

# Long ECGs reveal rich and robust dynamical regimes in patients with frequent PVCs

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# In collaboration with...

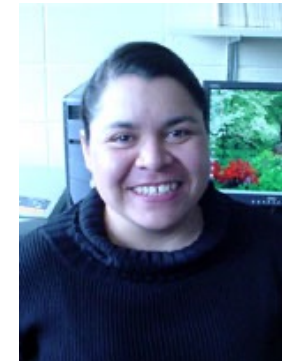
Marc Deyell, MD

Zachary Laksman, MD

Claudia Lerma

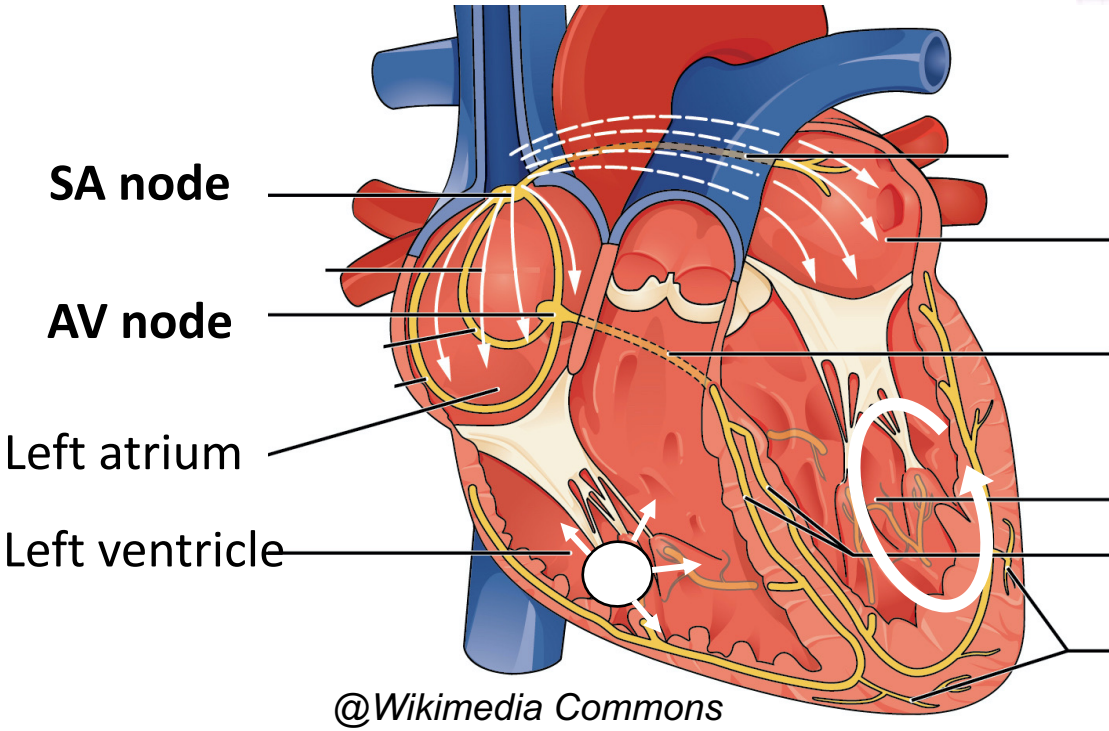
Leon Glass

Gil Bub



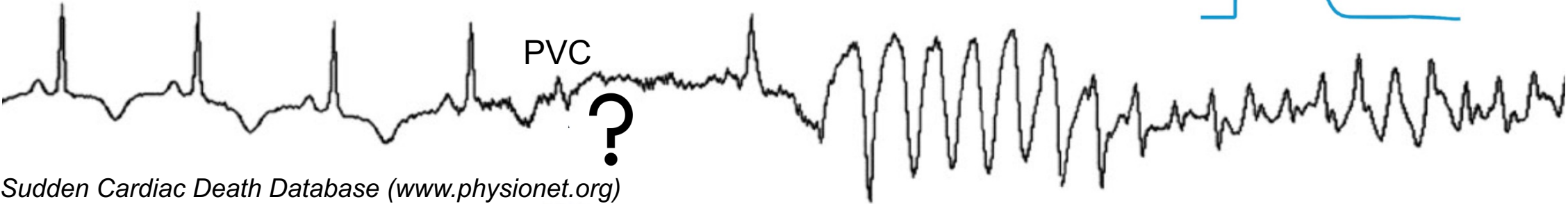
# Ventricular arrhythmia

PVC = Premature Ventricular Complex



### Initiation mechanisms

1. Ectopic pacemaker
2. Reentry
3. Triggered activity



Sudden Cardiac Death Database ([www.physionet.org](http://www.physionet.org))

# Why analyse PVC dynamics?

- Frequent PVCs show increased risk of sudden cardiac death

**Dukes et al.** Ventricular ectopy as a predictor of heart failure and death. JACC (2015)

- Ventricular fibrillation is often preceded by frequent PVCs

**Deyell et al.** Sudden Cardiac Death Risk Stratification. Circulation research. (2015)

- Risk stratification for sudden cardiac death is still a major challenge
- PVC dynamics in patients are rich but poorly understood – still cannot reliably infer mechanism from pattern

How can we analyse PVC dynamics?

# Holter monitor

1947 - Norman Holter



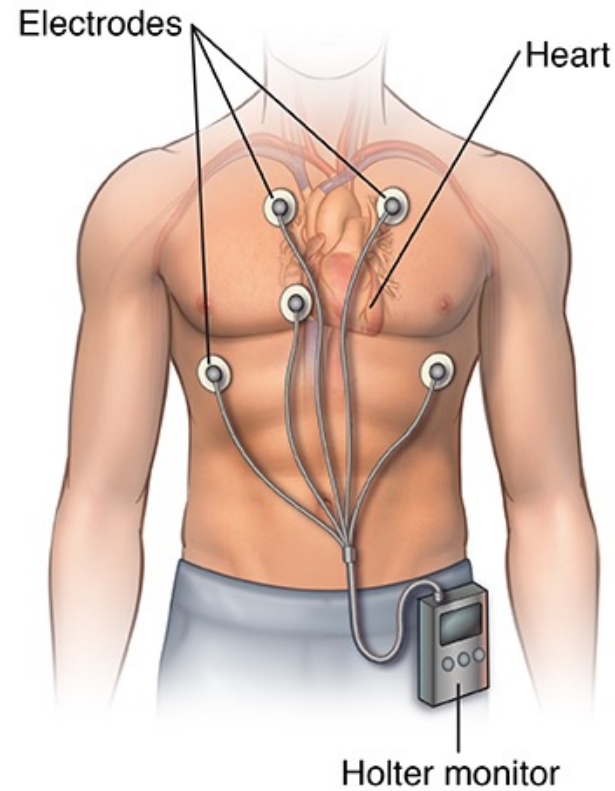
*Wikipedia.* The original Holter biotelemetry apparatus in 1947 weighing 85 lb

1954 – Briefcase recorder



*Image courtesy of National Museum of American History*

1960 – Tape recorder



2010 onwards:



*Icentia cardioSTAT*



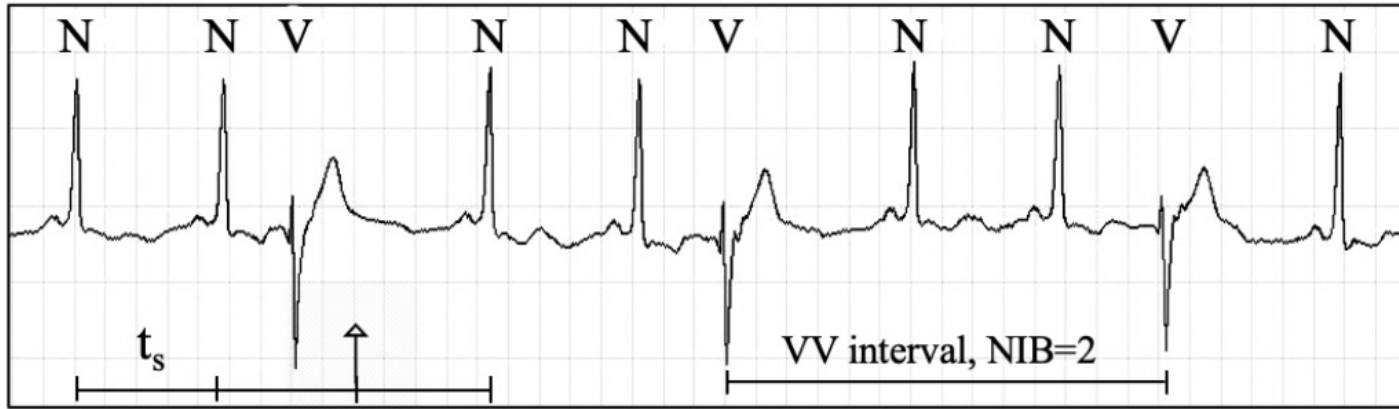
*Apple watch*

**H L Kennedy.** The history, science and innovation of Holter technology. *Annals of Noninvasive Electrocard.* (2006)



# ECG data processing

Cohort of 48 patients with idiopathic frequent PVCs



## Beat detection algorithm

N – normal (sinus) beat

V – premature ventricular complex (PVC)

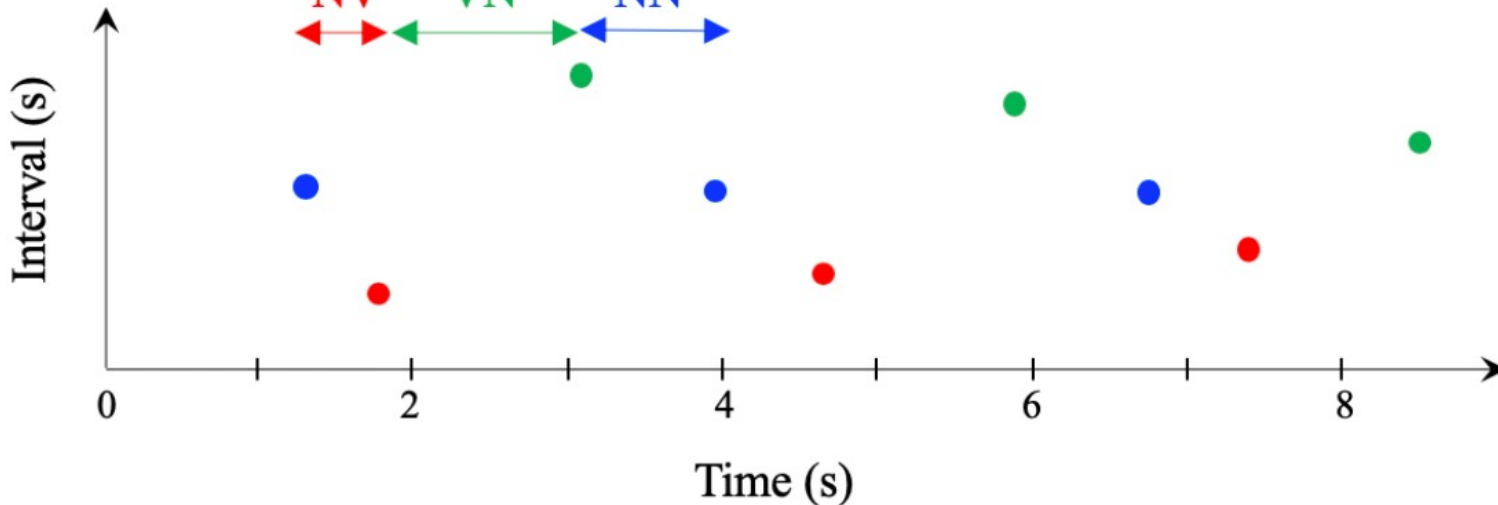
Timing – precise to 250Hz

## Beat-to-beat interval plot

NV – coupling interval

VN – compensatory pause

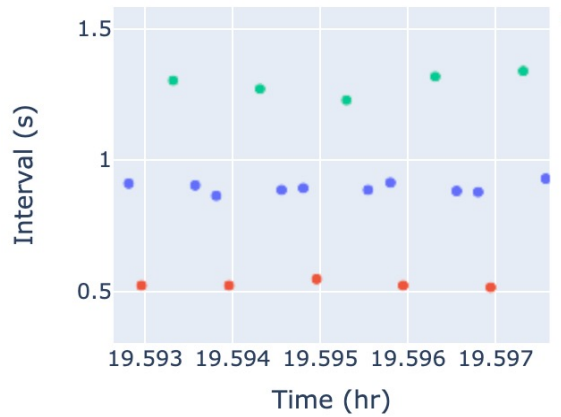
NN – sinus interval



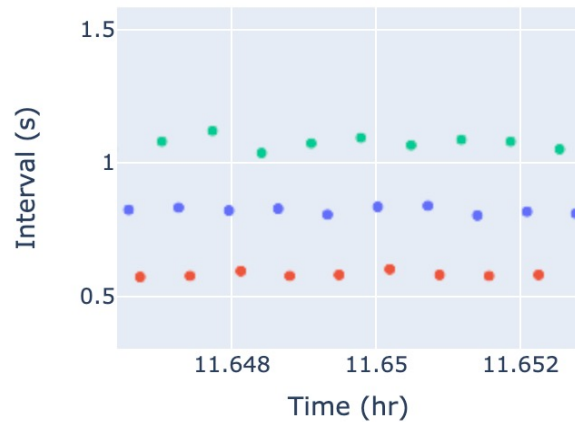
# Observations in single patients

**Record AC4182**

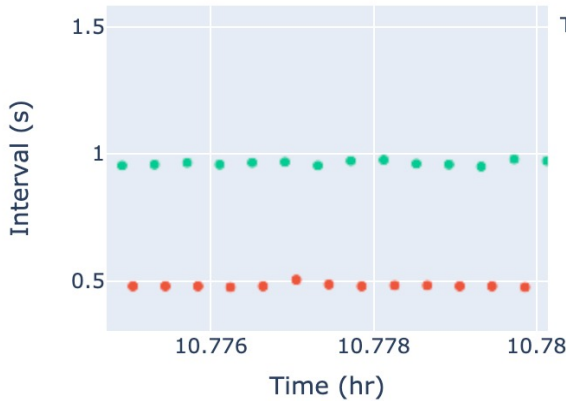
67 bpm : NIB=3



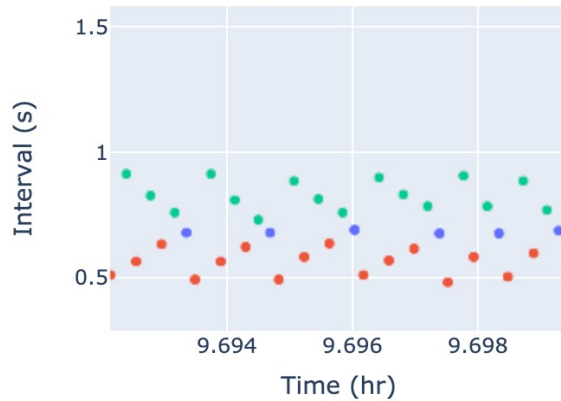
75 bpm : NIB=2



80 bpm : NIB=1



86 bpm : cycling CI



Type  
 ● NN  
 ● NV  
 ● VN

**Record AC5111**

Sequence of 149 NIB values

```

10 4 4 4 4 7 1 1 7 4
4 1 4 1 13 1 10 4 1 1
7 1 4 4 4 7 4 7 7 13
7 7 4 4 10 7 1 4 4 7
4 10 4 10 7 4 4 7 7 1
10 10 4 10 1 7 4 4 7 1
1 7 4 7 4 4 4 1 4 4
1 4 4 4 1 4 4 1 4 4
4 1 7 4 1 1 1 1 7 4
1 4 1 4 4 4 1 7 1 7
1 4 1 1 7 4 4 4 1 1
7 1 1 1 4 7 4 1 1 1
7 4 1 1 1 1 4 4 1 4
4 1 1 1 7 1 4 1 7 1
7 1 1 1 4 7 4 4 4
    
```

[1,4,7,10,13,...]

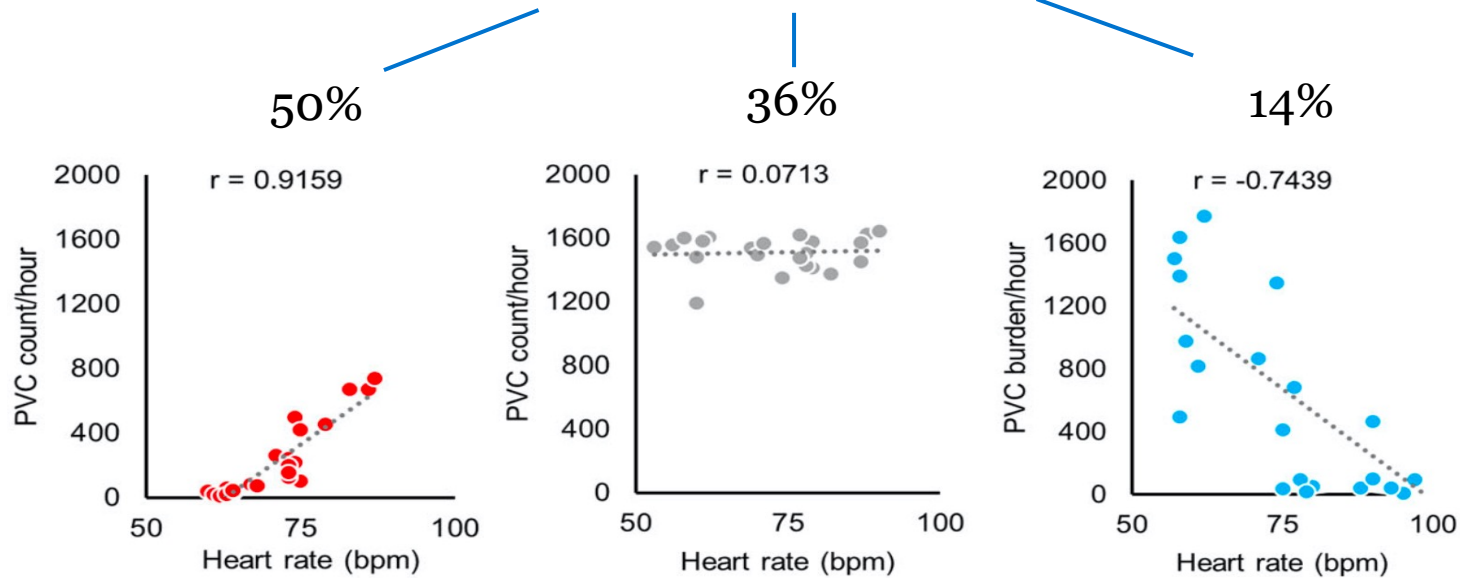
$NIB=3n-2$

$P_{\text{random}} =$

$(1/3)^{149} \sim 10^{-72}$

# PVCs as a function of heart rate

416 patients, 24-hour Holter



Prescribed beta blockers

Follow-up Holter

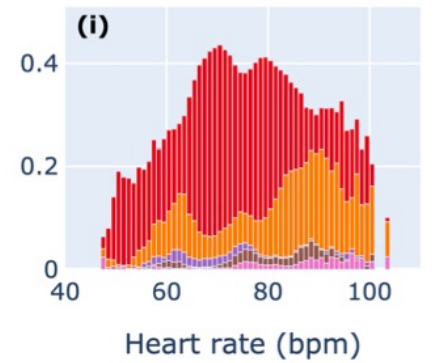
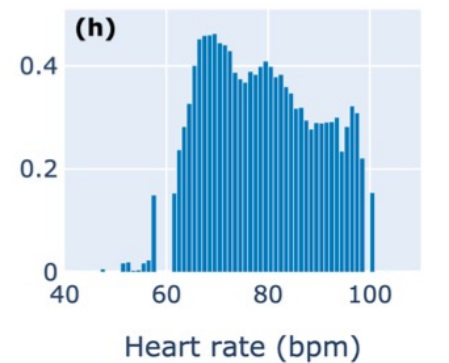
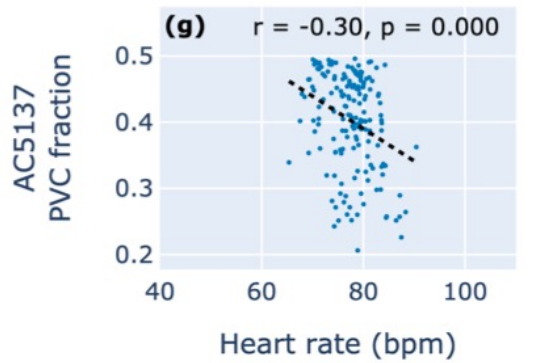
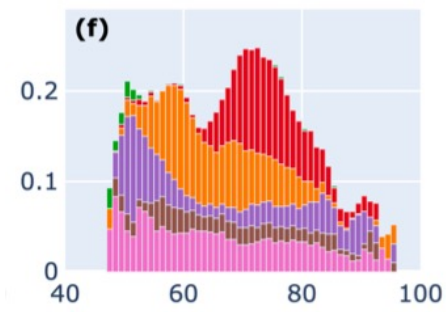
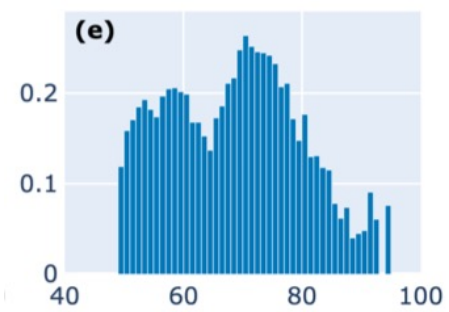
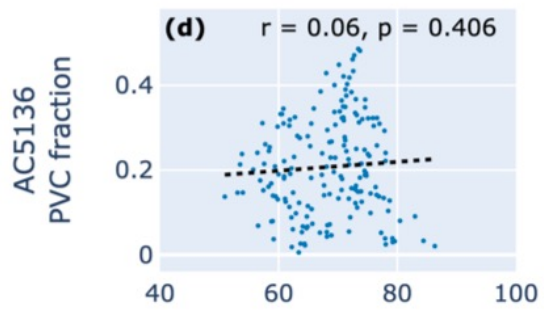
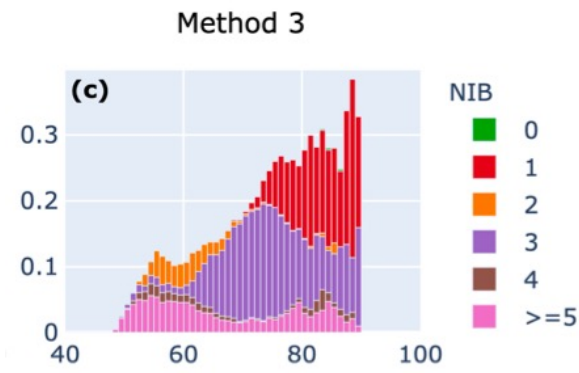
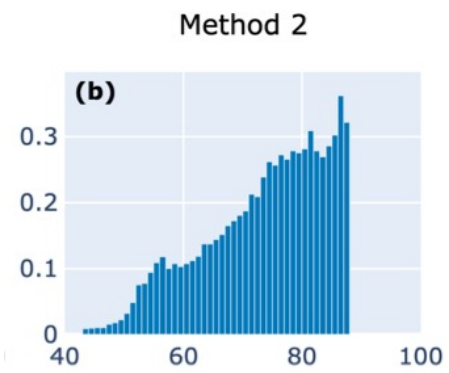
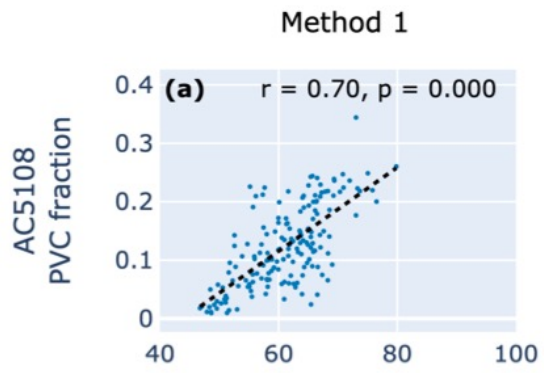
Decrease in PVCs

No effect

Increase in PVCs

**Hamon et al.** Premature ventricular contraction diurnal profiles predict distinct clinical characteristics and beta-blocker responses. *J Cardiovasc Electrophysiol.* (2019)





## Method 1 (standard approach)

- Hourly averaging of HR
- %PVC computed within each hour

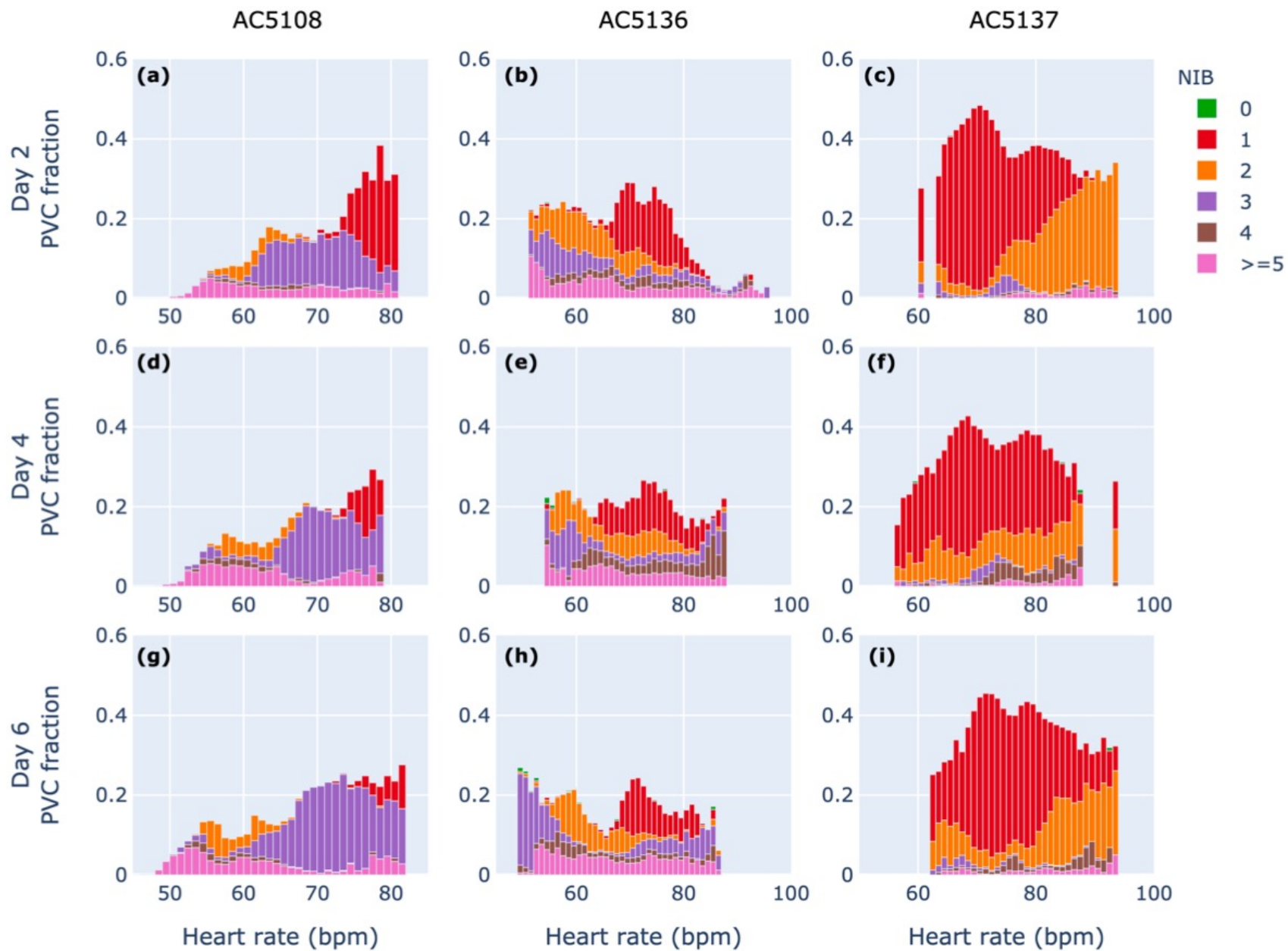
## Method 2

- Minute averaging of HR
- %PVC computed across entire record for each HR

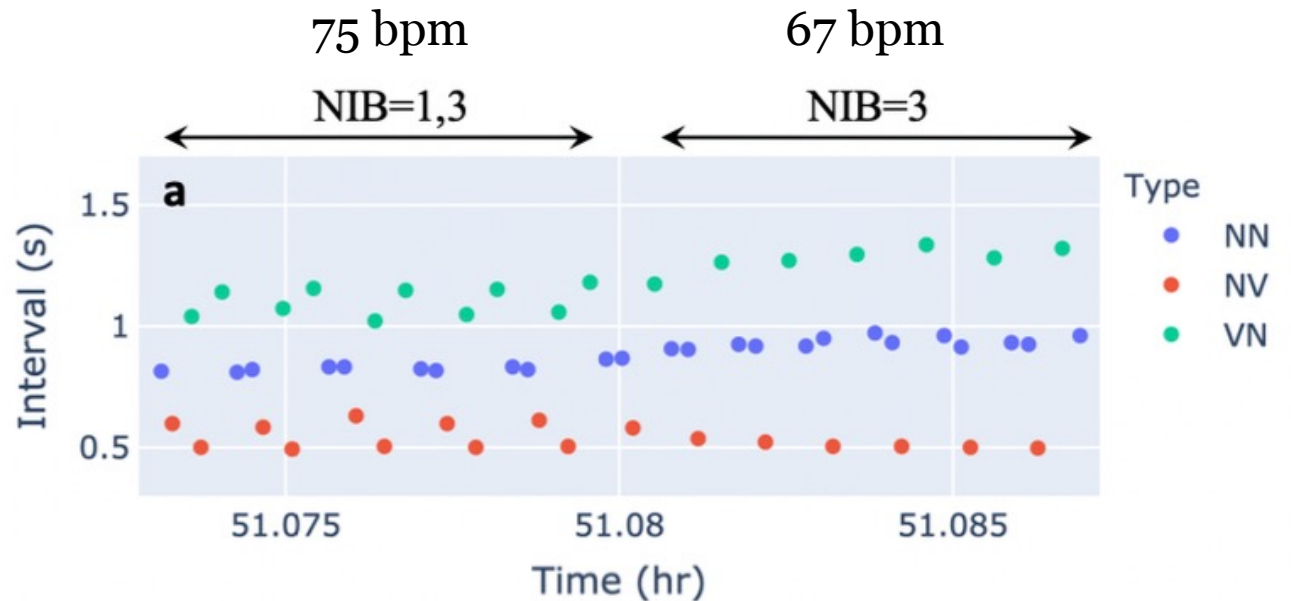
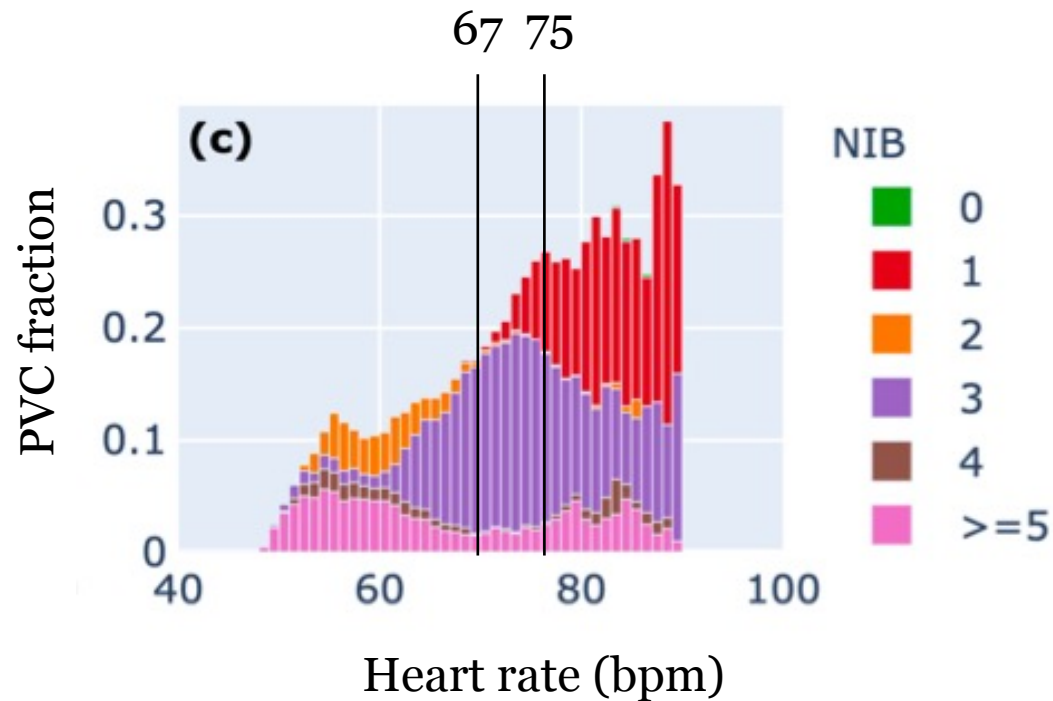
## Method 3

- Rolling window averaging of HR
- Relative occurrence of NIB values

# Over different 24 hour periods



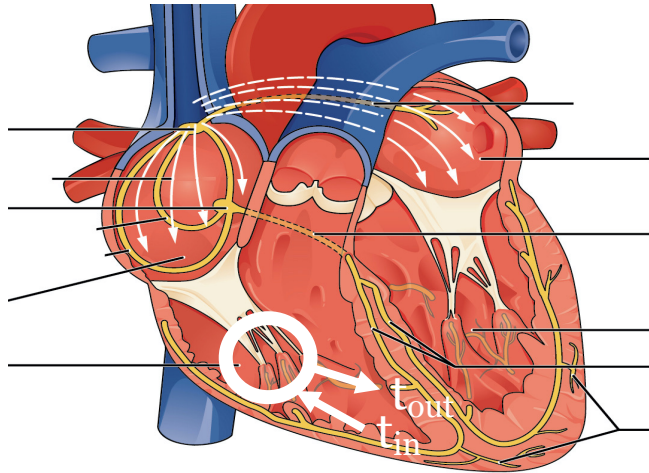
# Bifurcation behaviour of AC5108



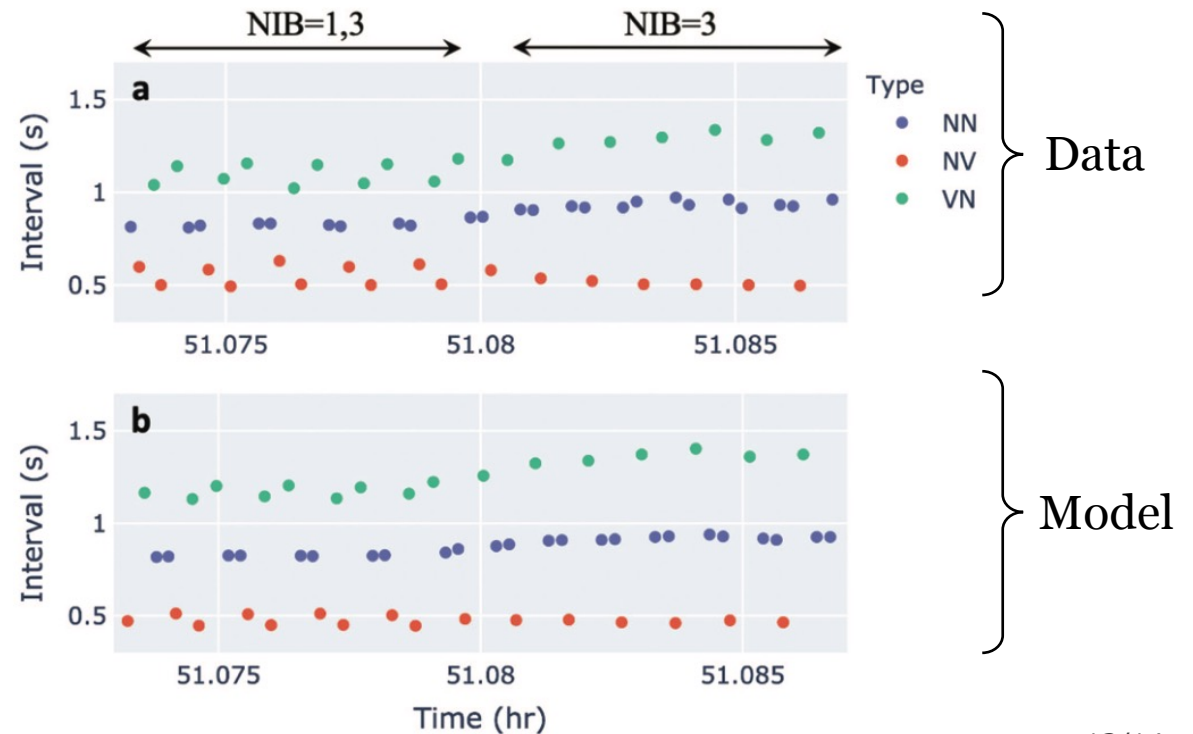
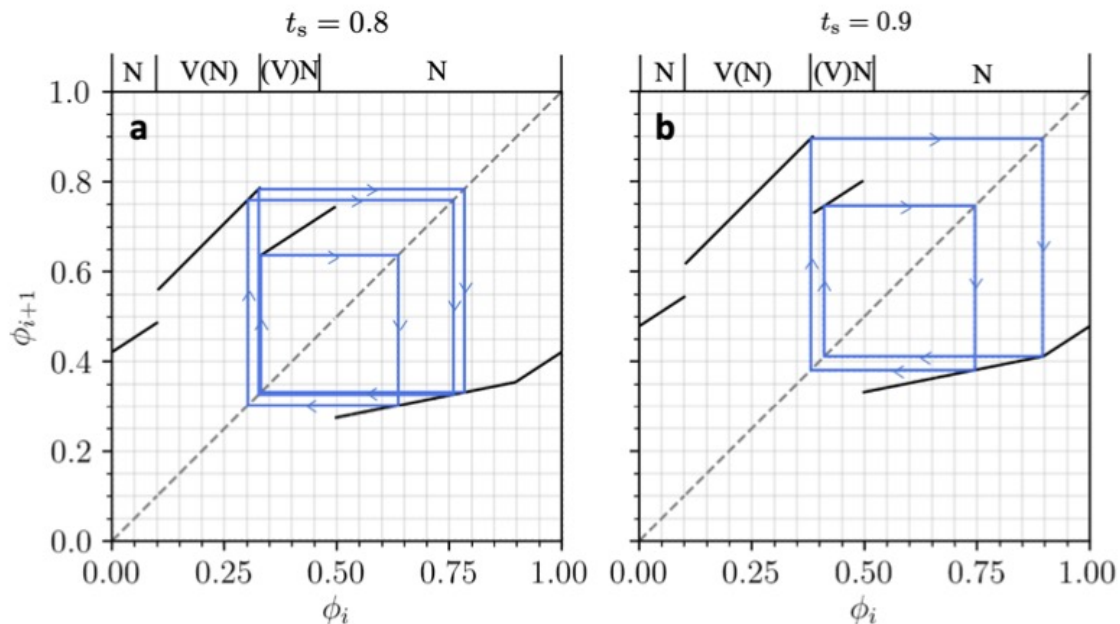
What mechanism gives rise to these robust patterns?

Goal: Find a model based on physiological principles that reproduces this behaviour

# Model: Modulated parasystole with conduction delay

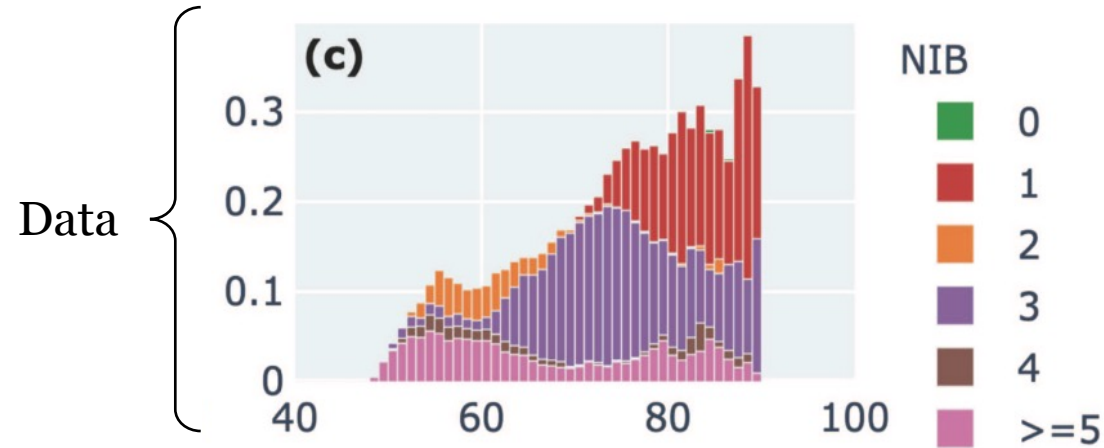


$$\phi_{i+1} = \begin{cases} \phi_i + \frac{t_s}{t_e} + 1 - f(\phi_i + \frac{t_{in}}{t_e}) & 0 \leq \phi_i < \frac{t_{out}}{t_e}, \\ \phi_i + \frac{t_s}{t_e} & \frac{t_{out}}{t_e} \leq \phi_i < \frac{t_{out} + t_s - \theta}{t_e}, \\ \phi_i + \frac{t_s}{t_e} + 1 - f(\phi_i + \frac{t_{in}}{t_e}) & \frac{t_{out} + t_s - \theta}{t_e} \leq \phi_i < 1. \end{cases}$$

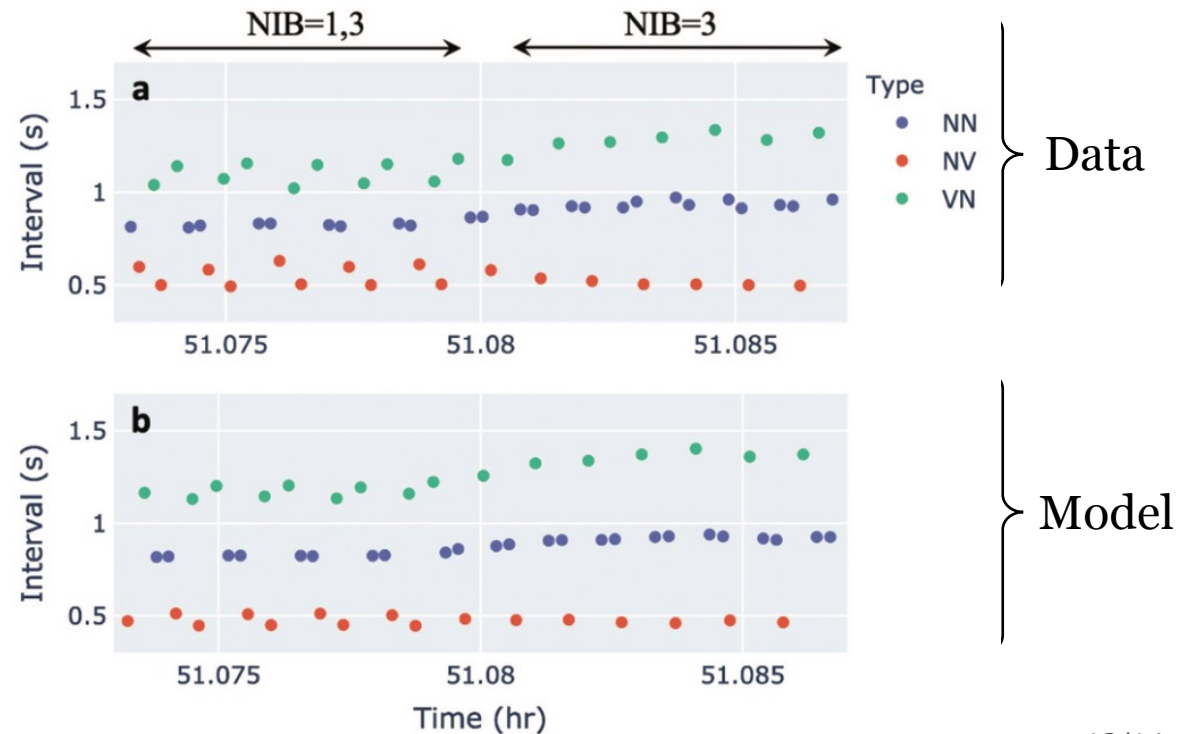
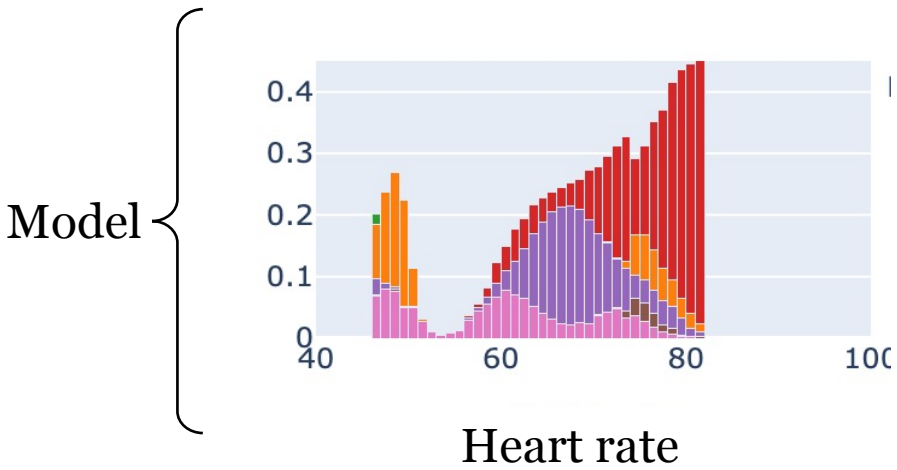




# Model: Modulated parasystole with conduction delay



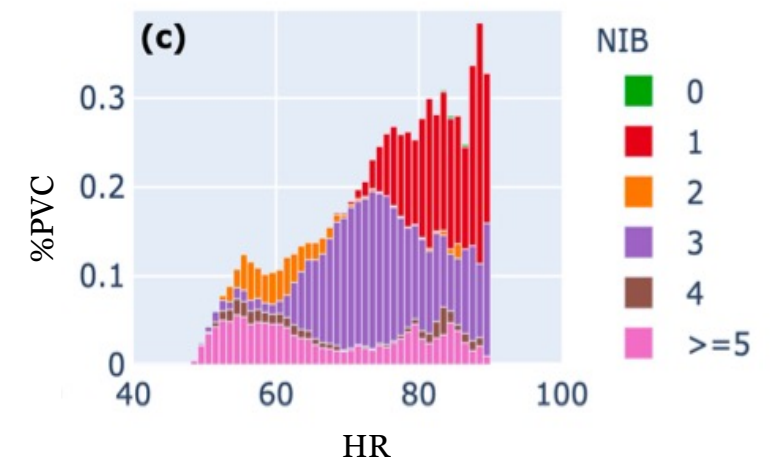
$$\phi_{i+1} = \begin{cases} \phi_i + \frac{t_s}{t_e} + 1 - f(\phi_i + \frac{t_{in}}{t_e}) & 0 \leq \phi_i < \frac{t_{out}}{t_e}, \\ \phi_i + \frac{t_s}{t_e} & \frac{t_{out}}{t_e} \leq \phi_i < \frac{t_{out} + t_s - \theta}{t_e}, \\ \phi_i + \frac{t_s}{t_e} + 1 - f(\phi_i + \frac{t_{in}}{t_e}) & \frac{t_{out} + t_s - \theta}{t_e} \leq \phi_i < 1. \end{cases}$$



Bury et al. "Long ECGs reveal rich and robust dynamical regimes in patients with frequent ectopy." *Chaos: An Interdisciplinary Journal of Nonlinear Science* 30.11 (2020): 113127.

# Take-home points

- New opportunities for large-scale analysis of PVC dynamics
- Patients with unexplained PVCs exhibit **diverse** bifurcations in cardiac rhythm as a function of heart rate
- Facilitates the development and calibration of mathematical models – a dynamics-based personalised medicine.



*Questions/comments?*