

## Modelling a circadian clock with HYPE

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Modelling a circadian clock with HYPE

HYPE	Circadian clock	Model construction	A different approach	Conclusions

# Outline

#### HYPE

#### Circadian clock

Model construction

Results

A different approach

#### Conclusions

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HYPF				

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- well-defined subcomponents

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- define controllers consisting only of events
- obtain controlled system  $\Sigma \Join \underline{init}.Con$

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• configuration,  $\left< \Sigma \Join D, \sigma \right>$ 

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- configuration,  $\langle \Sigma \bowtie D, \sigma \rangle$
- $\blacktriangleright~\sigma$  maps influence names to influence strengths and types

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prefixes

$$\langle \underline{\mathsf{a}} : (\iota, r, I) . E, \sigma \rangle \xrightarrow{\mathtt{a}} \langle E, \sigma[\iota \mapsto (r, I)] \rangle \qquad \langle \underline{\mathsf{a}} . E, \sigma \rangle \xrightarrow{\mathtt{a}} \langle E, \sigma \rangle$$

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$$\langle \underline{\mathsf{a}} : (\iota, r, I).E, \sigma \rangle \xrightarrow{\underline{\mathsf{a}}} \langle E, \sigma[\iota \mapsto (r, I)] \rangle \qquad \langle \underline{\mathsf{a}}.E, \sigma \rangle \xrightarrow{\underline{\mathsf{a}}} \langle E, \sigma \rangle$$

cooperation

$$\frac{\langle E, \sigma \rangle \xrightarrow{\underline{a}} \langle E', \tau \rangle \quad \langle F, \sigma \rangle \xrightarrow{\underline{a}} \langle F', \tau' \rangle}{\langle E \bowtie_{M} F, \sigma \rangle \xrightarrow{\underline{a}} \langle E' \bowtie_{M} F', \Gamma(\sigma, \tau, \tau') \rangle} \quad \underline{a} \in M, \Gamma \text{ defined}$$

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generates labelled transition system over configurations



labelled transition system is basis of hybrid automaton

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- labelled transition system is basis of hybrid automaton
- configurations are modes

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- labelled transition system is basis of hybrid automaton
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  - ODE for variable  $X_i$  at mode obtained from  $\sigma$

$$\frac{\mathrm{d}X_i}{\mathrm{d}t} = \sum \left\{ r \times \llbracket I(\vec{Y}) \rrbracket \middle| \operatorname{iv}(\iota) = X_i \text{ and } \sigma(\iota) = (r, I(\vec{Y})) \right\}$$



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transitions are events that cause a change in mode



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  - events have activation condition act(<u>a</u>)
  - events have reset res(<u>a</u>)
- initial mode and first event init



regulatory mechanism for organisms

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- regulatory mechanism for organisms
- generate biochemical rhythms



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- entrain to the day/night cycle



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- regulatory mechanism for organisms
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- entrain to the day/night cycle
- maintain cycles when day lengths change
- typically built out of negative feedback loops
- show oscillatory behaviour in concentrations of species
- consider very simple example, Ostreococcus tauri

#### tiny green alga



- tiny green alga
- experimental data, parameters for ODE model

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- diagram of behaviour

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- two genes and proteins from these genes
- involves modelling mRNA but abstracts from genes
- hybrid different behaviour depending on light conditions



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work from flows in diagram

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- plus knowledge of reaction types

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  - $L_m$ ,  $L_c$ ,  $L_n$  mRNA and proteins for LHY

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- what are the flows?
- how do they differ from light to dark?

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three events:

$$ec(\underline{init}) = (true, (T' = t_0 \land (initial values)))$$
$$ec(\underline{dark}) = (T = 12, true)$$
$$ec(\underline{light}) = (T = 24, T' = 0)$$

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$$ec(\underline{dark}) = (T = 12, true)$$
  

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• controller:  $Con \stackrel{\text{\tiny def}}{=} \underline{\text{light}}.\underline{\text{dark}}.Con$ 

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- influence names:  $\iota_{S,R}$  with  $iv(\iota_{S,R}) = S$

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  - $\blacktriangleright$  captures the flow from reaction R that influences species S

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  - captures the flow from reaction R that influences species S
- one subcomponent for each influence

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three events:

$$\begin{array}{lll} \operatorname{ec}(\operatorname{\underline{init}}) &=& (\mathit{true}, (\mathit{T}'=\mathit{t}_0 \land (\operatorname{initial values}))\\ \operatorname{ec}(\operatorname{\underline{dark}}) &=& (\mathit{T}=12, \mathit{true})\\ \operatorname{ec}(\operatorname{\underline{light}}) &=& (\mathit{T}=24, \mathit{T}'=0) \end{array}$$

• controller:  $Con \stackrel{\text{\tiny def}}{=} \underline{\text{light}}.\underline{\text{dark}}.Con$ 

- influence names:  $\iota_{S,R}$  with  $iv(\iota_{S,R}) = S$ 
  - captures the flow from reaction R that influences species S
- one subcomponent for each influence
- if not light-sensitive then only <u>init</u> event required



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- deg2: degradation of acc
  - mass action

$$I_{A,2}(A) \stackrel{\text{\tiny def}}{=} \underline{\text{init}}:(\iota_{A,2}, -r_2, \textit{linear}(A)).I_{A,2}(A)$$

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$$I_{A,2}(A) \stackrel{\text{\tiny def}}{=} \underline{\text{init}}:(\iota_{A,2}, -r_2, \textit{linear}(A)).I_{A,2}(A)$$

- deg7: degradation of TOC1 mRNA
  - mass action

$$I_{T_m,7}(T_m) \stackrel{\text{def}}{=} \underline{\text{init}}:(\iota_{T_m,7}, -r_7, \textit{linear}(T_m)).I_{T_m,7}(T_m)$$

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- deg7: degradation of TOC1 mRNA
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- deg9: degradation of LHY mRNA
  - mass action

$$I_{L_m,9}(L_m) \stackrel{\text{\tiny def}}{=} \underline{\text{init}}:(\iota_{L_m,9}, -r_9, \textit{linear}(L_m)).I_{L_m,9}(L_m)$$



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- deg4: degradation of activated TOC1
  - mass action

$$\begin{split} I_{T_a,4}(T_a) &\stackrel{\text{def}}{=} \quad \underbrace{\mathsf{light}}_{:}(\iota_{T_a,4}, -l_4, \mathit{linear}(T_a)).I_{T_a,4}(T_a) + \\ & \underbrace{\mathsf{dark}}_{:}(\iota_{T_a,4}, -d_4, \mathit{linear}(T_a)).I_{T_a,4}(T_a) + \\ & \underbrace{\mathsf{init}}_{:}(\iota_{T_a,4}, -r_4, \mathit{linear}(T_a)).I_{T_a,4}(T_a) \end{split}$$



- deg4: degradation of activated TOC1
  - mass action

$$\begin{split} I_{\mathcal{T}_{a},4}(\mathcal{T}_{a}) & \stackrel{\text{def}}{=} \quad \underbrace{\mathsf{light}}_{:}(\iota_{\mathcal{T}_{a},4}, -I_{4}, \mathit{linear}(\mathcal{T}_{a})).I_{\mathcal{T}_{a},4}(\mathcal{T}_{a}) + \\ & \underbrace{\mathsf{dark}}_{:}(\iota_{\mathcal{T}_{a},4}, -d_{4}, \mathit{linear}(\mathcal{T}_{a})).I_{\mathcal{T}_{a},4}(\mathcal{T}_{a}) + \\ & \underbrace{\mathsf{init}}_{:}(\iota_{\mathcal{T}_{a},4}, -r_{4}, \mathit{linear}(\mathcal{T}_{a})).I_{\mathcal{T}_{a},4}(\mathcal{T}_{a}) \end{split}$$

- deg12: degradation of cytosolic LHY
  - mass action

$$\begin{split} I_{L_{c},12}(L_{c}) &\stackrel{\text{def}}{=} \quad \underbrace{\text{light}}_{:}(\iota_{L_{c},12}, -l_{12}, \textit{linear}(L_{c})).I_{L_{c},12}(L_{c}) + \\ & \underbrace{\text{dark}}_{:}(\iota_{L_{c},12}, -d_{12}, \textit{linear}(L_{c})).I_{L_{c},12}(L_{c}) + \\ & \underbrace{\text{init}}_{:}(\iota_{L_{c},12}, -r_{12}, \textit{linear}(L_{c})).I_{L_{c},12}(L_{c}) \end{split}$$



## Degradation flows – light-sensitive (continued)

- deg13: degradation of nuclear LHY
  - mass action

$$\begin{split} I_{L_n,13}(L_n) &\stackrel{\text{def}}{=} \quad \underline{\text{light}}: (\iota_{L_n,13}, -l_{13}, \textit{linear}(L_n)). I_{L_n,13}(L_n) + \\ & \underline{\text{dark}}: (\iota_{L_n,13}, -r_{13}, \textit{linear}(L_n)). I_{L_n,13}(L_n) + \\ & \underline{\text{init}}: (\iota_{L_n,13}, -d_{13}, \textit{linear}(L_n)). I_{L_n,13}(L_n) \end{split}$$

### Production flows – not light sensitive



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### Production flows – not light sensitive



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- ▶ transl5: translation of TOC1 mRNA to TOC1 protein
  - mass action

 $I_{T_i,5}(T_m) \stackrel{\text{def}}{=} \underline{\text{init}}: (\iota_{T_i,5}, r_5, \textit{linear}(T_m)).I_{T_i,5}(T_m)$ 

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- ▶ transl5: translation of TOC1 mRNA to TOC1 protein
  - mass action

 $I_{T_i,5}(T_m) \stackrel{\text{\tiny def}}{=} \underline{\text{init}}: (\iota_{T_i,5}, r_5, \textit{linear}(T_m)).I_{T_i,5}(T_m)$ 

- ► transl10: translation of LHY mRNA to LHY protein
  - mass action

 $I_{L_{c},10}(L_{m}) \stackrel{\text{\tiny def}}{=} \underline{\text{init}}:(\iota_{L_{c},10}, r_{10}, \textit{linear}(L_{m})).I_{L_{c},10}(L_{m})$ 

- ▶ transl5: translation of TOC1 mRNA to TOC1 protein
  - mass action

 $I_{T_i,5}(T_m) \stackrel{\text{def}}{=} \underline{\text{init}}: (\iota_{T_i,5}, r_5, \textit{linear}(T_m)).I_{T_i,5}(T_m)$ 

- ► transl10: translation of LHY mRNA to LHY protein
  - mass action

 $I_{L_c,10}(L_m) \stackrel{\text{def}}{=} \underline{\text{init}}:(\iota_{L_c,10}, r_{10}, \textit{linear}(L_m)).I_{L_c,10}(L_m)$ 

- transc3: transcription of TOC1 mRNA from TOC1 gene
  - not directly light sensitive, but enhanced by acc
  - inhibited by nuclear LHY
  - complex rate function

 $I_{T_m,3}(A,L_n) \stackrel{\text{def}}{=} \underline{\text{init}}:(\iota_{T_m,3},1,g(A,L_n)).I_{T_m,3}(A,L_n)$ 



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▶ prod1: production of *acc*, entirely light-sensitive

$$I_{A,1} \stackrel{\text{def}}{=} \underline{\text{light}}: (\iota_{A,1}, I_1, constant).I_{A,1} + \\ \underline{\text{dark}}: (\iota_{A,1}, 0, constant).I_{A,1} + \\ \underline{\text{init}}: (\iota_{A,1}, 0, constant).I_{A,1}$$

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prod1: production of acc, entirely light-sensitive

$$I_{A,1} \stackrel{\text{def}}{=} \underline{\text{light}}: (\iota_{A,1}, I_1, constant).I_{A,1} + \\ \underline{\text{dark}}: (\iota_{A,1}, 0, constant).I_{A,1} + \\ \underline{\text{init}}: (\iota_{A,1}, 0, constant).I_{A,1}$$

- transc8: transcription of LHY mRNA
  - enhanced by active TOC1 protein

$$I_{L_m,8}(T_a) \stackrel{\text{def}}{=} \underline{\text{light}}: (\iota_{L_m,8}, 1, f(T_a)).I_{L_m,8}(T_a) + \\ \underline{\text{dark}}: (\iota_{L_m,8}, 1, f'(T_a)).I_{L_m,8}(T_a) + \\ \underline{\text{init}}: (\iota_{L_m,8}, 1, f'(T_a)).I_{L_m,8}(T_a)$$

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### Conversion flows - light sensitive



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### Conversion flows - light sensitive

- ▶ conv6: conversion of TOC1 protein from inactive to active
  - mass action

$$\begin{split} I_{\mathcal{T}_i,6}(\mathcal{T}_i) & \stackrel{\text{def}}{=} \quad \underline{\text{light}}: (\iota_{\mathcal{T}_i,6}, -l_6, \textit{linear}(\mathcal{T}_i)).I_{\mathcal{T}_i,6}(\mathcal{T}_i) + \\ & \underline{\text{dark}}: (\iota_{\mathcal{T}_i,6}, -d_6, \textit{linear}(\mathcal{T}_i)).I_{\mathcal{T}_i,6}(\mathcal{T}_i) + \\ & \underline{\text{init}}: (\iota_{\mathcal{T}_i,6}, -r_6, \textit{linear}(\mathcal{T}_i)).I_{\mathcal{T}_i,6}(\mathcal{T}_i) \end{split}$$

$$\begin{split} I_{\mathcal{T}_{a},6}(\mathcal{T}_{i}) &\stackrel{\text{def}}{=} \quad \underbrace{\mathsf{light}}_{:}(\iota_{\mathcal{T}_{a},6},\mathit{I}_{6},\mathit{linear}(\mathcal{T}_{i})).I_{\mathcal{T}_{a},6}(\mathcal{T}_{i}) + \\ & \underbrace{\mathsf{dark}}_{:}(\iota_{\mathcal{T}_{a},6},\mathit{d}_{6},\mathit{linear}(\mathcal{T}_{i})).I_{\mathcal{T}_{a},6}(\mathcal{T}_{i}) + \\ & \underbrace{\mathsf{init}}_{:}(\iota_{\mathcal{T}_{a},6},\mathit{r}_{6},\mathit{linear}(\mathcal{T}_{i})).I_{\mathcal{T}_{a},6}(\mathcal{T}_{i}) \end{split}$$

#### Transportation flows – not light sensitive



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Modelling a circadian clock with HYPE

**PASTA 2010** 

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#### Transportation flows and time flow

- transp11: movement of LHY protein
  - from cytoplasm to nucleus
  - not light sensitive

$$I_{L_c,11}(L_c) \stackrel{\text{def}}{=} \underline{\text{init}}:(\iota_{L_c,11}, -r_{11}, \textit{linear}(L_c)).I_{L_c,11}(L_c)$$

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construct controlled system from subcomponents and controller

#### Results – constant light



identical to Bio-PEPA ODE output

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#### Results – 12 hours light, 12 hours dark



identical to Bio-PEPA ODE output

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#### given a ODE biological model with hybrid behaviour

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- given a ODE biological model with hybrid behaviour
- assumptions about model

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- understand hybrid aspects, identify variables and ODEs
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  - circadian clock, choose light or dark conditions

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form of each species ODE

$$\frac{dX_i}{dt} = \sum_{j=1}^m D[i, j] v[j] = \sum_{j=1}^m D[i, j] f_j(\vec{X})$$

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$$I_{i,j}(\vec{X}) \stackrel{\text{\tiny def}}{=} \underline{\text{init}} : (\iota_{i,j}, D[i,j], v[j]) . I_{i,j}(\vec{X})$$

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- HYPE model, validate if possible

 $\left( \bigotimes_{*}^{n} \prod_{i=1}^{n} \left( \bigotimes_{*}^{m} \prod_{j=1}^{m} I_{i,j}(\vec{X}) \right) \right) \bigotimes_{*} \underline{\text{init}}.0$
form of each species ODE

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 $\left( \bigotimes_{*}^{n} \prod_{i=1}^{n} \left( \bigotimes_{*}^{m} \prod_{j=1}^{m} I_{i,j}(\vec{X}) \right) \right) \bigotimes_{*} \underline{\text{init.0}}$ 

 defines redundant subcomponents whenever D[i, j] = 0, can omit

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determine switches for hybrid behaviour

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- add new variables that relate to the hybrid behaviour

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$$\left( \Join_{*}^{n}_{i=1} ( \bowtie_{*}^{m}_{j=1} l'_{i,j}(\vec{X})) \right) \Join_{*} \operatorname{\underline{init}}( \bowtie_{*}^{p}_{k=1} Con_{k})$$

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$$(\bigotimes_{*}^{n} \underset{i=1}{\overset{n}{\underset{i=1}{i}}} (\bigotimes_{*}^{m} \underset{j=1}{\overset{m}{\underset{i,j}{i}}} l'_{i,j}(\vec{X}))) \boxtimes_{*} \underline{\text{init.}} (\boxtimes_{*}^{p} \underset{k=1}{\overset{p}{\underset{k=1}{k}}} Con_{k})$$

circadian clock

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- circadian clock
  - essentially same HYPE model

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$$\big( \Join_{*}^{n} \underset{i=1}{\overset{n}{\underset{j=1}{}}} ( \bowtie_{*}^{m} \underset{j=1}{\overset{m}{\underset{j=1}{}}} l'_{i,j}(\vec{X})) \big) \bowtie_{*} \underline{\operatorname{init}}.( \bowtie_{*}^{p} \underset{k=1}{\overset{p}{\underset{k=1}{}}} Con_{k})$$

- circadian clock
  - essentially same HYPE model
  - difference is variable parameters in subcomponents

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model of circadian clock of Ostreococcus tauri

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Modelling a circadian clock with HYPE



- model of circadian clock of Ostreococcus tauri
- first approach

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HYPE	Circadian clock	Model construction	A different approach	Conclusions
Conc	lucione			

- model of circadian clock of Ostreococcus tauri
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  - work from diagrammatic description of model

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HYPE	Circadian clock	Model construction	A different approach	Conclusions
Cana	luctore			

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HYPE	Circadian clock	Model construction	A different approach	Conclusions

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  - successful model construction

HYPE	Circadian clock	Model construction	A different approach	Conclusions

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  - understand ODE model enough to identify hybrid behaviour
- further research: more examples

HYPE	Circadian clock	Model construction	A different approach	Conclusions

## Thank you

#### This research was funded by the EPSRC SIGNAL Project

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Modelling a circadian clock with HYPE