

# **Using Mathematical Modeling and Experiments to Understand the Mechanism of Pulsatile Insulin Secretion**

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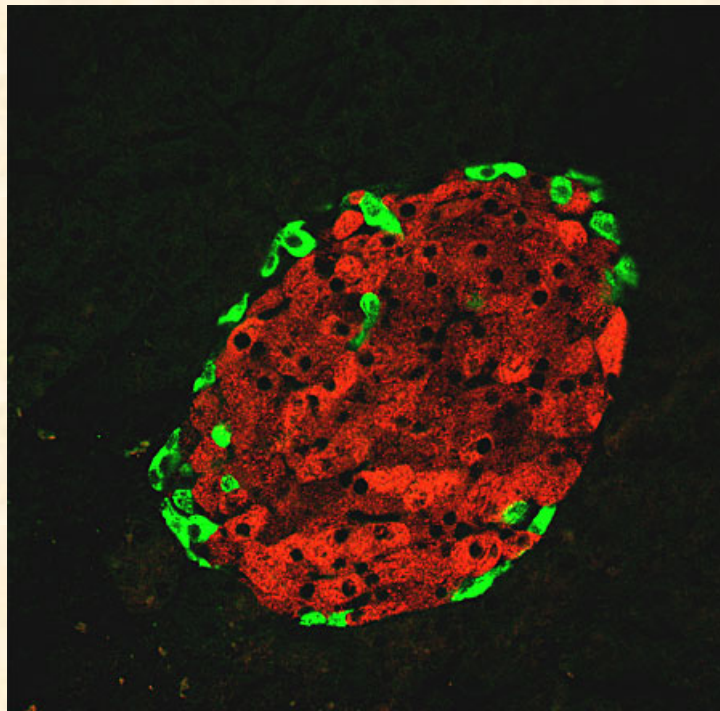
Dan Luciani

# Funding

National Science Foundation, Division of Mathematical Sciences

# What is an Islet of Langerhans?

Coupled cluster of hormone-secreting cells. These clusters are located in the pancreas. Human pancreas has about **1 million islets**.

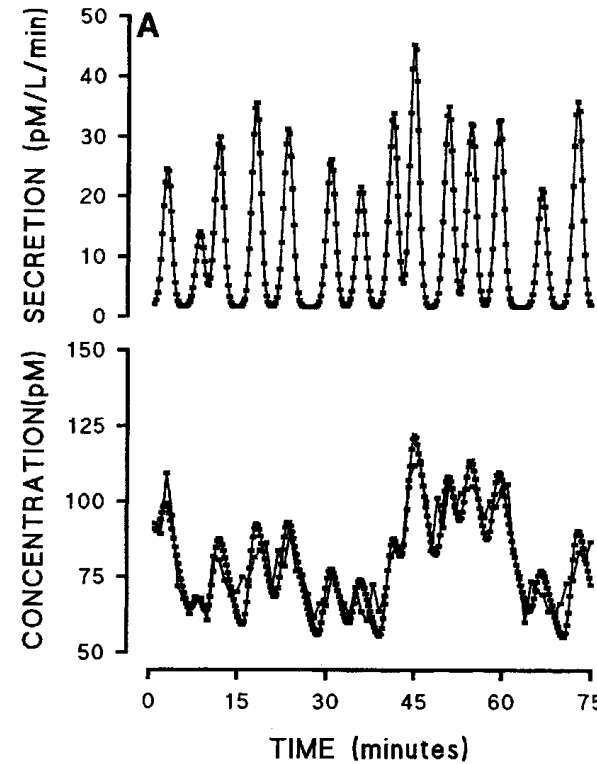


Courtesy of Rohit Kulkarni

Immunostained for glucagon (green) and insulin (red)

# Insulin Secretion is Pulsatile

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



← deconvoluted

← measured

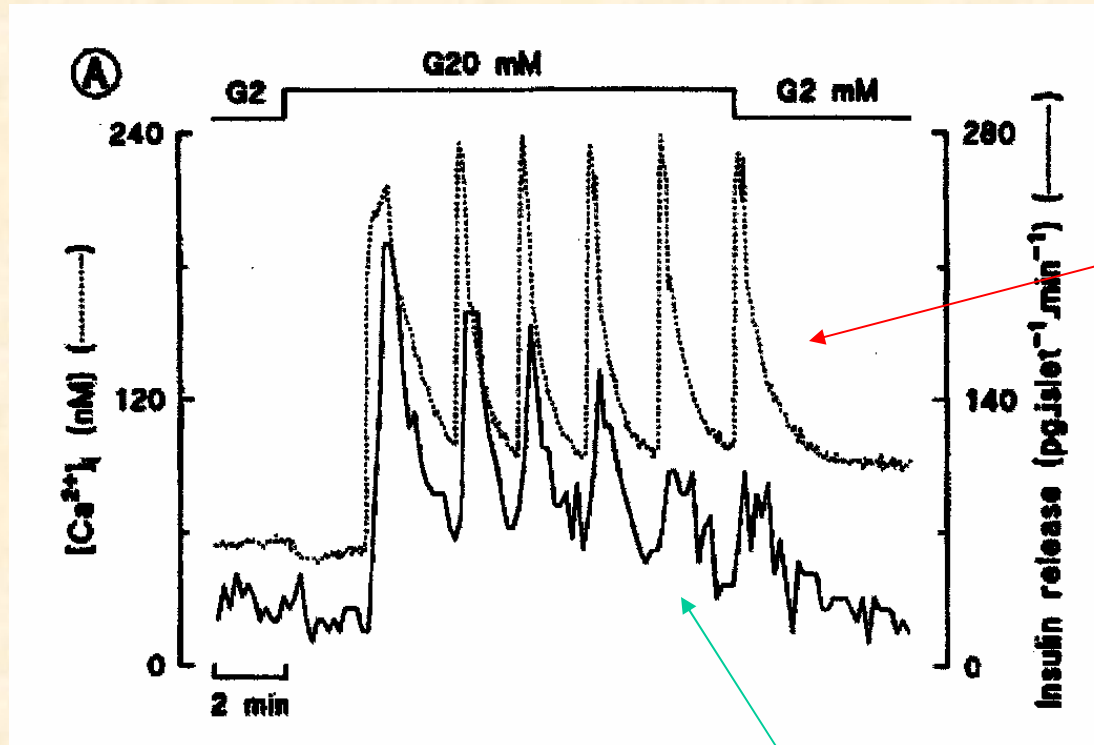
Peripheral insulin measurements in the blood of humans exhibits oscillations, suggesting that insulin is secreted in a pulsatile manner.

# Central Questions:

1. What is the biophysical mechanism for pulsatile insulin secretion from an islet?
2. How do the many islets in a pancreas synchronize their activity?

# 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.

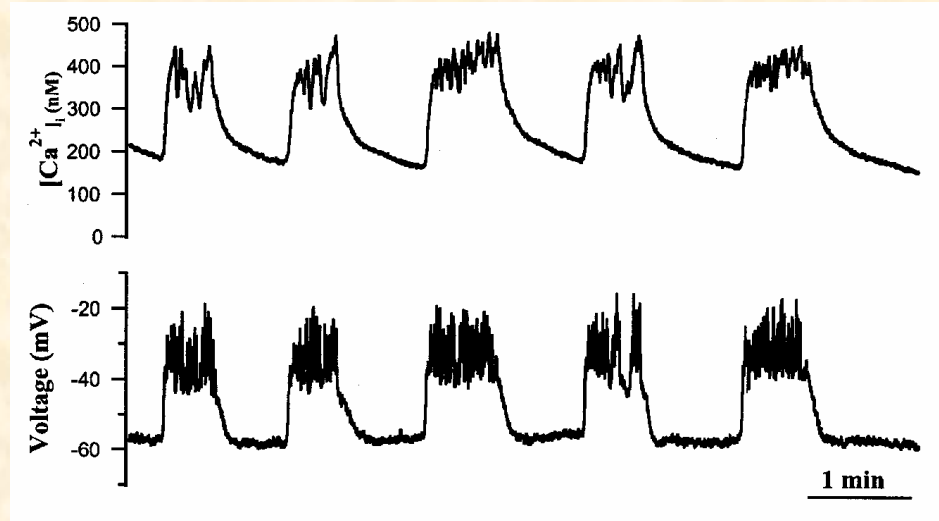


Gilon et al.,  
JBC, 268:22265,  
1993

calcium

# Islets Have Characteristic Patterns of Electrical Activity

# Fast Bursting Oscillations

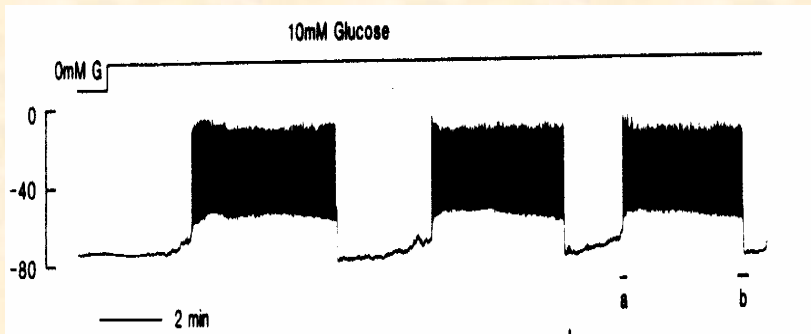


Simultaneous fast  $Ca^{2+}$  and voltage measurements from a mouse islet in 11.1 mM glucose. From Zhang et al., *Biophys. J.*, 84:2852, 2003



# Slow Bursting Oscillations

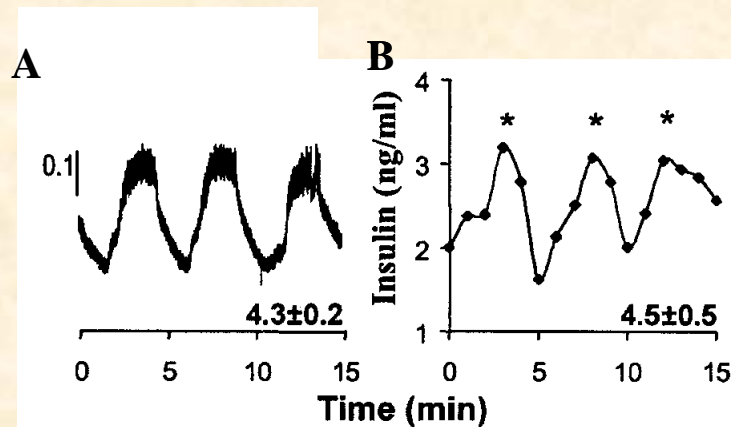
Slow oscillations of  $\text{Ca}^{2+}$  and voltage from an islet...



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

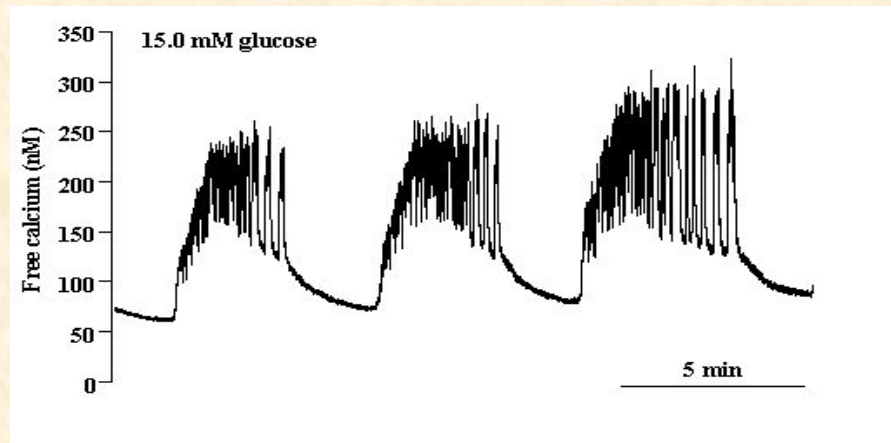


Henquin et al., *Eur. J. Physiol.*, 393:322, 1982

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)

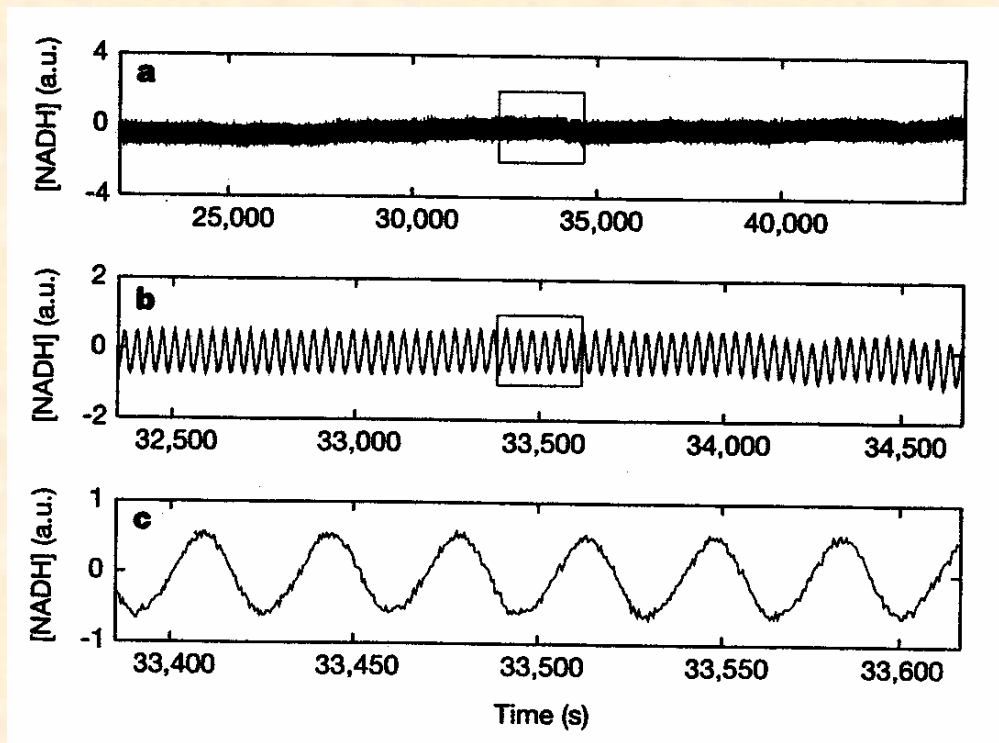
Goal: Develop a Mathematical Model  
That Can Reproduce the Various  
Patterns of Activity

# The Dual Oscillator Model

# Central Hypothesis

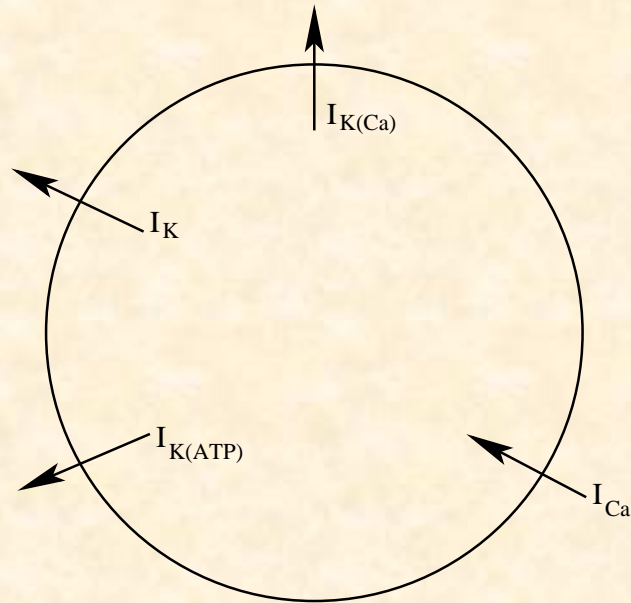
Fast, slow, and compound oscillations can all be produced by a mechanism that includes  $\text{Ca}^{2+}$  feedback onto ion channels (for the **fast component** of the oscillation) and glycolytic oscillations (for the **slow component**). This mechanism is the basis for our recent **Dual Oscillator Model (DOM)** for  $\beta$ -cell activity.

# Glycolytic Oscillations in Yeast



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

# Electrical Component of the DOM



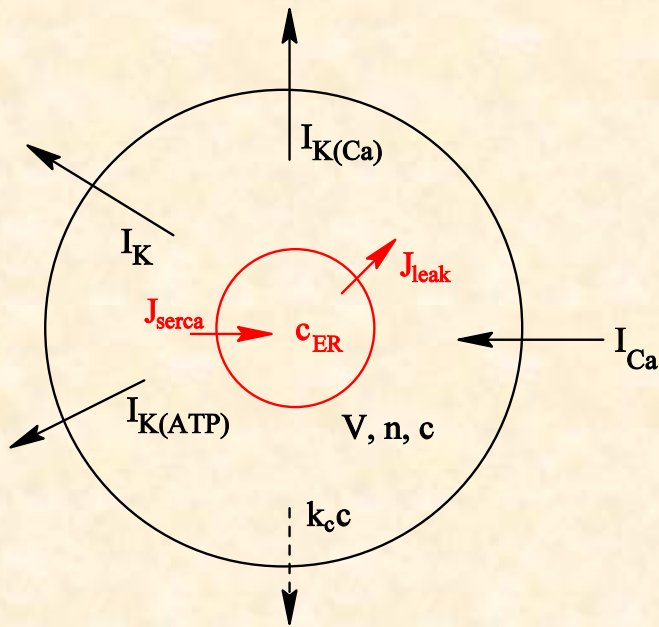
$$\dot{V} = -(I_{Ca} + I_K + I_{K(Ca)} + I_{K(ATP)}) / C_m$$
$$\dot{n} = (n_\infty(V) - n) / \tau_n$$

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



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

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

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

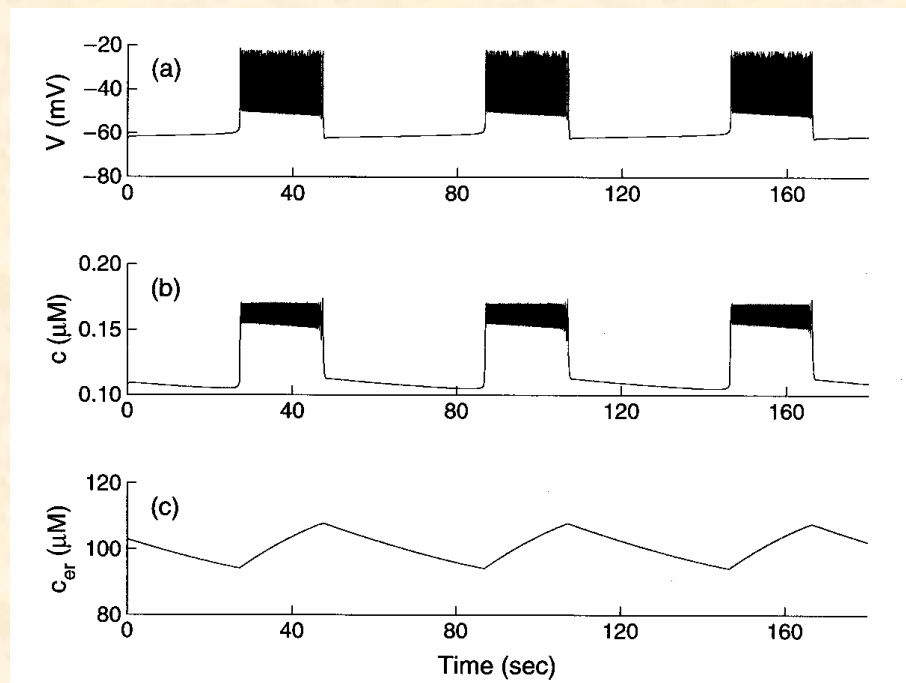
$$\dot{c}_{ER} = f_{ER} \left( V_{cyt} / V_{ER} \right) (J_{serca} - J_{leak})$$

## ER is the Endoplasmic Reticulum

Ca<sup>2+</sup> enters the cell through L-type Ca<sup>2+</sup> channels. The free cytosolic Ca<sup>2+</sup> activates K(Ca) channels. Thus, there is mutual feedback between the electrical and Ca<sup>2+</sup> components.

# Fast Oscillations with the DOM

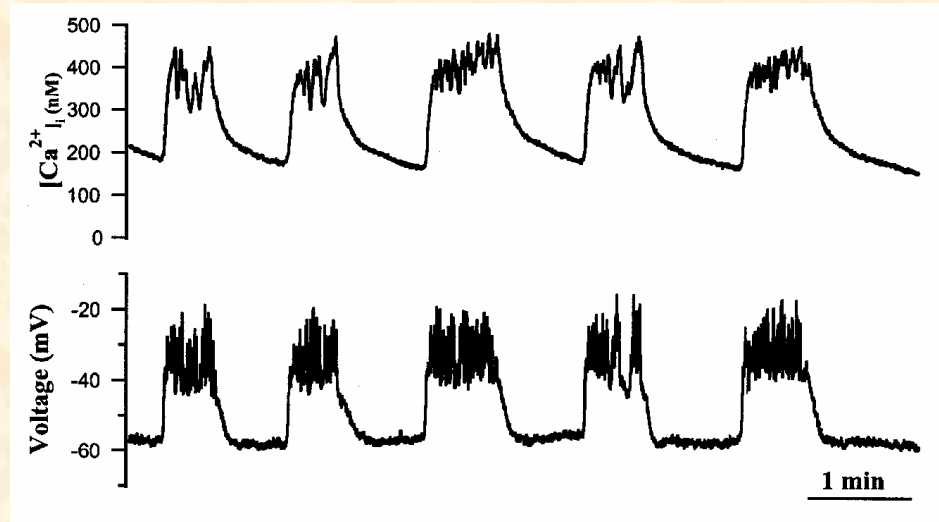
When glycolysis is non-oscillatory, the DOM produces fast bursting oscillations, due to the electrical/calcium components of the model.



Bertram and  
Sherman, BMB,  
66:1313, 2004

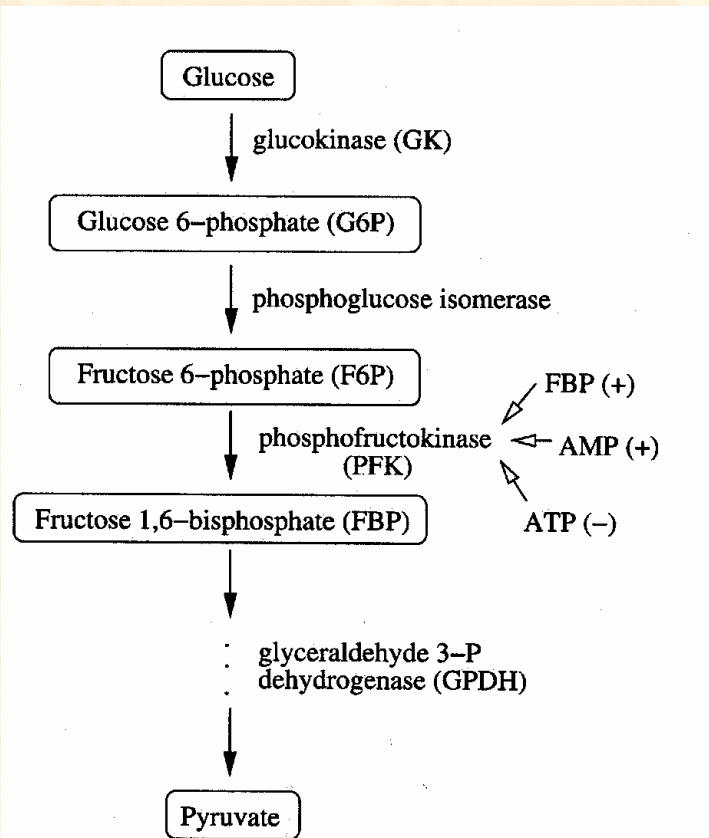
The ER acts as a slow  $\text{Ca}^{2+}$  filter, setting the period of bursting through its interaction with the cytosol.

# 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



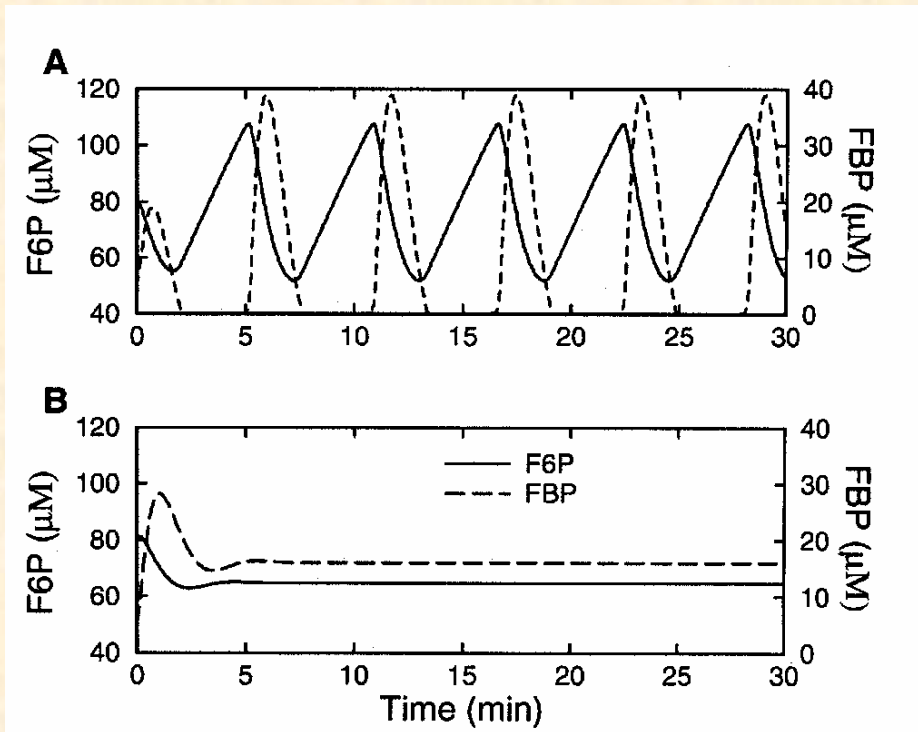
$$\frac{d F6P}{d t} = \lambda(J_{GK} - J_{PFK})$$

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

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

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

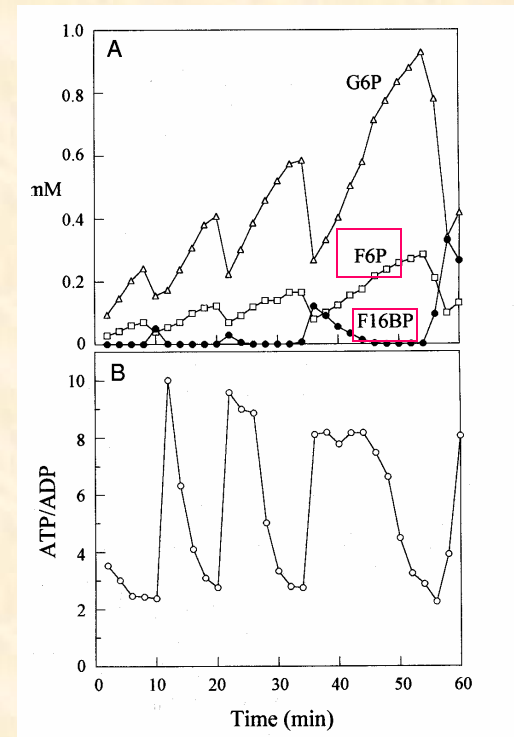
Solid-F6P, Dashed-FBP



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

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

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

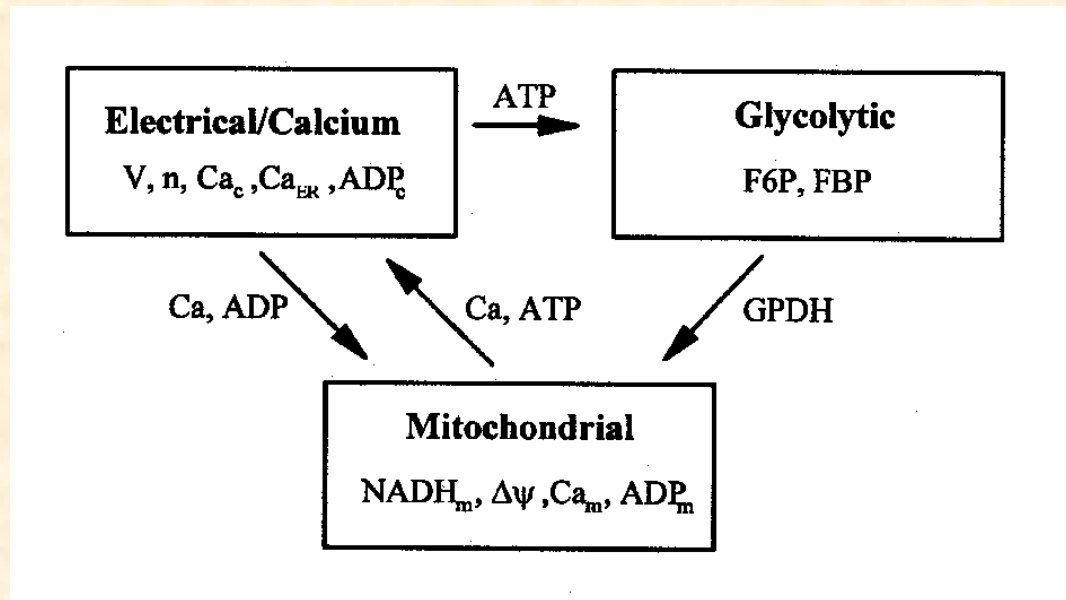


Glycolytic oscillations in muscle extracts (Tornheim, *Diabetes*, 46:1375, 1997)

# Mitochondrial Component

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

Final 3-compartment model:



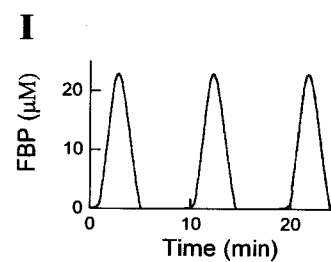
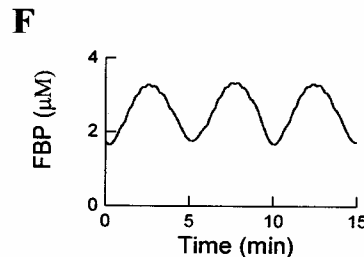
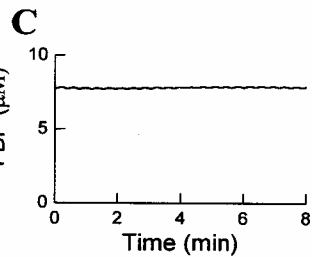
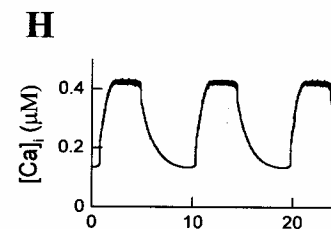
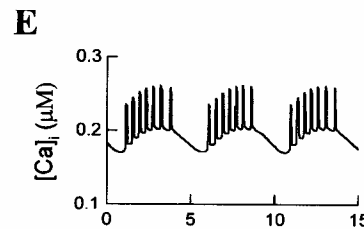
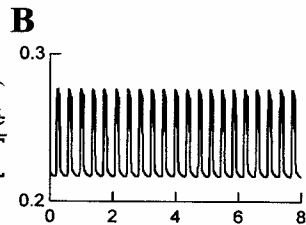
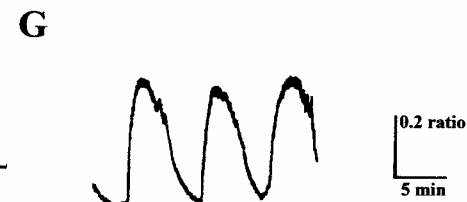
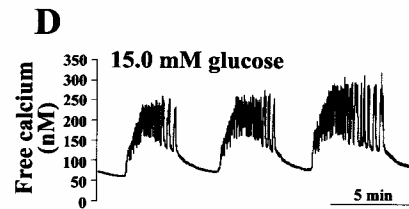
# The Three Types of Activity can be Reproduced by the Model

No glycolytic oscillations

With glycolytic oscillations

With glycolytic oscillations

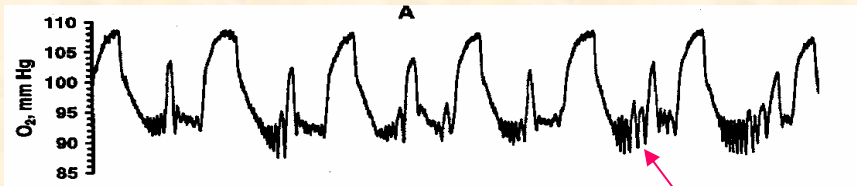
Experiment



Model

Model

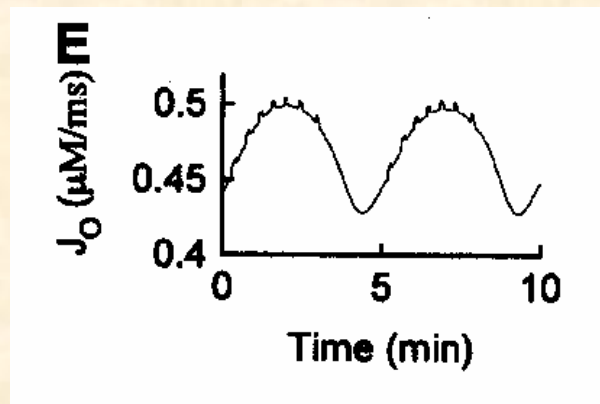
# DOM Reproduces the Slow Rhythm and “Teeth” in O<sub>2</sub> Consumption



O<sub>2</sub> measured  
with O<sub>2</sub> electrode

Jung et al., *BBRC*, 259:331, 1999

Teeth in oxygen concentration



Teeth in oxygen  
consumption

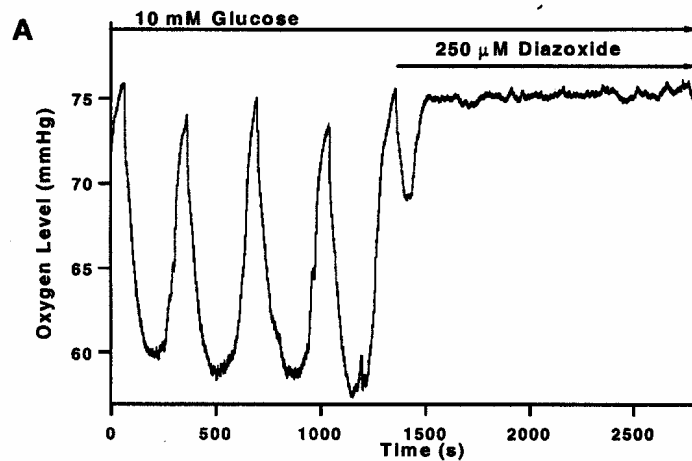
Bertram et al., *BJ*, 92:1544, 2007



# Terminating Bursting Terminates Metabolic Oscillations in Islets

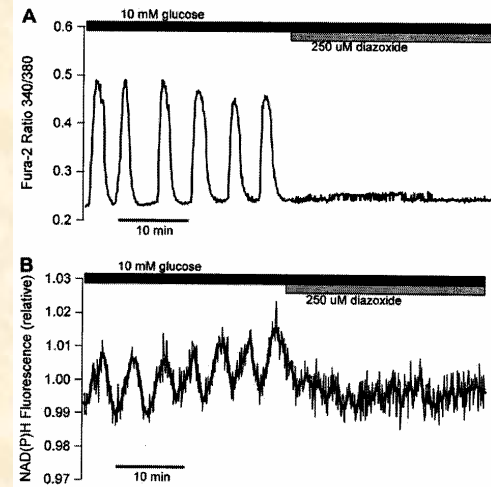
Diazoxide hyperpolarizes the islet, terminating electrical activity.

Oxygen



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

NADH



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

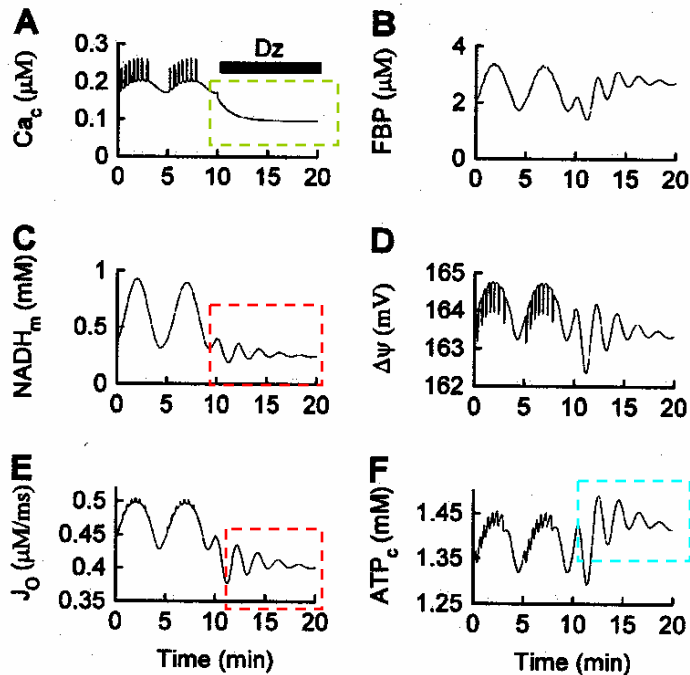
# Kennedy's Conclusion

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.

# Kennedy Data Consistent with the DOM

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  $Ca^{2+}$  concentration is reduced

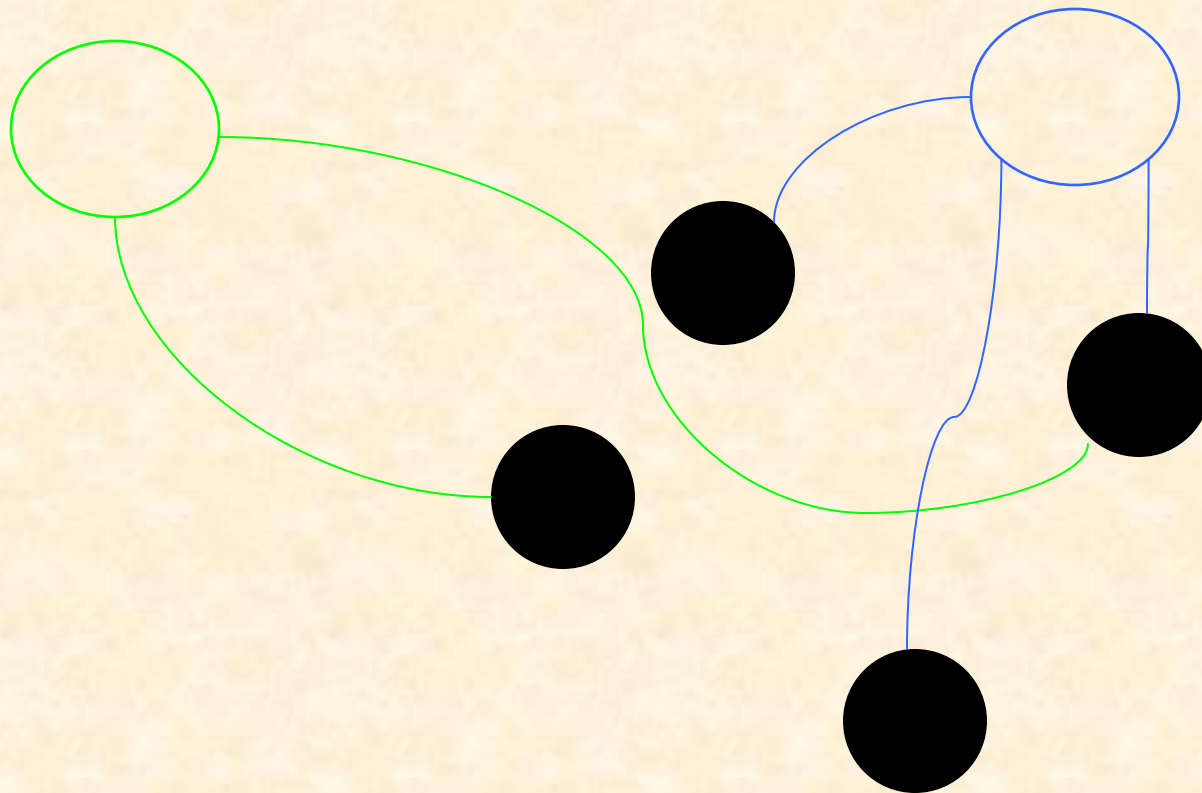
3.  $Ca^{2+}$  pumps don't need to work as hard, so less ATP is utilized.

4. Cytosolic ATP level increases

5. The ATP inhibits PFK, terminating metabolic oscillations

How are Islets Synchronized?

# Hypothesis: Islets are Entrained by Intrapancreatic Ganglia

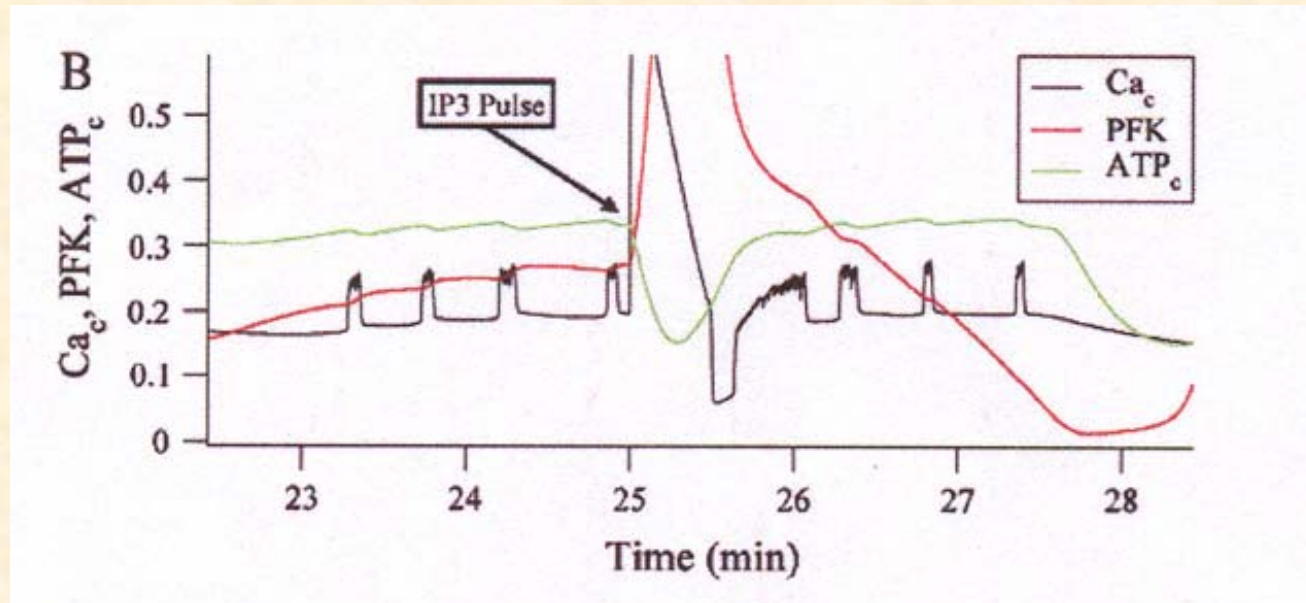


# The Idea and Evidence for It

- Intrapancreatic ganglia send out axons that innervate islets
- The synapses onto islets release Acetylcholine (ACh) and islets have muscarinic ACh receptors
- Stimulation of the vagus nerve, which connects to ganglia, induces insulin release from islets

**Idea:** Ganglia send out periodic pulses that entrain the islet oscillators, thus synchronizing the islet population

# What's the Mechanism of Action of ACh?



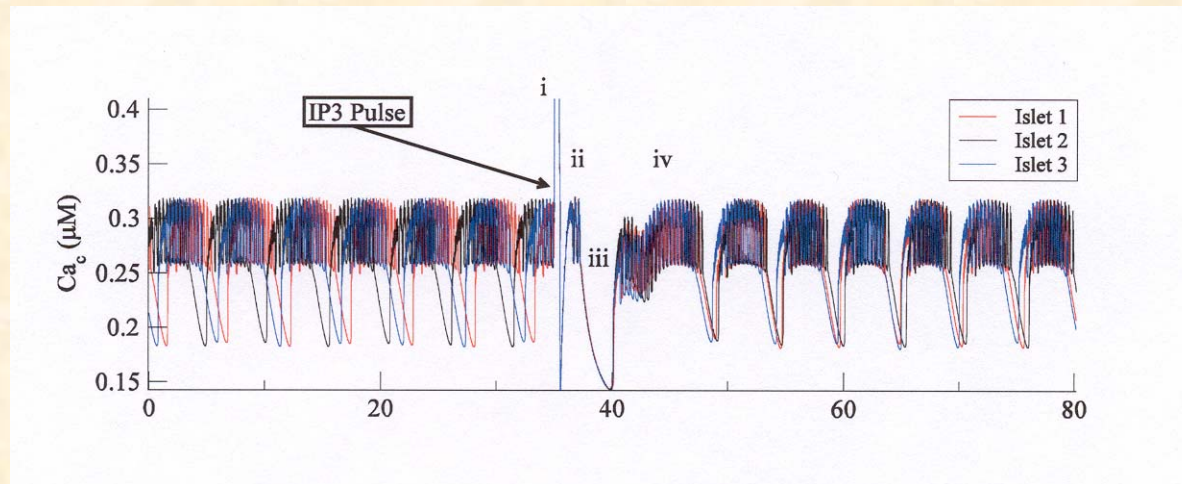
Zhang et al., BJ, 95:4676, 2008

The effect of a pulse of ACh is to perturb the glycolytic oscillator via transient stimulation of PFK.



# Modeling Suggests an *in vitro* Experiment

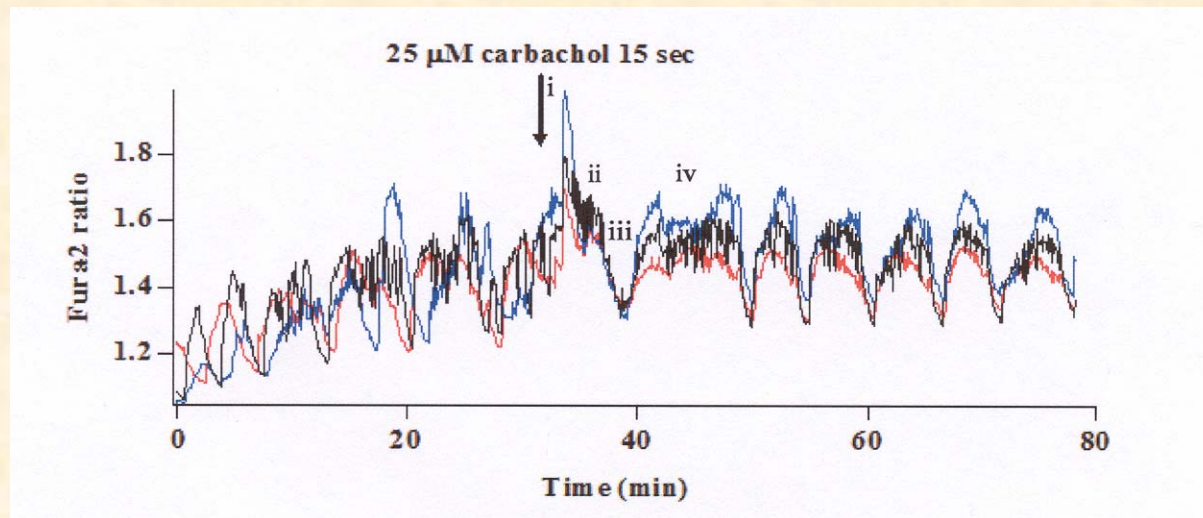
Experiment: Put some islets in a dish and measure cytosolic  $\text{Ca}^{2+}$  levels for each islet as oscillations proceed. Add a single large bolus of ACh to the bath and see if the islets synchronize.



Simulation with 3 model islets, following single pulse of ACh



# The *in vitro* Experiment Matched the Prediction of the Model



Zhang et al., BJ, 95:4676, 2008

Three islets synchronized by a single pulse of the muscarinic agonist carbachol.

## A More Realistic Scenario

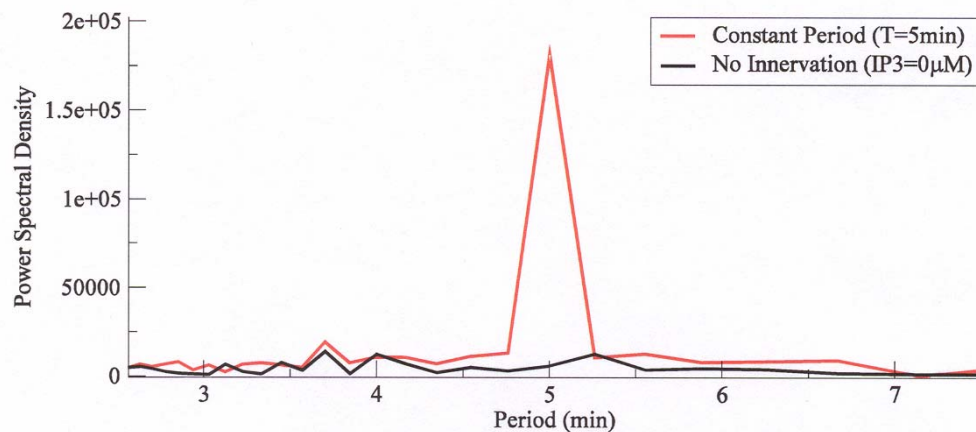
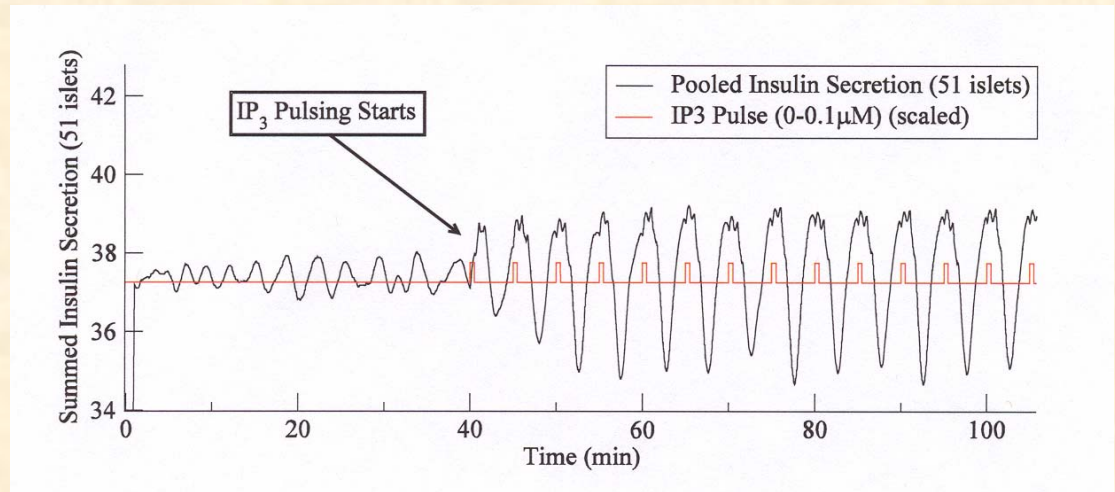
In an *in vivo* setting the ACh pulses will not be as large.  
**Can a periodic train of small ACh pulses synchronize the islet population?**

How should we measure synchronization for a large model islet population?

Each model islet has an insulin secretion variable. Sum this over the islet population. Synchronous oscillations will produce large-amplitude summed insulin oscillations.

# Model Islets Synchronized by $IP_3$ Pulse Train

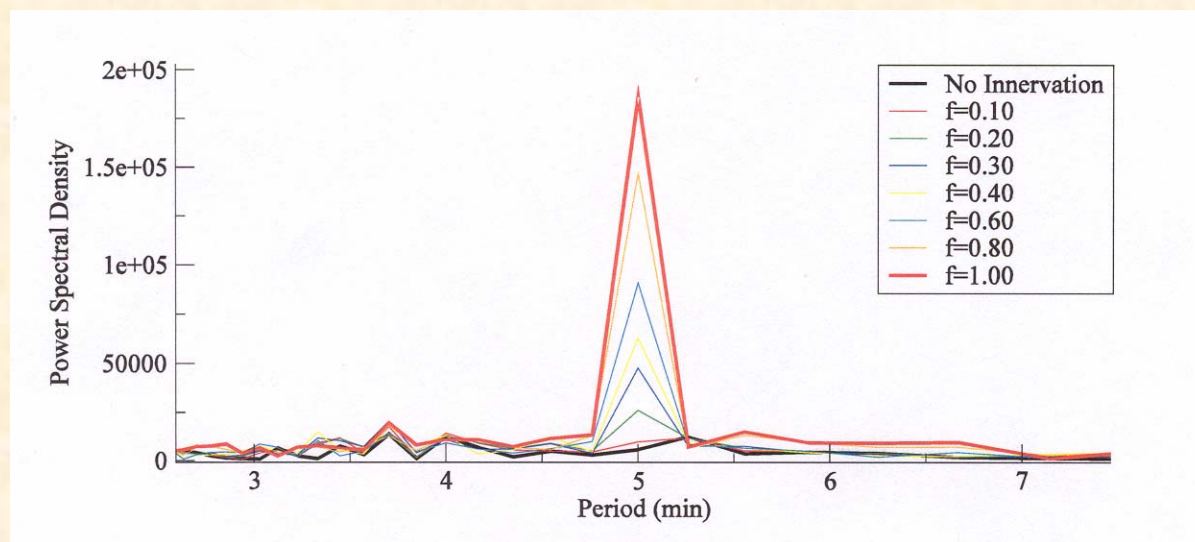
Time course of summed insulin secretion



Power spectrum, with (red) and without (black) periodic  $IP_3$  input

# Synchronization Occurs with only a Small Fraction of Islet Innervation

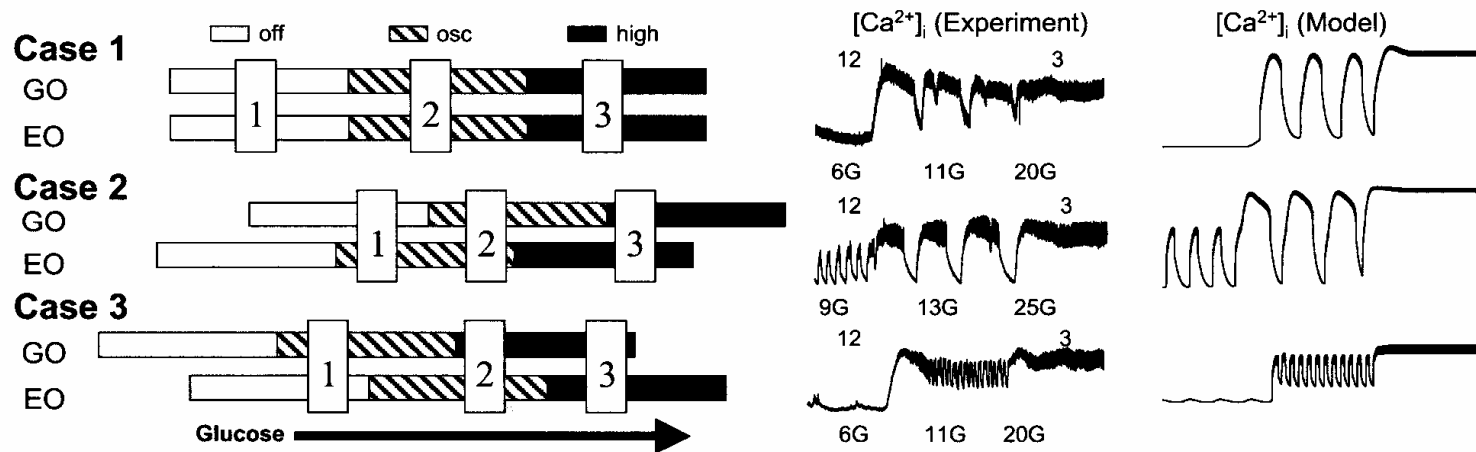
It is not known how many of the islets are innervated by ganglia. **How effective is entrainment if only a fraction of islets are innervated?**



Power spectrum from a population of 50 heterogeneous islets.

**Thank You!**

# Glucose Response Can Be Explained with a Sliding Bar Diagram



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

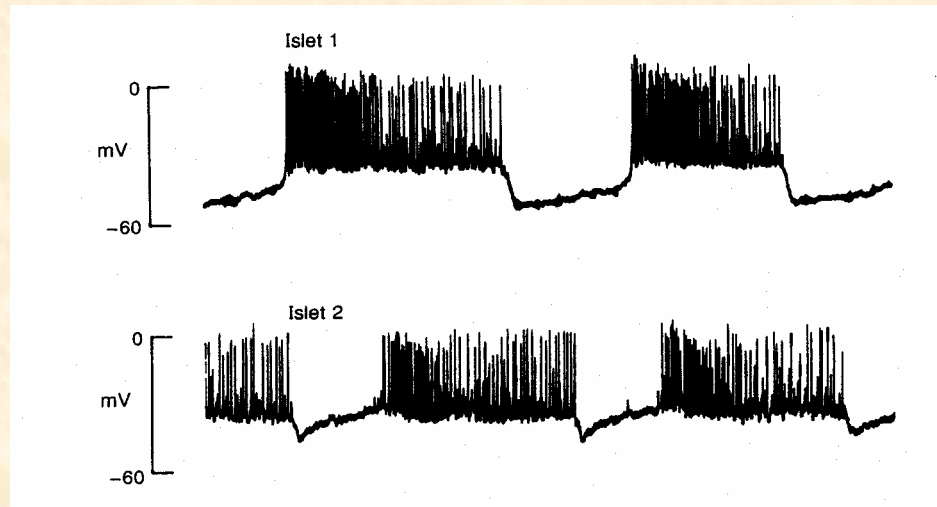
Model reproduces the islet response to changes in the **glucose level**, the primary hormone affecting islets.



# In Vivo Bursting Found To Be Asynchronous

*In vivo* synchronous membrane potential oscillations in mouse pancreatic  $\beta$ -cells: lack of co-ordination between islets

M. Valdeolmillos, A. Gomis and J. V. Sánchez-Andrés

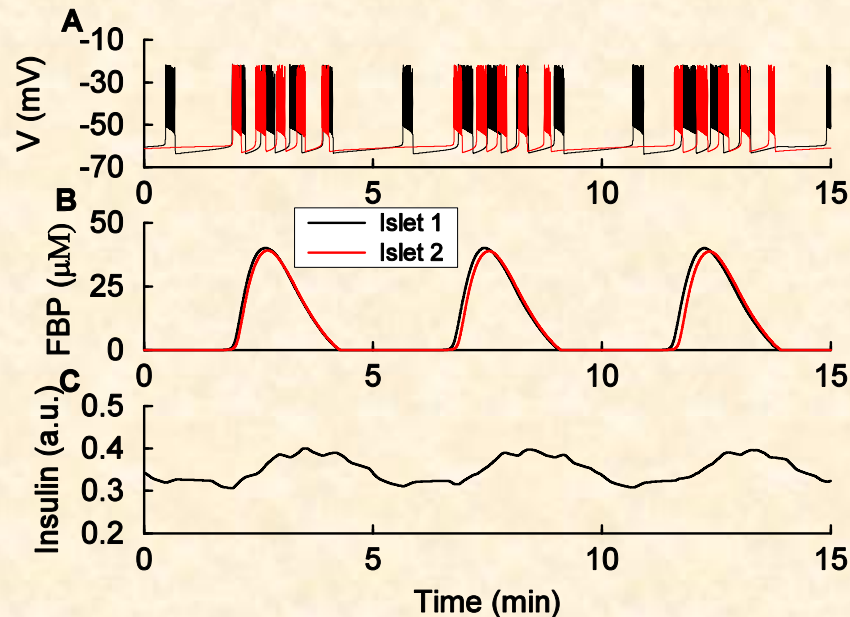


*J. Physiol.*, 493:9,  
1996

Electrical recordings from two islets *in vivo* show that islet bursting is not synchronized

# Electrical Synchronization Not Required

The DOM predicts that insulin secretion oscillations within an islet population can be synchronized even if the individual fast bursts are not synchronized. That is, **only the glycolytic oscillations need be synchronized.**

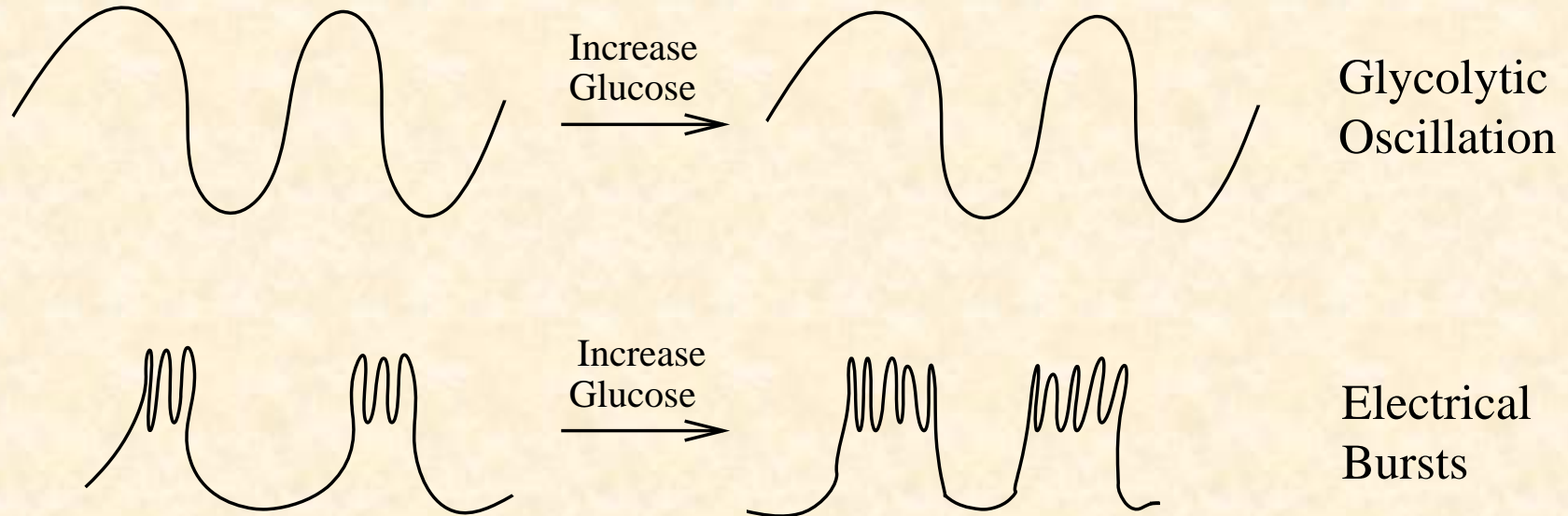


This can account for *in vivo* data from Valdeolmillos et al. (J. Physiol., 493:9, 1996) showing that bursting oscillations in two islets were not synchronized.



# Why Compound Oscillations?

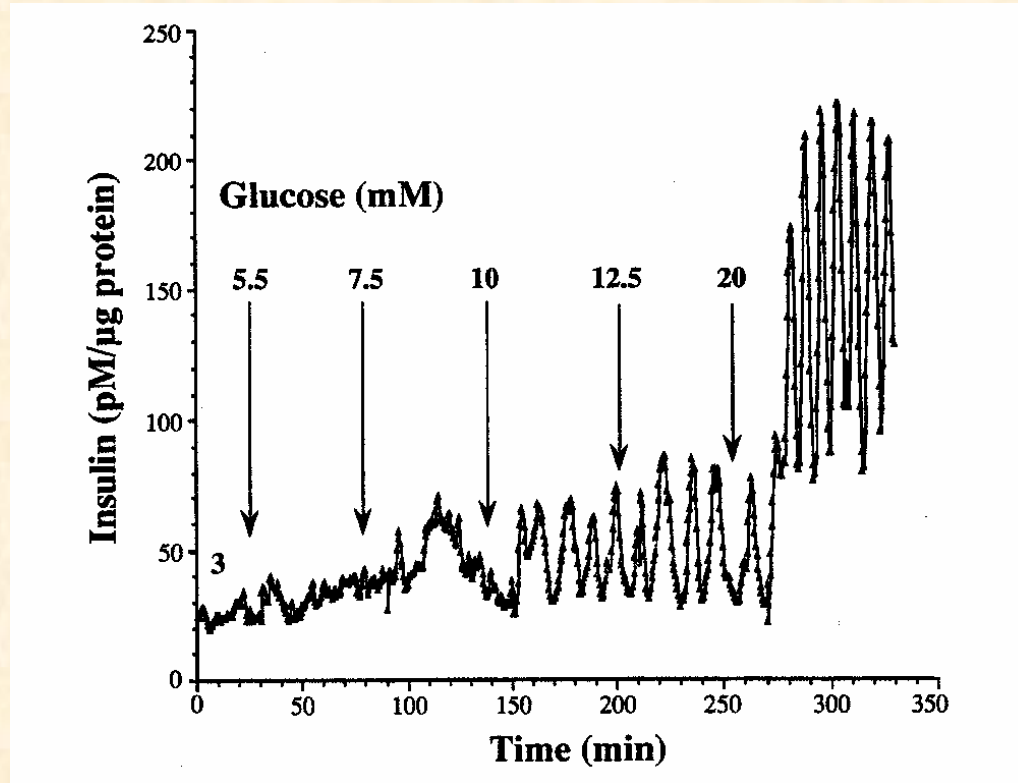
# Metronome Hypothesis



The frequency of glycolytic oscillations in the DOM is only moderately sensitive to the glucose concentration. However, the plateau fraction (i.e., duty cycle) of the inner bursts is very sensitive to glucose. When glucose is increased, the plateau fraction increases. This **amplifies the amplitude** of the insulin oscillation, while the effect on frequency is smaller.

# Increasing Glucose Primarily Increases Insulin Oscillation Amplitude

Perifused islets



Cunningham et al.,  
*Am. J. Physiol.*,  
271:E702, 1996

Data from several labs have shown that increasing glucose primarily **increases the amplitude** of insulin oscillations. The change in frequency is more modest.