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Supplemental information

Slow oscillations persist in pancreatic beta cells lacking phosphofruc-

tokinase M

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¹ **Slow oscillations persist in pancreatic beta cells lacking**

² **phosphofructokinase M**

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7 **Supporting Material**

8 **1. List of TaqMan assay probes**

Table S1. List of TaqMan assay probes for gene expression analysis by RT-qPCR.

9 **2. Model equations and parameters**

 The Integrated Oscillator Model (IOM) used in this paper is built upon previously developed mathematical models [1, 2] and consists of modules. The first module describes the cellular 12 electrical activity and intracellular Ca^{2+} dynamics. The second module describes the components of the metabolic pathway included in our model: glycolysis and mitochondrial metabolism.

15 *The electrical and calcium module*

16 The rate of change of the cellular membrane potential, *V^M* , is expressed by

$$
\frac{dV_M}{dt} = \frac{1}{C} \left[I_{\text{Ca}} + I_{\text{K(Ca)}} + I_{\text{K(ATP)}} + I_{\text{K}} \right],\tag{S1}
$$

17 where C is the membrane capacitance, I_{Ca} is the V_M -dependent Ca²⁺ current, $I_{K(Ca)}$ is the Ca²⁺-18 activated K⁺ current, $I_{K(ATP)}$ is the ATP-dependent K⁺ current, and I_K is the delayed-rectifying

19 K⁺ current:

$$
I_{\text{Ca}} = g_{\text{Ca}} m_{\infty} (V_M) (V_M - V_{\text{Ca}}) \quad , \tag{S2}
$$

$$
I_{K(Ca)} = g_{K(Ca)} q_{\infty}(c) (V_M - V_K) \quad , \tag{S3}
$$

$$
I_{K(ATP)} = g_{K(ATP)} o_{\infty} (ADP, ATP)(V_M - V_K) \quad , \tag{S4}
$$

$$
I_{\rm K} = g_{\rm K} n (V_M - V_{\rm K}) \quad . \tag{S5}
$$

- 20 The upstroke and downstroke of action potentials are mediated by I_{Ca} and I_{K} , respectively. The
- 21 K(Ca) and K(ATP) currents are involved in clustering action potentials into bursts.
- 22 The activation functions for I_{Ca} , $I_{\text{K(Ca)}}$, and $I_{\text{K(ATP)}}$ are given by

$$
m_{\infty}(V_M) = \frac{1}{1 + \exp[(v_m - V_M)/s_m]} \tag{S6}
$$

$$
q_{\infty}(Ca) = \frac{Ca^2}{k_d^2 + Ca^2} \tag{S7}
$$

$$
o_{\infty}(\text{ADP, ATP}) = \frac{0.08 + 0.89 \left(\frac{\text{MgADP}}{k_{dd}}\right)^{2} + 0.16 \left(\frac{\text{MgADP}}{k_{dd}}\right)}{\left(1 + \frac{\text{MgADP}}{k_{dd}}\right)^{2} \left(1 + \frac{\text{ATP}^{4-}}{k_{tt}} + \frac{\text{ADP}^{3-}}{k_{td}}\right)}
$$
(S8)

- 23 with MgADP = 0.165 ADP, ATP^{4−} = 0.05 ATP, and ADP^{3−} = 0.135 ADP. The parameters of
- 24 this module are given in Table S2.
- The activation variable for the delayed-rectifying K^+ current, *n*, is given by

$$
\frac{dn}{dt} = \frac{n_{\infty}(V_M) - n}{\tau_n} \tag{S9}
$$

where

$$
n_{\infty}(V_M) = \frac{1}{1 + \exp[(v_n - V_M)/s_n]} \quad . \tag{S10}
$$

- 26 The dynamics of the free Ca^{2+} concentration in the cytosol, Ca , in the mitochondria, Ca_m , and
- 27 in endoplasmic reticulum (ER), Ca_{er} , are given by

$$
\frac{dCa}{dt} = f_{Ca} (J_{\text{mem}} - J_{\text{er}} - J_{\text{m}}) ,
$$

$$
\frac{dCa_{\text{m}}}{dt} = f_{Ca} \sigma_{\text{m}} J_{\text{m}} ,
$$

$$
\frac{dCa_{\text{er}}}{dt} = f_{Ca} \sigma_{\text{er}} J_{\text{er}} ,
$$
 (S11)

28 Here, f_{Ca} is the fraction of Ca²⁺ ions not bound to buffers, and J_{mem} , J_{m} , and J_{er} represent the Ca^{2+} flux densities across the plasma membrane, into the mitochondria, and into the ER, 30 respectively:

$$
J_{\text{mem}} = -\left[\frac{\alpha}{V_{\text{cyt}}}I_{\text{Ca}} + k_{\text{PMCA}}Ca\right],
$$
 (S12)

$$
J_{er} = k_{\text{SERCA}} C a - k_{Nac} (C a_m - C a) \quad , \tag{S13}
$$

$$
J_m = J_{\text{uni}} - J_{Naca} \quad . \tag{S14}
$$

31 The terms J_{uni} and J_{NaCa} represent the flux through the Ca²⁺ pumps and through the Na⁺/ Ca²⁺ 32 exchanger, respectively:

$$
J_{\text{uni}} = (p_{21}\psi_{\text{m}} - p_{22})Ca^2 \quad , \tag{S15}
$$

$$
J_{\text{NaCa}} = p_{21}(Ca_{\text{m}} - Ca) \exp(p_{24}\psi_{\text{m}}) \quad . \tag{S16}
$$

Table S1. Parameter values for the electrical and calcium module.

35

36 *The metabolic module*

37 The cytosolic concentrations of F6P and FBP are described by

$$
\frac{d\text{F6P}}{dt} = 0.3(J_{\text{GK}} - J_{\text{PFK}}),
$$

$$
\frac{d\text{FBP}}{dt} = J_{\text{PFK}} - \frac{1}{2} \frac{J_{\text{PDH}}}{\sigma_{\text{m}}},
$$
 (S17)

38 where J_{GK} is the glucose-dependent glucokinase (GK) reaction rate, J_{PFK} is the 39 phosphofructokinase (PFK) reaction rate defined in (1) , and J_{PDH} is the pyruvate 40 dehydrogenase (PDH) reaction rate. Since the glucose level is the same in all simulations, J_{GK} 41 does not vary. Flux through PDH is described by

$$
J_{\rm PDH} = v_{\rm PDH} \frac{1}{K_{\rm NADH_m, PDH} + \frac{\rm NADH_m}{\rm NAD_m}} J_{\rm GPDH} \tag{S18}
$$

42 where v_{PDH} is the maximum PDH reaction rate. The glycerol-3-phosphate dehydrogenase 43 (GPDH) reaction rate, J_{GPDH} , is

$$
J_{\text{GPDH}} = \frac{Ca_m}{K_{GPDH} + Ca_m} \sqrt{\text{FBP}} \quad . \tag{S19}
$$

44 The adenosine diphosphate (ADP) dynamics are given by

$$
\frac{dADP}{dt} = J_{\text{hyd}} - \frac{J_{\text{ANT}}}{\sigma_{\text{m}}} \tag{S20}
$$

45 where J_{hyd} reflects ATP hydrolysis and J_{ANT} is the flux of ATP produced in the mitochondria 46 and transported to the cytosol through the adenine nucleotide translocator (ANT),

$$
J_{\text{hyd}} = (k_{\text{hyd}} C a + k_{\text{hyd},\text{bas}}) \text{ATP} \tag{S21}
$$

$$
J_{\text{ANT}} = p_{19} \frac{\frac{\text{ATP}_{\text{m}}}{\text{ADP}_{\text{m}}}}{\frac{\text{ATP}_{\text{m}}}{\text{ADP}_{\text{m}}} + p_{20}} \exp\left(\frac{\text{F}}{2RT} \psi_{\text{m}}\right) \tag{S22}
$$

47 The hydrolysis term has a Ca^{2+} -independent term that represents ATP hydrolysis for cell 48 homeostasis, and a Ca^{2+} -dependent term that represents hydrolysis by Ca^{2+} pumps present on 49 the plasma and ER membranes.

50 The model assumes that the total nucleotide concentrations in the cytosol and in the 51 mitochondria (A_{tot} and $A_{\text{tot,m}}$, respectively) is constant, and that the sum of both cytosolic and 52 mitochondrial nucleotides are conserved:

$$
ATP = \frac{1}{2} \bigg[A_{\text{tot}} + \sqrt{-4ADP^2 + (A_{\text{tot}} - ADP)^2 - ADP} \bigg] , \qquad (S23)
$$

$$
ATP_m = A_{\text{tot,m}} - ADP_m \quad . \tag{S24}
$$

53 There are two terms for NADH production: production due to pyruvate dehydrogenase (I_{PDH}) , 54 and production due to the combined action of dehydrogenases in the citric acid cycle (J_{DH}) . 55 The mitochondrial concentration of NADH is then

$$
\frac{d\text{NADH}_{\text{m}}}{dt} = J_{\text{PDH}} + J_{\text{DH}} - J_{\text{O}} \quad , \tag{S25}
$$

56 where J_{PDH} is given by (S18) and J_{DH} and the oxygen consumption rate (J_0) are:

$$
J_{\rm DH} = v_{\rm DH} \frac{Ca_{\rm m}}{K_{\rm DH} + Ca_{\rm m}} \frac{1}{K_{\rm NADH_{\rm m},DH} + \frac{\rm NADH_{\rm m}}{\rm NAD_{\rm m}}},
$$
(S26)

$$
J_{\rm O} = p_4 \frac{\text{NADH}_{\rm m}}{p_5 + \text{NADH}_{\rm m}} \frac{1}{1 + \exp\left(\frac{\psi_{\rm m} - p_6}{p_7}\right)} \tag{S27}
$$

57 The model assumes nucleotide conservation:

$$
NAD_m = N_{\text{tot,m}} - NADH_m \quad , \tag{S28}
$$

58 where $N_{\text{tot,m}}$ is the total concentration in the mitochondria.

59 The changes in the dynamics of the mitochondrial membrane potential, ψ_m , are described by

$$
\frac{d\psi_{\rm m}}{dt} = \frac{1}{C_{\rm m}} \left[J_{\rm Hres} - J_{\rm Hatp} - J_{\rm Hleak} - J_{\rm ANT} - J_{\rm NaCa} - 2J_{\rm uni} \right] \tag{S29}
$$

Here, C_m is the mitochondrial inner membrane capacitance, J_{Hres} is the flux through respiration-61 driven proton pumps, J_{Hatp} is the proton flux entering the mitochondria through the ATPase, 62 while J_{Hleak} is the proton flux entering the mitochondria through leakage down the proton 63 gradient:

$$
J_{\text{Hres}} = p_8 \frac{\text{NADH}_{\text{m}}}{p_9 + \text{NADH}_{\text{m}} \frac{1}{1 + \exp\left(\frac{\psi_{\text{m}} - p_{10}}{p_{11}}\right)}} \tag{S30}
$$

$$
J_{\text{Hatp}} = 3J_{\text{F1F0}} \quad , \tag{S31}
$$

$$
J_{\text{Hleak}} = p_{17}\psi_{\text{m}} - p_{18} \quad . \tag{S32}
$$

64 The term J_{F1F0} in (S31) is the rate at which the F1F0 ATP synthase phosphorylates ADP to 65 form ATP:

$$
J_{\text{FIF0}} = p_{16} \frac{p_{13}}{p_{13} + \text{ATP}_{\text{m}}} \frac{1}{1 + \exp\left(\frac{p_{14} - \psi_{\text{m}}}{p_{15}}\right)} \tag{S33}
$$

66 Since mitochondrial ATP production comes at the expense of ADP, the mitochondrial ADP 67 level (ADP_m) is given by

$$
\frac{d\text{ADP}_{\text{m}}}{dt} = J_{\text{ANT}} - J_{\text{FIFO}} \quad , \tag{S34}
$$

68 with J_{ANT} and J_{F1F0} given in (S22) and (S33), respectively.

Parameter	Value	Parameter	Value	Parameter	Value
$J_{\rm GK}$	$0.001 \mu M \text{ ms}^{-1}$	p_{4}	$0.55 \mu M \text{ ms}^{-1}$	p_{15}	8.5 mV
$v_{\rm{PDH}}$	$0.4 \mu M \text{ ms}^{-1}$	p_{5}	250 µM	p_{16}	$4 \mu M \text{ ms}^{-1}$
$K_{\text{NADH}_m,\text{PDH}}$	1.3	p_6	165 mV	p_{17}	$0.0014 \mu M$
					$\rm{ms^{-1}mV^{-1}}$
$K_{\rm GPDH}$	$1.5 \mu M$	p_7	5mV	p_{18}	$0.02 \mu M \text{ ms}^{-1}$
k_{hyd}	1.864	p_8	$7.4 \mu M \text{ ms}^{-1}$	p_{19}	$0.6 \mu M \text{ ms}^{-1}$
	$\times 10^{-6} \mu M \text{ ms}^{-1}$				
$k_{\text{hyd, bas}}$	$6.48 \times 10^{-7} \mu M$	p_9	$100 \mu M$	p_{20}	$\mathfrak{2}$
	ms^{-1}				
$v_{\rm DH}$	$1.1 \mu M \text{ ms}^{-1}$	p_{10}	165 mV	$A_{\rm tot}$	$3000 \mu M$
$K_{\text{NADH}_m,\text{DH}}$	1.3	p_{11}	5 mV	$A_{\rm tot,m}$	15000 μM
$K_{\rm DH}$	$0.8\mu M$	p_{13}	$10000 \mu M$	$N_{\text{tot,m}}$	$10000 \mu M$
\overline{F} 2RT	0.037	p_{14}	190 mV	C_m	180 mV

69 Parameter values for the metabolic module are given in Table S3.

Table S3. Parameter for the metabolic module.

3. Linear mixed effects modelling

 To compare the oscillation properties of islets between different groups of animals, care must be taken to account for the fact that measurements from islets have an inherent non- independence: islets from a given mouse are not independent samples when multiple animals 75 are used in a study. In the case of Ca^{2+} imaging, a batch of islets from an individual animal are assayed in one recording, such that inter-animal variability is not present within recordings from a given animal, but only between recordings from different animals. Similarly, variability due to recording conditions occurs when comparing islets from different recordings, but not within a single recording. Finally, within a single recording we recorded islet responses to multiple glucose levels. Linear mixed effects modelling is a technique designed to explicitly handle precisely this type of hierarchical structure in the data. The response variable of interest is modelled as a function of predictor variables (so-called fixed effects) while accounting for the fact that variance is shared among hierarchical groupings in the data (random effects).

 To test whether oscillation properties were different between islets from male and female PFKM-KO and wild-type animals, we fit linear models using the R function lm, or mixed 86 models using the R function lmer from the lme4 package. For each of voltage, Ca^{2+} , and PKAR data, we fit models for oscillation period and plateau fraction. We included PFKM-KO status, sex, and glucose as fixed effects, except in PKAR models where glucose was always 89 11.1 mM. Mouse, recording, and islet were specified as random effects for the analysis of Ca^{2+} data. For voltage recordings, in which only one islet is measured per recording, recording was omitted as a random effect. For PKAR, islets were only exposed to a single glucose level, so islet was omitted as a random effect. The model specification and fitting summaries are shown below; all models were fit using REML=TRUE. Summary tables were generated using the 94 "tab model" function from the R package sjPlot, with p.val="Satterthwaite".

95 *Voltage recordings*

 Table S4. Summary of linear mixed modelling of period and plateau fraction in voltage recordings. Model formulas were: Period ~ Condition + Sex + Glucose + (1|Mouse); Plateau 98 Fraction \sim Condition + Sex + Glucose + (1|Mouse) + (1|Islet). The reference group (intercept) was Female Control at 8mM glucose. Estimates, 95% confidence intervals, and p-value (bold, p<0.05) for each predictor of Period (left) and Plateau Fraction (right) are shown. A summary 101 of the random effects are also shown: σ^2 , mean variance of random effects; τ_{00} , random intercept variance (between subject variance) for each random effect; ICC, intraclass correlation coefficient (proportion of variance explained by the grouping structure); N, number of groups per random effect; Observations, total number of recordings of islets in any 105 combination of fixed effects; Marginal \mathbb{R}^2 , \mathbb{R}^2 value considering only fixed effects; Conditional R^2 , R^2 considering both fixed and random effects.

107

109 *Calcium recordings*

 Table S5. Summary of linear mixed modelling of period and plateau fraction in calcium recordings. Model formulas were: Period ~ Condition + Sex + Glucose + (1|Mouse) + (1|Recording); Plateau Fraction ~ Condition + Sex + Glucose + (1|Mouse) + (1|Recording). The reference group was Female Control at 8mM glucose. The meaning of table entries is as in Table S4.

116 *PKAR recordings*

117 Table S6. Summary of linear mixed modelling of period and plateau fraction in PKAR 118 recordings. Model formulas were: Period ~ Condition + Sex + (1|Mouse) + (1|Recording); 119 Plateau Fraction ~ Condition + Sex. The reference group was Female Control at 11mM

120 glucose. The meaning of table entries is as in Table S4.

121 **4. Number of mice, islets, and recordings**

122

Table S7: Number of mice, islets, and recordings per sex and PFKM-KO condition included in quantitative analysis of period and plateau fraction.

Fig. S1. Comparison of oscillation period and plateau fraction between female and male mice. Violin plots showing mean oscillation period (top panels) and plateau fraction (bottom panels) for islets exposed to specific glucose levels: 8 mM and 11.1mM glucose for membrane potential (panel A) and Ca^{2+} concentration (panel B), or at 11.1 mM glucose for PKAR (panel C). White dots indicate the median across all islets.

References Cited

 2. Marinelli, I., et al., *Transitions between bursting modes in the integrated oscillator model for pancreatic beta-cells.* J. Theor. Biol., 2018. **454**: p. 310-319.