# **Coupled Cell Systems**

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#### **Two Identical Cells**



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 is a symmetry

- Fix $(\sigma) = \{x_1 = x_2\}$  is flow invariant Synchrony is a robust phenomenon
- Time-periodic solutions can exist where two cells oscillate a half-period out of phase

$$x_2(t) = x_1(t + \frac{1}{2})$$

Basic questions for symmetric differential equations
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 (b) What kinds of symmetry can solutions have?
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- Related: Network architecture is modeling assumption

#### **Fixed-Point Subspaces**

- $\Sigma \subset \Gamma$  is a subgroup
- Fixed-point subspace:  $Fix(\Sigma) = \{x : \sigma x = x \quad \forall \sigma \in \Sigma\}$
- $Fix(\Sigma)$  is flow-invariant:

$$\sigma f(x) = f(\sigma x) = f(x)$$

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Coupled cell systems described by graph



Output from different cells can be compared

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• Fixed-point subspaces are synchrony subspaces Example:  $\sigma = (2 \ 4)$   $x_2(0) = x_4(0) \Longrightarrow x_2(t) = x_4(t)$ 

## **Symmetry and Synchrony**

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- Fixed-point subspaces are synchrony subspaces Example:  $\sigma = (2 \ 4)$   $x_2(0) = x_4(0) \Longrightarrow x_2(t) = x_4(t)$
- Question: Are all synchrony spaces fixed-point spaces? Answer: No

# **Spatio-Temporal Symmetries**

**Question:** Assume  $\Gamma$  is finite

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- Let x(t) be a time-periodic solution
  - $K = \{ \gamma \in \Gamma : \gamma x(t) = x(t) \}$  space symmetries
  - $H = \{\gamma \in \Gamma : \gamma\{x(t)\} = \{x(t)\}\}$  spatiotemporal symm's

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#### **Facts:**

- $h \in H \Longrightarrow \theta \in \mathbf{S}^1$  such that  $hx(t) = x(t + \theta)$
- H/K is cyclic

# **3-Cell Directed Ring: Rotating Wave**

How do spatio-temporal symmetries manifest themselves in coupled cell systems? Answer: phase synchrony

• One-dimensional internal dynamics. Phase space is  $\mathbf{R}^3$ 

• 
$$K = 1; H = \mathbf{Z}_3$$



3

2



#### **Another Three-Cell System**

$$\dot{x}_1 = f(x_1, x_2) \dot{x}_2 = g(x_2, x_1, x_3) \qquad g(x_2, x_1, x_3) = g(x_2, x_3, x_1) \dot{x}_3 = f(x_3, x_2)$$

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• Out-of-phase periodic solutions ( $H = \mathbf{Z}_2(\sigma)$ ,  $K = \mathbf{1}$ ):

$$\sigma X(t) = X\left(t + \frac{1}{2}\right)$$
  
 $x_3(t) = x_1\left(t + \frac{1}{2}\right)$  and  $x_2(t) = x_2\left(t + \frac{1}{2}\right)$ 

#### **Another Three-Cell System (2)**



# **Quadrupedal Gaits**



Black disk indicates time when foot hits ground

Trot

Thanks to: Sue Morris at http://www.classicaldressage.co.uk

G., Stewart, Buono, and Collins (1999, 2000)

# **Gait Symmetries**





Collins and Stewart (1993)

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#### **Four Cells Do Not Suffice**

- $\Gamma =$  symmetry group of network
- Network produces walk. There is a four-cycle

 $(1\ 3\ 2\ 4)\in\Gamma$ 

Four-cycle permutes pace to trot



PACE

TROT

CPG cannot be modeled by four-cell network where each cell gives rhythmic pulsing to one leg

Use symmetries to construct coupled cell network.

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•  $\Gamma = \mathbf{Z}_4(\omega) \times \mathbf{Z}_2(\kappa)$  is abelian

# **Primary Gaits:** $H = \Gamma = \mathbf{Z}_4(\omega) \times \mathbf{Z}_2(\kappa)$

K	$\Gamma/K$	Phase Diagram	Gait	
Г	1	$\left(\begin{array}{cc} 0 & 0 \\ 0 & 0 \end{array}\right)$	pronk	
$<\omega>$	$\mathbf{Z}_2$	$\left(\begin{array}{cc} 0 & \frac{1}{2} \\ 0 & \frac{1}{2} \end{array}\right)$	pace	
$<\kappa\omega>$	$\mathbf{Z}_2$	$\left(\begin{array}{ccc} \frac{1}{2} & 0\\ 0 & \frac{1}{2} \end{array}\right)$	trot	
$<\kappa,\omega^2>$	$\mathbf{Z}_2$	$\left(\begin{array}{cc} 0 & 0\\ \frac{1}{2} & \frac{1}{2} \end{array}\right)$	bound	
$<\kappa\omega^2>$	$\mathbf{Z}_4$	$ \left(\begin{array}{ccc} \pm\frac{1}{4} & \pm\frac{3}{4} \\ 0 & \frac{1}{2} \end{array}\right) $	$walk^{\pm}$	
$<\kappa>$	$\mathbf{Z}_4$	$\left(\begin{array}{cc} 0 & 0 \\ \pm \frac{1}{4} & \pm \frac{1}{4} \end{array}\right)$	jump±	

Primary gaits occur by Hopf bifurcation from stand

# The Jump



- Average Right Rear to Right Front = 31.2 frames
- Average Right Front to Right Rear = 11.4 frames

$$\frac{31.2}{11.4} = 2.74$$

## **Coupled Cell Theory**

- input sets and input isomorphisms
- network architecture = symmetry groupoids
- balanced colorings and synchrony subspaces
- quotient networks

Stewart, G., and Pivato (2003); G., Stewart, and Török (2004)

## **Asymmetric Three-Cell Network**



•  $Y = \{x : x_1 = x_2\}$  is flow-invariant

Synchrony spaces exist in networks without symmetry

Restrict equations  $\dot{x}_1, \dot{x}_2$  to Y

$$\dot{x}_1 = f(x_1, x_1, x_3)$$
  
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Cells 1 and 2 are identical within the network

#### **Input Sets**

Input set of cell j: Cell j & cells i that connect to j



Key idea: cells 1, 2 have isomorphic input sets

## **Coupled Cell Network Definition**

- A set of *cells*  $\mathcal{C} = \{1, \dots, N\}$
- An equivalence relation on cells
- Each cell c has input terminal I(c) with incoming arrows
- An equivalence relation on arrows
- Equivalent arrows have equivalent tail and head cells

A coupled cell network is represented by a graph

- For each class of cells choose node symbol  $\bigcirc, \Box, \triangle$
- For each class of arrows choose arrow symbol  $\rightarrow$ ,  $\Rightarrow$ ,  $\rightsquigarrow$

# Symmetry Groupoid

- An input isomorphism is a bijection  $\beta : I(c) \rightarrow I(d)$  that preserves arrow types
- **\mathcal{B}\_G** = set of all input isomorphisms;  $\mathcal{B}_G$  is a groupoid
- Groupoid is like group; but product not always defined
- Coupled cell systems: ODEs that commute with  $\mathcal{B}_G$

• Color cells in C (red, blue, maroon, etc)

 $\Delta = \{ x : x_c = x_d \quad \text{whenever} \quad c \text{ and } d \quad \text{have same color} \}$ 

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**Synchrony subspace** if  $\Delta$  is always flow invariant

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**Synchrony subspace** if  $\Delta$  is always flow invariant

 $\Delta$  is coupled cell analog of fixed-point subspace

- Coloring is balanced if every pair of cells with same color has a color preserving input isomorphism
- Theorem: synchrony subspace balanced

Stewart, G., and Pivato (2003)

# **Example: Lattice Dynamical Systems**

- Consider square lattice with nearest neighbor coupling
- Form a two-color balanced relation



Each black cell connected to two black and two white Each white cell connected to two black and two white

Stewart, G. and Nicol (2003)

# Lattice Dynamical Systems (2)

There are eight isolated balanced two-colorings on square lattice with nearest neighbor coupling



Wang and G. (2004)

#### indicates nonsymmetric solution

# Lattice Dynamical Systems (3)

There are two infinite families of balanced two-colorings

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# Lattice Dynamical Systems (3)

#### There are two infinite families of balanced two-colorings





#### A continuum of different synchrony subspaces exist



# Lattice Dynamical Systems (4)

Up to symmetry these are all balanced two-colorings

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Lemma: Each balanced two coloring leads to equilibria in one parameter bifurcations

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Lemma: Each balanced two coloring leads to equilibria in one parameter bifurcations

Architecture is important

No infinite families with next nearest neighbor coupling

# **Hexagonal Lattice: NNN Coupling**

There are 13 two-color patterns of synchrony in hex lattice with nearest and next nearest neighbor coupling



#### **Three-Cell Feed-Forward Network**



 $\alpha =$  linearized internal  $\beta =$  linearized coupling

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Network supports solution by Hopf bifurcation where  $x_1(t)$  equilibrium  $x_2(t), x_3(t)$  time periodic



#### **Three-Cell Feed-Forward Network (2)**

Network supports solution where

 $x_1(t)$  equilibrium,  $x_2(t)$  time periodic,  $x_3(t)$  quasiperiodic





• Let  $x_0 = (x_1^0, \dots, x_N^0)$  be a hyperbolic equilibrium Color cells c, d same color iff  $x_c^0 = x_d^0$  $\Delta = \{x : x_c = x_d \text{ if } c \text{ and } d \text{ have same color}\}$ 

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- Theorem: Coloring is rigid iff balanced

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- Theorem: Coloring is rigid iff balanced
- Conjecture: Hyperbolic periodic solutions can have rigid phase shift synchrony only when there is a symmetric quotient network
- G., Stewart, and Török (2003)

## **Quotient Cell Systems**

- Given cell network C and balanced coloring  $\bowtie$
- **Define** *quotient network*  $\mathcal{C}_{\bowtie}$  by
  - $\mathbf{C}_{\bowtie} = \{ \overline{c} : c \in \mathcal{C} \} = \mathcal{C} / \bowtie$
  - Quotient cells equivalent if C cells equivalent
  - Quotient arrows are projections of C arrows
  - Quotient arrows equivalent if C arrows equivalent
- Thm: C-admissible DE restricted to  $\Delta_{\bowtie}$  is  $C_{\bowtie}$ -admissible DE on  $\Delta_{\bowtie}$  lifts to C-admissible DE
- G., Stewart, and Török (2003)

## **Asymmetric Five-Cell Network**



- Quotient is bidirectional 3-cell ring with D<sub>3</sub> symmetry
- One-parameter synchrony-breaking Hopf yields





## **Two Color Quotient Networks**

Every balanced two coloring has two-cell quotient





## **Two-Color Branching Lemma**





 $\ell = k_1 + m_1 = k_2 + m_2$ 

 $x_1 = x_2$  is flow-invariant

• Let  $\alpha$  = linearized internal and  $\beta$  = linearized coupling Jacobian =  $\begin{bmatrix} \alpha + k_1 \beta & m_1 \beta \\ m_2 \beta & \alpha + k_2 \beta \end{bmatrix}$ 

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• Eigenvalues are  $\alpha + \ell \beta$  ((1,1)) and  $\alpha + (k_1 + k_2 - \ell)\beta$ 

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• Eigenvalues are  $\alpha + \ell \beta$  ((1,1)) and  $\alpha + (k_1 + k_2 - \ell)\beta$ 

Solution Vary  $\alpha$  — get synchrony-breaking bifurcation

# **Two-Color Synchrony-Breaking Hopf**

- Unique synchrony-breaking Hopf bifurcation
- Periodic sol'ns are synchronous on cells of same color
- Near bifurcation to first order
  - Opposite color cells  $\approx$  one-half period out of phase
  - Ratio of amplitudes of opposite color cells  $\approx m_1/m_2$



