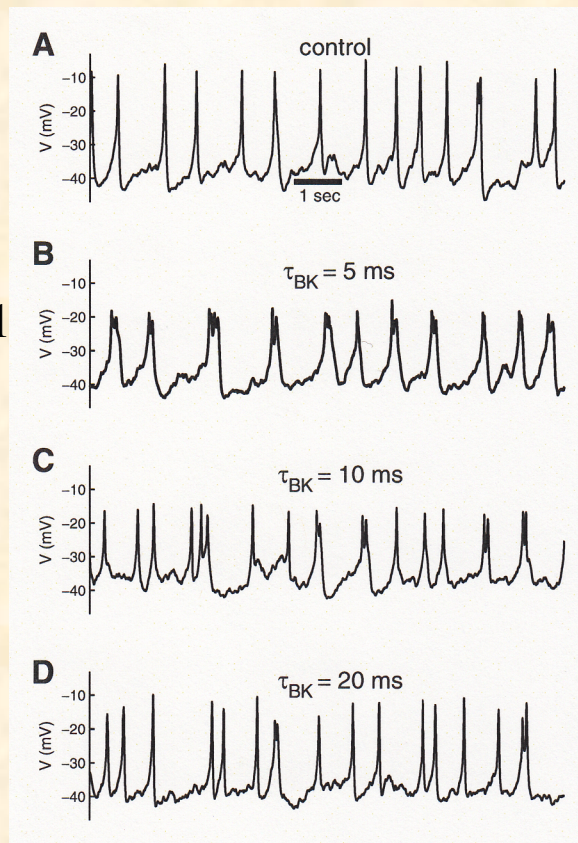
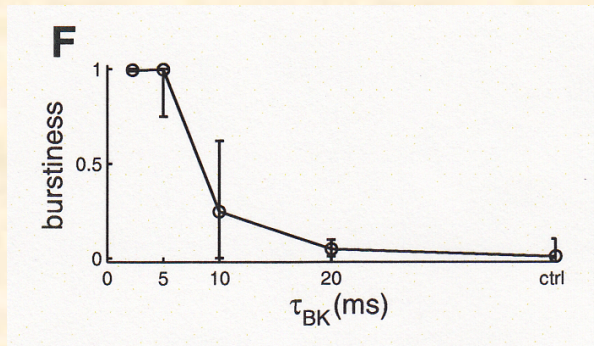




# Model and Analysis Predict That BK Current Rescues Bursting Only If It Activates Quickly

We tested this prediction on pituitary cells using D-clamp...

Tabak et al., J. Neurosci., 31:16855, 2011



Tonic spiking cell

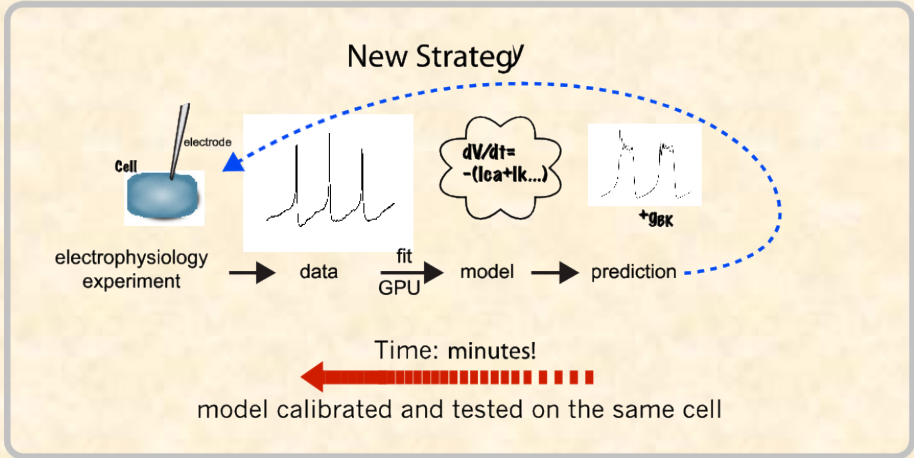
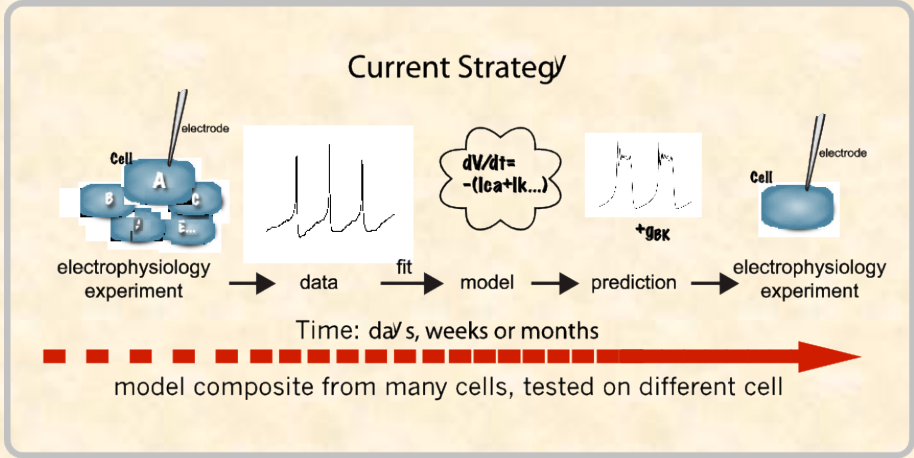
Rapidly activating BK added

Slower activation

Even slower

Prediction Validated!

# In the Future...



Thank You!