

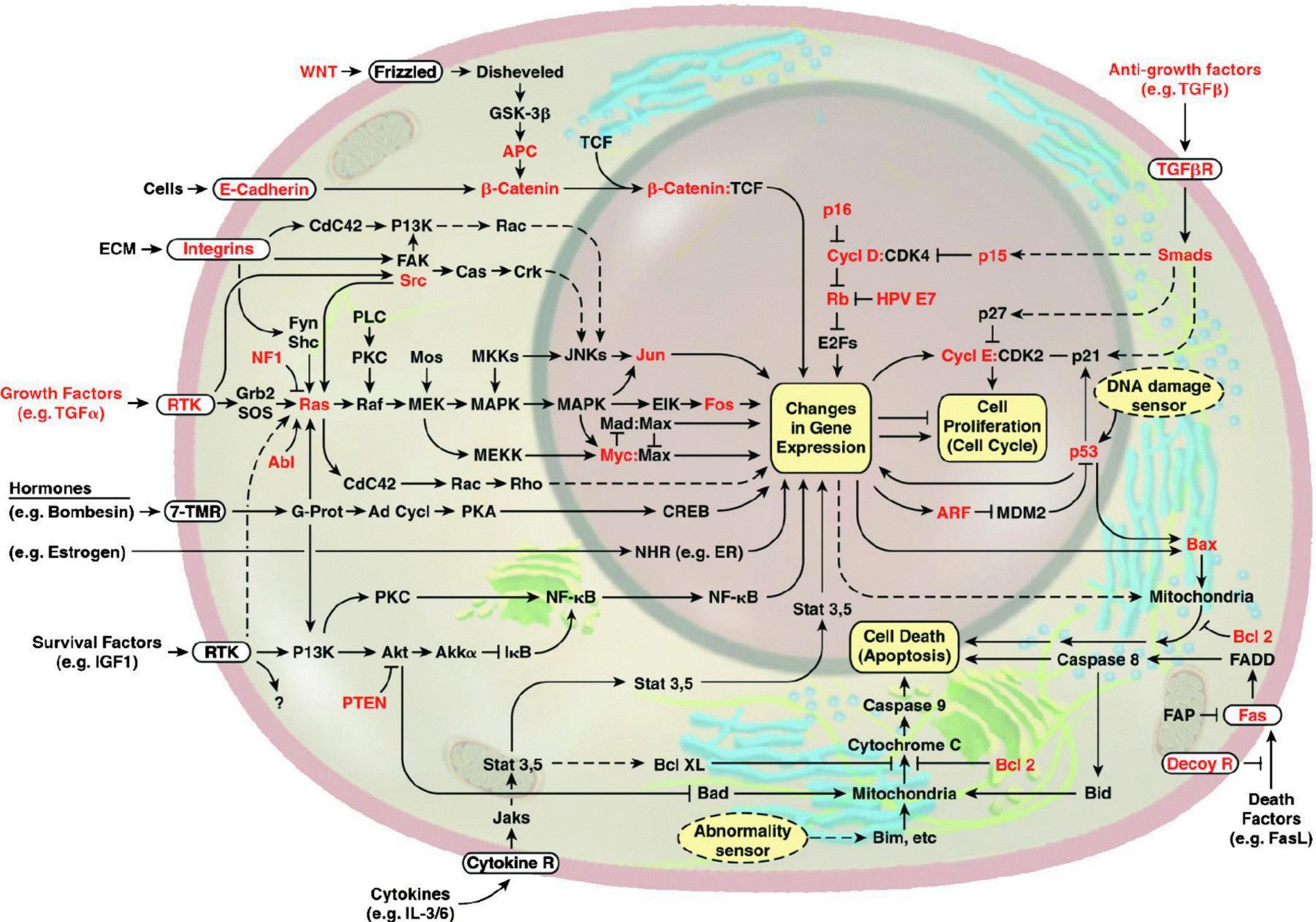
***Mathematical and computational
methods for understanding the
dynamics of biochemical networks***

Gheorghe Craciun

***Department of Mathematics and
Department of Biomolecular Chemistry
University of Wisconsin - Madison***

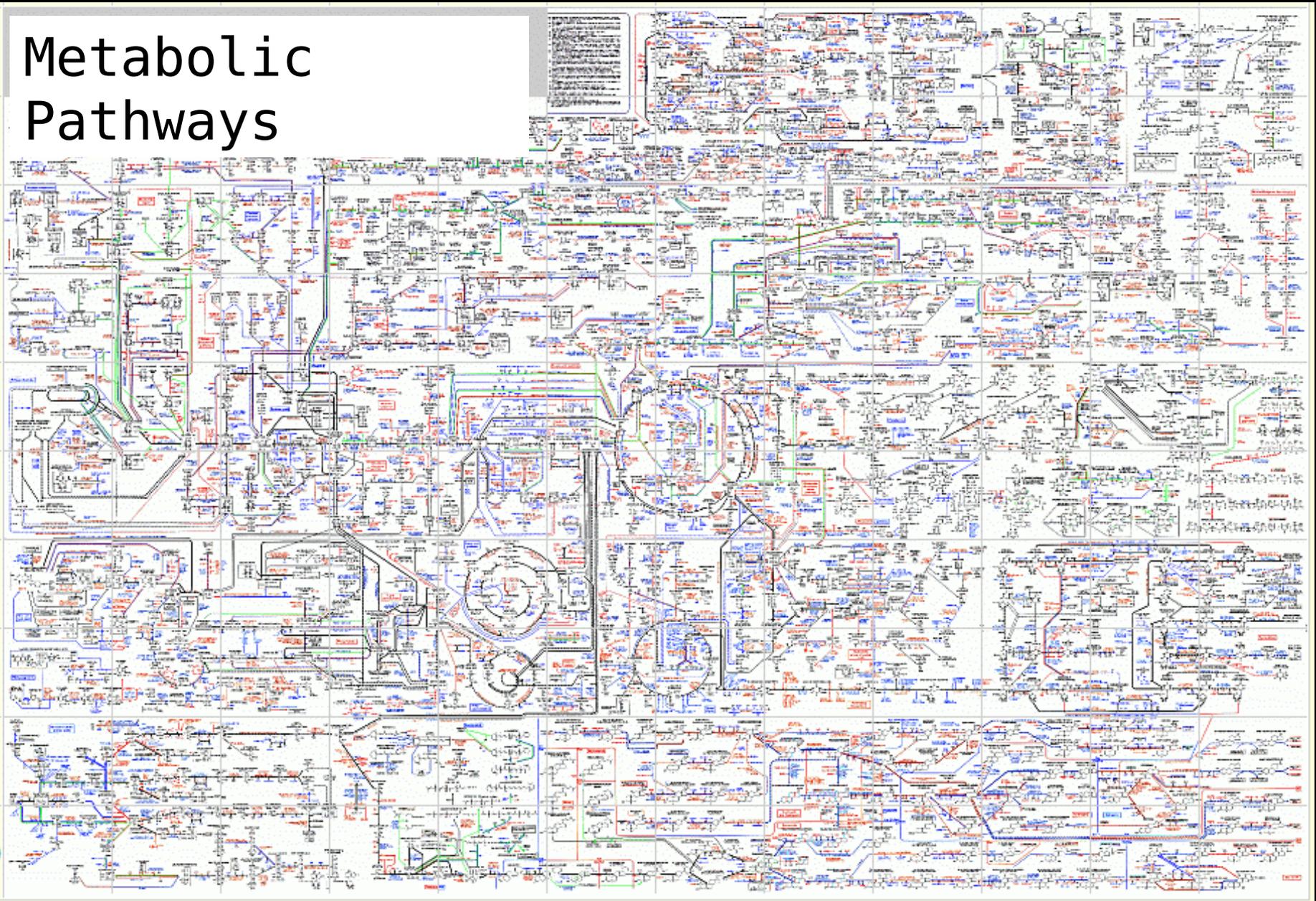
Outline

- *Examples*
- *Bistable biochemical networks*
- *The global attractor conjecture*



Hanahan and Weinberg, The Hallmarks of Cancer, *Cell*, 2000.

Metabolic Pathways



Outline

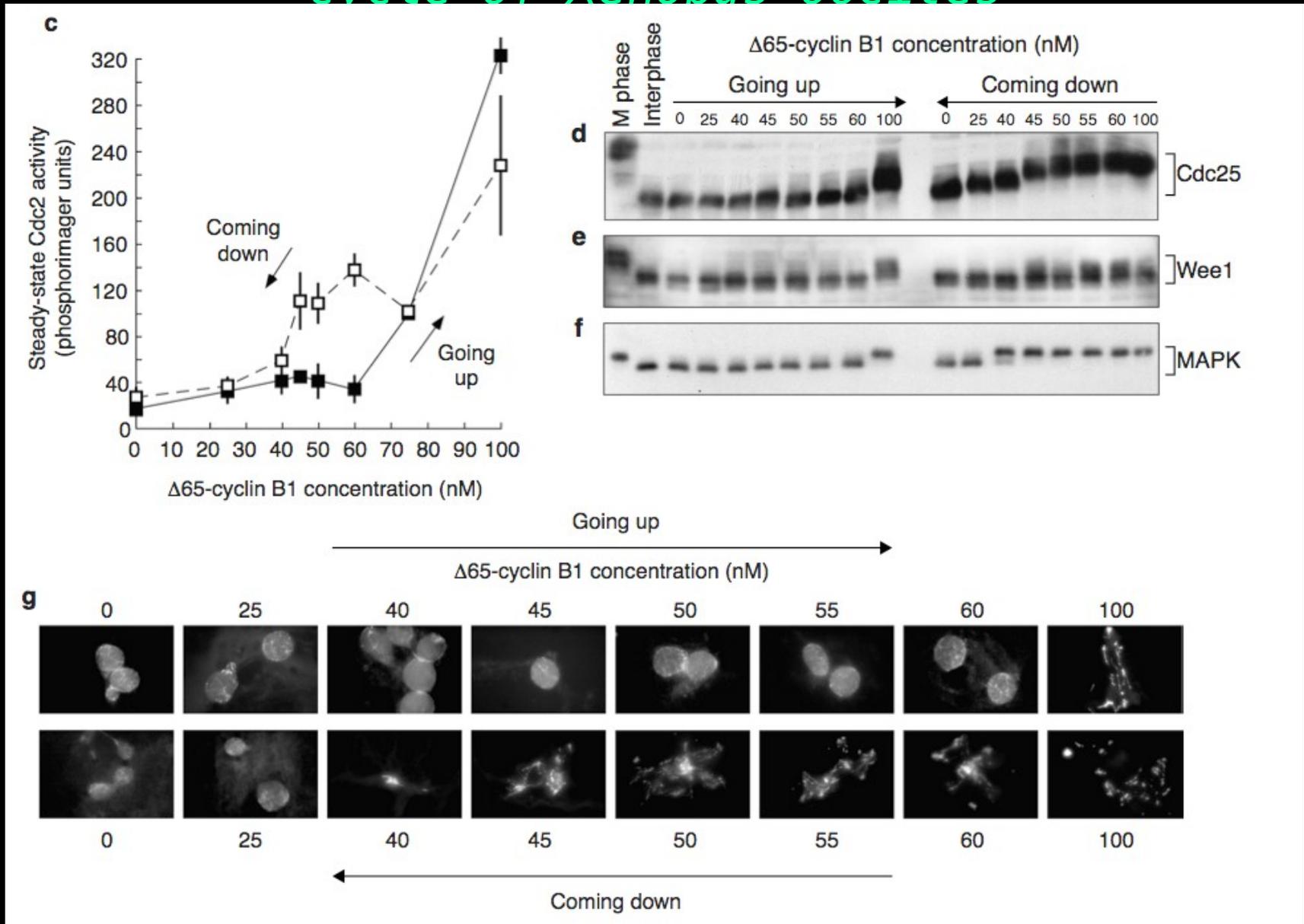
- *Examples*
- *Bistable biochemical networks*
- *The global attractor conjecture*

Bistability and Biochemical Switching

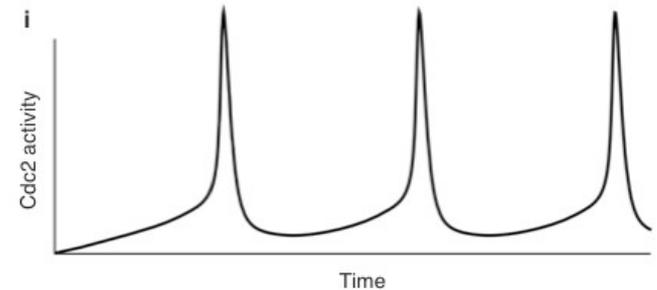
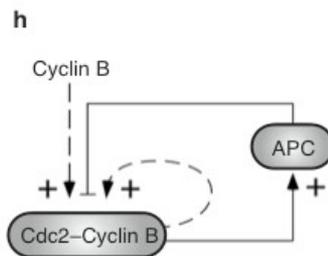
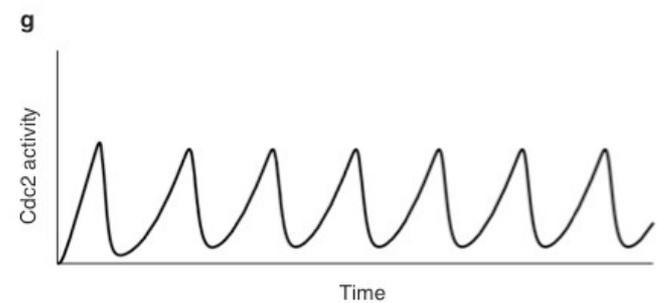
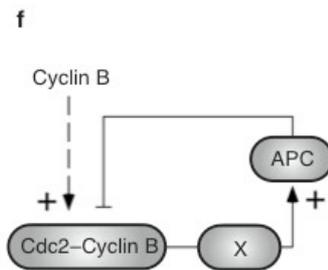
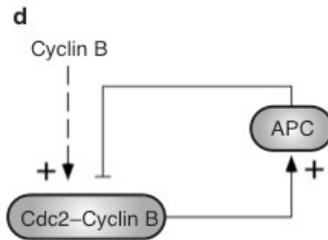
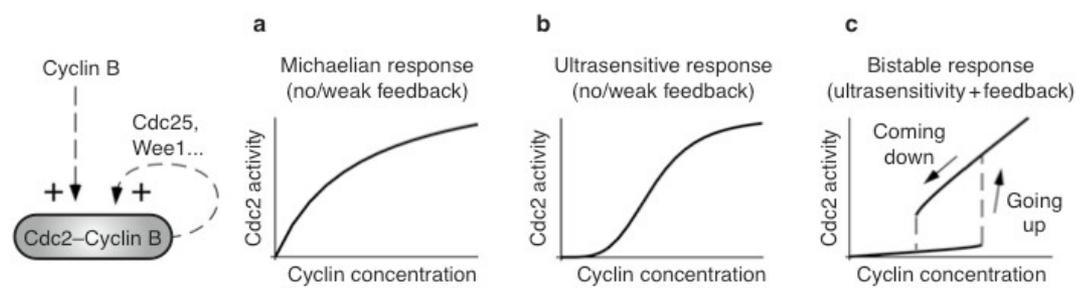
- J. Bailey, **Complex biology with no parameters**, *Nature*, 2001:

*...does a cell generally operate at one steady state, or can a cell **switch** under certain circumstances **from one steady state to another**?*

Bistability and hysteresis in the embryonic cell cycle of *Xenopus* oocytes



Bistability and Biochemical Oscillations



J. Pomerening, E. Sontag, J. Ferrell, *Building a cell cycle oscillator: hysteresis and bistability in the activation of Cdc2,*

Given a reaction network, how can we decide if it has the capacity for bistability ?

Some Simple Enzyme Networks and their Capacity for Bistability

	<i>Network</i>	<i>Remark</i>	<i>Capacity for Bistability</i>
1.	$E + S \rightleftharpoons ES \rightarrow E + P$	Elementary enzyme catalysis underlying Michaelis-Menten kinetics. $S \rightarrow P$	NO
2.	$E + S \rightleftharpoons ES \rightarrow E + P$ $E + I \rightleftharpoons EI$	Elementary enzyme catalysis with competitive inhibition $S \rightarrow P$	NO
3.	$E + S \rightleftharpoons ES \rightarrow E + P$ $ES + I \rightleftharpoons ESI$	Elementary enzyme catalysis with uncompetitive inhibition $S \rightarrow P$	NO
4.	$E + S \rightleftharpoons ES \rightarrow E + P$ $E + I \rightleftharpoons EI$ $ES + I \rightleftharpoons ESI \rightleftharpoons EI + S$	Elementary enzyme catalysis with mixed inhibition $S \rightarrow P$	YES

*Network**Remark**Capacity for Bistability*

5.

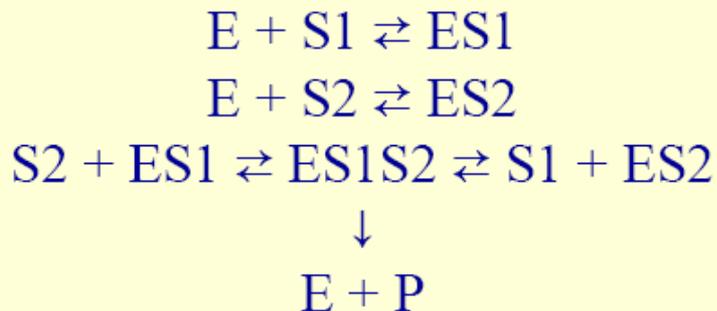


Two-substrate enzyme catalysis with ordered substrate-binding



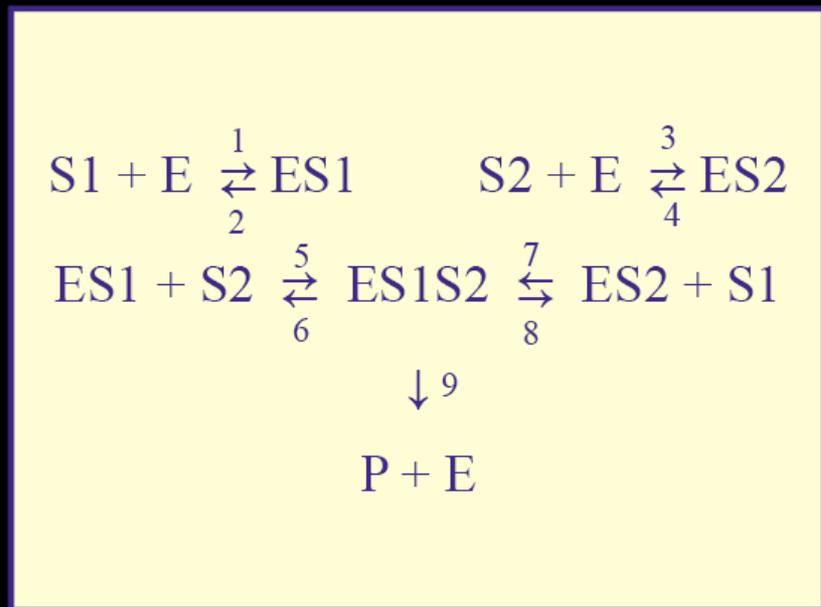
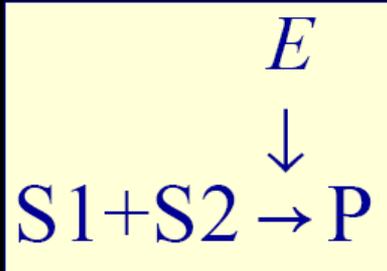
NO

6.

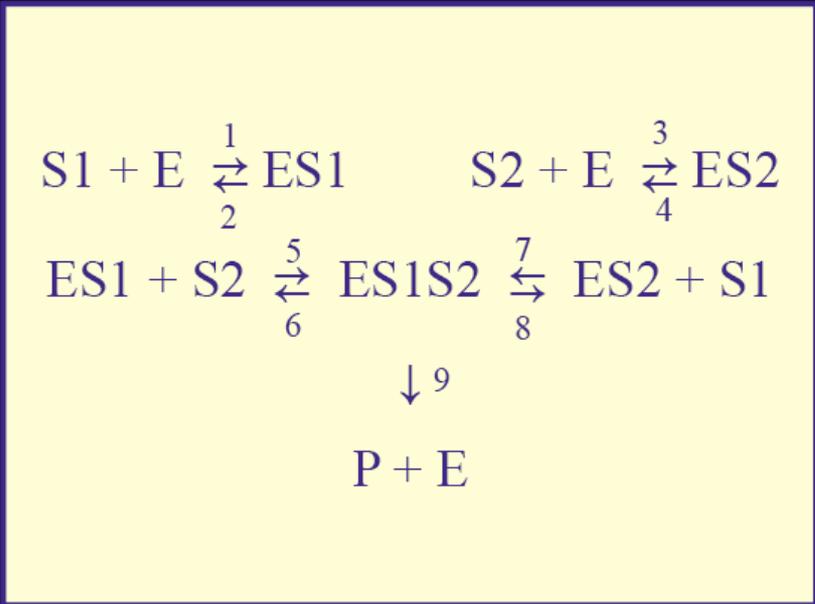
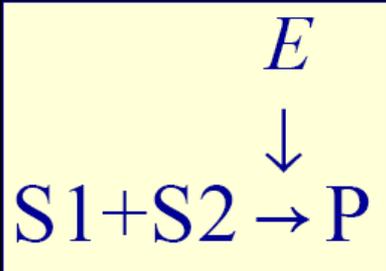


Two-substrate enzyme catalysis with unordered substrate-binding

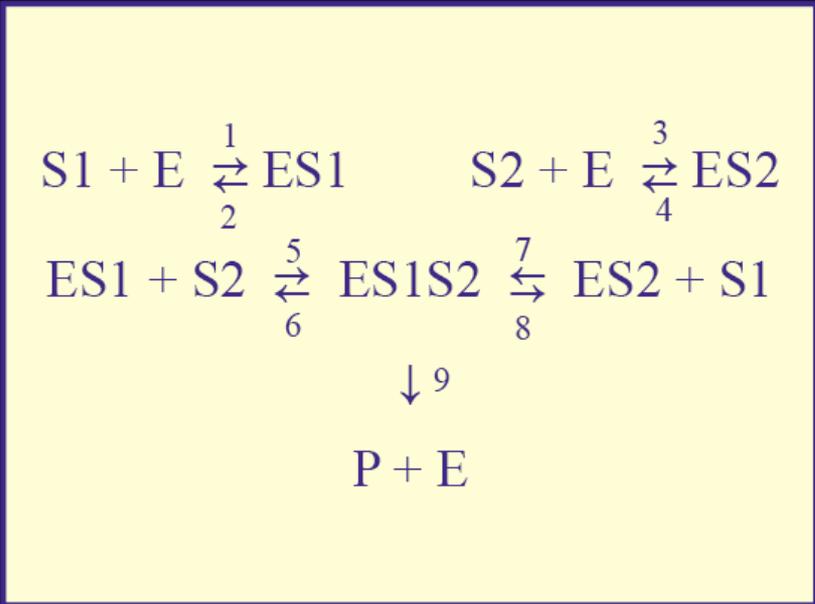
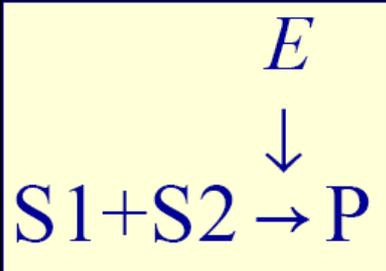
**YES**



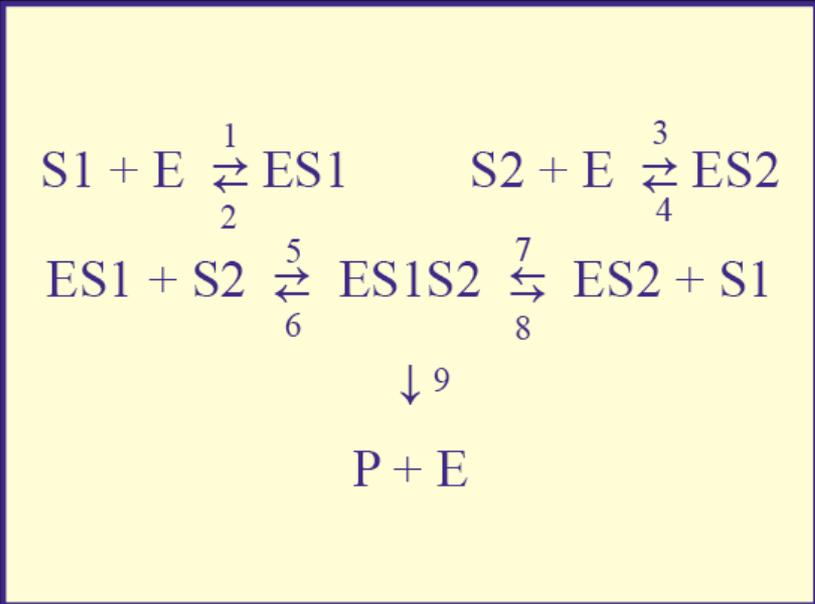
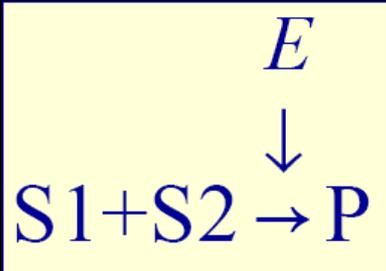
$$\begin{aligned}
 \dot{c}_E &= -k_1 c_E c_{S1} + k_2 c_{ES1} - k_3 c_E c_{S2} + k_4 c_{ES2} + k_9 c_{ES1S2} \\
 \dot{c}_{S1} &= -k_1 c_E c_{S1} + k_2 c_{ES1} - k_7 c_{S1} c_{ES2} + k_8 c_{ES1S2} - \xi_{S1} c_{S1} + F_{S1} \\
 \dot{c}_{S2} &= -k_3 c_E c_{S2} + k_4 c_{ES2} - k_5 c_{S2} c_{ES1} + k_6 c_{ES1S2} - \xi_{S2} c_{S2} + F_{S2} \\
 \dot{c}_{ES1} &= k_1 c_E c_{S1} - k_2 c_{ES1} - k_5 c_{ES1} c_{S2} + k_6 c_{ES1S2} \\
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 \dot{c}_{ES1S2} &= k_5 c_{S2} c_{ES1} + k_7 c_{S1} c_{ES2} - (k_6 + k_8 + k_9) c_{ES1S2} \\
 \dot{c}_P &= k_9 c_{ES1S2} - \xi_P c_P
 \end{aligned}$$



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 \dot{c}_{S2} &= -k_3 c_E c_{S2} + k_4 c_{ES2} - k_5 c_{S2} c_{ES1} + k_6 c_{ES1S2} - \xi_{S2} c_{S2} + F_{S2} \\
 \dot{c}_{ES1} &= k_1 c_E c_{S1} - k_2 c_{ES1} - k_5 c_{ES1} c_{S2} + k_6 c_{ES1S2} \\
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 \dot{c}_P &= k_9 c_{ES1S2} - \xi_P c_P
 \end{aligned}$$

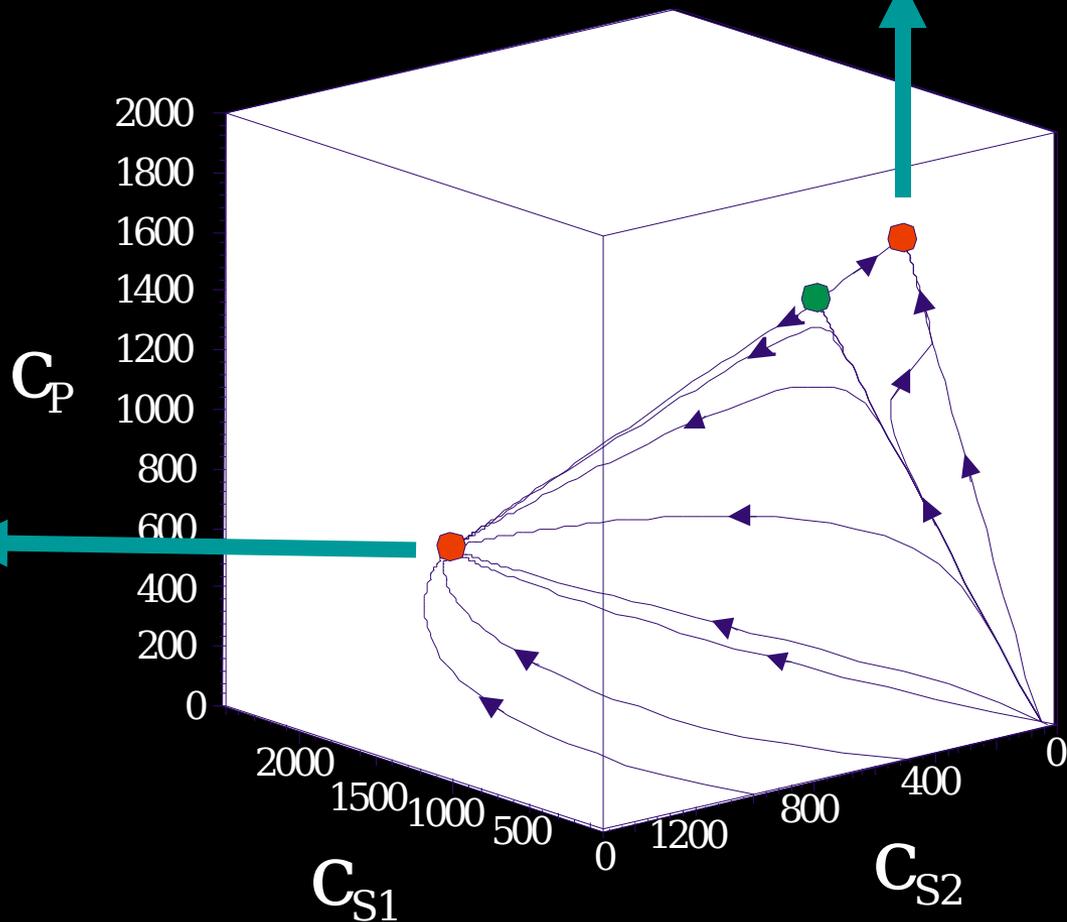
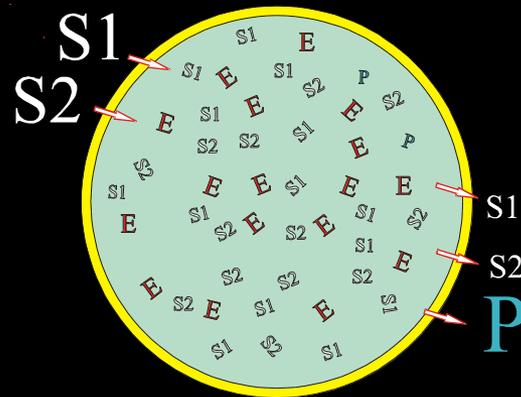
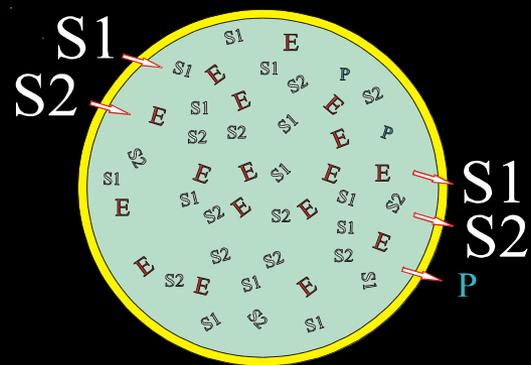


$$\begin{aligned}
 \dot{c}_E &= -k_1 c_E c_{S1} + k_2 c_{ES1} - k_3 c_E c_{S2} + k_4 c_{ES2} + k_9 c_{ES1S2} \\
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 \dot{c}_{S2} &= -k_3 c_E c_{S2} + k_4 c_{ES2} - k_5 c_{S2} c_{ES1} + k_6 c_{ES1S2} - \xi_{S2} c_{S2} + F_{S2} \\
 \dot{c}_{ES1} &= k_1 c_E c_{S1} - k_2 c_{ES1} - k_5 c_{ES1} c_{S2} + k_6 c_{ES1S2} \\
 \dot{c}_{ES2} &= k_3 c_E c_{S2} - k_4 c_{ES2} - k_7 c_{ES2} c_{S1} + k_8 c_{ES1S2} \\
 \dot{c}_{ES1S2} &= k_5 c_{S2} c_{ES1} + k_7 c_{S1} c_{ES2} - (k_6 + k_8 + k_9) c_{ES1S2} \\
 \dot{c}_P &= k_9 c_{ES1S2} - \xi_P c_P
 \end{aligned}$$



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 \dot{c}_P &= k_9 c_{ES1S2} - \xi_P c_P
 \end{aligned}$$

Bistability



Vocabulary:



Vocabulary:

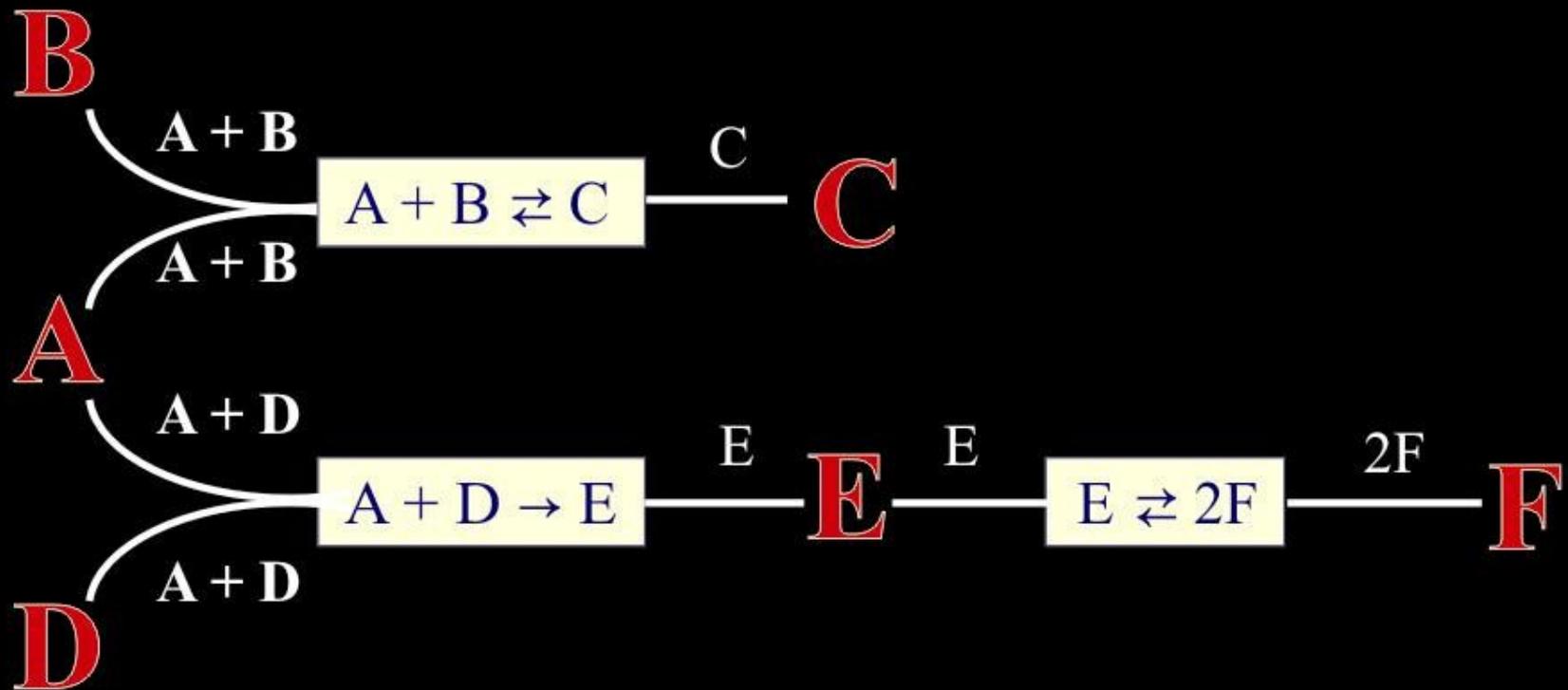
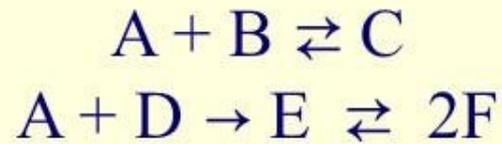


Species: A, B, C, D, E, F

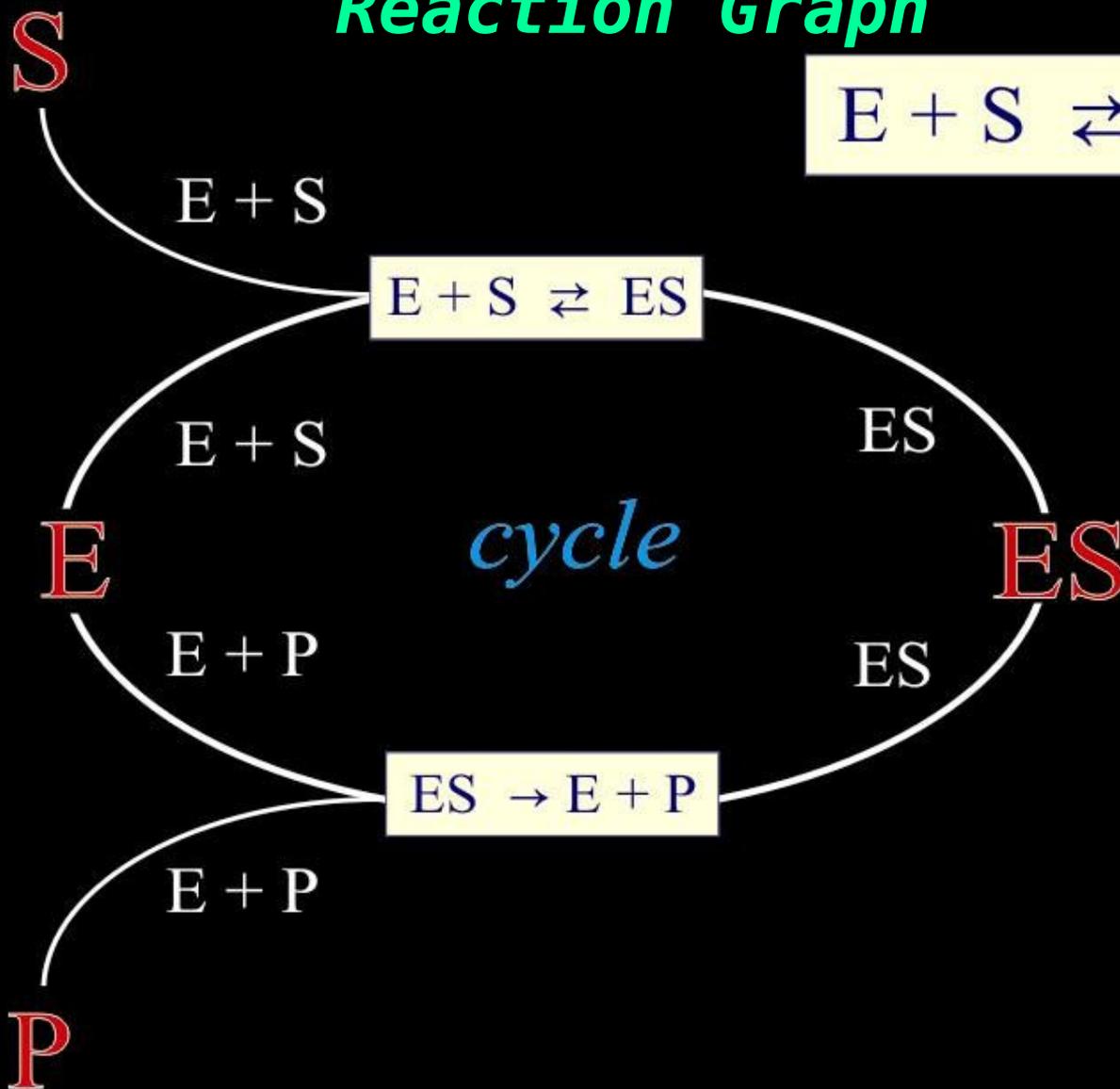
Reactions: $A + B \rightleftharpoons C$, $A + D \rightarrow E$, $E \rightleftharpoons 2F$

Complexes: A + B, C, A + D, E, 2F

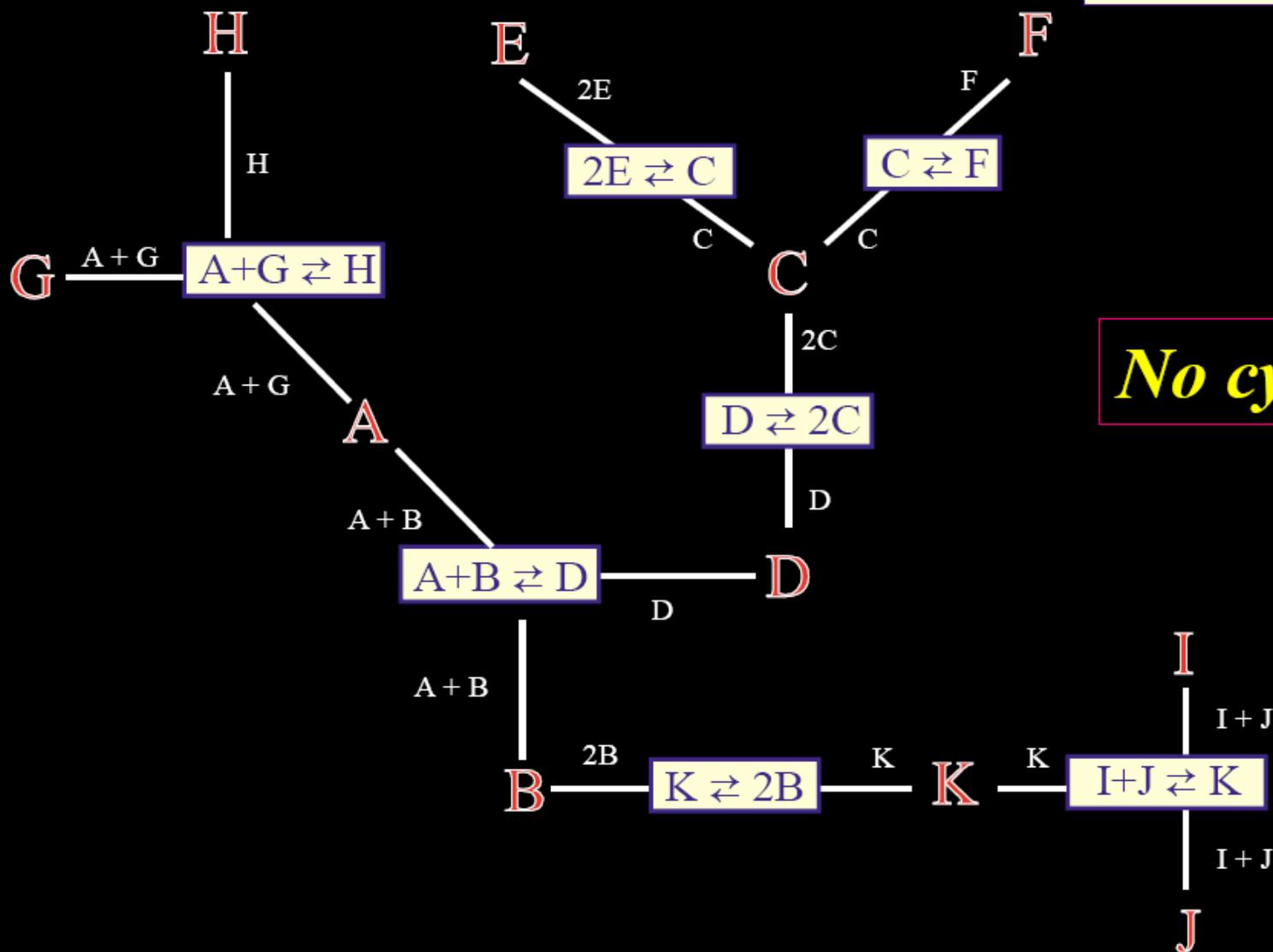
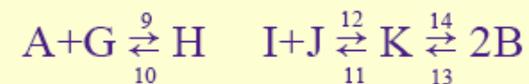
The Species-Reaction Graph



Another Species- Reaction Graph



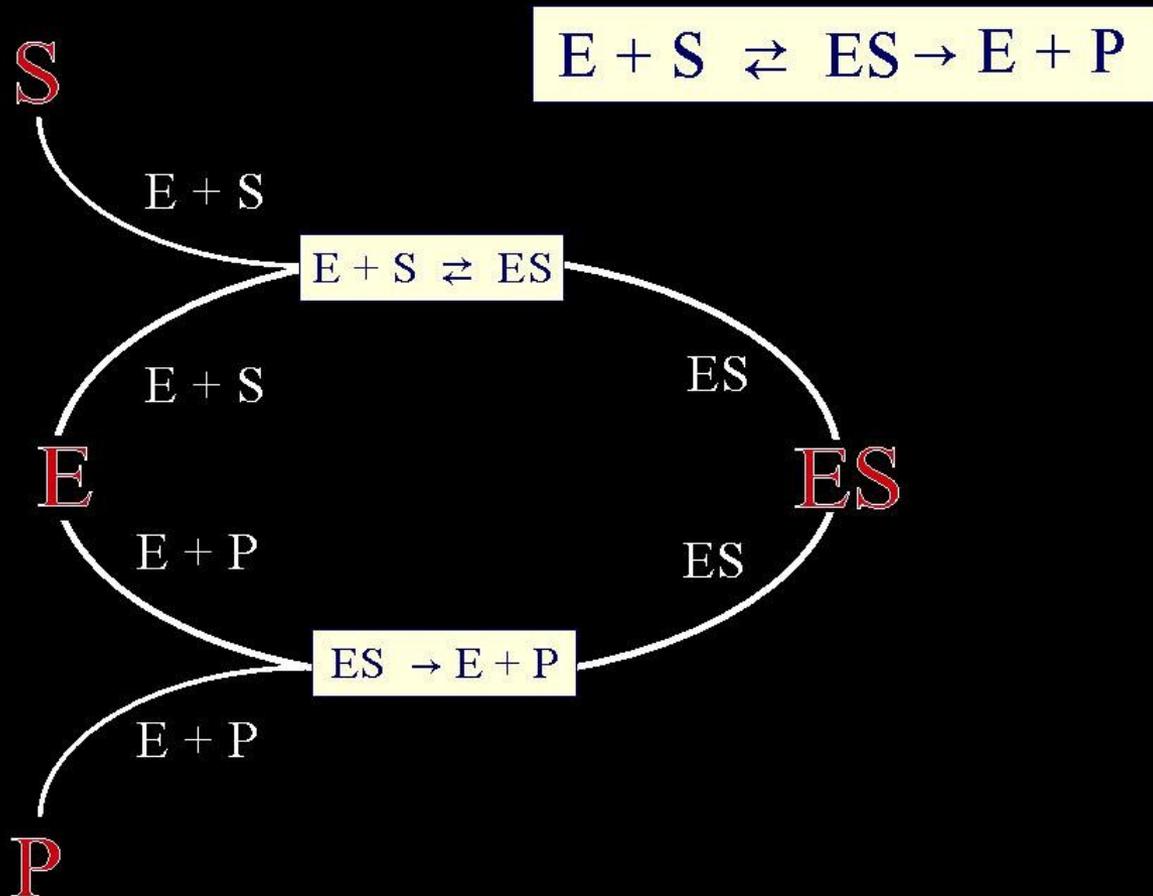
Theorem: Consider a reaction network for which the species-reaction graph has **no cycles**. Then, **regardless of parameter values**, the corresponding system of mass-action differential equations does not have the capacity for bistability.



No cycles!

Important remark:

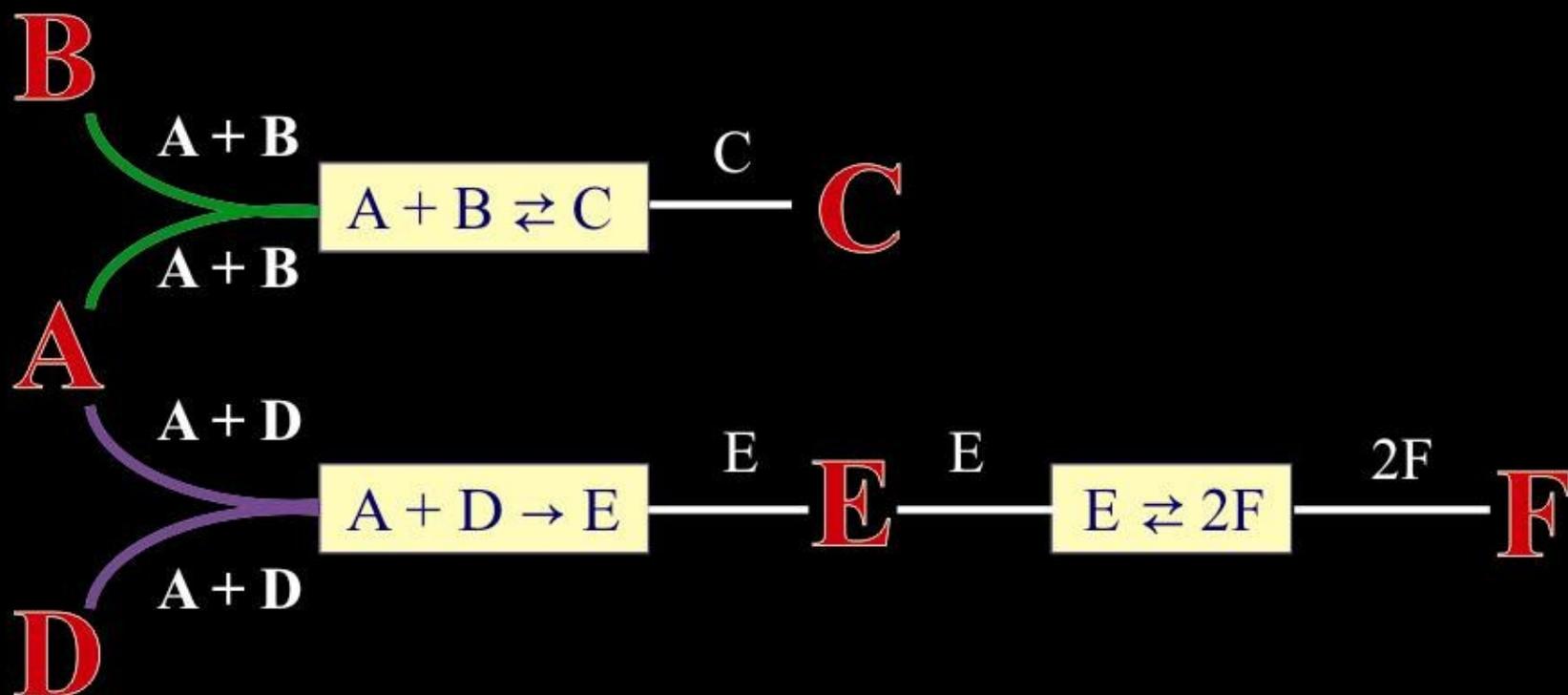
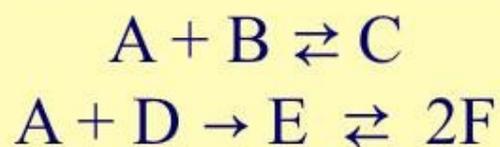
Enzyme catalysis *generates cycles* in the species-reaction graph.



More vocabulary: classifying cycles

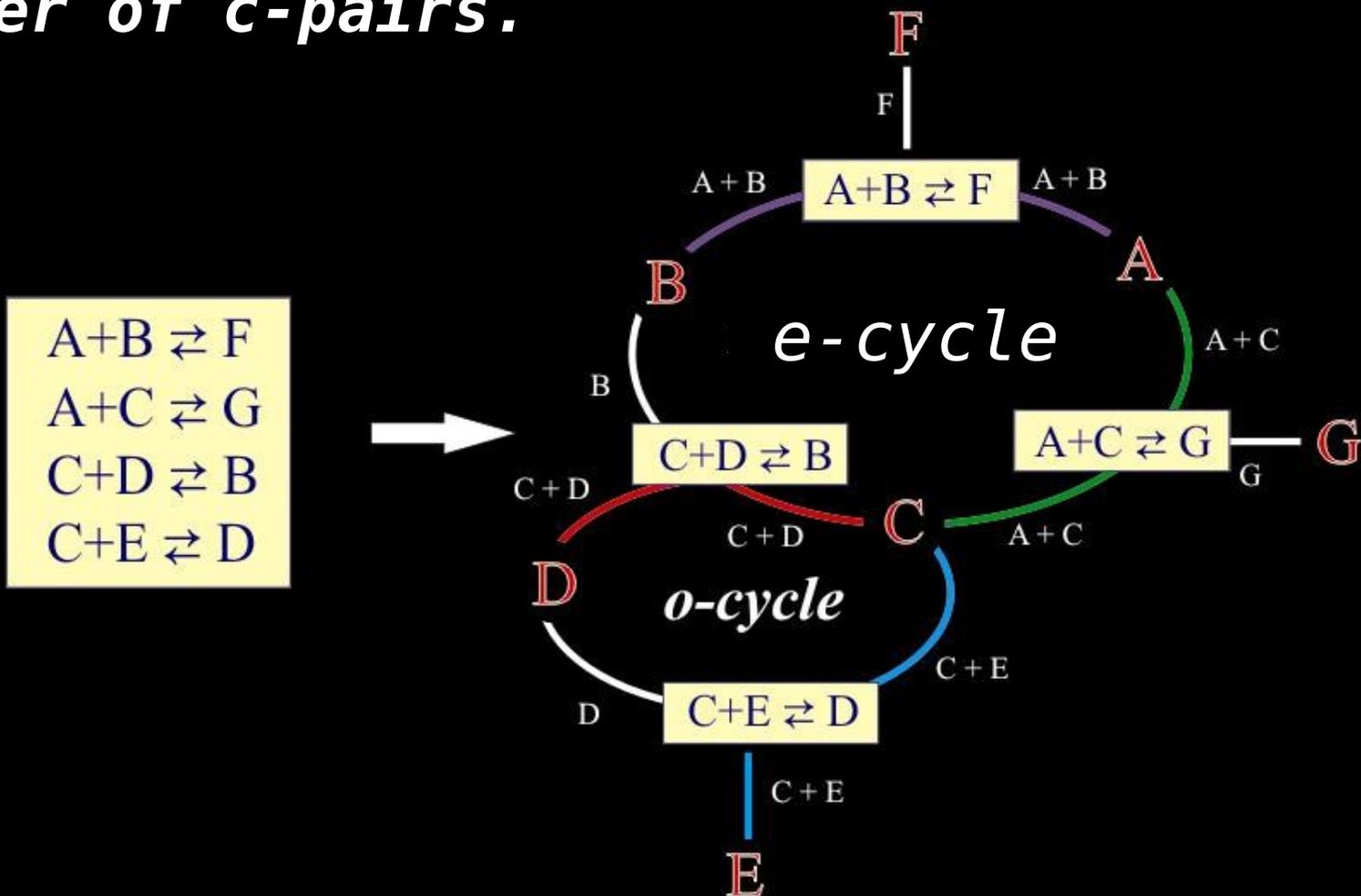
o-cycles, e-cycles, and s-cycles

c-Pairs in the Species-Reaction Graph



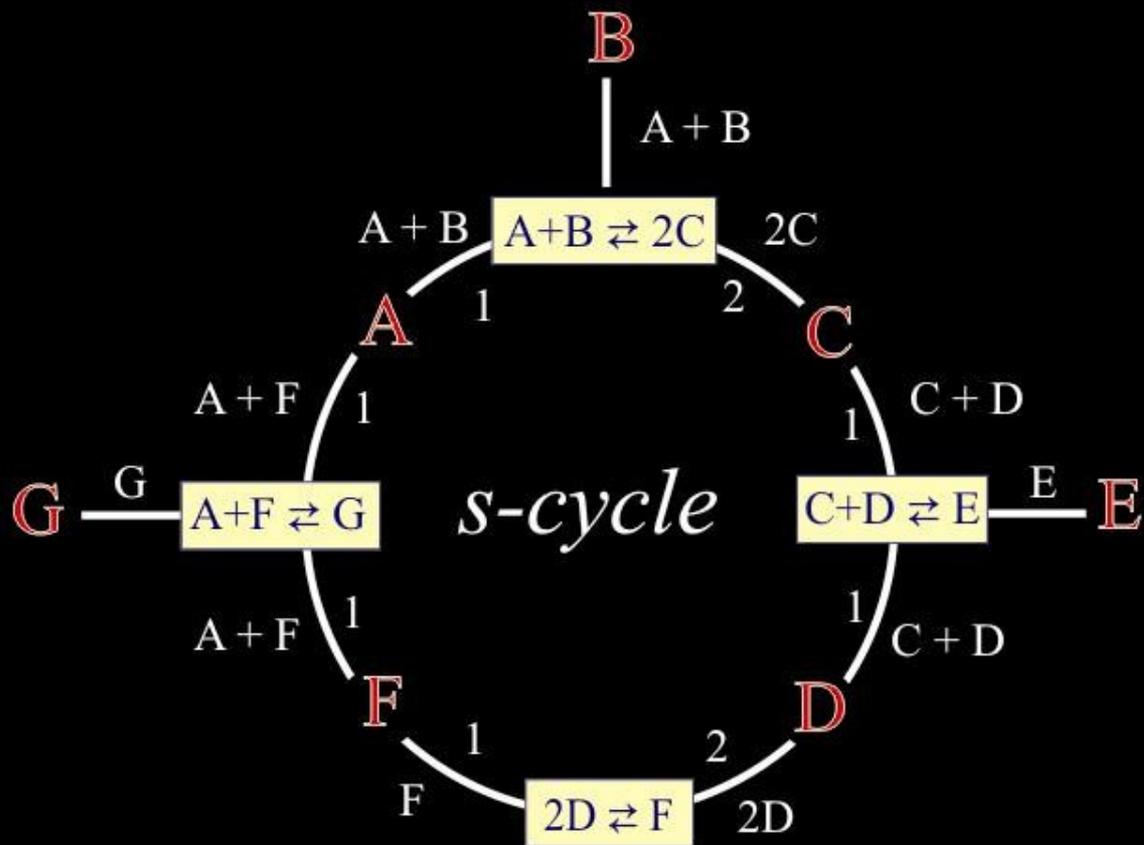
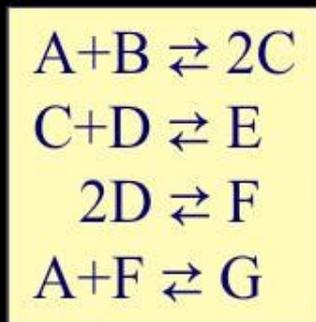
o-Cycles and e-Cycles

An *o-cycle* is a cycle containing an **odd** number of *c-pairs*.
 An *e-cycle* is a cycle containing an **even** number of *c-pairs*.

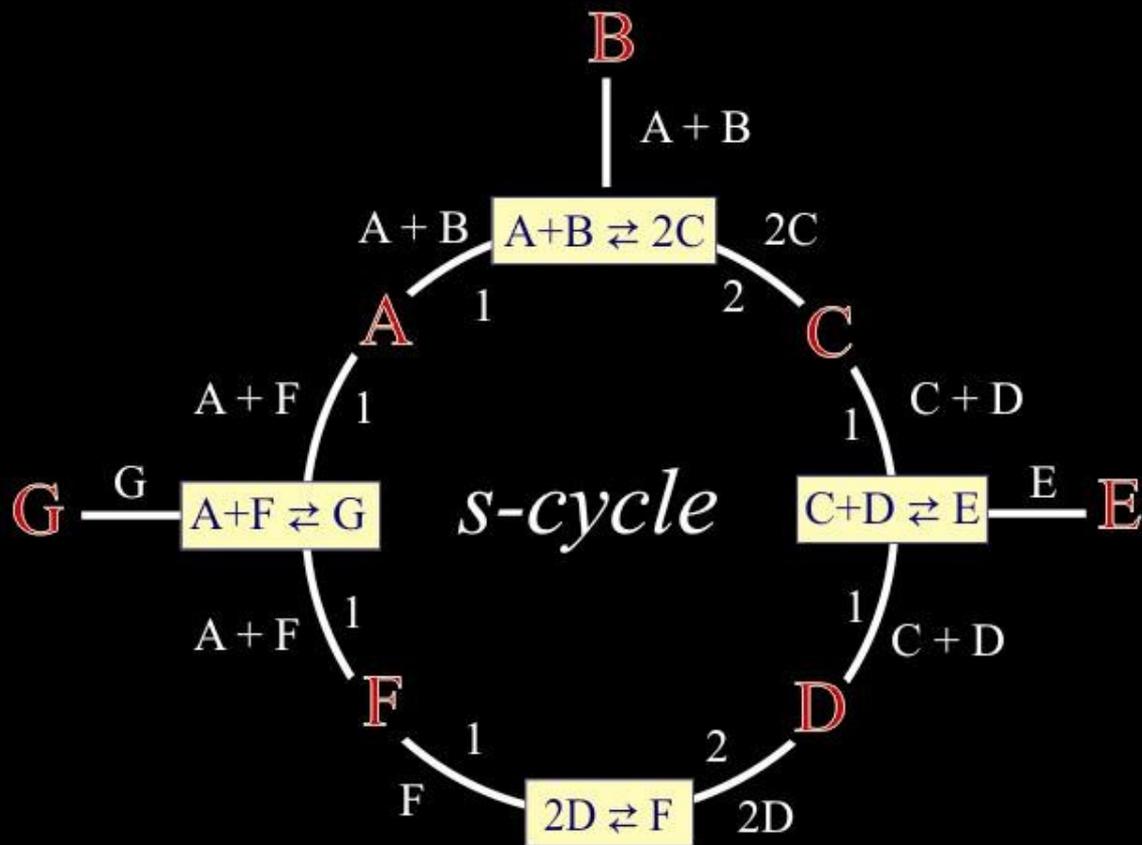
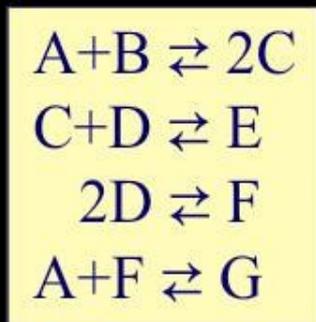


Theorem: Consider a reaction network for which each cycle in the species-reaction graph is an **o-cycle**. Then, **regardless of parameter values**, the corresponding system of mass-action differential equations does not have the capacity for bistability.

S- Cycles

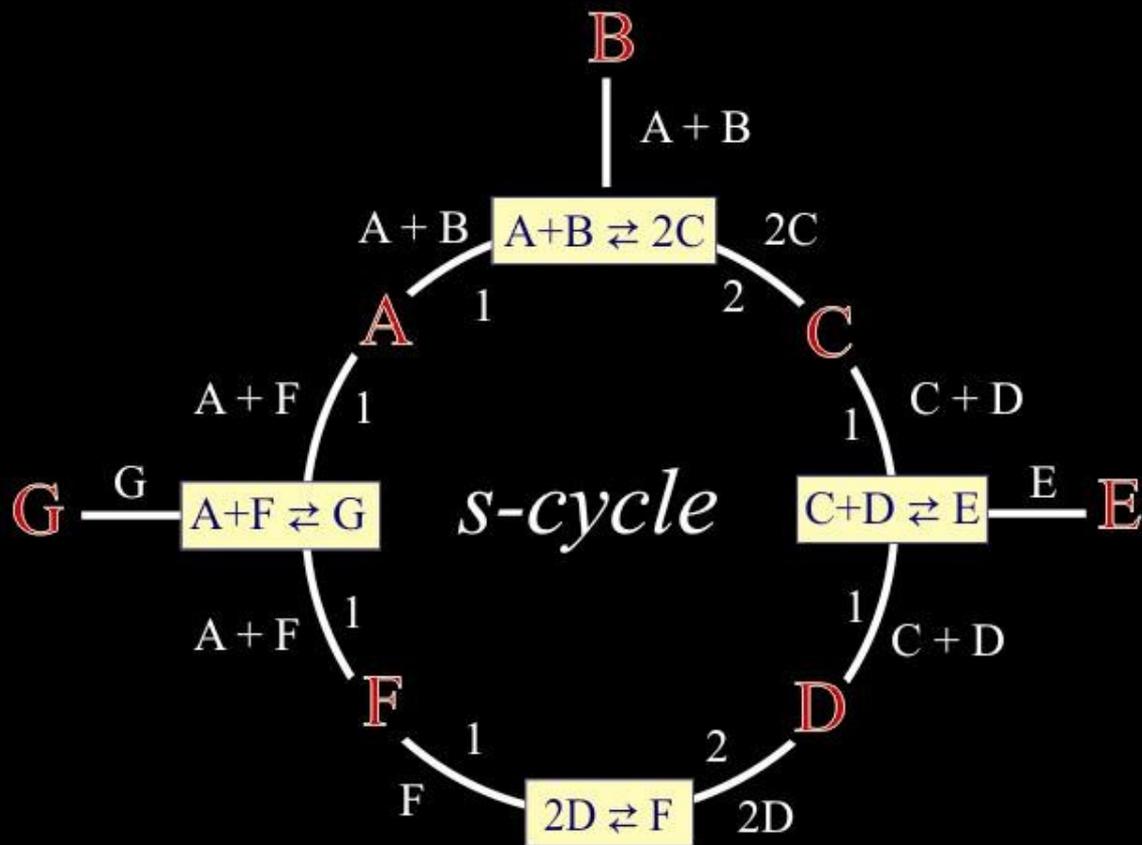
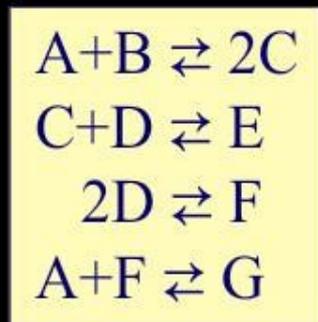


S- Cycles



$$1 \times (1/2) \times 1 \times (1/1) \times 2 \times (1/1) \times 1 \times (1/1) = 1$$

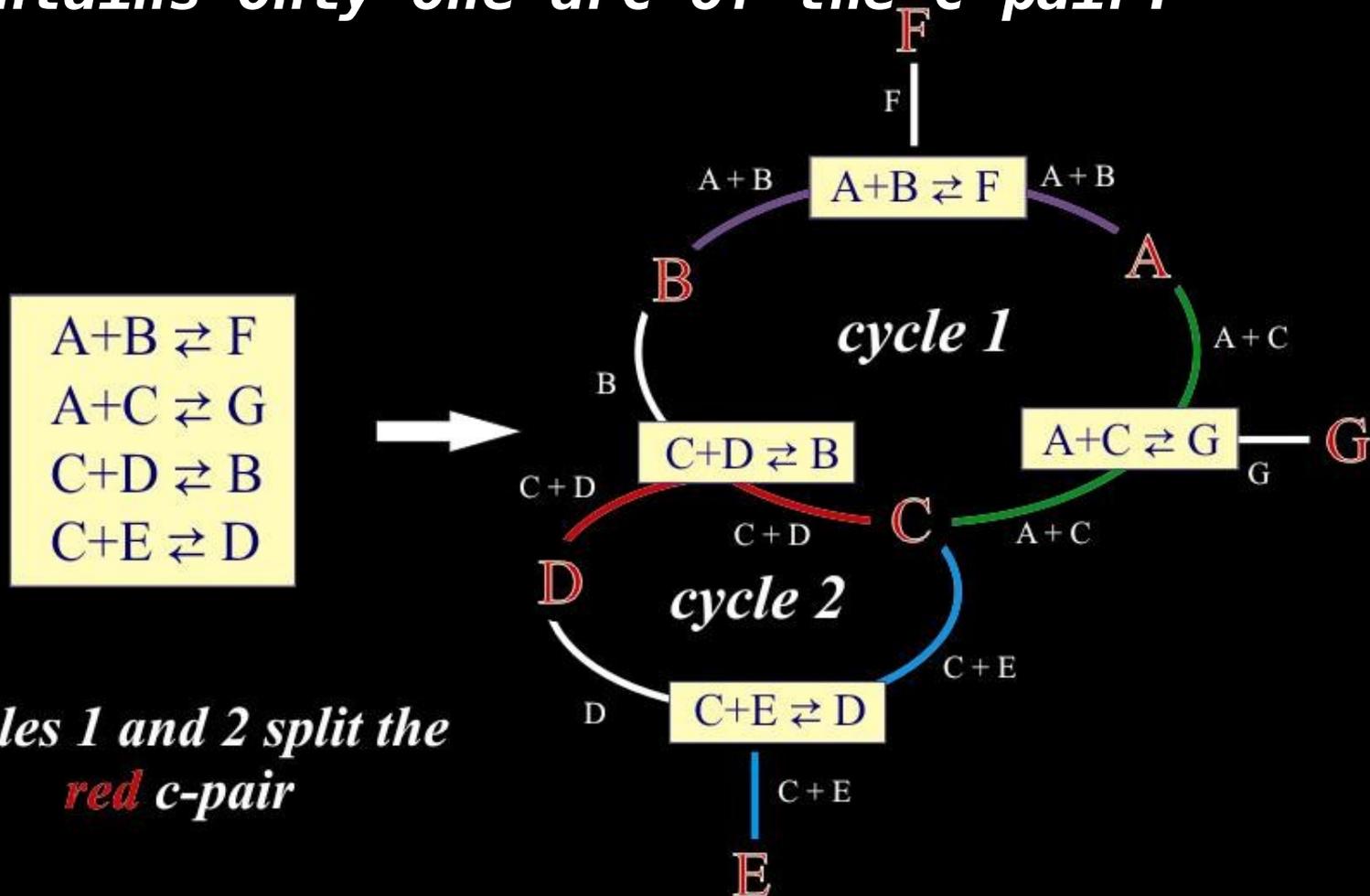
S- Cycles



$$1 \times (1/2) \times 1 \times (1/1) \times 2 \times (1/1) \times 1 \times (1/1) = 1$$

Remark: If every stoichiometric coefficient in a network is “1”, then **every** cycle in the corresponding Species-Reaction Graph is an *s-cycle*.

Two cycles **split a c-pair** if their combined arcs contain the c-pair and if at least one of the cycles contains only one arc of the c-pair.



Theorem: Consider a reaction network for which the species-reaction graph has the following properties:

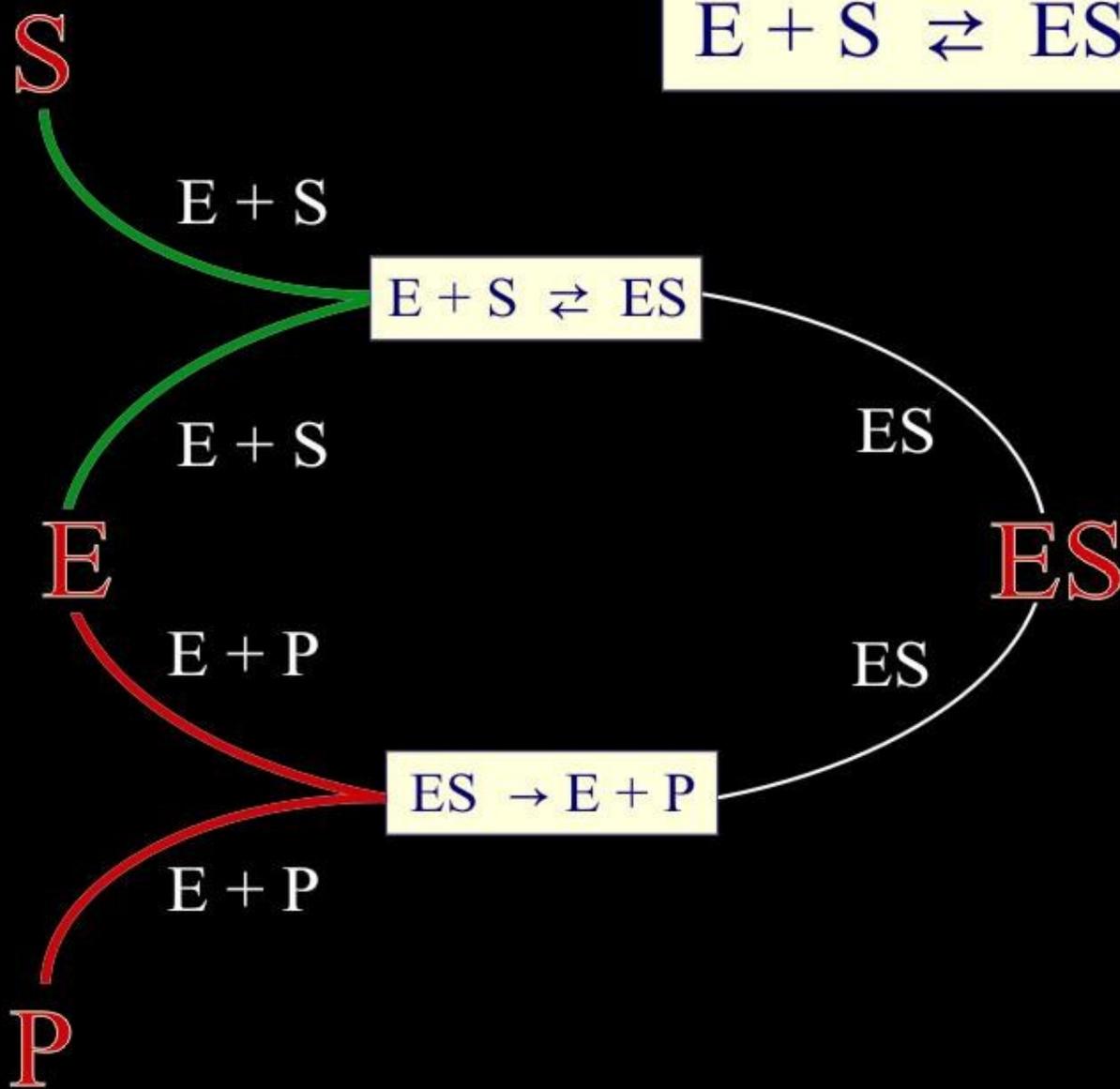
(i) Each cycle is an o-cycle or an s-cycle (or both).

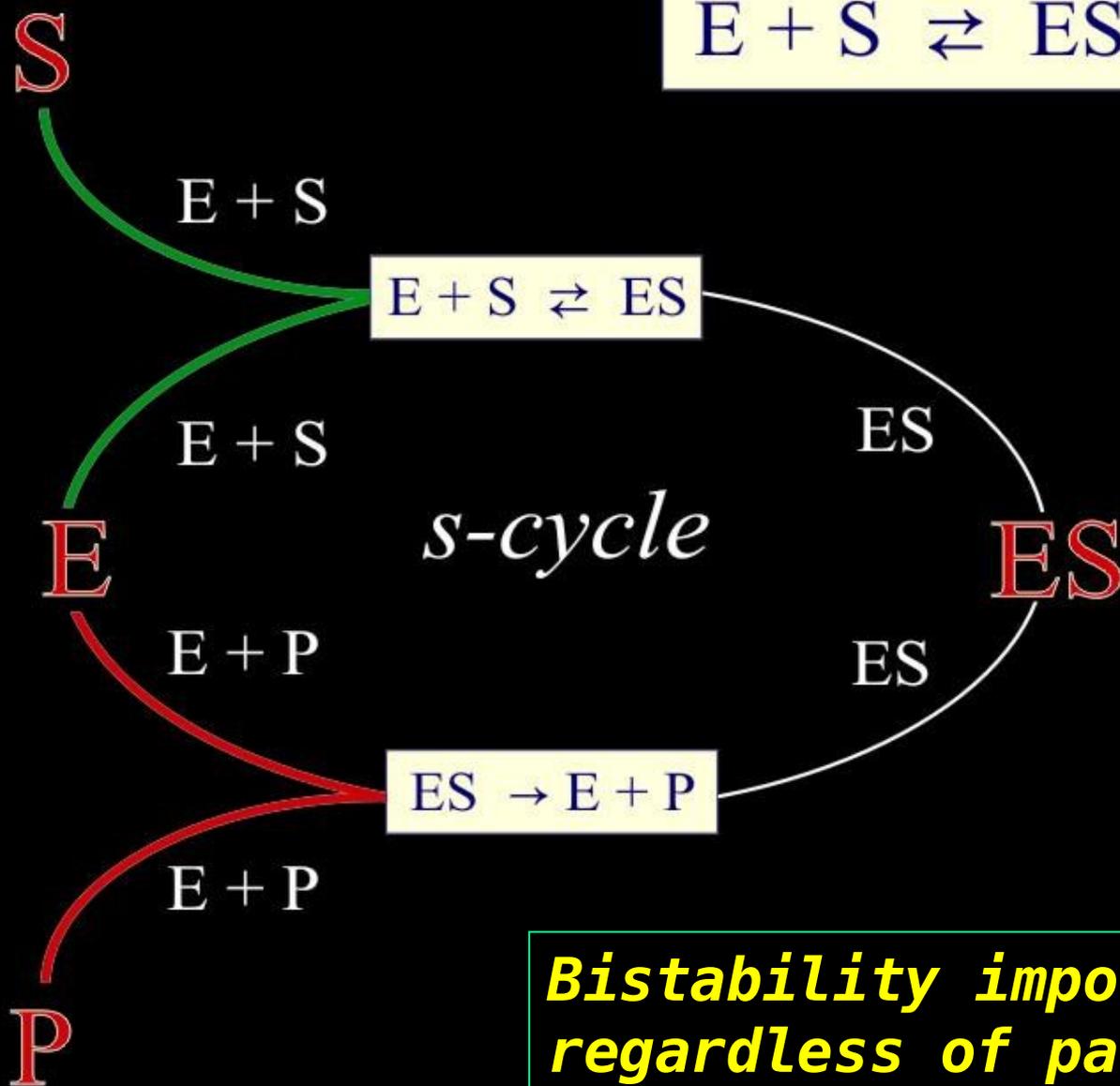
(ii) No c-pair is split by two e-cycles.

Then, **regardless of parameter values**, the corresponding system of mass-action differential equations does not have the capacity for bistability.

Some Simple Enzyme Networks and their Capacity for Bistability

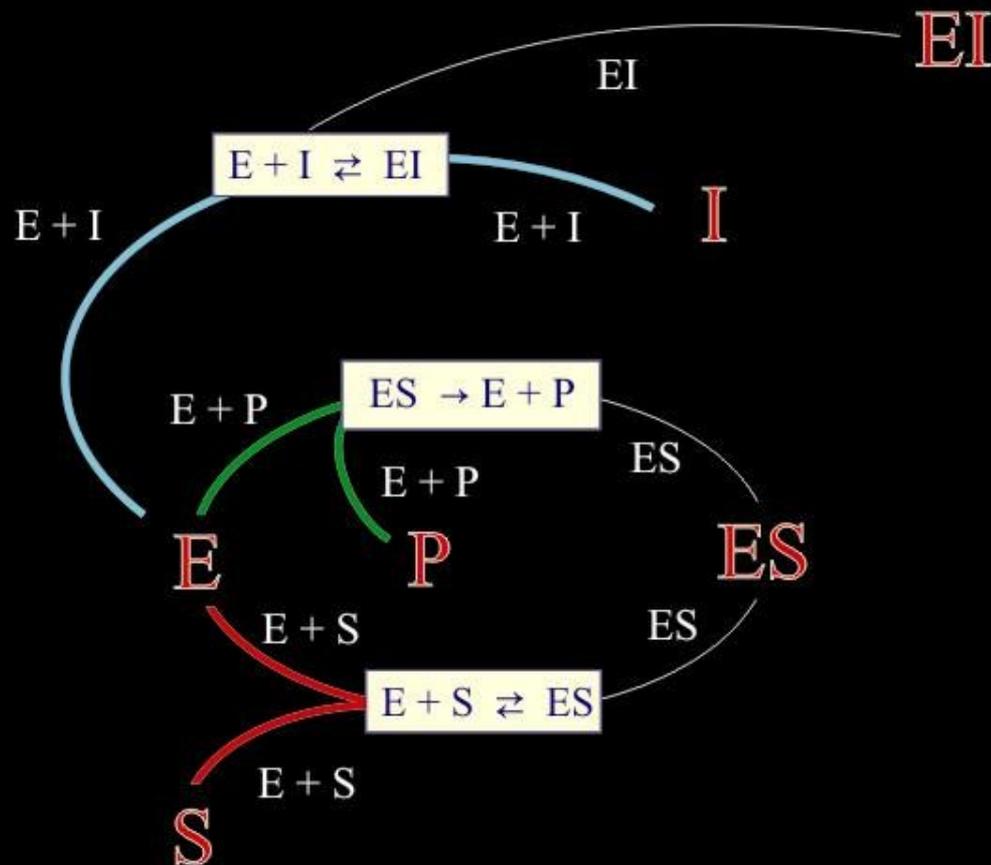
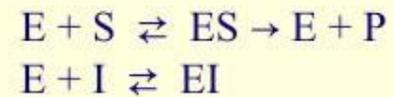
	<i>Network</i>	<i>Remark</i>	<i>Capacity for Bistability</i>
1.	$E + S \rightleftharpoons ES \rightarrow E + P$	Elementary enzyme catalysis underlying Michaelis-Menten kinetics. $S \rightarrow P$	NO
2.	$E + S \rightleftharpoons ES \rightarrow E + P$ $E + I \rightleftharpoons EI$	Elementary enzyme catalysis with competitive inhibition $S \rightarrow P$	NO
3.	$E + S \rightleftharpoons ES \rightarrow E + P$ $ES + I \rightleftharpoons ESI$	Elementary enzyme catalysis with uncompetitive inhibition $S \rightarrow P$	NO
4.	$E + S \rightleftharpoons ES \rightarrow E + P$ $E + I \rightleftharpoons EI$ $ES + I \rightleftharpoons ESI \rightleftharpoons EI + S$	Elementary enzyme catalysis with mixed inhibition $S \rightarrow P$	YES



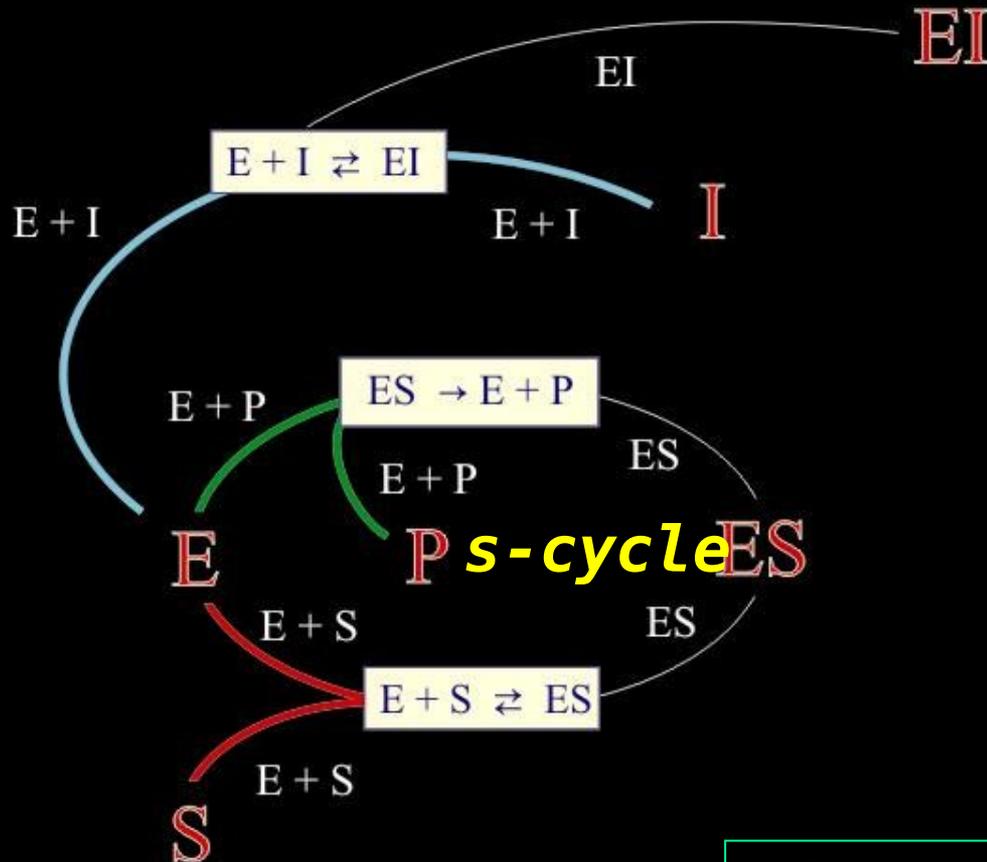
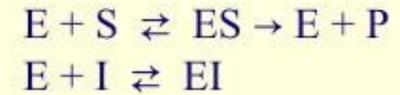


**Bistability impossible,
regardless of parameter values**

Elementary Enzyme Catalysis with Competitive Inhibition

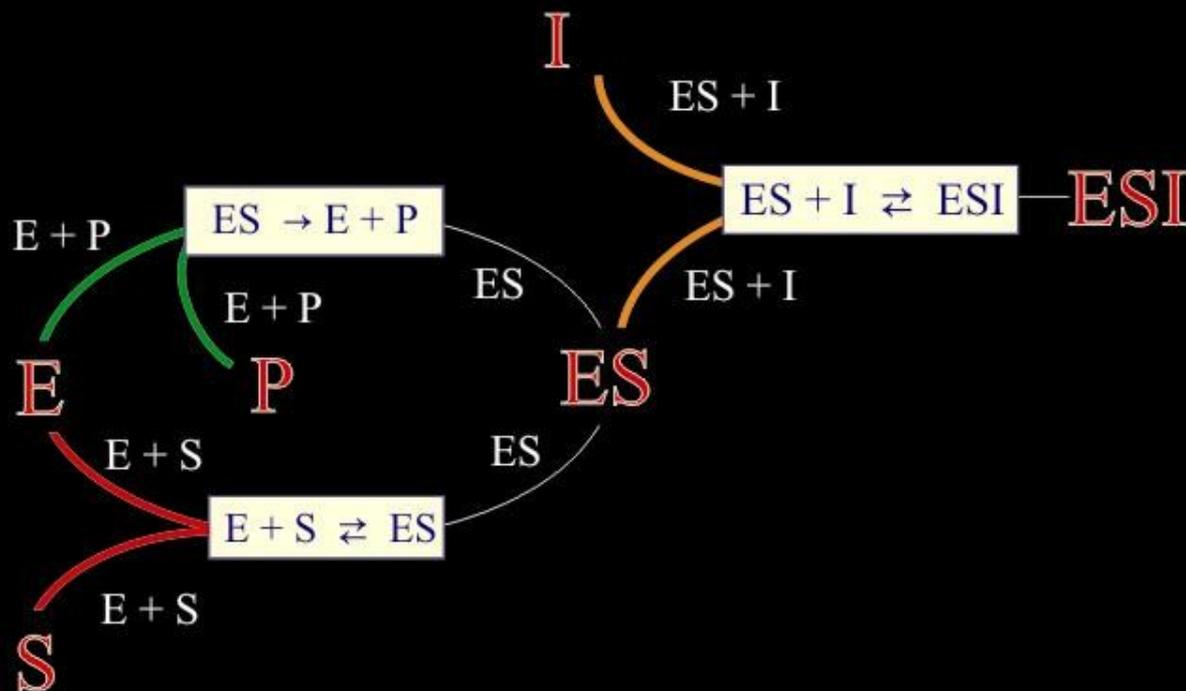
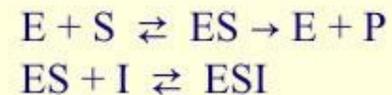


Elementary Enzyme Catalysis with Competitive Inhibition

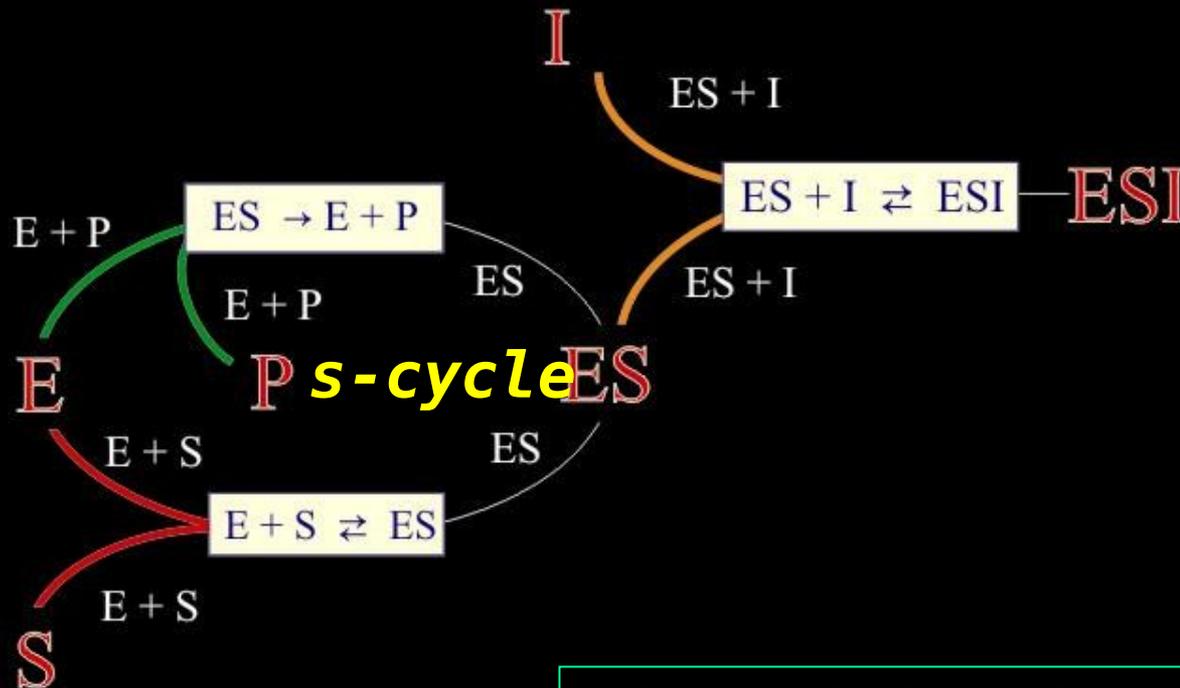
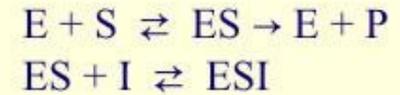


**Bistability impossible,
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Elementary Enzyme Catalysis with Uncompetitive Inhibition

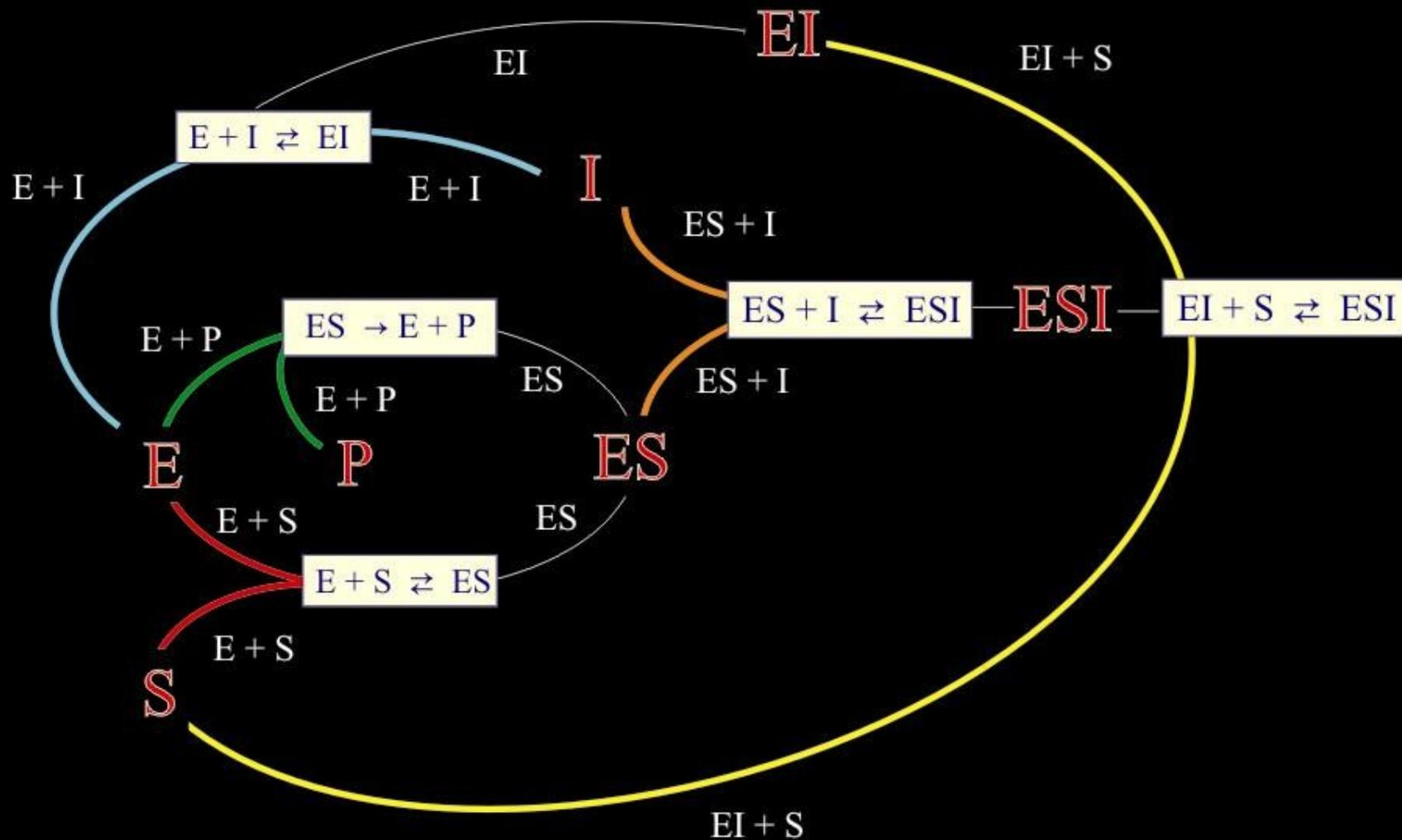
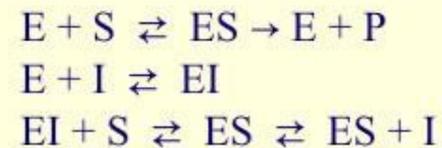


Elementary Enzyme Catalysis with Uncompetitive Inhibition



**Bistability impossible,
regardless of parameter value**

Elementary Enzyme Catalysis with Mixed Inhibition



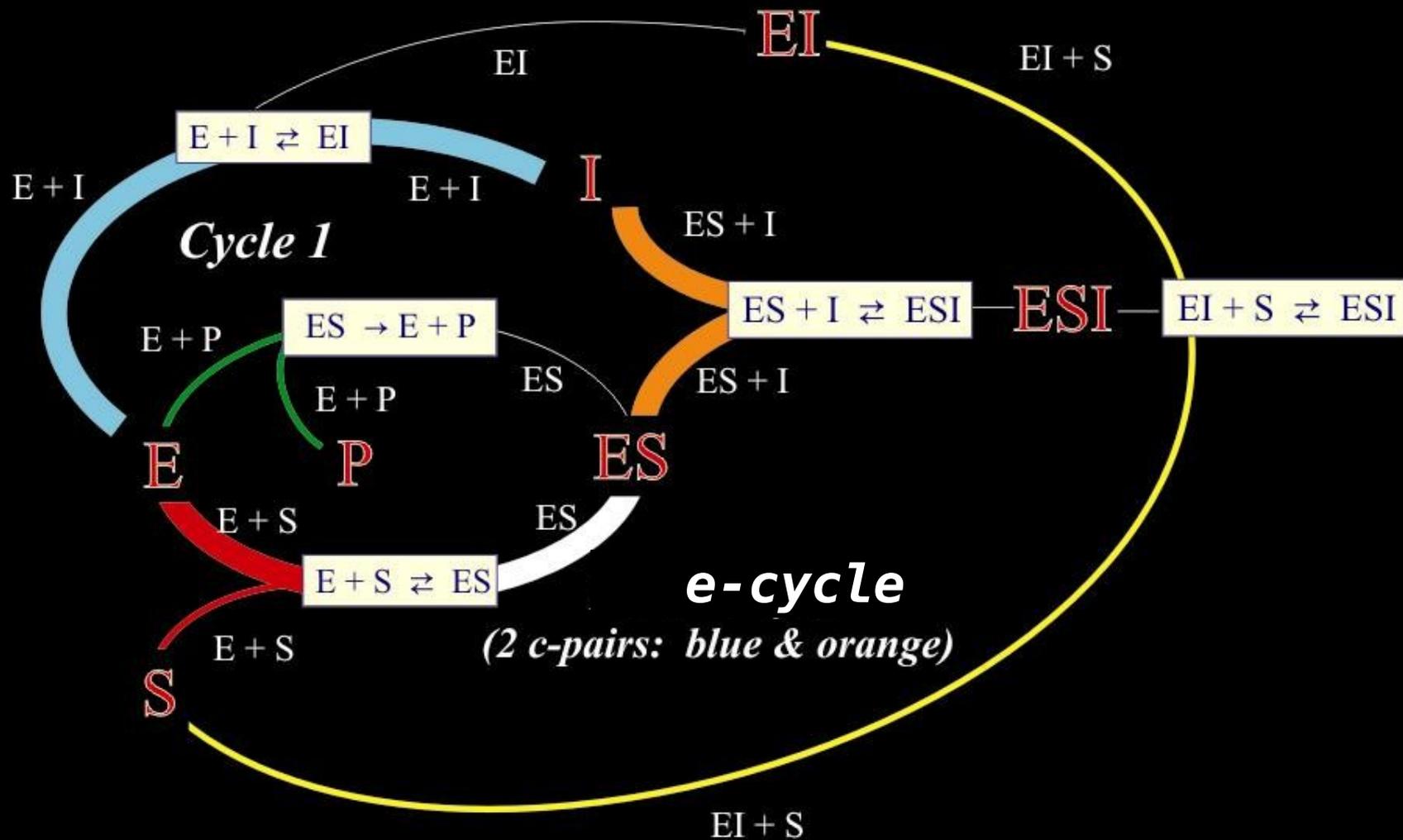
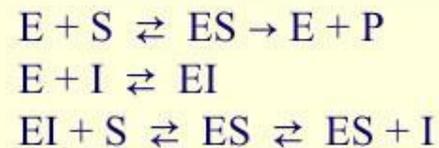
Theorem: Consider a reaction network for which the species-reaction graph has the following properties:

 (i) Each cycle is an o-cycle or an s-cycle (or both).

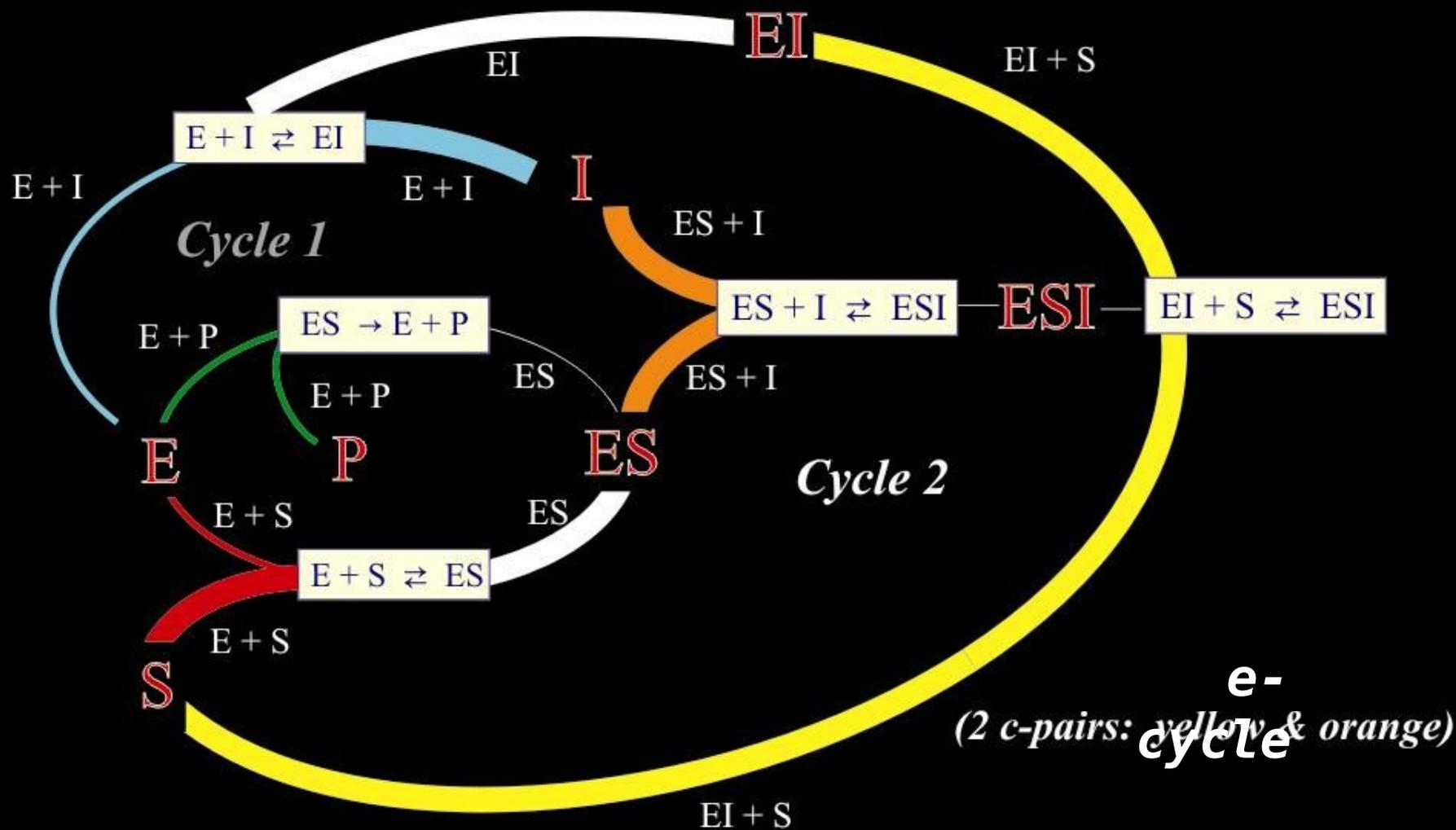
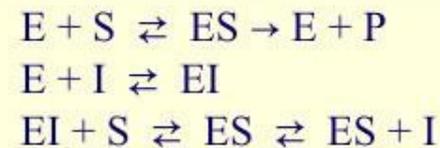
(ii) No c-pair is split by two e-cycles.

Then, **regardless of parameter values**, the corresponding system of mass-action differential equations does not have the capacity for bistability.

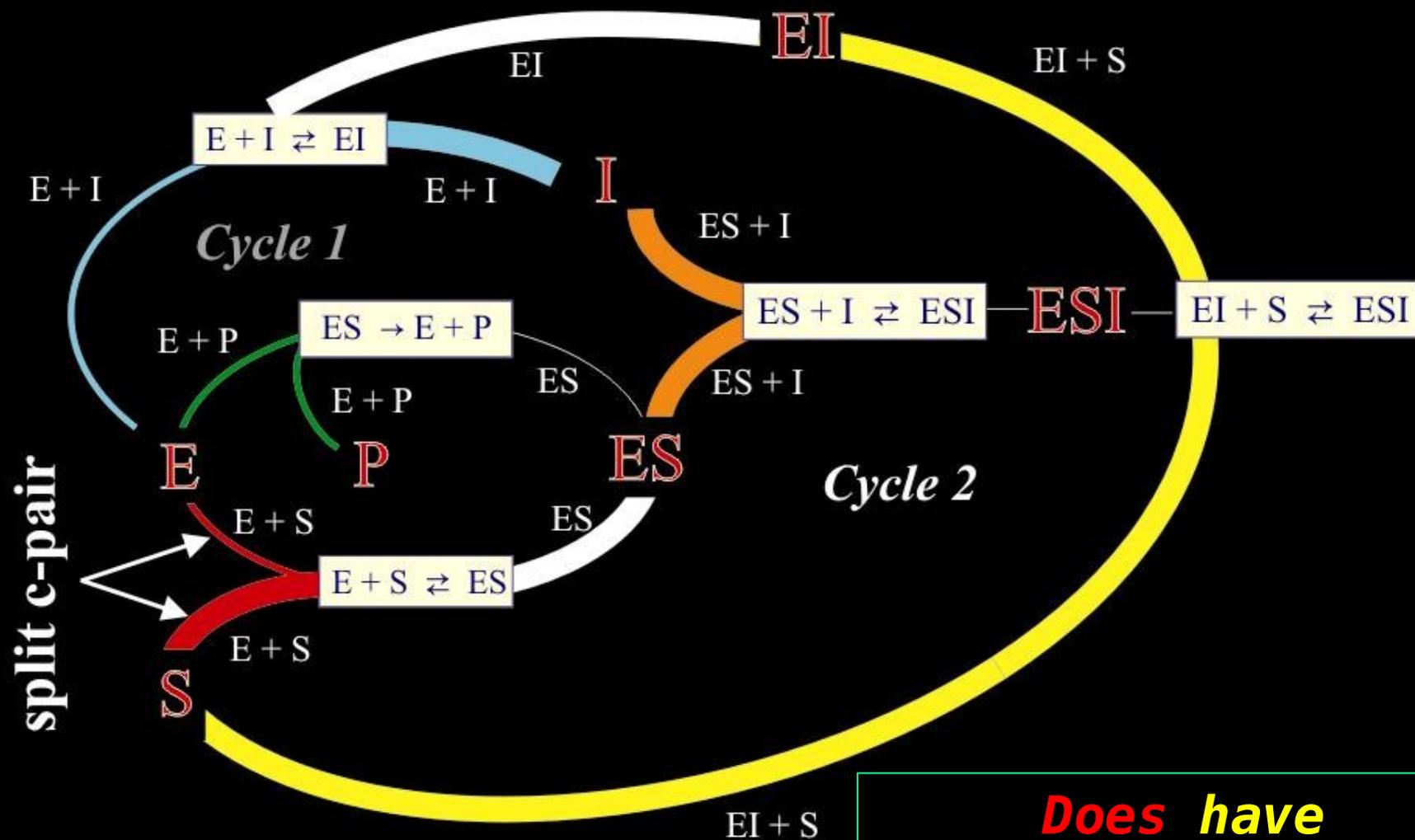
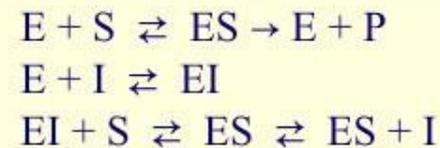
Elementary Enzyme Catalysis with Mixed Inhibition



Elementary Enzyme Catalysis with Mixed Inhibition



Elementary Enzyme Catalysis with Mixed Inhibition



Does have capacity for inhibition

*Network**Remark**Capacity for Bistability*

5.

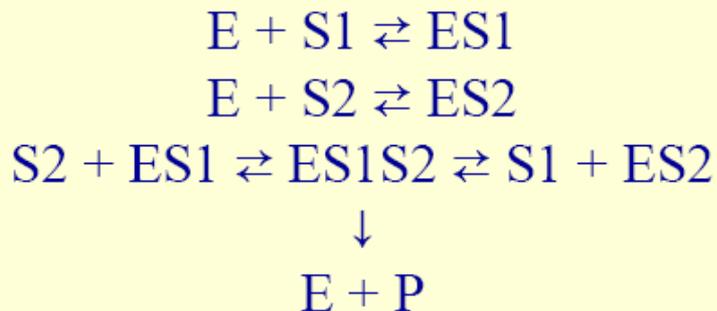


Two-substrate enzyme catalysis with ordered substrate-binding



NO

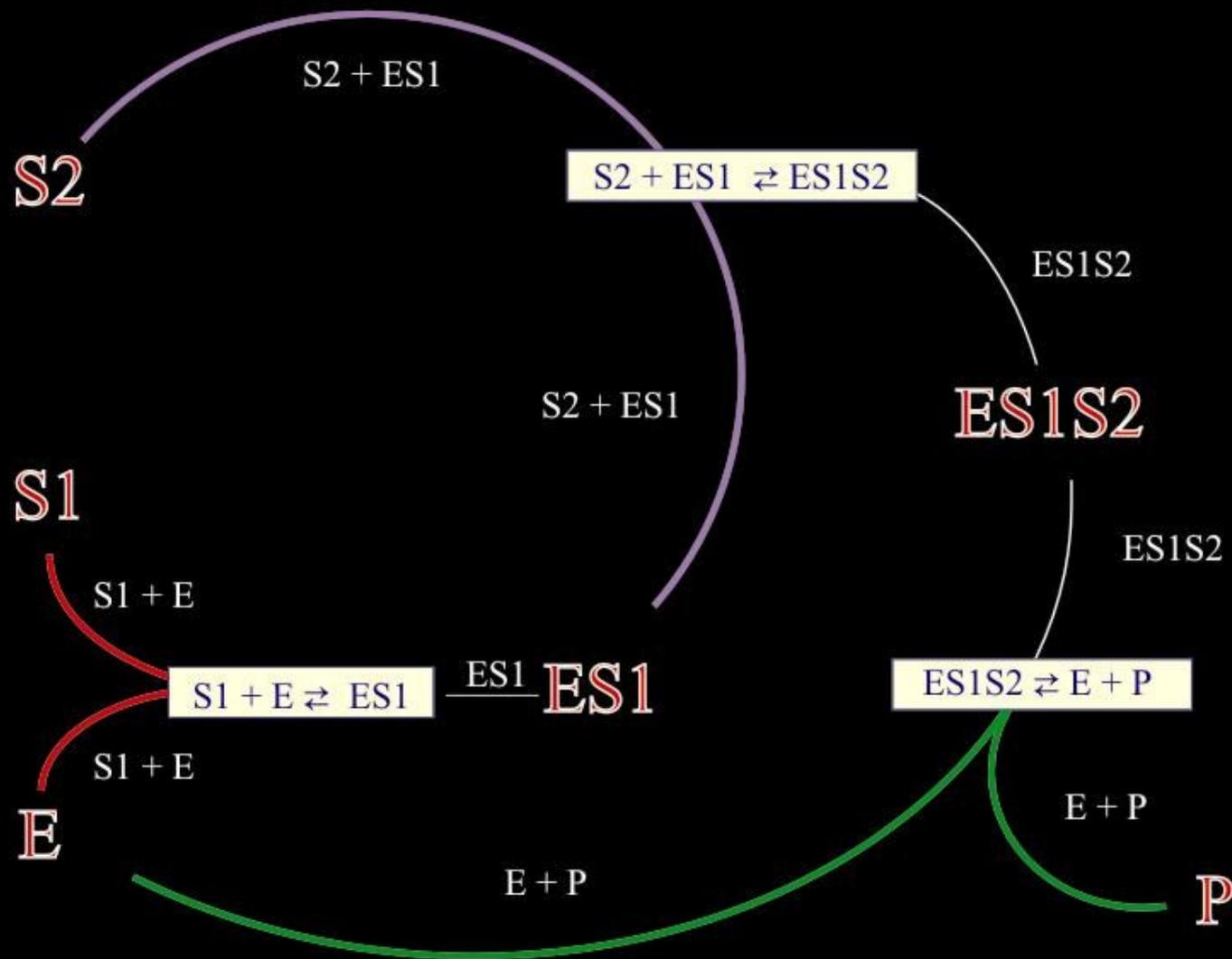
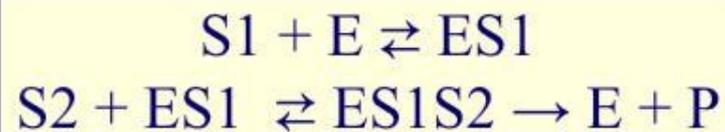
6.



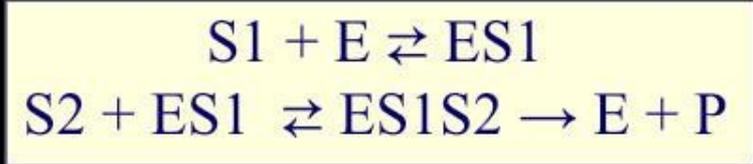
Two-substrate enzyme catalysis with unordered substrate-binding

**YES**

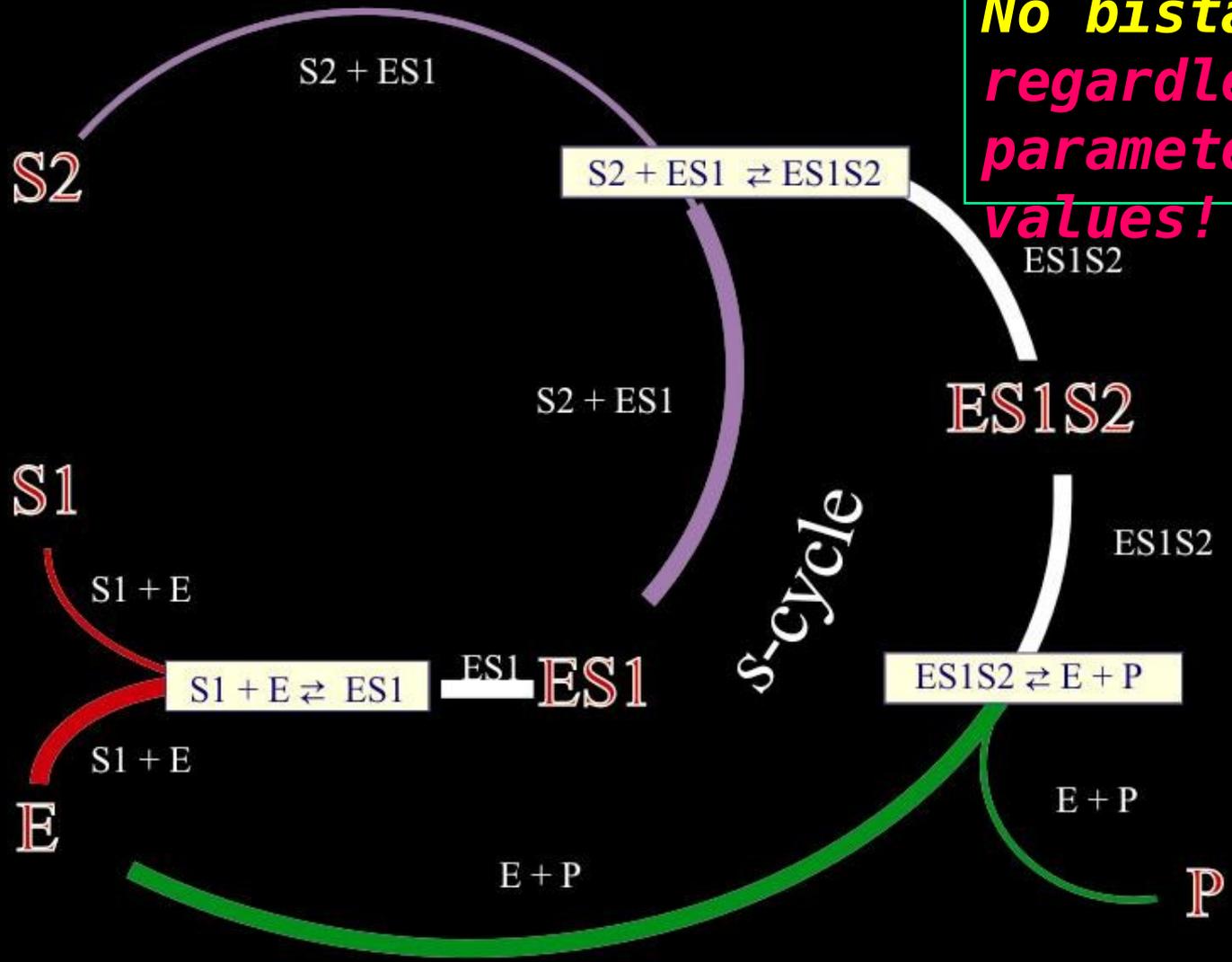
Two-Substrate Enzyme Catalysis with Ordered Binding

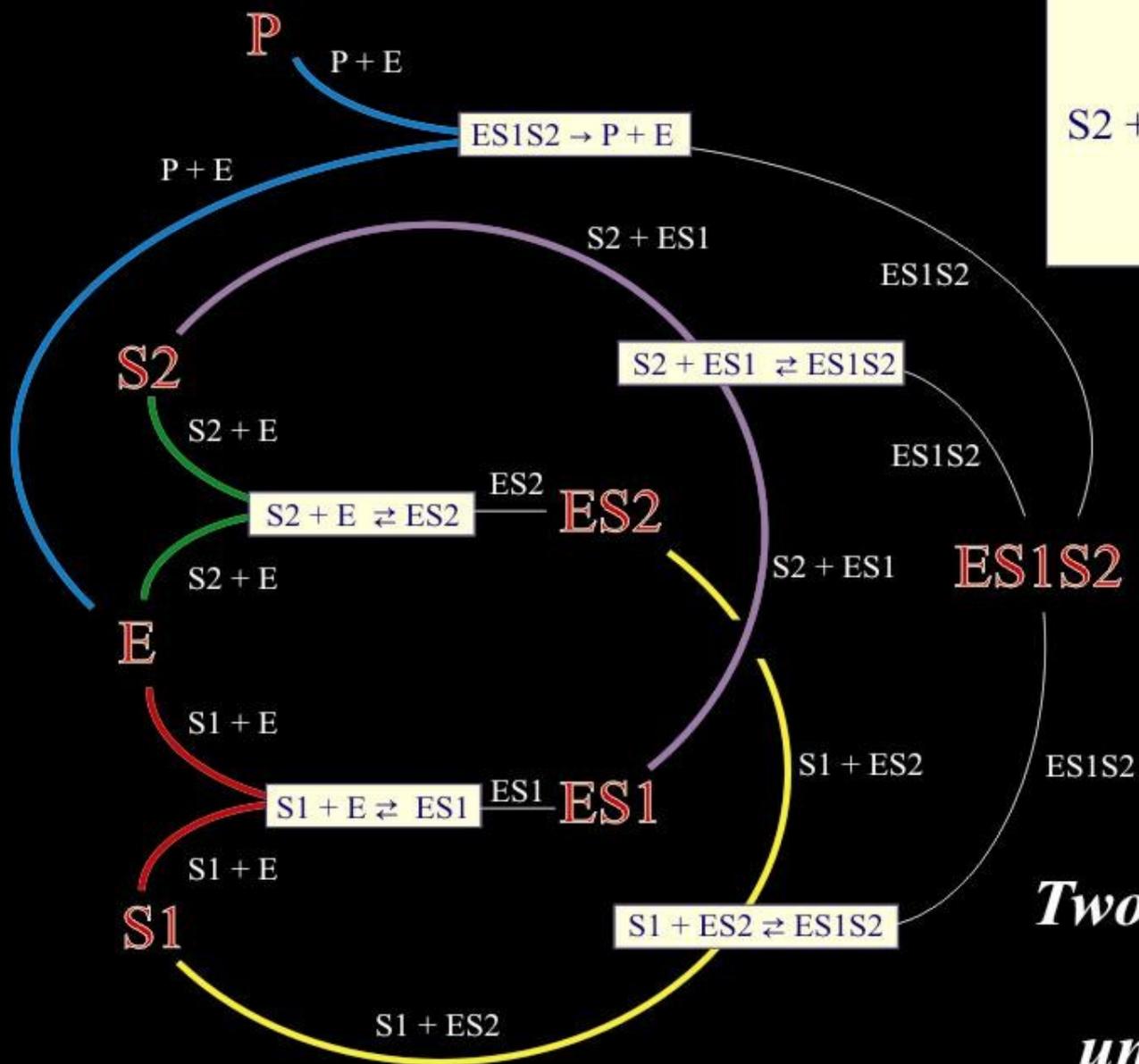


Two-Substrate Enzyme Catalysis with Ordered Binding



**No bistability,
regardless of
parameter
values!**





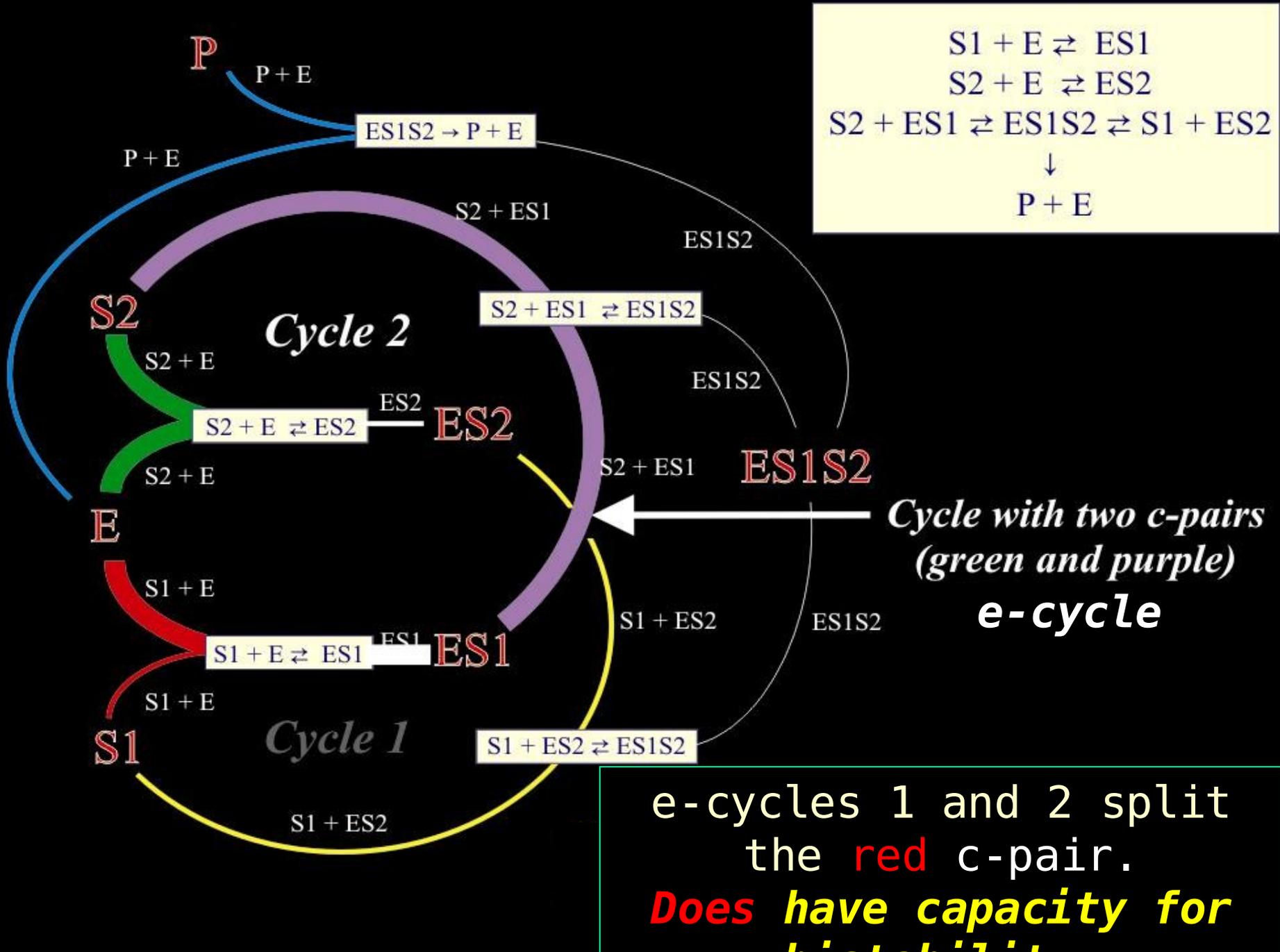
Two-substrate enzyme catalysis with unordered binding

Theorem: Consider a reaction network for which the species-reaction graph has the following properties:

→ (i) Each cycle is an o-cycle or an s-cycle (or both).

(ii) No c-pair is split by two e-cycles.

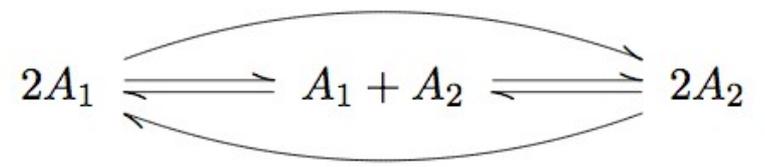
Then, **regardless of parameter values**, the corresponding system of mass-action differential equations does not have the capacity for bistability.



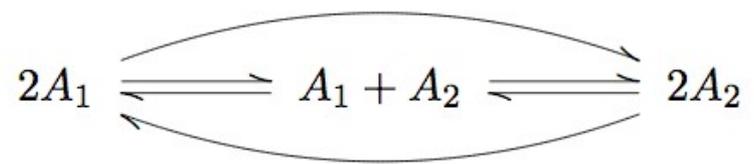
Outline

- *Examples*
- *Bistable biochemical networks*
- *The global attractor conjecture*

Mass-action kinetics



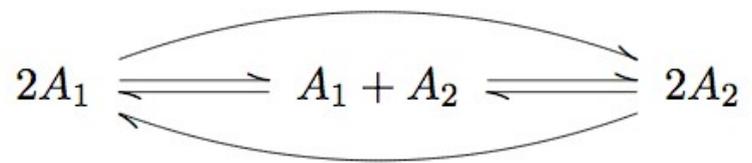
Mass-action kinetics



$$\begin{aligned}\dot{c}_{A_1} = & -k_{2A_1 \rightarrow A_1 + A_2} c_{A_1}^2 + k_{A_1 + A_2 \rightarrow 2A_1} c_{A_1} c_{A_2} - k_{A_1 + A_2 \rightarrow 2A_2} c_{A_1} c_{A_2} \\ & + k_{2A_2 \rightarrow A_1 + A_2} c_{A_2}^2 - 2k_{2A_1 \rightarrow 2A_2} c_{A_1}^2 + 2k_{2A_2 \rightarrow 2A_1} c_{A_2}^2\end{aligned}$$

$$\begin{aligned}\dot{c}_{A_2} = & k_{2A_1 \rightarrow A_1 + A_2} c_{A_1}^2 - k_{A_1 + A_2 \rightarrow 2A_1} c_{A_1} c_{A_2} + k_{A_1 + A_2 \rightarrow 2A_2} c_{A_1} c_{A_2} \\ & - k_{2A_2 \rightarrow A_1 + A_2} c_{A_2}^2 + 2k_{2A_1 \rightarrow 2A_2} c_{A_1}^2 - 2k_{2A_2 \rightarrow 2A_1} c_{A_2}^2\end{aligned}$$

Mass-action kinetics



$$\dot{c}_{A_1} = -k_{2A_1 \rightarrow A_1 + A_2} c_{A_1}^2 + k_{A_1 + A_2 \rightarrow 2A_1} c_{A_1} c_{A_2} - k_{A_1 + A_2 \rightarrow 2A_2} c_{A_1} c_{A_2}$$

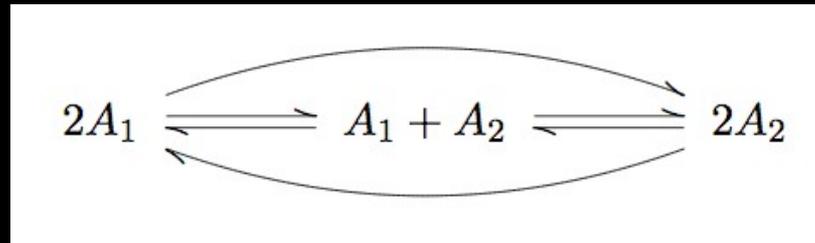
$$+ k_{2A_2 \rightarrow A_1 + A_2} c_{A_2}^2 - 2k_{2A_1 \rightarrow 2A_2} c_{A_1}^2 + 2k_{2A_2 \rightarrow 2A_1} c_{A_2}^2$$

$$\dot{c}_{A_2} = k_{2A_1 \rightarrow A_1 + A_2} c_{A_1}^2 - k_{A_1 + A_2 \rightarrow 2A_1} c_{A_1} c_{A_2} + k_{A_1 + A_2 \rightarrow 2A_2} c_{A_1} c_{A_2}$$

$$- k_{2A_2 \rightarrow A_1 + A_2} c_{A_2}^2 + 2k_{2A_1 \rightarrow 2A_2} c_{A_1}^2 - 2k_{2A_2 \rightarrow 2A_1} c_{A_2}^2$$

$$\begin{bmatrix} \dot{c}_1 \\ \dot{c}_2 \end{bmatrix} = k_{2A_1 \rightarrow A_1 + A_2} c^{2A_1} \begin{bmatrix} -1 \\ 1 \end{bmatrix} + k_{A_1 + A_2 \rightarrow 2A_1} c^{A_1 + A_2} \begin{bmatrix} 1 \\ -1 \end{bmatrix} + k_{A_1 + A_2 \rightarrow 2A_2} c^{A_1 + A_2} \begin{bmatrix} -1 \\ 1 \end{bmatrix} \\ + k_{2A_2 \rightarrow A_1 + A_2} c^{2A_2} \begin{bmatrix} 1 \\ -1 \end{bmatrix} + k_{2A_1 \rightarrow 2A_2} c^{2A_1} \begin{bmatrix} -2 \\ 2 \end{bmatrix} + k_{2A_2 \rightarrow 2A_1} c^{2A_2} \begin{bmatrix} 2 \\ -2 \end{bmatrix} .$$

Mass-action kinetics



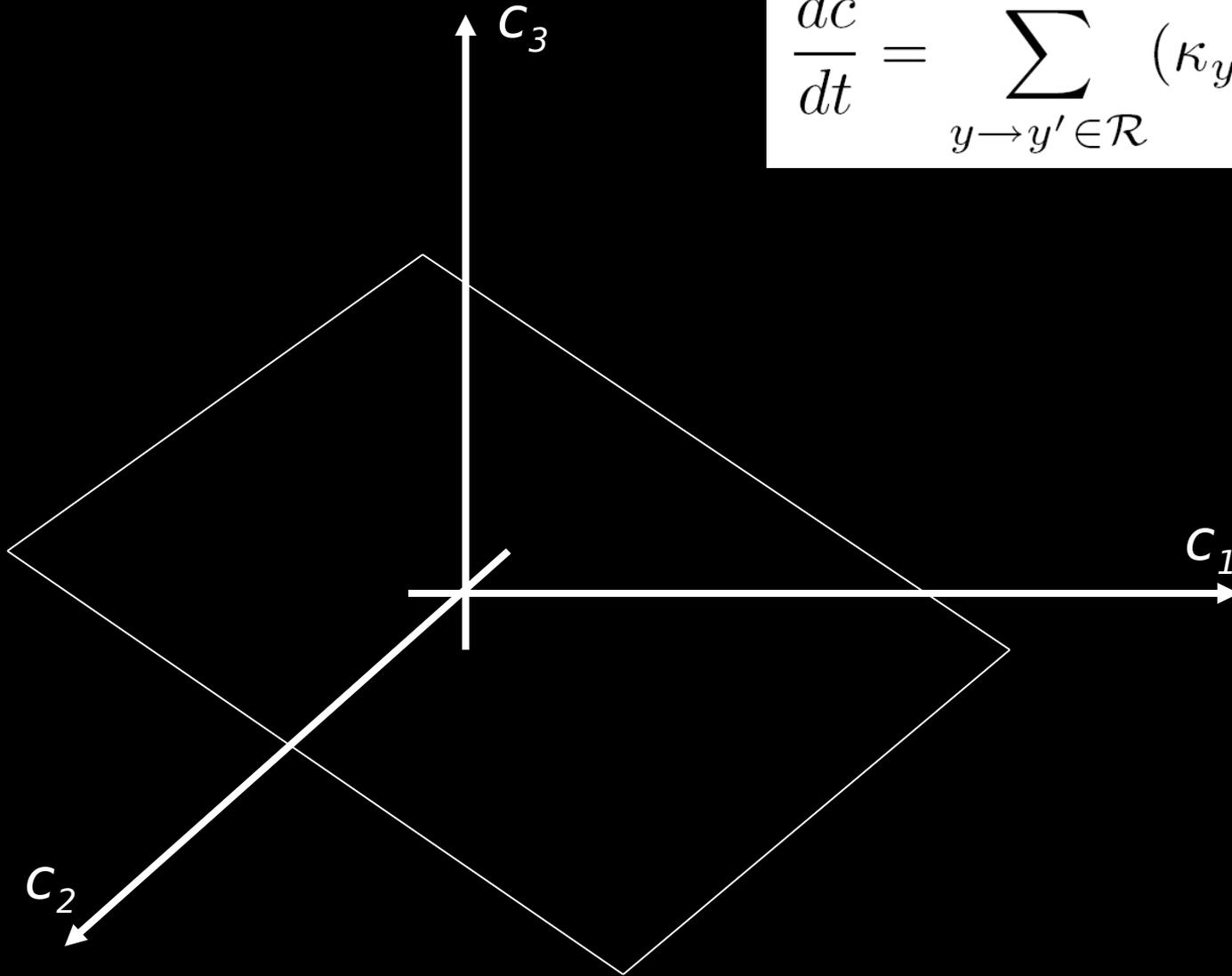
$$\begin{bmatrix} \dot{c}_1 \\ \dot{c}_2 \end{bmatrix} = k_{2A_1 \rightarrow A_1 + A_2} c^{2A_1} \begin{bmatrix} -1 \\ 1 \end{bmatrix} + k_{A_1 + A_2 \rightarrow 2A_1} c^{A_1 + A_2} \begin{bmatrix} 1 \\ -1 \end{bmatrix} + k_{A_1 + A_2 \rightarrow 2A_2} c^{A_1 + A_2} \begin{bmatrix} -1 \\ 1 \end{bmatrix} \\ + k_{2A_2 \rightarrow A_1 + A_2} c^{2A_2} \begin{bmatrix} 1 \\ -1 \end{bmatrix} + k_{2A_1 \rightarrow 2A_2} c^{2A_1} \begin{bmatrix} -2 \\ 2 \end{bmatrix} + k_{2A_2 \rightarrow 2A_1} c^{2A_2} \begin{bmatrix} 2 \\ -2 \end{bmatrix}.$$

$$\dot{c} = \sum_{y \rightarrow y' \in \mathcal{R}} k_{y \rightarrow y'} c^y (y' - y)$$

$$c^y = \prod_{s \in \mathcal{S}} (c_s)^{y_s}$$

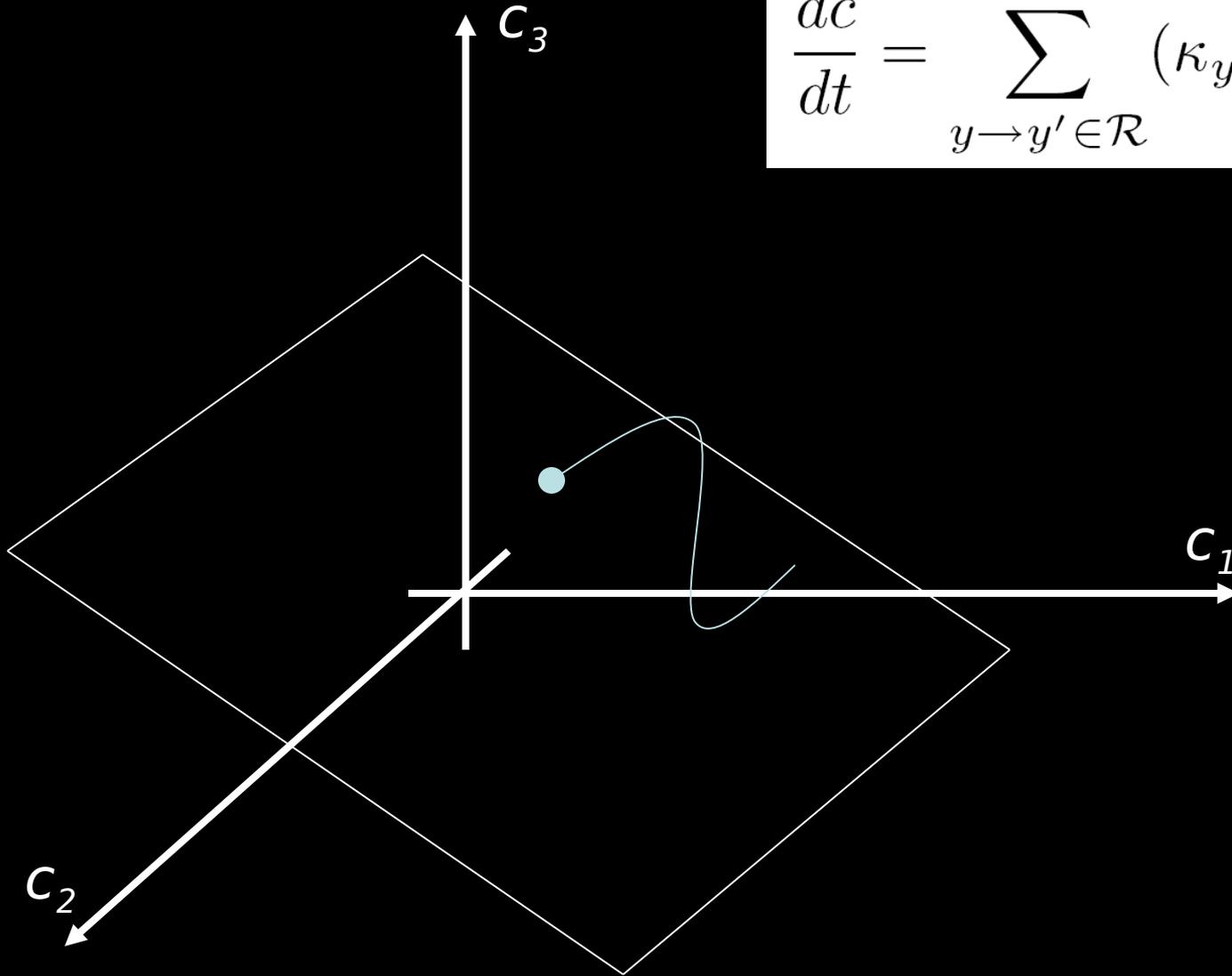
Invariant subspaces

$$\frac{dc}{dt} = \sum_{y \rightarrow y' \in \mathcal{R}} (\kappa_{y \rightarrow y'}) c^y (y' - y)$$



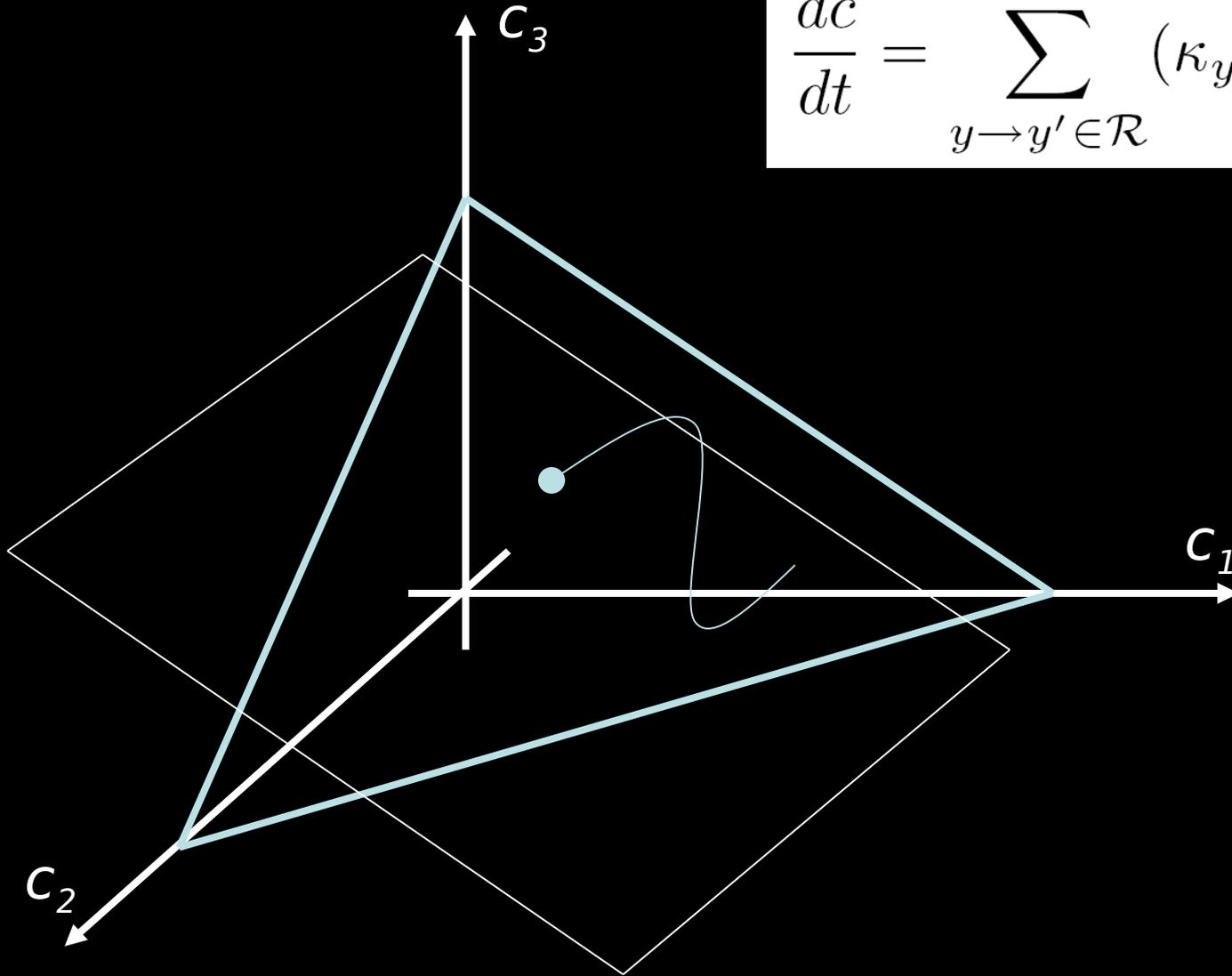
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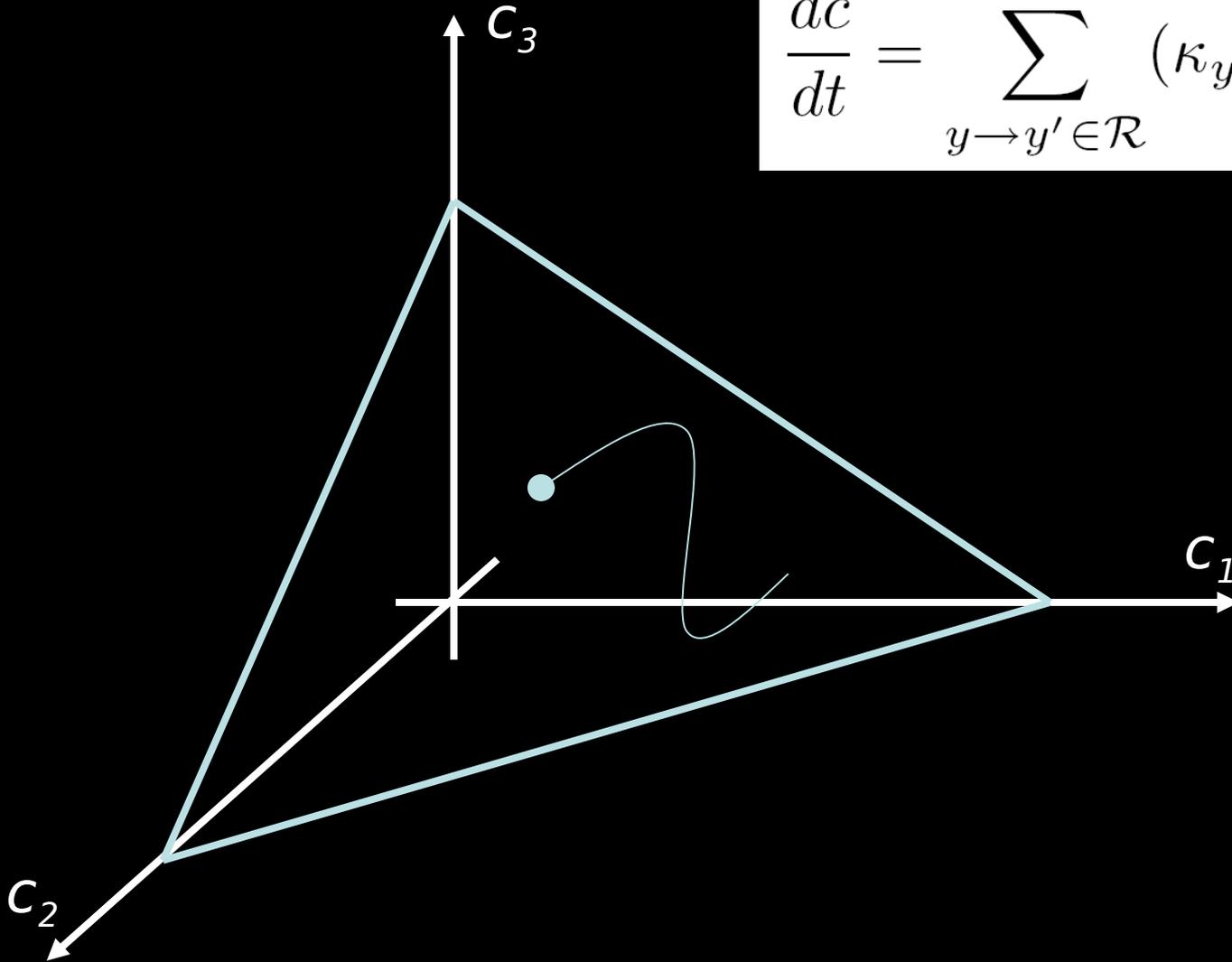
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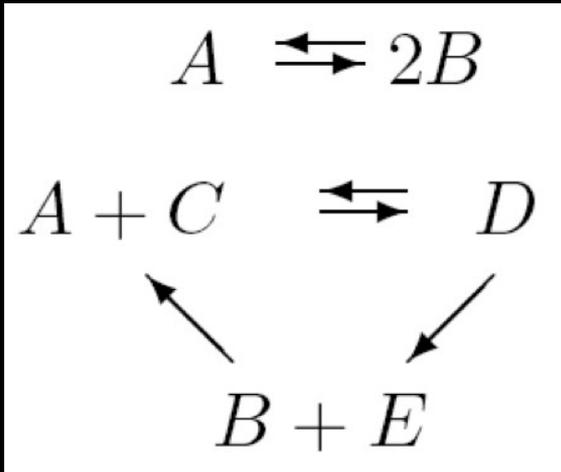


Invariant subspaces

$$\frac{dc}{dt} = \sum_{y \rightarrow y' \in \mathcal{R}} (\kappa_{y \rightarrow y'}) c^y (y' - y)$$



Deficiency theory (Feinberg, Horn, and Jackson)

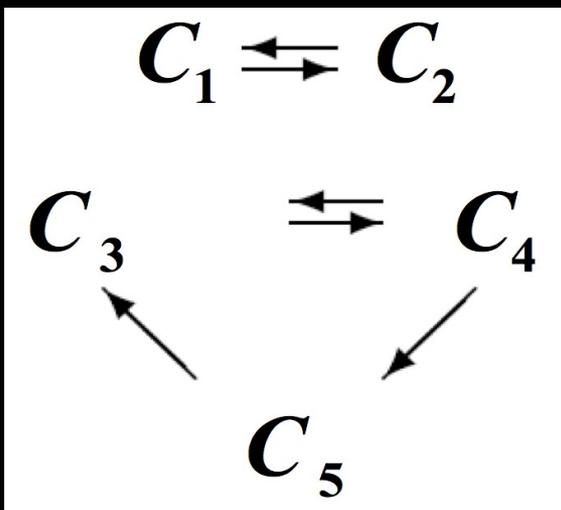


Definition. The deficiency of a reaction network is $n - l - s$, where

n = the number of complexes

l = the number of linkage classes

s = the dimension of the stoichiometric subspace



$$\begin{aligned}
 dc_A/dt &= -(\kappa_{A \rightarrow 2B})c_A + (\kappa_{2B \rightarrow A})c_B^2 - (\kappa_{A+C \rightarrow D})c_A c_C + (\kappa_{D \rightarrow A+C})c_D + (\kappa_{B+E \rightarrow A+C})c_B c_E \\
 dc_B/dt &= 2(\kappa_{A \rightarrow 2B})c_A - 2(\kappa_{2B \rightarrow A})c_B^2 + (\kappa_{D \rightarrow B+E})c_D - (\kappa_{B+E \rightarrow A+C})c_B c_E \\
 dc_C/dt &= -(\kappa_{A+C \rightarrow D})c_A c_C + (\kappa_{D \rightarrow A+C})c_D + (\kappa_{B+E \rightarrow A+C})c_B c_E \\
 dc_D/dt &= (\kappa_{A+C \rightarrow D})c_A c_C - (\kappa_{D \rightarrow A+C})c_D - (\kappa_{D \rightarrow B+E})c_D \\
 dc_E/dt &= (\kappa_{D \rightarrow B+E})c_D - (\kappa_{B+E \rightarrow A+C})c_B c_E .
 \end{aligned}$$

Example: $S = \text{span}\{2B - A, A + C - D, B + E - D, B + E - A - C\}$.

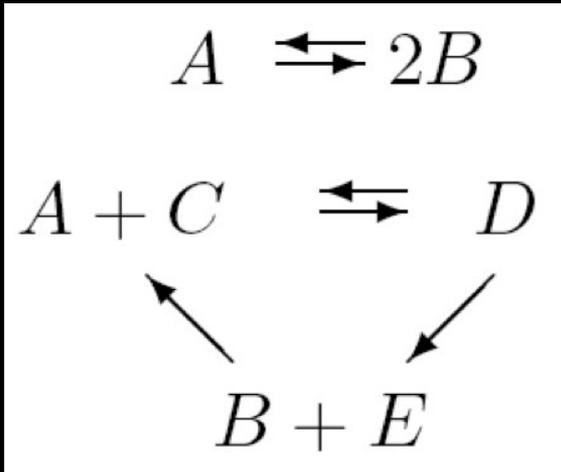
Since $B + E - A - C = (B + E - D) - (A + C - D)$, this simplifies further to give

$$S = \text{span}\{2B - A, A + C - D, B + E - D\}$$

Deficiency zero theory (Feinberg, Horn, and Jackson)

***Theorem.** If a reaction network has deficiency zero, then there exists a unique positive equilibrium in each stoichiometric subspace, and this equilibrium is complex balanced.*

Deficiency theory (Feinberg, Horn, and Jackson)

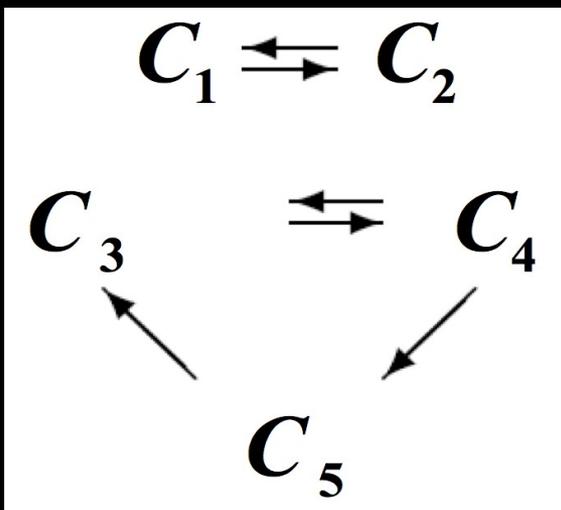


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 dc_B/dt &= 2(\kappa_{A \rightarrow 2B})c_A - 2(\kappa_{2B \rightarrow A})c_B^2 + (\kappa_{D \rightarrow B+E})c_D - (\kappa_{B+E \rightarrow A+C})c_B c_E \\
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 dc_D/dt &= (\kappa_{A+C \rightarrow D})c_A c_C - (\kappa_{D \rightarrow A+C})c_D - (\kappa_{D \rightarrow B+E})c_D \\
 dc_E/dt &= (\kappa_{D \rightarrow B+E})c_D - (\kappa_{B+E \rightarrow A+C})c_B c_E .
 \end{aligned}$$

Example: $S = \text{span}\{2B - A, A + C - D, B + E - D, B + E - A - C\}$.

Since $B + E - A - C = (B + E - D) - (A + C - D)$, this simplifies further to give

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Deficiency zero theory (Feinberg, Horn, and Jackson)

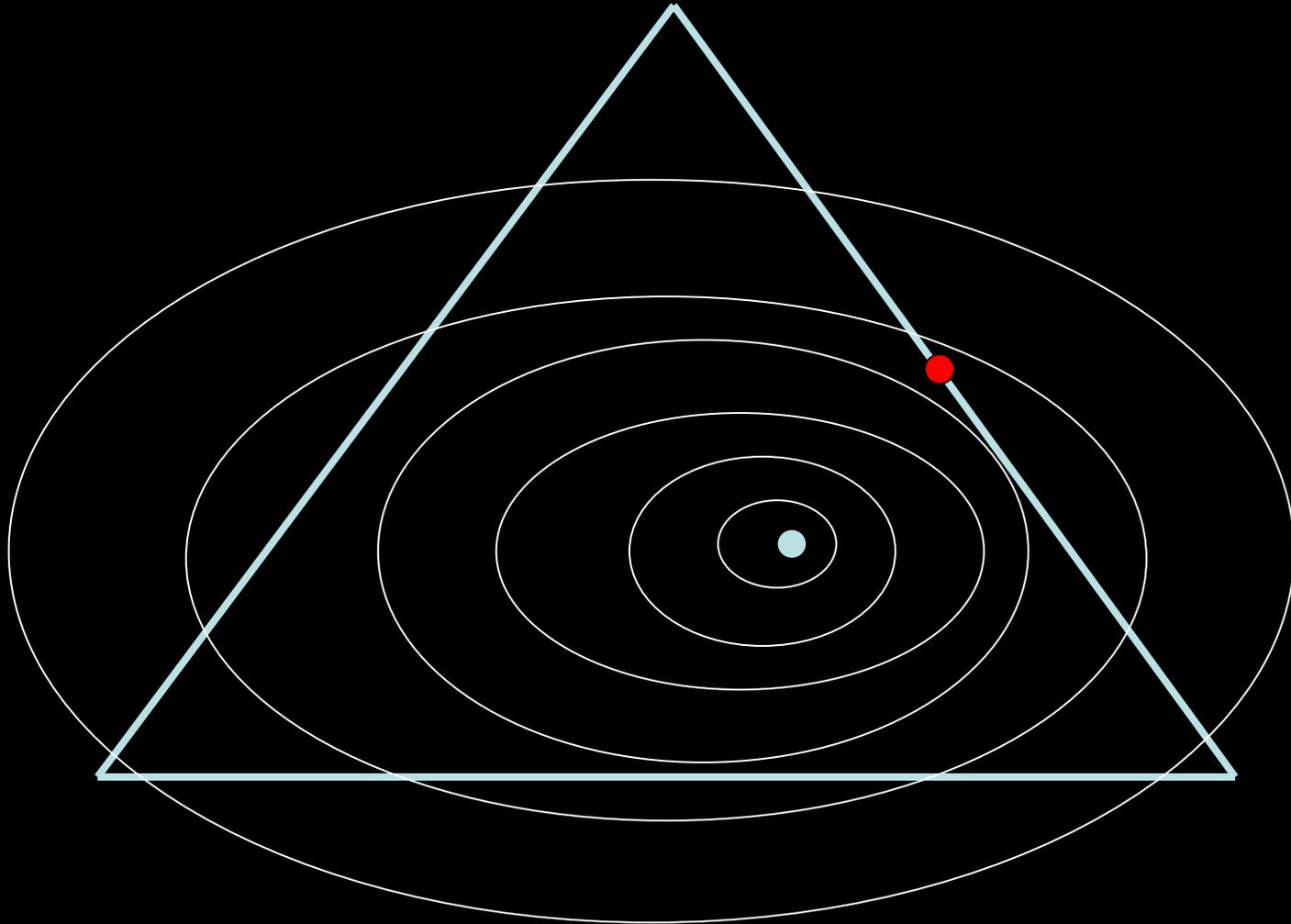
Theorem. If a reaction network has deficiency zero, then there exists a unique positive equilibrium in each stoichiometric subspace, and this equilibrium is complex balanced.

Theorem. If a reaction network has complex balanced equilibrium, then, for each stoichiometric subspace, there exists a strict Lyapunov function with a minimum at that equilibrium.

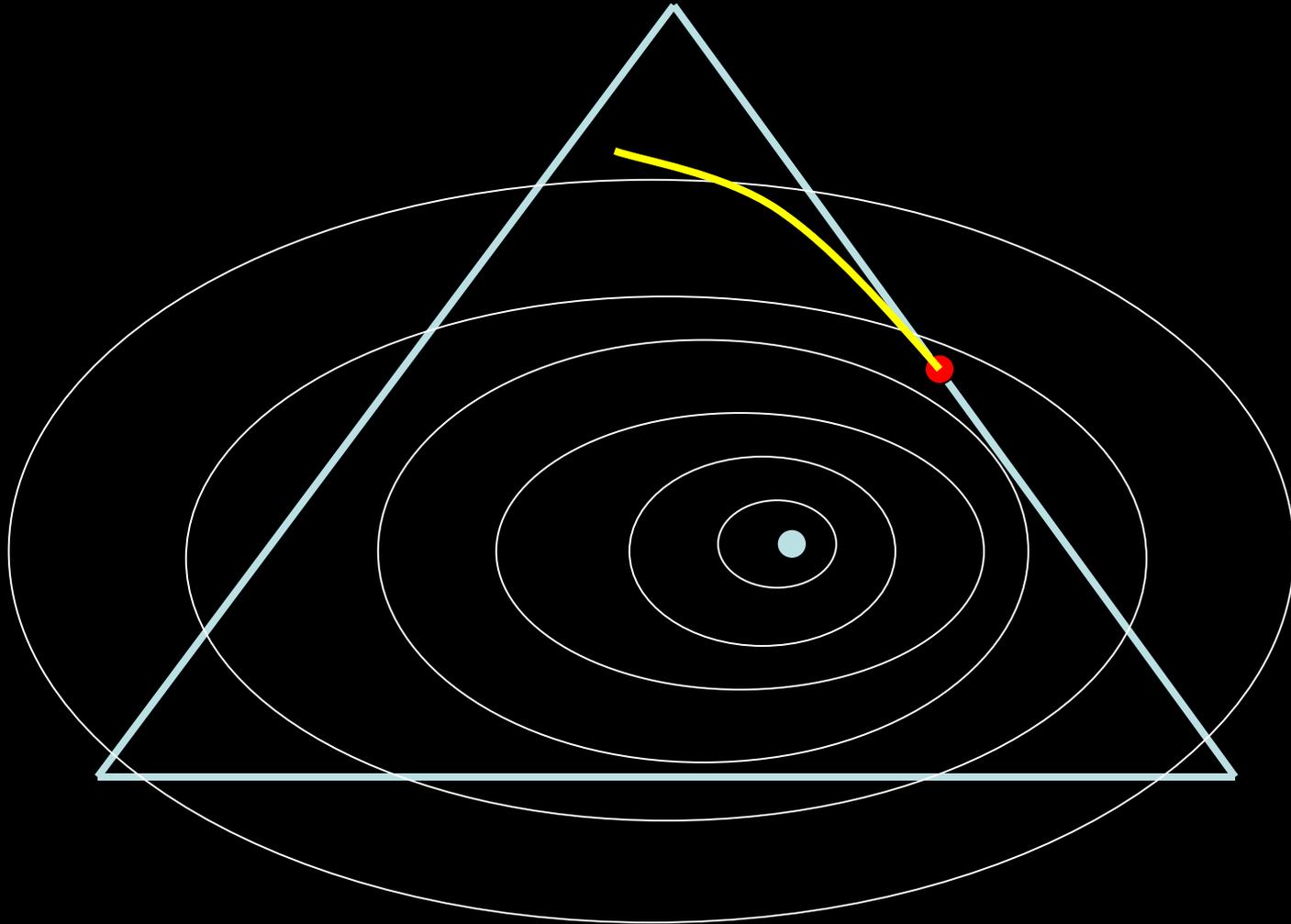
Complex balanced reaction networks

Deficiency zero reaction networks

Lyapunov function and boundary equilibria

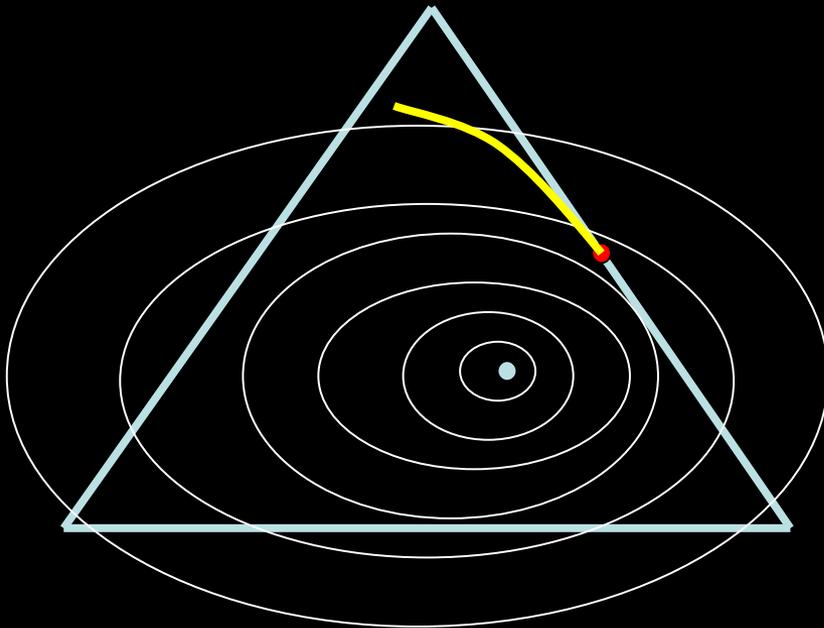


Lyapunov function and boundary equilibria



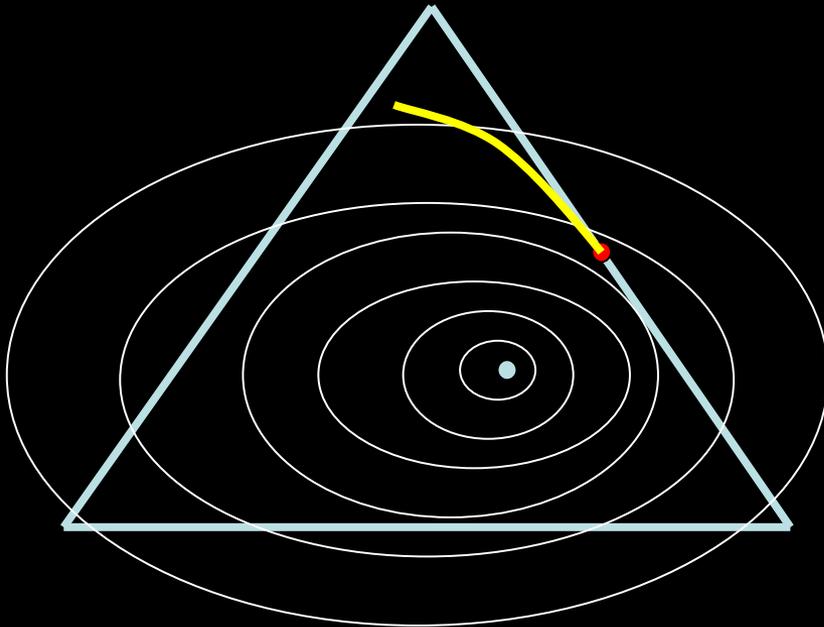
Global Attractor Conjecture

Conjecture. *If a reaction network has a complex balanced equilibrium, then any trajectory with positive initial condition converges to that equilibrium.*



Global Attractor Conjecture

Conjecture. *If a reaction network has a complex balanced equilibrium, then any trajectory with positive initial condition converges to that equilibrium.*



How do we prove this?

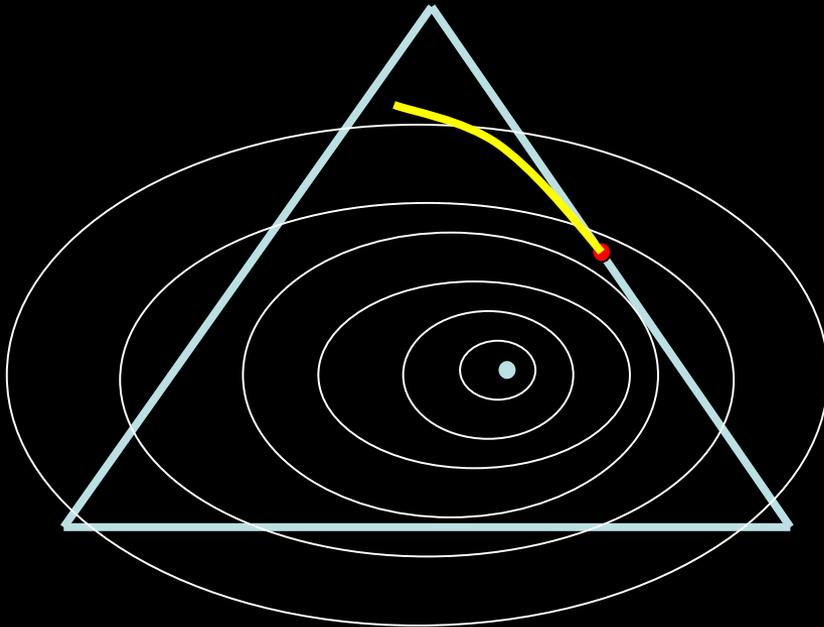
No boundary equilibria.

(Angeli, De Leenheer, Sontag)

Even if there exist boundary equilibria, they are “repelling”.

Global Attractor Conjecture

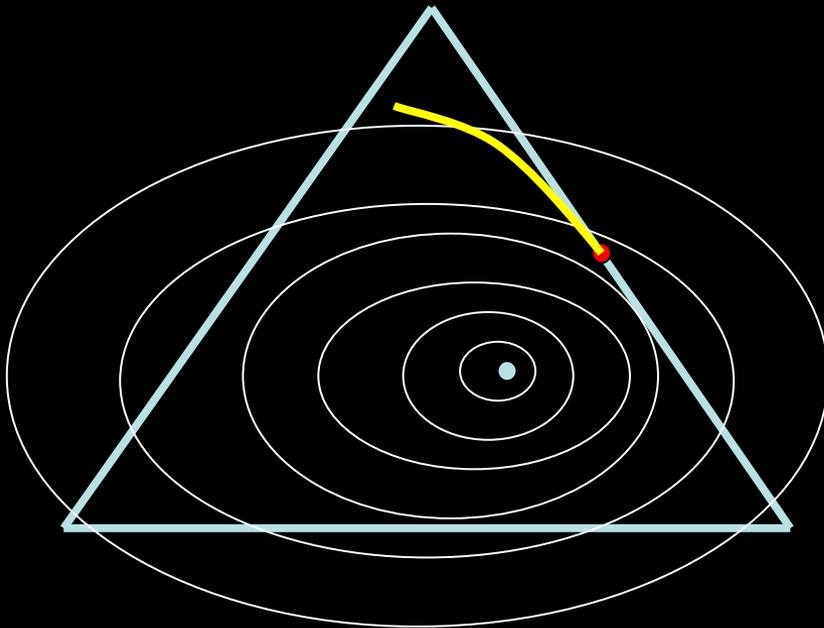
Conjecture. *If a reaction network has a complex balanced equilibrium, then any trajectory with positive initial condition converges to that equilibrium.*



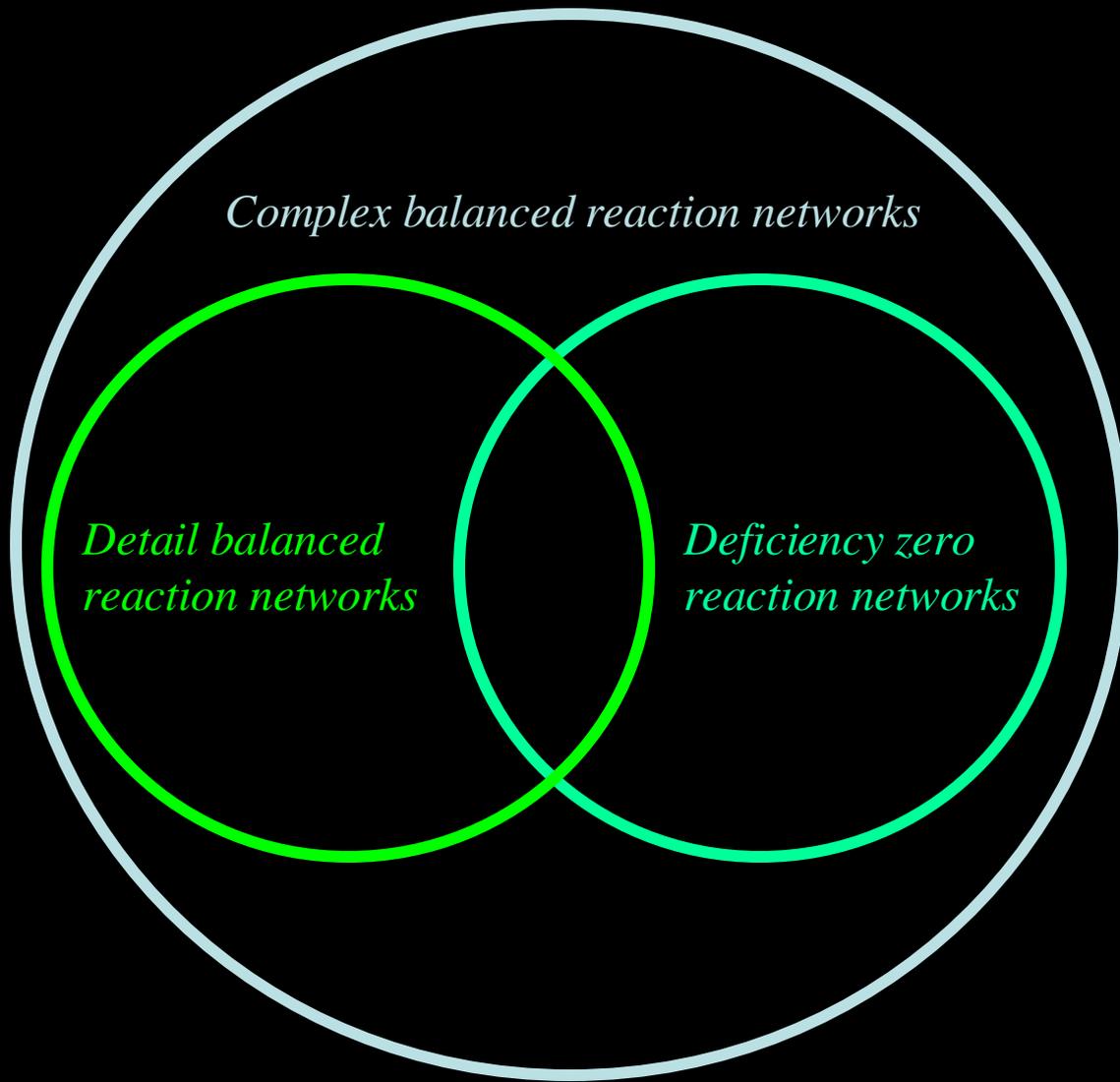
Theorem 1. *If a reaction network has a complex balanced equilibrium, then no trajectory with positive initial condition can converge to a vertex of its stoichiometric compatibility class.*

Global Attractor Conjecture

Conjecture. *If a reaction network has a complex balanced equilibrium, then any trajectory with positive initial condition converges to that equilibrium.*



Theorem 2. *If a reaction network has a detailed balanced equilibrium, then no trajectory with positive initial condition can converge to a bounded facet of its stoichiometric compatibility class.*



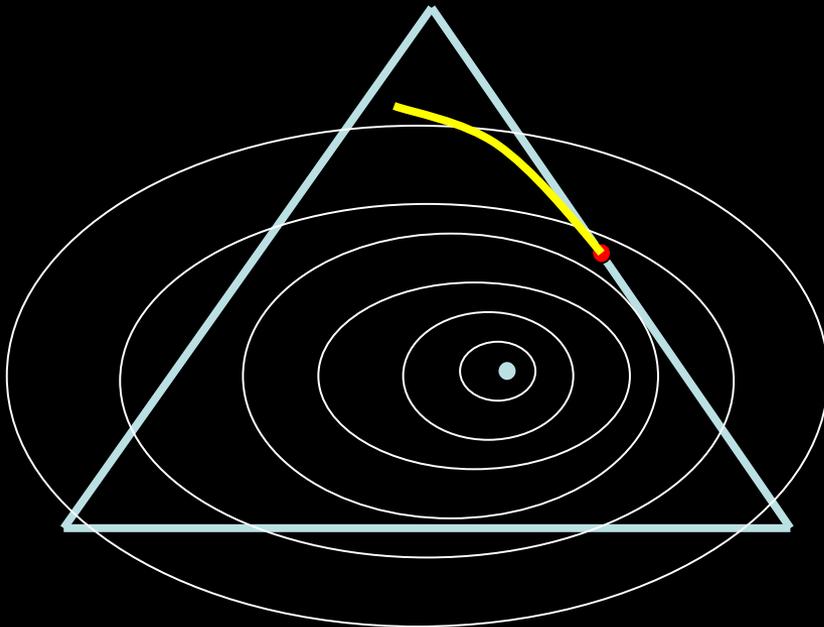
Complex balanced reaction networks

*Detail balanced
reaction networks*

*Deficiency zero
reaction networks*

Global Attractor Conjecture

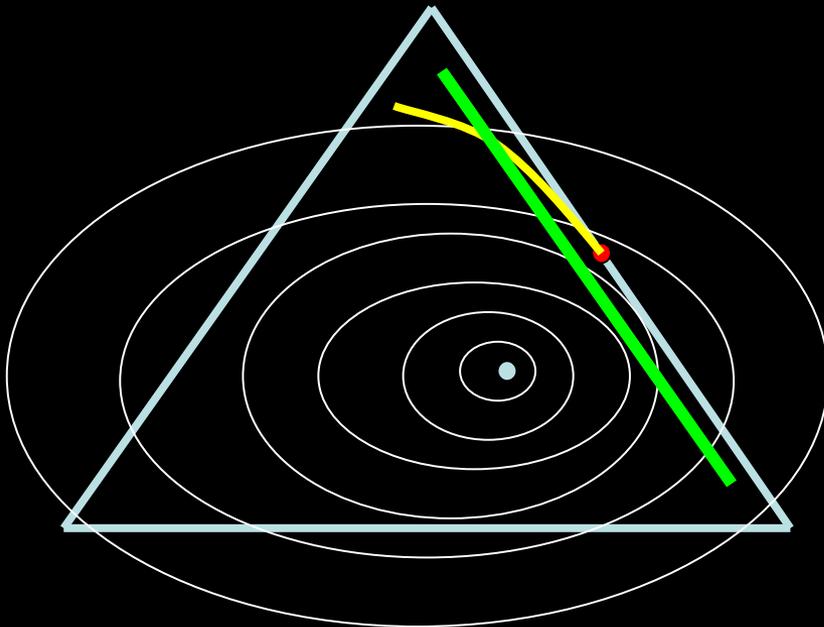
Conjecture. *If a reaction network has a complex balanced equilibrium, then any trajectory with positive initial condition converges to that equilibrium.*



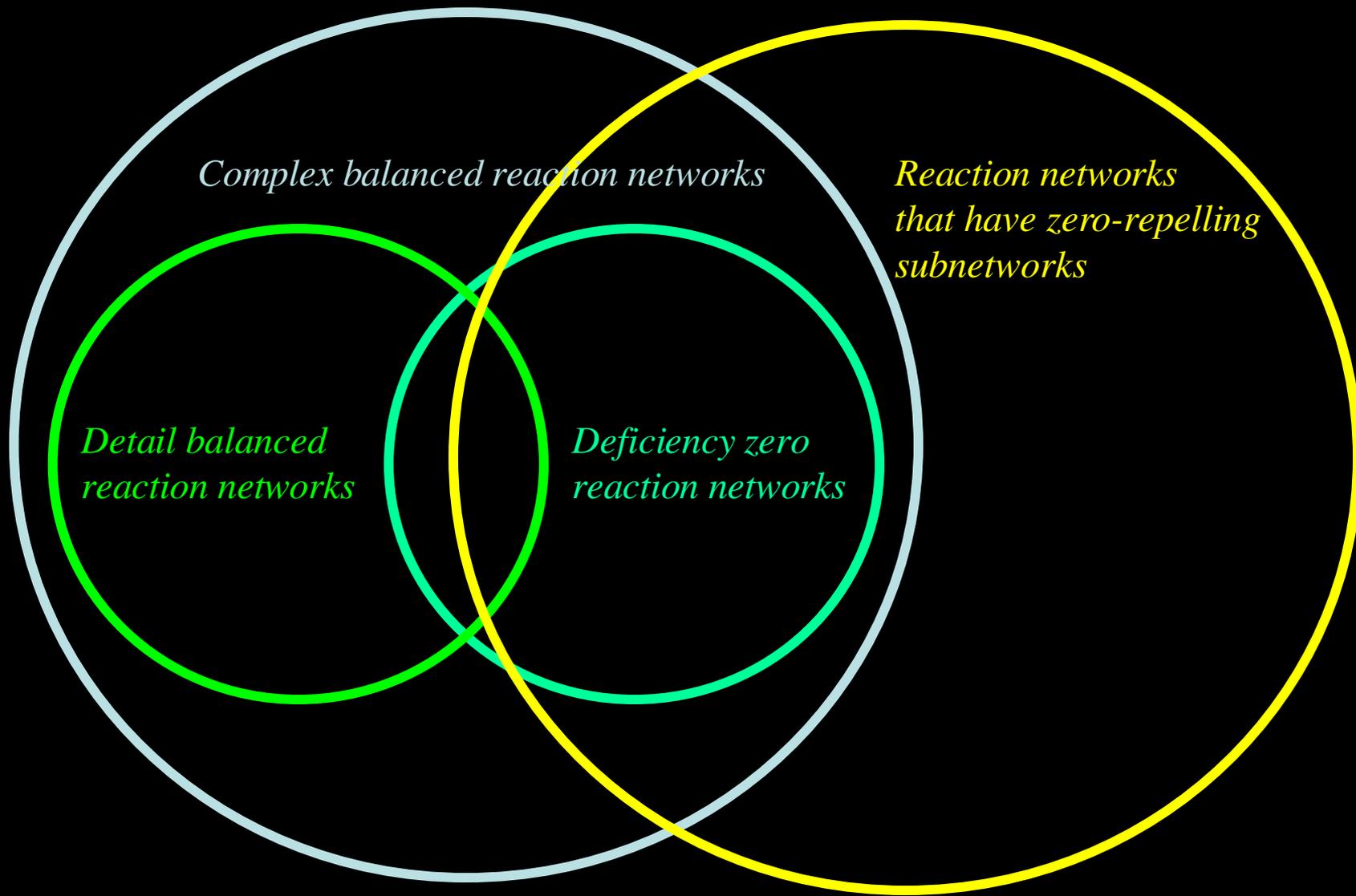
Theorem 3. *If a reaction network has stoichiometric subspace of dimension two, then any trajectory with positive initial condition converges to that equilibrium.*

Global Attractor Conjecture

Conjecture. *If a reaction network has a complex balanced equilibrium, then any trajectory with positive initial condition converges to that equilibrium.*



Theorem 4. *If a reaction network has zero-repelling subnetworks, then no trajectory with positive initial condition can converge to a boundary point.*

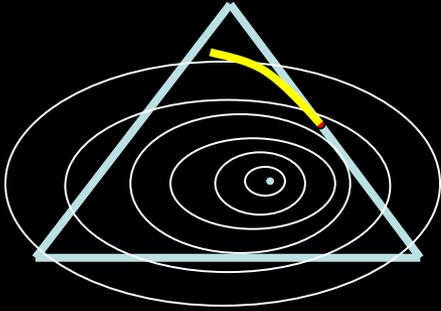


Complex balanced reaction networks

*Reaction networks
that have zero-repelling
subnetworks*

*Detail balanced
reaction networks*

*Deficiency zero
reaction networks*



Summary

- *Conjecture: the complex balancing equilibrium is global attractor.*
- *The complex balancing equilibrium always exists if the deficiency is zero.*
- *Proof, under additional assumptions: either the rate constants satisfy additional conditions, or the reaction network has special structure.*

Collaborato

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Fedor Nazarov, Department of Mathematics, University of Wisconsin-Madison.

Bernd Sturmfels, Department of Mathematics, UC Berkeley.

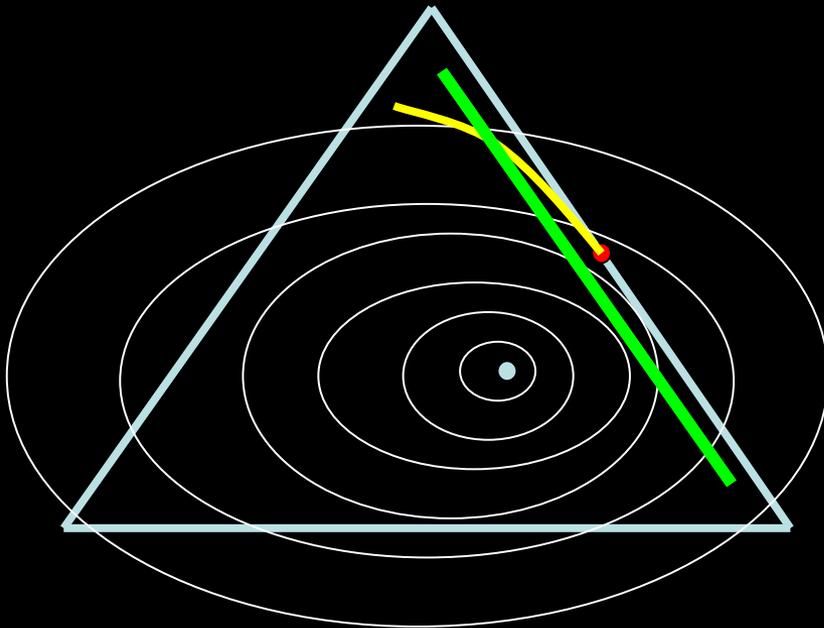
Anne Shiu, Department of Mathematics, Department of Mathematics, UC Berkeley.

Alicia Dickenstein, Department of Mathematics, University of Buenos Aires.

Support: NSF and DOE BACTER Institute.

Global Attractor Conjecture

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General Reference

Craciun, G., Tang, Y. and Feinberg, M., Understanding bistability in complex enzyme-driven reaction networks, *Proc. Nat. Acad. Sci. USA*, **103**, 8697-8702, 2006.

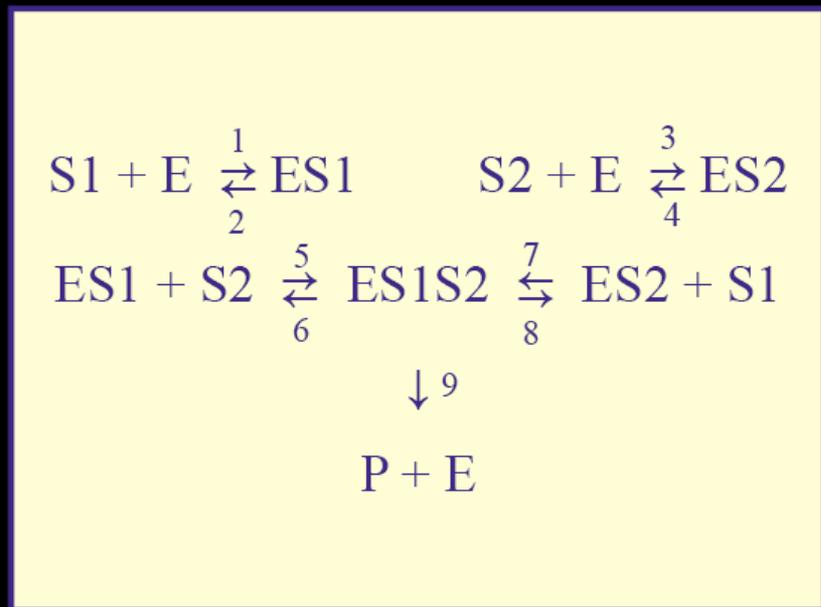
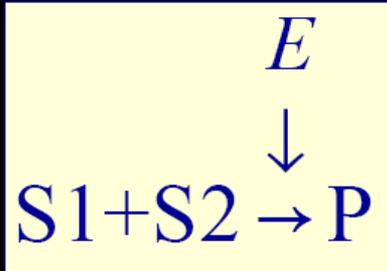
References for Proofs

Craciun, G. and Feinberg, M., Multiple equilibria in complex chemical reaction networks: I. The injectivity property, *S.I.A.M. J. Appl. Math.*, **65**, 1526-1546, 2005.

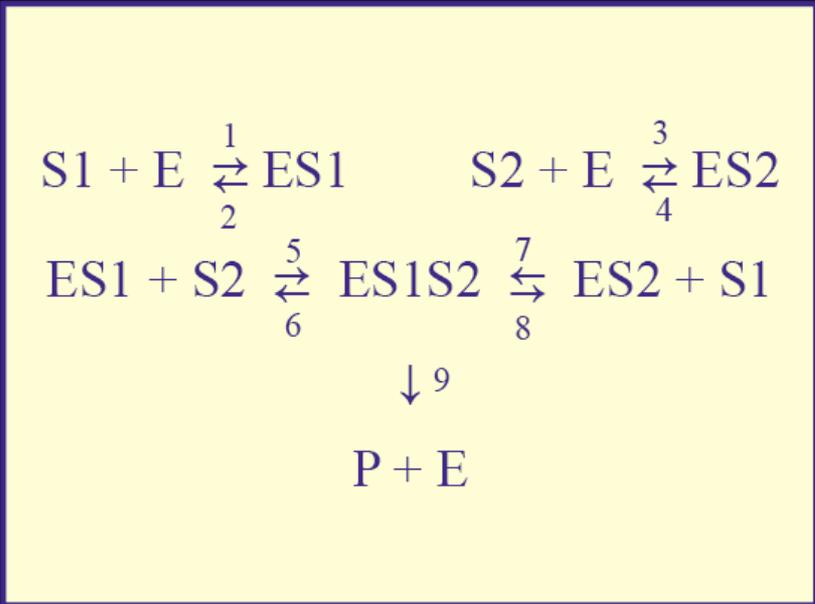
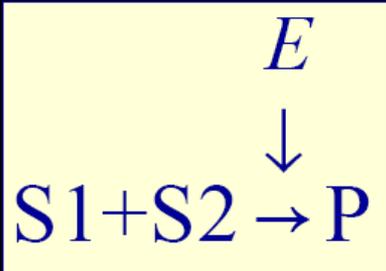
Craciun, G. and Feinberg, M., Multiple equilibria in complex chemical reaction networks: II. The species-reaction graph, *S.I.A.M. J. of Appl. Math.*, **66**, 1321-1338, 2006.

Craciun, G. and Feinberg, M., Multiple equilibria in complex chemical reaction networks: Extensions to entrapped species models, *I.E.E. Proc. Systems Biology*, **153**, 179-186, 2006

Given a reaction network, does it have multiple equilibria ?



$$\begin{aligned}
 \dot{c}_E &= -k_1 c_E c_{S1} + k_2 c_{ES1} - k_3 c_E c_{S2} + k_4 c_{ES2} + k_9 c_{ES1S2} \\
 \dot{c}_{S1} &= -k_1 c_E c_{S1} + k_2 c_{ES1} - k_7 c_{S1} c_{ES2} + k_8 c_{ES1S2} - \xi_{S1} c_{S1} + F_{S1} \\
 \dot{c}_{S2} &= -k_3 c_E c_{S2} + k_4 c_{ES2} - k_5 c_{S2} c_{ES1} + k_6 c_{ES1S2} - \xi_{S2} c_{S2} + F_{S2} \\
 \dot{c}_{ES1} &= k_1 c_E c_{S1} - k_2 c_{ES1} - k_5 c_{ES1} c_{S2} + k_6 c_{ES1S2} \\
 \dot{c}_{ES2} &= k_3 c_E c_{S2} - k_4 c_{ES2} - k_7 c_{ES2} c_{S1} + k_8 c_{ES1S2} \\
 \dot{c}_{ES1S2} &= k_5 c_{S2} c_{ES1} + k_7 c_{S1} c_{ES2} - (k_6 + k_8 + k_9) c_{ES1S2} \\
 \dot{c}_P &= k_9 c_{ES1S2} - \xi_P c_P
 \end{aligned}$$



$$\begin{array}{l}
 \dot{c}_E = -k_1 c_E c_{S1} + k_2 c_{ES1} - k_3 c_E c_{S2} + k_4 c_{ES2} + k_9 c_{ES1S2} \\
 \dot{c}_{S1} = -k_1 c_E c_{S1} + k_2 c_{ES1} - k_7 c_{S1} c_{ES2} + k_8 c_{ES1S2} - \xi_{S1} c_{S1} + F_{S1} \\
 \dot{c}_{S2} = -k_3 c_E c_{S2} + k_4 c_{ES2} - k_5 c_{S2} c_{ES1} + k_6 c_{ES1S2} - \xi_{S2} c_{S2} + F_{S2} \\
 \dot{c}_{ES1} = k_1 c_E c_{S1} - k_2 c_{ES1} - k_5 c_{ES1} c_{S2} + k_6 c_{ES1S2} \\
 \dot{c}_{ES2} = k_3 c_E c_{S2} - k_4 c_{ES2} - k_7 c_{ES2} c_{S1} + k_8 c_{ES1S2} \\
 \dot{c}_{ES1S2} = k_5 c_{S2} c_{ES1} + k_7 c_{S1} c_{ES2} - (k_6 + k_8 + k_9) c_{ES1S2} \\
 \dot{c}_P = k_9 c_{ES1S2} - \xi_P c_P
 \end{array}$$

p(c, k)

The Jacobian Criterion

Theorem. For a fully diffusive reaction network, the associated polynomial function $p(c, k)$ is **injective for all k** if and only if the determinant of the Jacobian

$$\det \left(\frac{\partial p}{\partial c} (c, k) \right)$$

does not vanish for any k .

Example

$$\begin{aligned}
 c_A^f &= c_A + k_{A+B \rightarrow CCACB} - k_{C \rightarrow A+BCC} + 2k_{2A+D \rightarrow X} c_A^2 c_D \\
 &\quad - 2k_{X \rightarrow 2A+DCX} + 2k_{2A+D \rightarrow Y} c_A^2 c_D - 2k_{Y \rightarrow 2A+DCY} \\
 c_B^f &= c_B + k_{A+B \rightarrow CCACB} - k_{C \rightarrow A+BCC} - k_{Z \rightarrow B+DCZ} \\
 &\quad + k_{B+D \rightarrow ZCB CD} \\
 c_C^f &= c_C - k_{A+B \rightarrow CCACB} + k_{C \rightarrow A+BCC} - k_{D \rightarrow C+WCD} \\
 &\quad + k_{C+W \rightarrow DC CCW} \\
 c_D^f &= c_D - k_{X \rightarrow 2A+DCX} + k_{2A+D \rightarrow X} c_A^2 c_D - k_{Y \rightarrow 2A+DCY} \\
 &\quad + k_{2A+D \rightarrow Y} c_A^2 c_D + k_{D \rightarrow C+WCD} - k_{C+W \rightarrow DC CCW} \\
 &\quad + k_{B+D \rightarrow ZCB CD} - k_{Z \rightarrow B+DCZ} \\
 c_W^f &= c_W - k_{D \rightarrow C+WCD} + k_{C+W \rightarrow DC CCW} \\
 c_X^f &= c_X + k_{X \rightarrow 2A+DCX} - k_{2A+D \rightarrow X} c_A^2 c_D \\
 c_Y^f &= c_Y - k_{2A+D \rightarrow Y} c_A^2 c_D + k_{Y \rightarrow 2A+DCY} \\
 c_Z^f &= c_Z - k_{B+D \rightarrow ZCB CD} + k_{Z \rightarrow B+DCZ}
 \end{aligned}$$

← $p(c, k)$

Coefficients of monomials in the determinant of the Jacobian of $p(c, k)$:

16	4	4	1	4	6	9	9	4	4	4	1	4	4	4	4	4	9	4	4
1	4	4	1	1	4	4	1	1	1	4	4	4	4	4	6	4	4	4	4
1	1	4	1	1	4	1	1	1	4	4	1	1	15	4	4	4	4	1	1
9	1	4	9	4	4	4	1	1	4	15	4	1	9	1	1	1	1	1	1
3	3	3	4	1	4	4	4	1	1	4	4	9	1	1	4	4	4	15	1
1	4	4	1	1	4	1	6	4	4	4	4	1	1	4	4	4	10	1	4
4	4	4	4	6	1	1	4	4	4	6	4	2	1	2	1	1	4	10	1
1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
1	1	1	1	1	1	1	1	1	1	1	1	3	1	3	1	3	1	1	4
4	4	1	1	1	1	1	4	4	1	1	6	4	4	1	4	1	9	1	1
1	4	1	1	1	1	4	1	4	4	4	2	1	10	4	4	4	1	4	1
1	1	4	1	1	1	1	1	4	1	4	2	1	1	6	4	4	4	15	6
2	4	1	1	4	4	1	4	1	4	4	1	4	4	4	4	1	1	1	2
4	4	4	4	4	4	4	1	4	4	1	1	1	1	4	4	1	4	1	1
1	4	1	1	2	1	1	1	1	1	1	1	1	1	1	1	1	2	1	1
1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
1	1	1	1	1	1	1	3	1	1	1	1	3	1	1	1	4	4	1	1
1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
1	1	1	4	1	1	1	1	1	1	1	1	1	1	4	1	1	1	1	1
1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1

The determinant of the Jacobian does not vanish !

Which polynomial dynamical systems can arise from mass-action kinetics?

Which polynomial dynamical systems can arise from mass-

Theorem. An n -dimensional polynomial dynamical system can arise from mass-action kinetics if and only if it can be written as

$$dc_1/dt = P_1(c_1, \dots, c_n) - c_1 Q_1(c_1, \dots, c_n)$$

$$dc_2/dt = P_2(c_1, \dots, c_n) - c_2 Q_2(c_1, \dots, c_n)$$

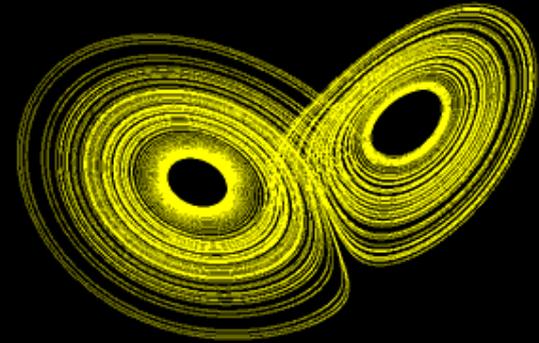
...

$$dc_n/dt = P_n(c_1, \dots, c_n) - c_n Q_n(c_1, \dots, c_n)$$

for some polynomials P_i and Q_i with non-negative coefficients.

Not mass-action kinetics: the Lorenz equation

$$\begin{aligned}dx/dt &= ay - ax \\dy/dt &= cx - y - xz \\dz/dt &= xy - bz\end{aligned}$$



$$\begin{aligned}dc_1/dt &= P_1(c_1, \dots, c_n) - c_1 Q_1(c_1, \dots, c_n) \\dc_2/dt &= P_2(c_1, \dots, c_n) - c_2 Q_2(c_1, \dots, c_n) \\&\dots \\dc_n/dt &= P_n(c_1, \dots, c_n) - c_n Q_n(c_1, \dots, c_n)\end{aligned}$$

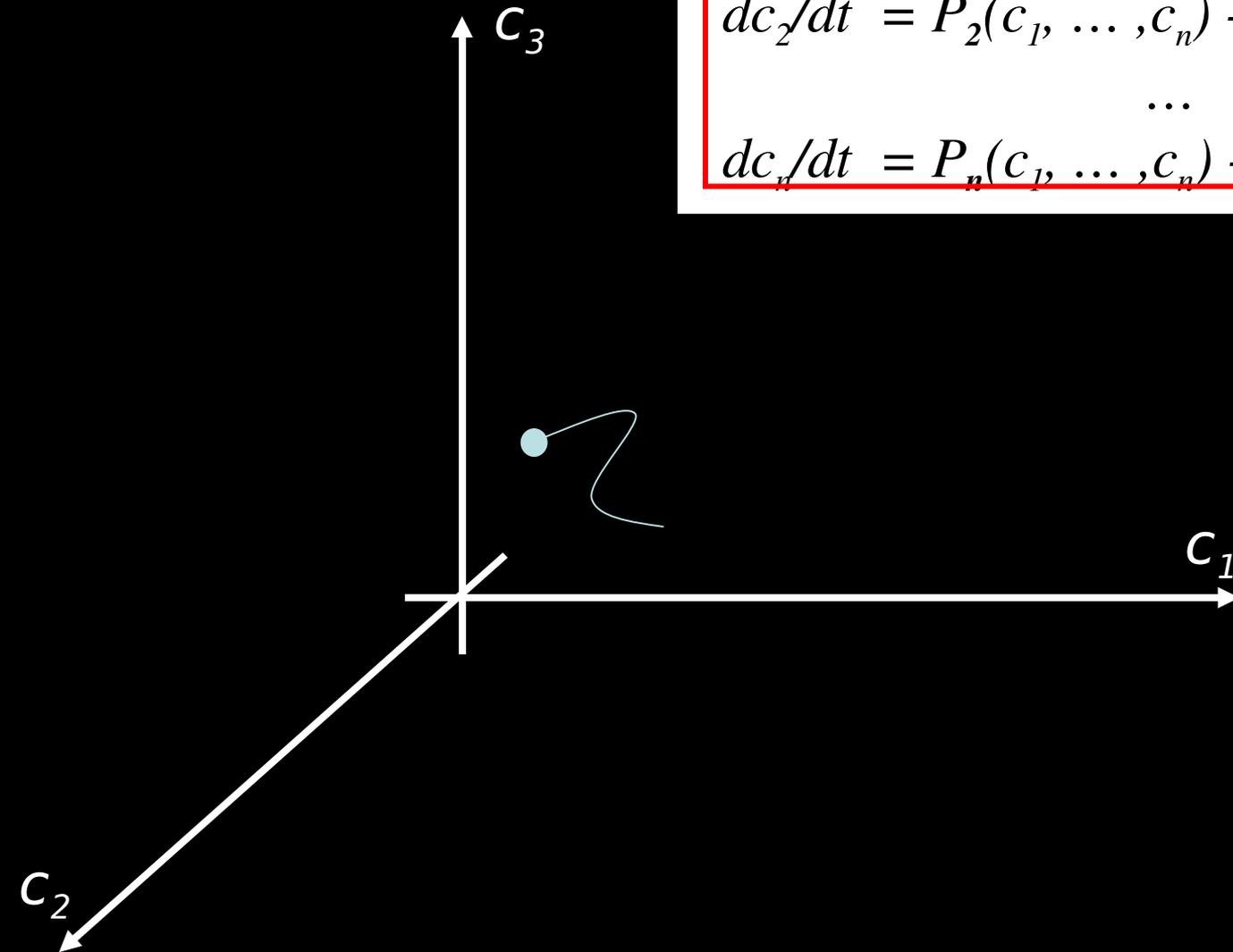
The positive quadrant is an
invariant

$$dc_1/dt = P_1(c_1, \dots, c_n) - c_1 Q_1(c_1, \dots, c_n)$$

$$dc_2/dt = P_2(c_1, \dots, c_n) - c_2 Q_2(c_1, \dots, c_n)$$

...

$$dc_n/dt = P_n(c_1, \dots, c_n) - c_n Q_n(c_1, \dots, c_n)$$



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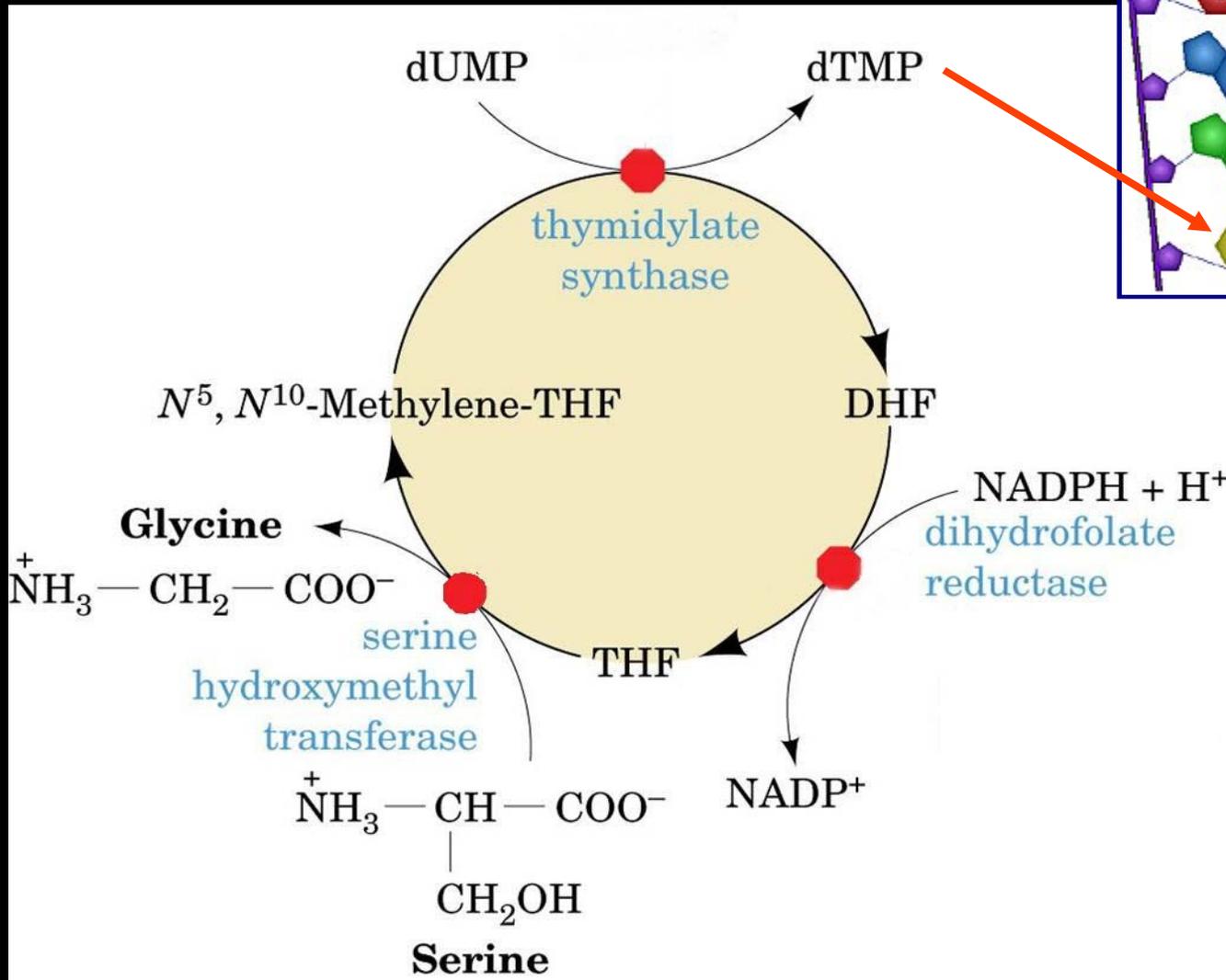
Martin Feinberg - Dept. of Chemical and Biomolecular Engineering, Ohio State University

Support: NSF, DOE.

Entrapped species models

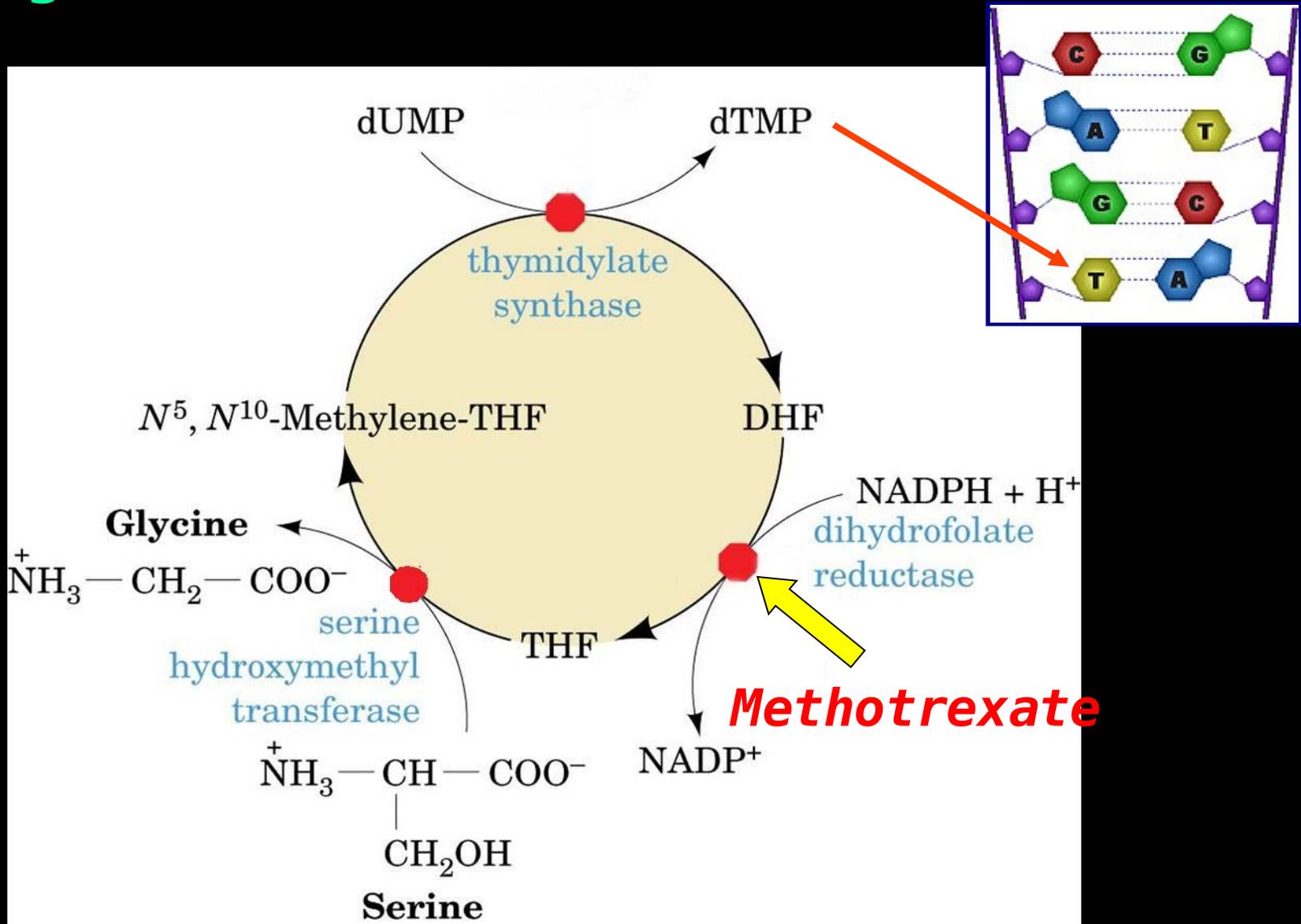
***Theorem.** Consider some reaction network which contains some entrapped species. If the corresponding fully diffusive network does not admit multiple equilibria, then the reaction network does not admit multiple equilibria.*

Methotrexate: How a Cancer Drug Works



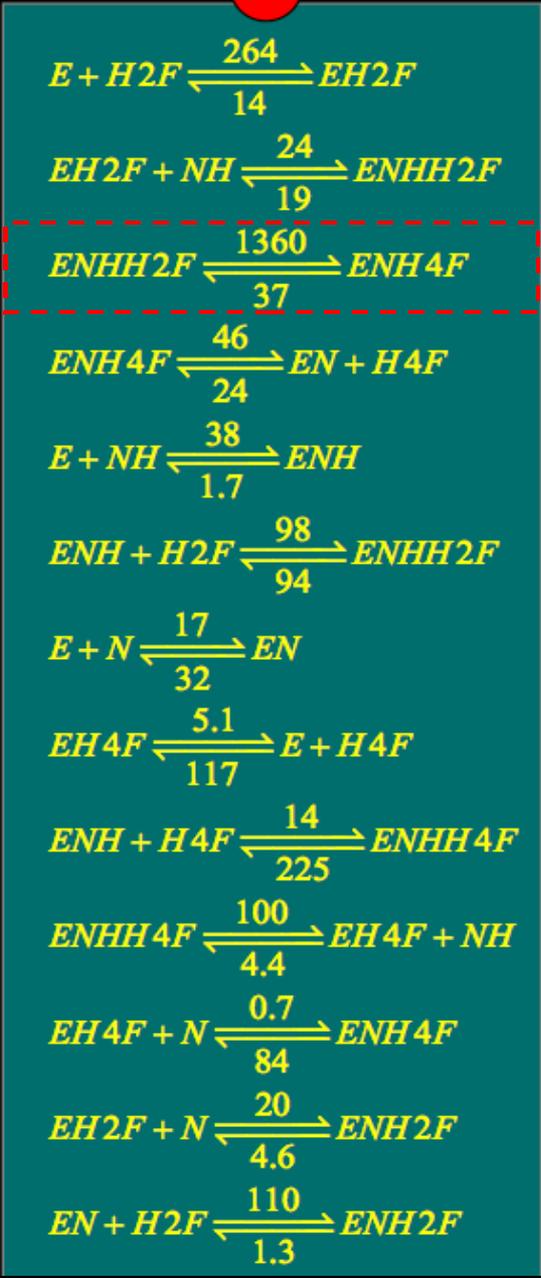
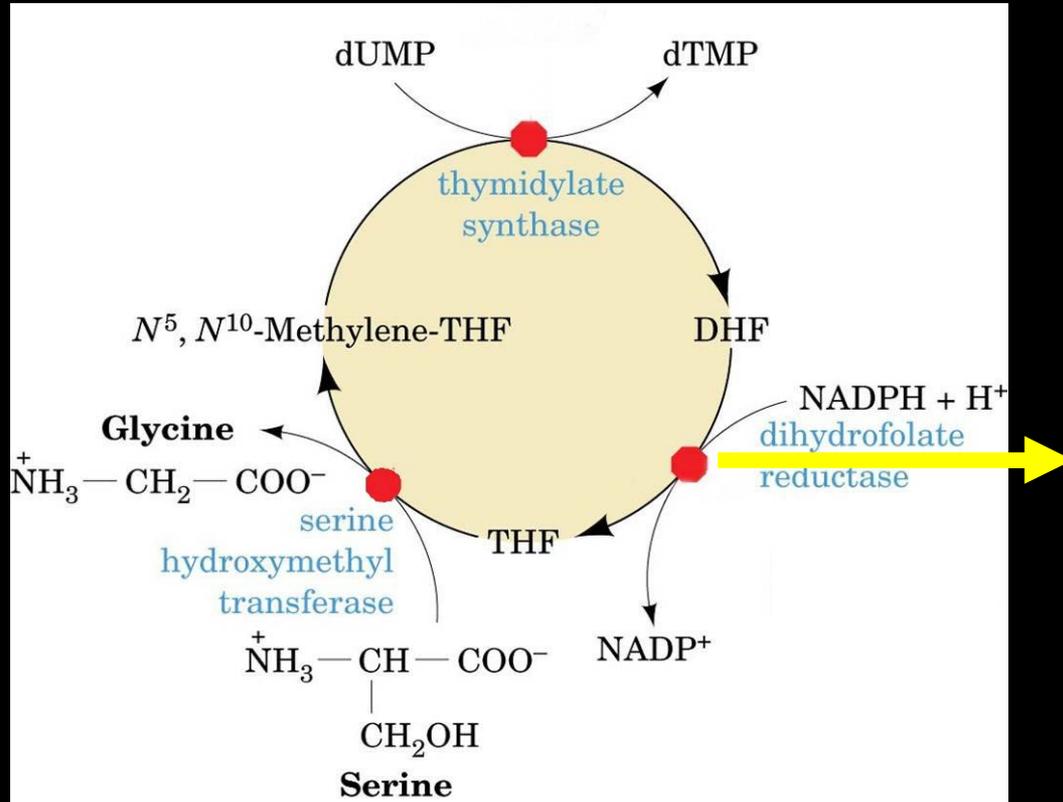
After Voet & Voet,

Methotrexate: How a Cancer Drug Works



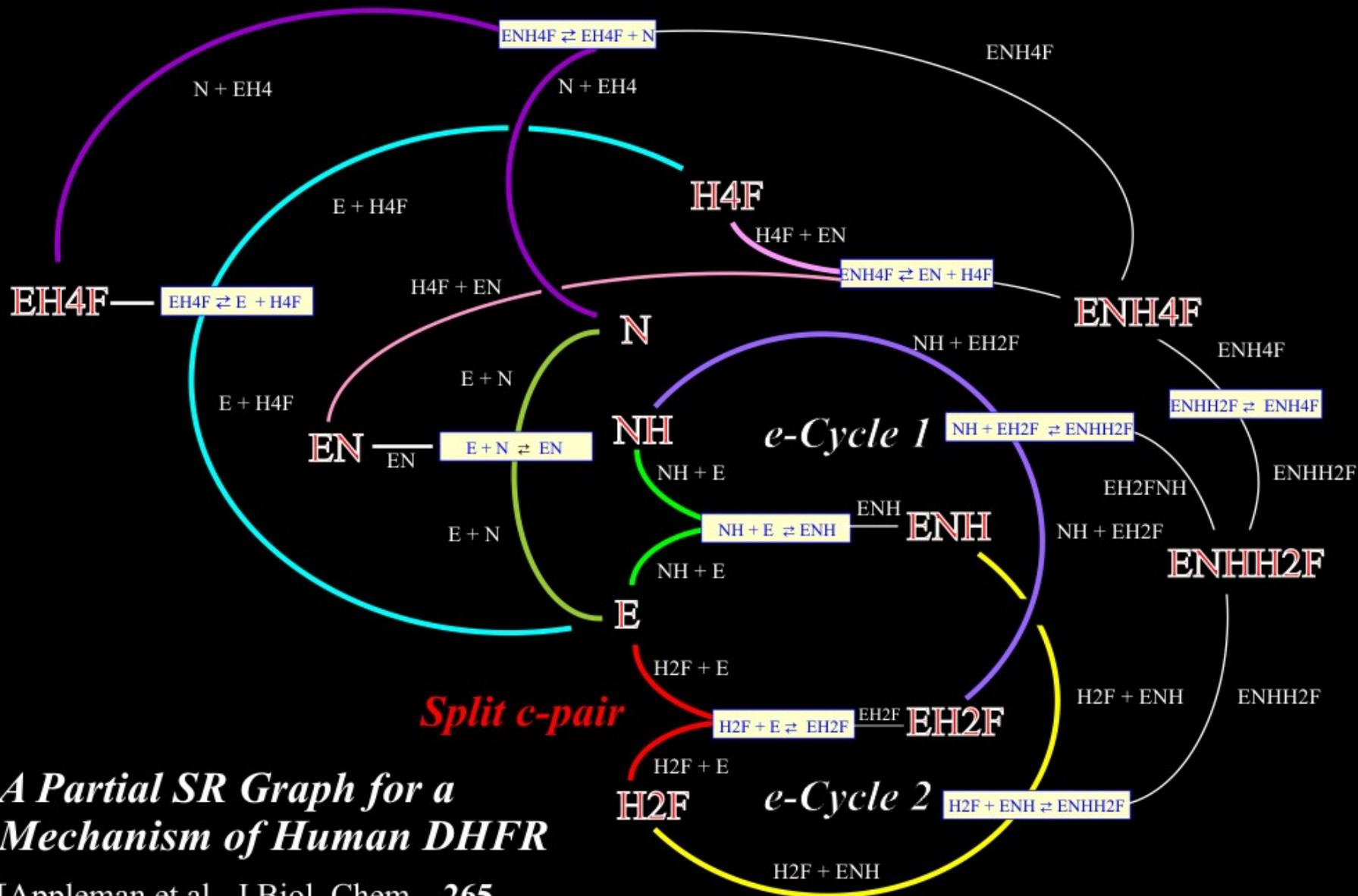
After Voet & Voet,

Inside the DHFR Red Dot (No Methotrexate!)



Mechanism and rate constants from
 Appleman et al.,
J. Biol. Chem., **265**, 2740-2748,
 (1990).

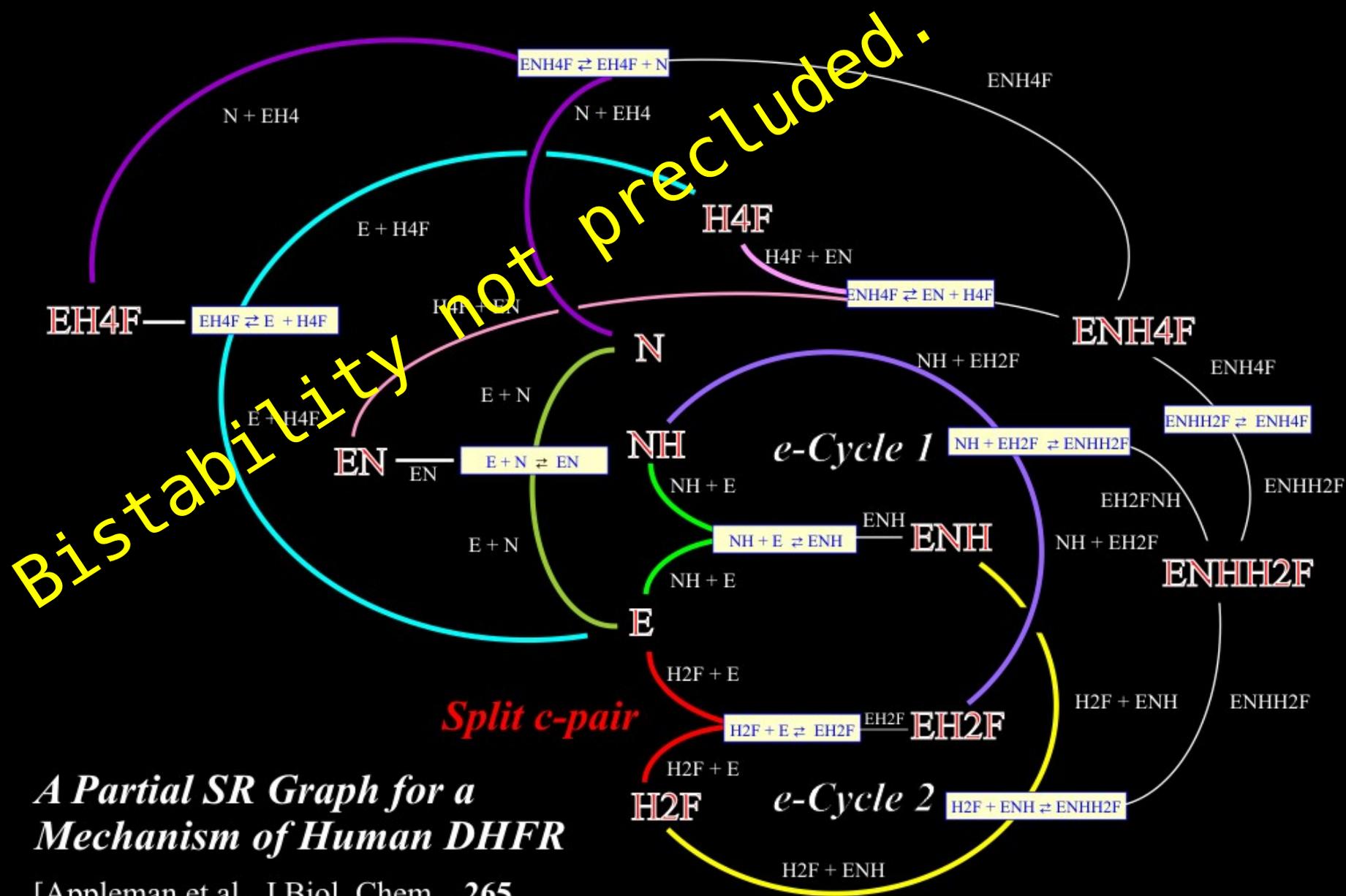
E = Human DHFR NH = NADPH H₂F = H₂folate N =
 NADP H₄F = H₄folate



A Partial SR Graph for a Mechanism of Human DHFR

[Appleman et al, J.Biol. Chem., **265**,
2740-2748 (1990)]

E = Human DHFR NH = NADPH N = NADP H2F = H2Folate H4F = H4Folate

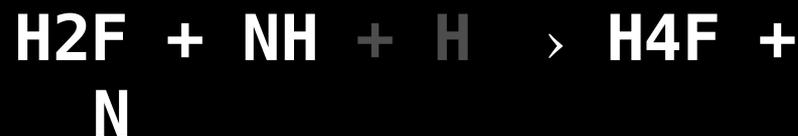
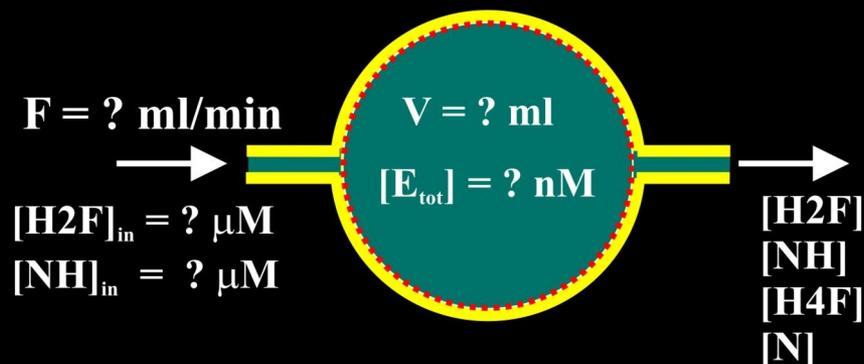
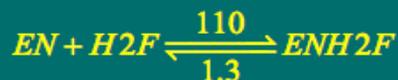
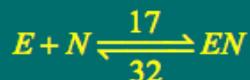
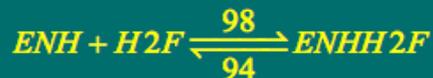


A Partial SR Graph for a Mechanism of Human DHFR

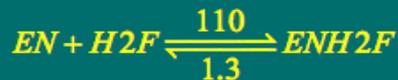
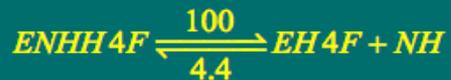
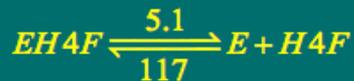
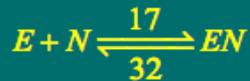
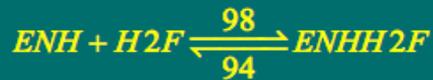
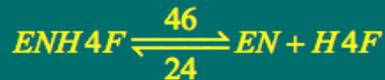
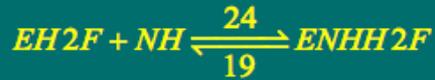
[Appleman et al, J.Biol. Chem., 265, 2740-2748 (1990)]

E = Human DHFR NH = NADPH N = NADP H2F = H2Folate H4F = H4Folate

Bistability Inside the DHFR Red Dot (No Methotrexate)



Bistability Inside the DHFR Red Dot (No Methotrexate)



$F = 0.56$ ml/min

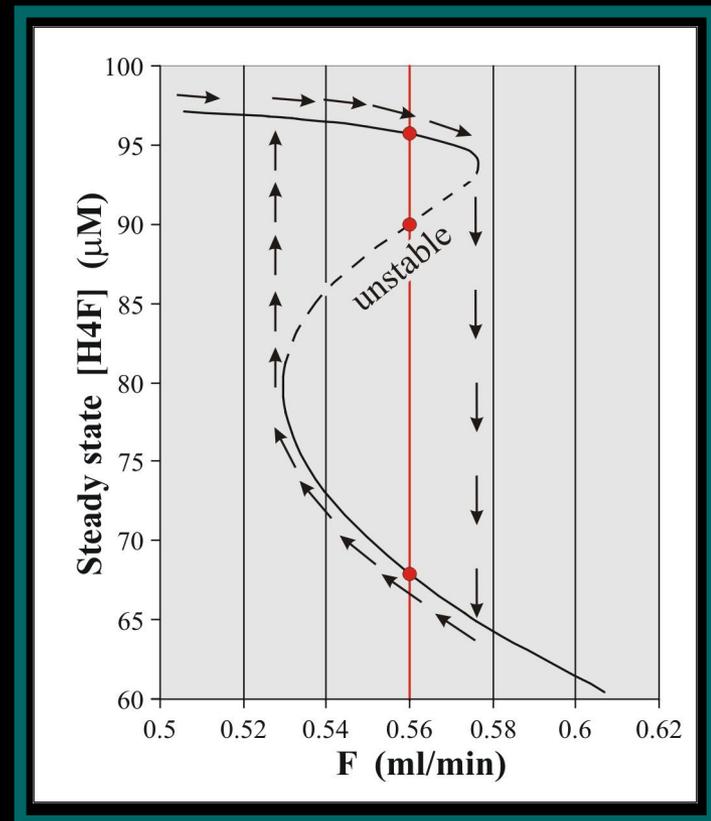
$V = 3.5$ ml

$[H2F]_{in} = 100$ μ M

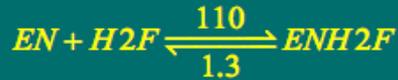
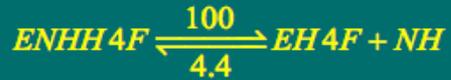
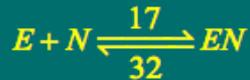
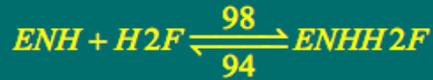
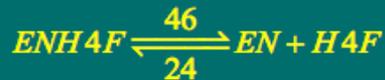
$[NH]_{in} = 400$ μ M

$[E_{tot}] = 15$ nM

$[H2F]$
 $[NH]$
 $[H4F]$
 $[N]$



Bistability Inside the DHFR Red Dot (No Methotrexate)



$F = 0.56$ ml/min

$[H2F]_{in} = 100 \mu M$

$[NH]_{in} = 400 \mu M$

$V = 3.5$ ml



$[H2F]$
 $[NH]$
 $[H4F]$
 $[N]$

