

# Gene regulatory network drift and speciation



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## Background

- Developmental systems drift: many different molecular pathways can yield identical phenotypes. For example, in *Drosophila melanogaster* and *D. simulans*, bristle patterning is identical, yet in hybrid crosses, bristle patterns are different, suggesting divergent molecular mechanisms<sup>1</sup>.
- Here we model gene regulatory networks as linear dynamical systems.
- We analytically describe the set of all phenotypically equivalent gene regulatory network architectures.
- Evolution can explore this set, despite selective and environmental stasis.
- Using quantitative genetics, we show that over time, this neutral process can lead to rapid hybrid phenotypic divergence and incompatibility ( $\sim$  on the order of  $N_e$ ).

## The set of all phenotypically identical gene networks of any size

$$\mathcal{A}_n(A_0) = \{A : Ce^{At}B = Ce^{A_0t}B \text{ for } t \geq 0\} \\ = \{A : CA^k B = CA_0^k B \text{ for } 1 \leq k \leq n-1\}$$

We denote  $\mathcal{A}_n(A_0)$  as the set of all  $n$ -dimensional gene network architectures equivalent to  $A_0$ , where  $A_0$  is any linear gene network.

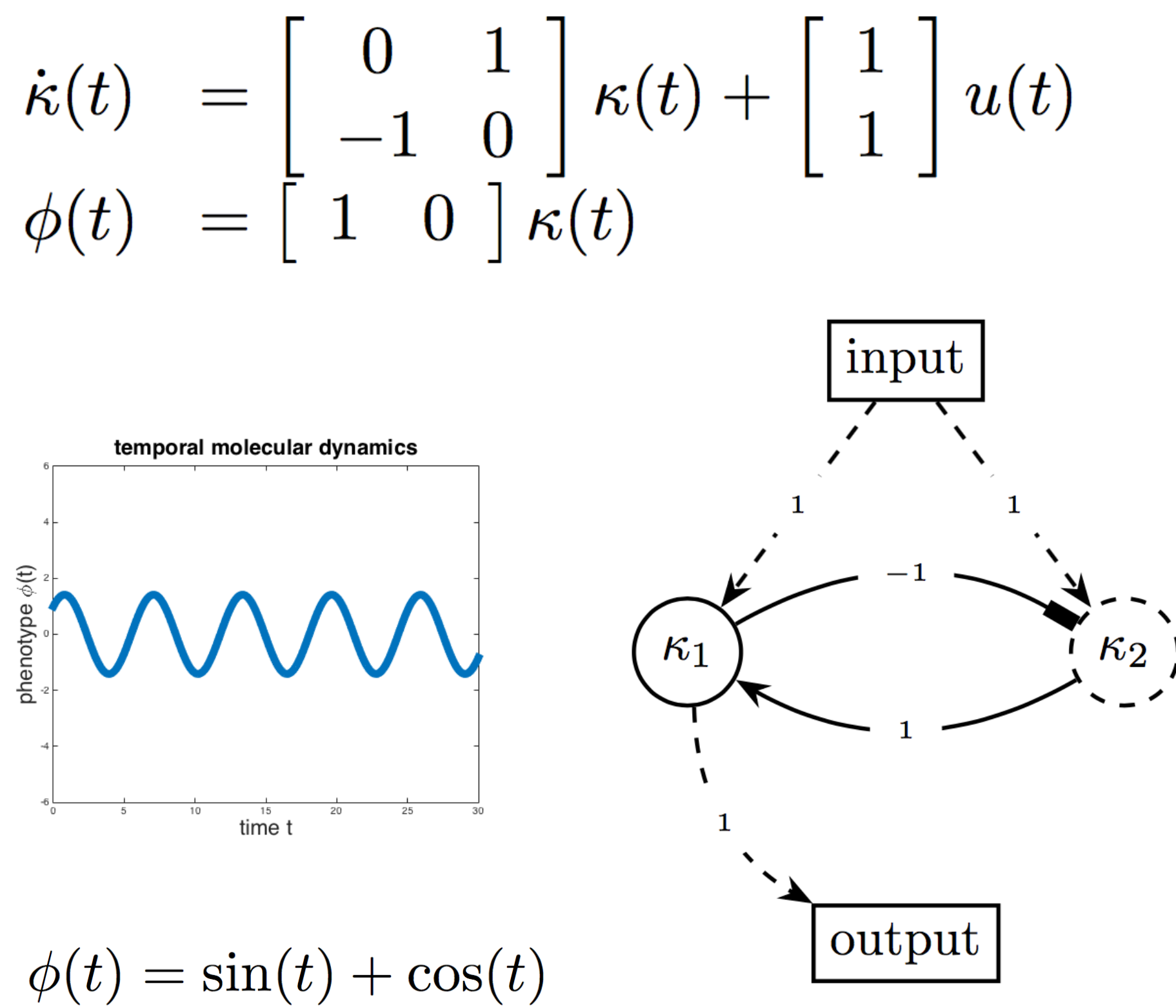
## Gene regulatory networks as linear dynamical systems

$$\begin{cases} \dot{\kappa}(t) &= A\kappa(t) + Bu(t) \\ \phi(t) &= C\kappa(t) \end{cases}$$

- $A$ : gene regulatory network ( $n \times n$  matrix); rows are *cis*-regulatory elements.
- $u(t)$ : environmental input at time  $t$ .
- $B$ : how the organism processes its input ( $n \times l$  matrix).
- $\kappa(t)$ : all molecular concentrations at time  $t$  – the **cryptotype**.
- $C$ : filtered molecular dynamics relevant to survival ( $l \times n$  matrix).
- $\phi(t)$ : molecular concentrations, visible to selection, at time  $t$  – the **phenotype**.

## Example 1: oscillating two-gene network

- A two-gene regulatory network with oscillating gene-1 expression.
- Environmental input is simply an impulse (a dirac delta).



$$\phi(t) = \sin(t) + \cos(t)$$

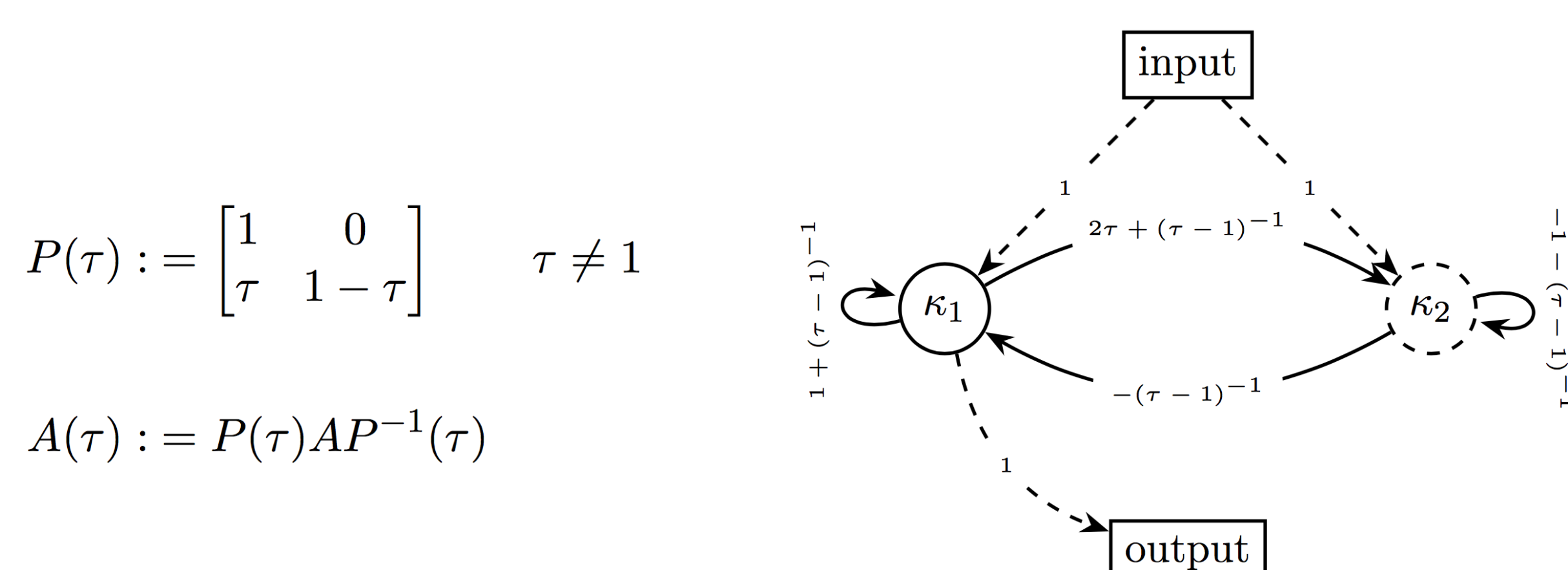
## Different network architectures produce identical phenotypes

$$\begin{aligned} \dot{\kappa}(t) &= \begin{bmatrix} 0 & 1 \\ -1 & 0 \end{bmatrix} \kappa(t) + \begin{bmatrix} 1 \\ 1 \end{bmatrix} u(t) \\ \phi(t) &= \begin{bmatrix} 1 & 0 \end{bmatrix} \kappa(t) \end{aligned}$$

$$\begin{aligned} \dot{\hat{\kappa}}(t) &= \begin{bmatrix} 2 & -1 \\ 5 & -2 \end{bmatrix} \hat{\kappa}(t) + \begin{bmatrix} 1 \\ 1 \end{bmatrix} u(t) \\ \hat{\phi}(t) &= \begin{bmatrix} 1 & 0 \end{bmatrix} \hat{\kappa}(t) \end{aligned}$$

$$\phi(t) = \hat{\phi}(t) = \sin(t) + \cos(t)$$

## The set of all two-gene oscillators with identical phenotypes



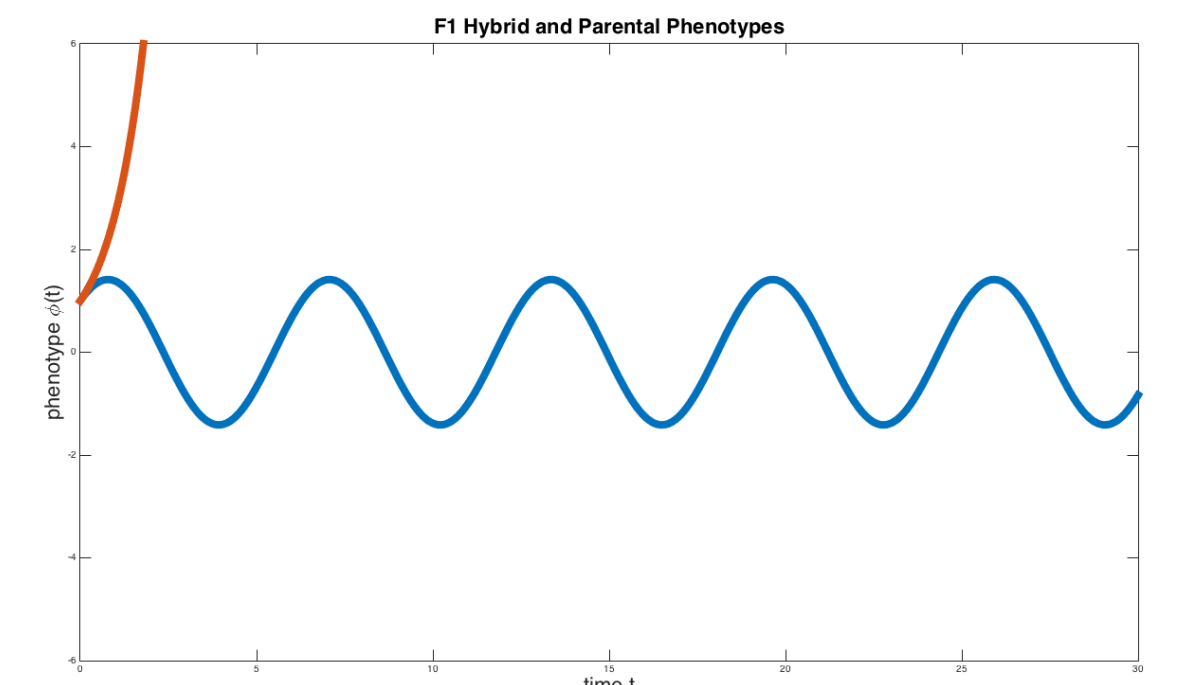
$$P(\tau) := \begin{bmatrix} 1 & 0 \\ \tau & 1 - \tau \end{bmatrix} \quad \tau \neq 1$$

$$A(\tau) := P(\tau)AP^{-1}(\tau)$$

Here the set of all phenotypically identical two-gene oscillator networks is given by any coordinate change that preserves  $B$  and  $C$ . More generally, without preserving input or output matrices, or network size, this set is given by the Kalman decomposition<sup>2</sup>.

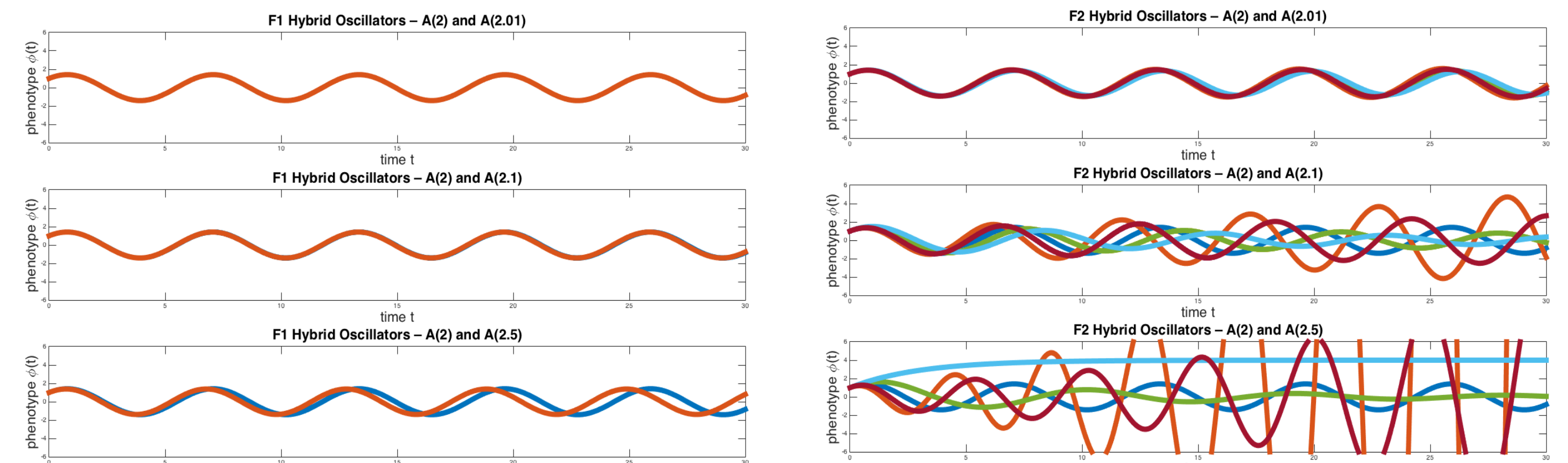
## Neutral evolution leads to hybrid incompatibility

- Diploid  $F_1$  hybrids are formed by averaging the two parental gene networks  $A$  and  $A'$ .
- $F_2$  hybrids are formed by first recombining genes (swapping rows between  $A$  and  $A'$ ), then next, two gametes are chosen and averaged.
- Fitness is scored as a Gaussian function of phenotypic distance.



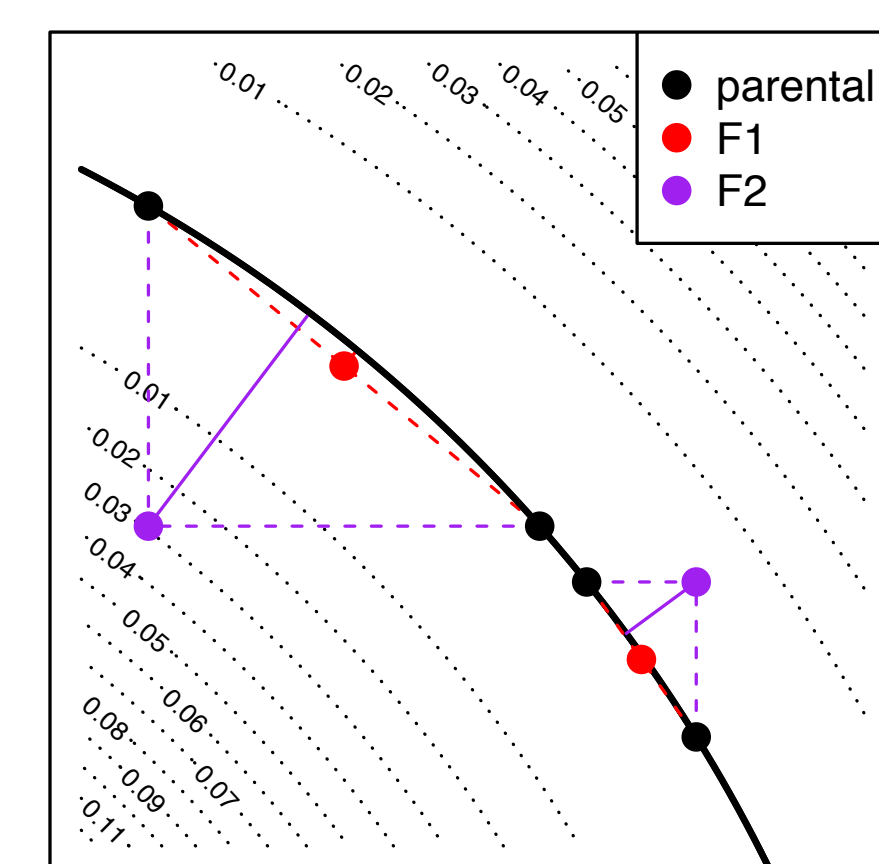
- Oscillators (from Ex. 1)  $A(0)$  and  $A(2)$
- Parents (blue) and  $F_1$  hybrid (orange).
- Hybrid phenotype,  $\phi_{F_1}(t) = e^t$ , does not oscillate.

## Example 2: hybrid phenotypic divergence in a two-gene oscillator



Phenotypes diverge quadratically in  $F_2$  and quartically in  $F_1$  hybrids, with respect to change in network architecture.

Example of a phenotypic landscape. The dark **black** line is the phenotypically identical gene network space, and numbers are phenotypic divergence.



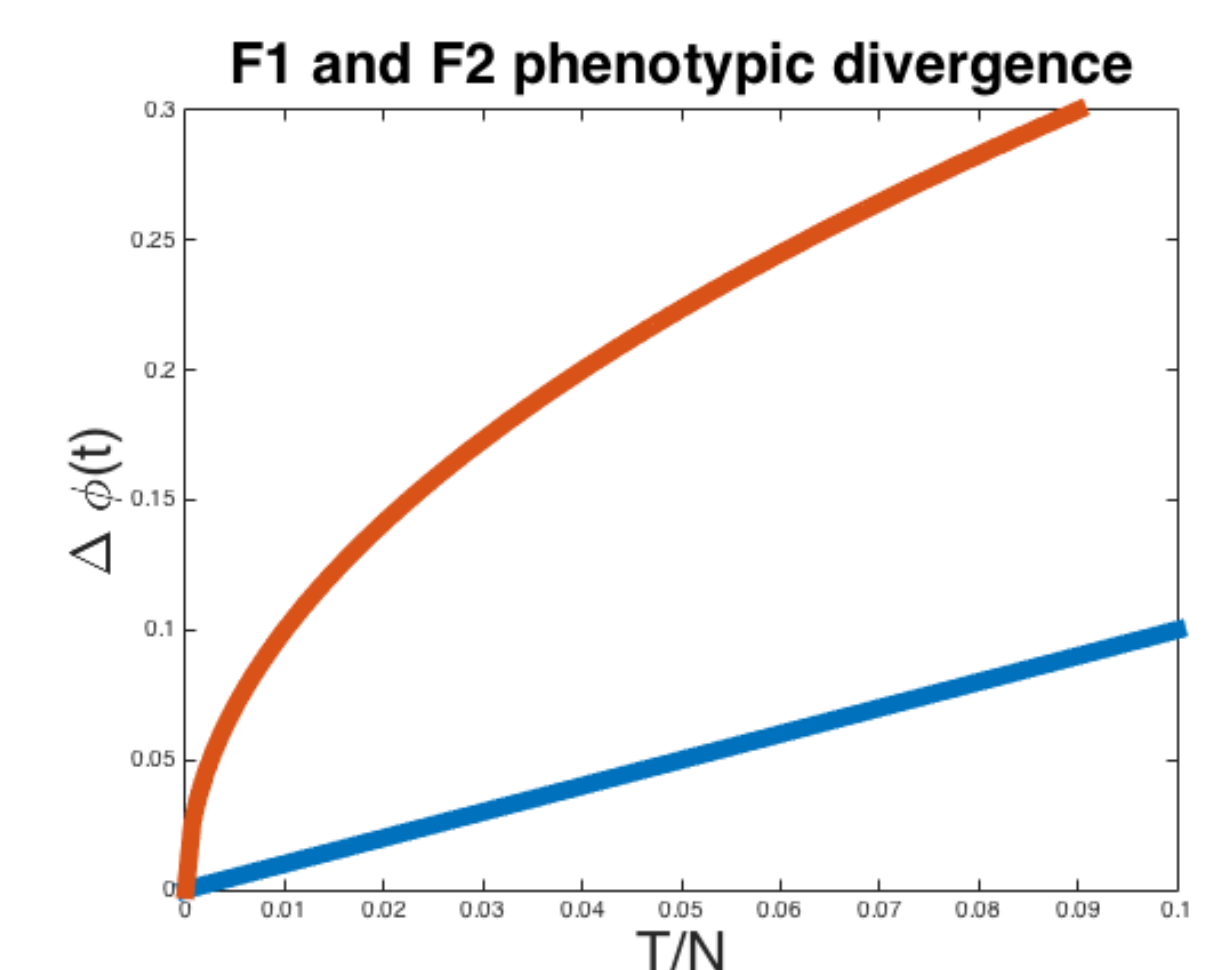
## Expected phenotypic divergence rate in allopatric populations under static and identical selective and environmental pressures

Using a quantitative genetics model and a Gaussian fitness function, the phenotypic divergence (locally) is,

$$\Delta\phi_{F_1}(t) \approx c_1 \frac{T}{N} \text{ in } F_1 \text{ (blue),}$$

$$\Delta\phi_{F_2}(t) \approx c_2 \sqrt{\frac{T}{N}} \text{ in } F_2 \text{ (orange)}$$

formed by mating allopatric populations of size  $N$  isolated for  $T$  generations, where  $c_1$  and  $c_2$  are constants.



## Future work

Apply model to study other evolutionary phenomena such as the necessity of complexity. Are gene regulatory networks Rube Goldberg machines? Is there a gene network ratchet?

## References

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- NA Johnson & AH Porter. Rapid speciation via parallel directional selection on regulatory genetic pathways. *Journal of Theoretical Biology*, 2000.