

Model Reduction and the Quasi-Steady State Approximation (QSSA)

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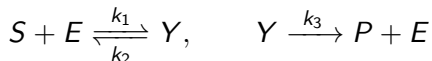
Joint with: Elisenda Feliu, Meritxell Sáez, Sebastian Walcher

SMB, June 14, 2021

The tale of the **non-interacting** species

Michaelis-Menten mechanism and the QSSA

Conversion of substrate S to product P



$$\dot{c}_S = -k_1 c_S c_E + k_2 c_Y$$

$$\dot{c}_P = k_3 c_Y$$

$$\dot{c}_E = -k_1 c_S c_E + k_2 c_Y + k_3 c_Y$$

$$\dot{c}_Y = k_1 c_S c_E - k_2 c_Y$$

$$\hat{T} = c_S + c_P + c_Y, \quad T = c_E + c_Y$$

Our interest is the accumulation of P in terms of S , so the species E, Y are nuisance species

Michaelis-Menten mechanism and the QSSA

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It assumes **quasi-stationarity** of the species to eliminate

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$$0 = -k_1 c_S c_E + k_2 c_Y + k_3 c_Y$$

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We solve the **red** equations in terms of c_E, c_Y , and plug the solution back into the remaining equations to get

$$\dot{c}_S = -\dot{c}_P = \frac{T k_1 k_3 c_S}{k_1 c_S + k_2 + k_3}$$

Michaelis-Menten mechanism and the QSSA

The QSSA **claims** the trajectories of the reduced system are **close** to the trajectories of the original system

For this, some **assumptions** are made on the speed of the reactions (k_i) and the total amounts of the eliminated species (T)

The method of verification in general (if any is given!) is reference to **Tikhonov's** theorem

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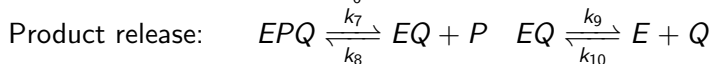
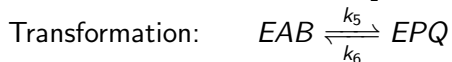
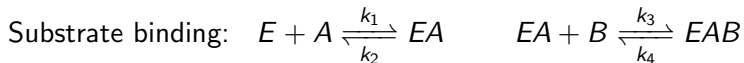
However, QSSA is **not** in general a valid procedure and **cannot** be verified generally¹

My interest is to give a simple procedure that guarantees the QSSA is valid²

¹Lax, Seliger & Walcher (2018); ²Feliu, Lax, Walcher & Wiuf (2021)

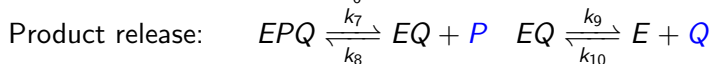
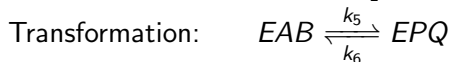
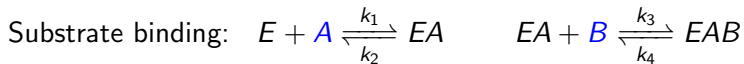
Two-substrate mechanism

Two-substrate example with mass-action kinetics (Cornish-Bowden, 2012)



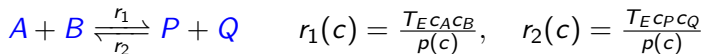
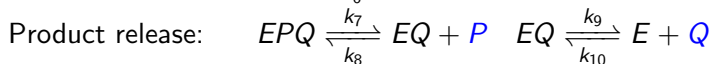
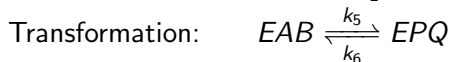
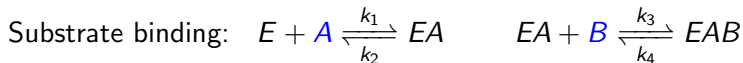
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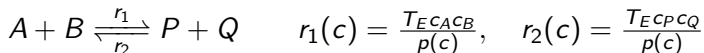
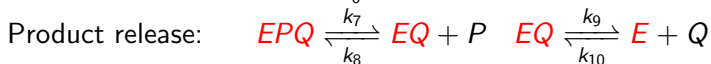
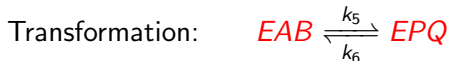
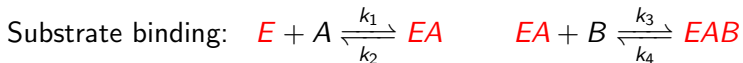
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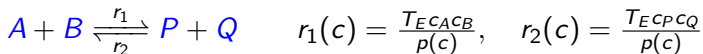
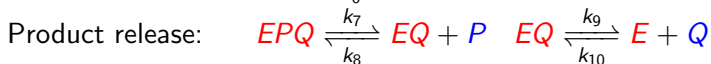
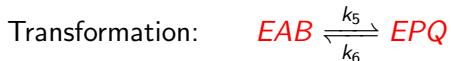
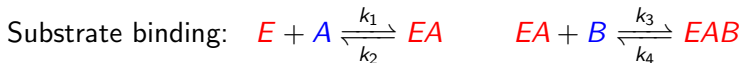
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The **red** species are **non-interacting** (stoichiometric coefficients are one and they are never on the same side of a reaction)

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Eliminated species: E, EA, EAB, EPQ, EQ Core species: A, B, P, Q

Reduction theorem

Let a mass-action reaction network and a set of **non-interacting** species be given.

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There exists a **mass-action-like** reduced reaction network (w/o the non-interacting species) and a time $t > 0$, such that the trajectories of original network converge to the trajectories of the reduced on finite time intervals $[u, t]$, for any $0 < u < t$, as $\epsilon \rightarrow 0$. The reaction rates of the reduced system are rational functions, depending on κ_i, τ

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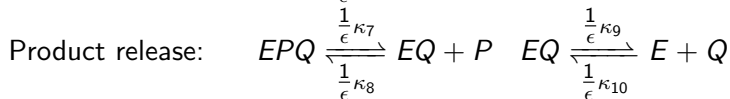
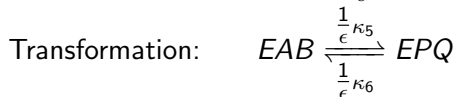
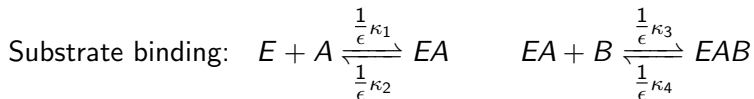
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Moreover, the QSSA is valid

Feliu & Wiuf (2012,2013a,b); Sáez, Wiuf & Feliu (2016); Feliu, Lax, Walcher & Wiuf (2021)

Related work: King & Altman (1956); Horiuti & Nakamura (1957); Wong & Hanes (1962)

Returning to the example



$$\epsilon TE = c_E + c_{EA} + c_{EAB} + c_{EPQ} + c_{EQ}$$

Michaelis-Menten mechanism



Non-interacting species E, Y

All reactions involve E or Y in the reactant and $T = c_Y + c_E$, so

$$k_i = \frac{1}{\epsilon} \kappa_i, \quad i = 1, 2, 3, \quad T = \epsilon \tau$$

The reduced system corresponds to the system $S \rightarrow P$ with kinetics

$$\dot{c}_S = -\dot{c}_P = \frac{\tau \kappa_1 \kappa_3 c_S}{\kappa_1 c_S + \kappa_2 + \kappa_3}$$

The proof

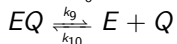
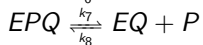
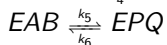
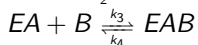
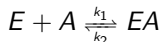
There are three steps in the proof

- Derive the reduced ODE system using QSSA¹
- Identify a mass-action-like reaction network for the reduced ODE system²
- Apply Tikhonov theory to deduce convergence of trajectories³

All three steps rely on the eliminated species being **non-interacting**

¹Feliu & Wiuf (2012,2013a,b); ²Sáez, Wiuf, Feliu (2016); ³Feliu, Walcher & Wiuf (2018)

ODE system and QSSA



$$\dot{C}_E = -k_1 C_E C_A - k_{10} C_E C_Q + k_2 C_{EA} + k_9 C_{EQ}$$

$$\dot{C}_A = -k_1 C_E C_A + k_2 C_{EA}$$

$$\dot{C}_B = -k_3 C_B C_{EA} + k_4 C_{EAB}$$

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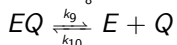
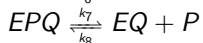
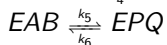
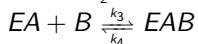
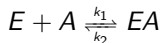
$$\dot{C}_{EA} = -k_3 C_B C_{EA} - k_2 C_{EA} + k_1 C_E C_A + k_4 C_{EAB}$$

$$\dot{C}_{EAB} = -k_4 C_{EAB} - k_5 C_{EAB} + k_3 C_B C_{EA} + k_6 C_{EPQ}$$

$$\dot{C}_{EPQ} = -k_6 C_{EPQ} - k_7 C_{EPQ} + k_8 C_P C_{EQ} + k_5 C_{EAB}$$

$$\dot{C}_{EQ} = -k_9 C_{EQ} - k_8 C_P C_{EQ} + k_{10} C_E C_Q + k_7 C_{EPQ}$$

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Conservation laws :

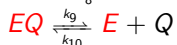
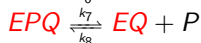
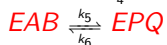
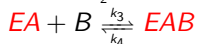
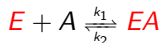
$$T_E = C_E + C_{EA} + C_{EAB} + C_{EPQ} + C_{EQ}$$

$$T_{A+Q} = C_A + C_Q + C_{EA} + C_{EAB} + C_{EPQ} + C_{EQ}$$

$$T_{B+Q} = C_B + C_Q + C_{EAB} + C_{EPQ} + C_{EQ}$$

$$T_{B+P} = C_B + C_P + C_{EAB} + C_{EPQ}$$

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$$T_{B+Q} = C_B + C_Q + C_{EAB} + C_{EPQ} + C_{EQ}$$

$$T_{B+P} = C_B + C_P + C_{EAB} + C_{EPQ}$$

Interpretation as a linear system

Steady state equations of C_E , C_{EA} , C_{EAB} , C_{EPQ} and C_{EQ}

$$\begin{aligned} \dot{C}_E &= 0 = -k_1 C_E C_A - k_{10} C_E C_Q + k_2 C_{EA} + k_9 C_{EQ} \\ \dot{C}_{EA} &= 0 = -k_2 C_{EA} - k_3 C_B C_{EA} + k_1 C_E C_A + k_4 C_{EAB} \\ \dot{C}_{EAB} &= 0 = -k_4 C_{EAB} - k_5 C_{EAB} + k_3 C_B C_{EA} + k_6 C_{EPQ} \\ \dot{C}_{EPQ} &= 0 = -k_6 C_{EPQ} - k_7 C_{EPQ} + k_8 C_P C_{EQ} + k_5 C_{EAB} \\ \dot{C}_{EQ} &= 0 = -k_8 C_P C_{EQ} - k_9 C_{EQ} + k_{10} C_E C_Q + k_7 C_{EPQ} \\ T_E &= C_E + C_{EA} + C_{EAB} + C_{EPQ} + C_{EQ} \end{aligned}$$

The system is **linear** in C_E , C_{EA} , C_{EAB} , C_{EPQ} , C_{EQ} and has a **unique solution**
 ... because the species are **non-interacting**

Solution

$$\begin{aligned}
 q(c) = & (k_4 k_6 + k_4 k_7 + k_5 k_7) k_2 k_9 + k_2 k_4 k_6 k_8 CP + k_3 k_5 k_7 k_9 CB + (k_4 k_6 + k_4 k_7 + k_5 k_7) k_2 k_{10} CQ + (k_4 k_6 + k_5 k_7 + k_4 k_7) k_1 k_9 CA \\
 & + (k_5 k_9 + k_7 k_9 + k_5 k_7 + k_6 k_9) k_1 k_3 CA CB + k_3 k_5 k_7 k_{10} CB CQ + k_1 k_4 k_6 k_8 CA CP + (k_5 + k_6) k_1 k_3 k_8 CA CB CP \\
 & + (k_5 k_2 + k_4 k_2 + k_6 k_2 + k_6 k_4) k_8 k_{10} CP CQ + (k_5 + k_6) k_3 k_8 k_{10} CB CP CQ
 \end{aligned}$$

$$CE = \frac{T_E}{q(c)} \left((k_4 k_6 + k_4 k_7 + k_5 k_7) k_2 k_9 + k_3 k_5 k_7 k_9 CB + k_2 k_4 k_6 k_8 CP \right)$$

$$CEA = \frac{T_E}{q(c)} \left((k_4 k_6 + k_5 k_7 + k_4 k_7) k_1 k_9 CA + k_4 k_6 k_8 k_{10} CP CQ + k_1 k_4 k_6 k_8 CA CP \right)$$

$$\begin{aligned}
 CEAB = & \frac{T_E}{q(c)} \left((k_6 + k_7) k_1 k_3 k_9 CA CB + k_2 k_6 k_8 k_{10} CP CQ + k_3 k_6 k_8 k_{10} CB CP CQ \right. \\
 & \left. + k_1 k_3 k_6 k_8 CA CB CP \right)
 \end{aligned}$$

$$\begin{aligned}
 CEPQ = & \frac{T_E}{q(c)} \left(k_1 k_3 k_5 k_9 CA CB + (k_4 + k_5) k_2 k_8 k_{10} CP CQ + k_3 k_5 k_8 k_{10} CB CP CQ \right. \\
 & \left. + k_1 k_3 k_5 k_8 CA CB CP \right)
 \end{aligned}$$

$$CEQ = \frac{T_E}{q(c)} \left((k_4 k_6 + k_5 k_7 + k_4 k_7) k_2 k_{10} CQ + k_3 k_5 k_7 k_{10} CB CQ + k_1 k_3 k_5 k_7 CA CB \right)$$

Non-negative solution because the species are **non-interacting**

The reduced reaction network

Inserting these expressions into the remaining equations yields

$$\begin{aligned}\dot{c}_A &= \frac{T_E}{q(c)} (-\alpha_1 c_A c_B + \alpha_2 c_P c_Q) & \alpha_1 &= k_1 k_3 k_5 k_7 k_9 \\ \dot{c}_B &= \frac{T_E}{q(c)} (-\alpha_1 c_A c_B + \alpha_2 c_P c_Q) & \alpha_2 &= k_2 k_4 k_6 k_8 k_{10} \\ \dot{c}_P &= \frac{T_E}{q(c)} (\alpha_1 c_A c_B - \alpha_2 c_P c_Q) \\ \dot{c}_Q &= \frac{T_E}{q(c)} (\alpha_1 c_A c_B - \alpha_2 c_P c_Q)\end{aligned}$$

This system is **invariant in the non-negative orthant**

... because the species are **non-interacting**

Reduced ODE system

Linear elimination of non-interacting species

The concentrations of a set of non-interacting species can be non-negatively eliminated from the steady state equations.

That is, the concentrations of the non-interacting species are rational functions of the remaining species, and furthermore, they are non-negative for non-negative concentrations of the remaining species

ODE system without the non-interacting species

By insertion of the rational expressions obtained for the non-interacting species into the original ODE system, an ODE system for the remaining species is obtained

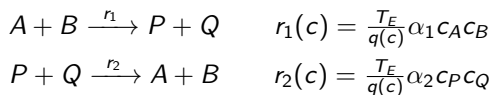
¹Feliu & Wiuf (2012,2013a,b)

The reduced reaction network

Returning to the reduced ODE system

$$\begin{aligned}\dot{c}_A &= \frac{T_E}{q(c)} (-\alpha_1 c_A c_B + \alpha_2 c_P c_Q) & \alpha_1 &= k_1 k_3 k_5 k_7 k_9 \\ \dot{c}_B &= \frac{T_E}{q(c)} (-\alpha_1 c_A c_B + \alpha_2 c_P c_Q) & \alpha_2 &= k_2 k_4 k_6 k_8 k_{10} \\ \dot{c}_P &= \frac{T_E}{q(c)} (\alpha_1 c_A c_B - \alpha_2 c_P c_Q) \\ \dot{c}_Q &= \frac{T_E}{q(c)} (\alpha_1 c_A c_B - \alpha_2 c_P c_Q)\end{aligned}$$

Reactions and kinetics



The kinetics is **mass-action-like** ... because of the **non-interacting** species

Reduction theorem

Let a mass-action reaction network and a set of **non-interacting** species be given. Further suppose

- the non-interacting species are **consumed** and **produced**
- the rate constants of the reactions involving non-interacting species in the reactant scale as $k_i = \frac{1}{\epsilon} \kappa_i$ ('fast' reactions)
- the conserved quantity of any conservation law involving only non-interaction species scales as $T = \epsilon \tau$

There exists a **mass-action-like** reduced reaction network (w/o the non-interacting species) and a time $t > 0$, such that the trajectories of original network converge to the trajectories of the reduced on finite time intervals $[u, t]$, for any $0 < u < t$, as $\epsilon \rightarrow 0$. The reaction rates of the reduced system are rational functions, depending on κ_i, τ

Moreover, the QSSA is valid

Feliu & Wiuf (2012,2013a,b); Sáez, Wiuf & Feliu (2016); Feliu, Lax, Walcher & Wiuf (2021)

Related work: King & Altman (1956); Horiuti & Nakamura (1957); Wong & Hanes (1962)

THANKS

to the audience

also to the Danish Research Councils
and the Lundbeck Foundation

Tikhonov reduction

Tikhonov's theorem assume 'fast' and 'slow' variables

$$\dot{x} = f(x, y), \quad \epsilon \dot{y} = g(x, y)$$

We have 'fast' and 'slow' reactions, defined by the reaction rate constants

$$\dot{x} = \frac{1}{\epsilon} f_1(x, y) + f_2(x, y), \quad \dot{y} = \frac{1}{\epsilon} g_1(x, y) + g_2(x, y)$$

There exist conditions under which a reaction network with fast and slow reactions can be transformed into Tikhonov form¹

Assuming mass-action kinetics and that the eliminated species are **non-interacting** then the conditions are fulfilled

¹Lax, Seliger & Walcher (2018)

Application of Tikhonov theory

Tikhonov reduction (non-interacting species)¹

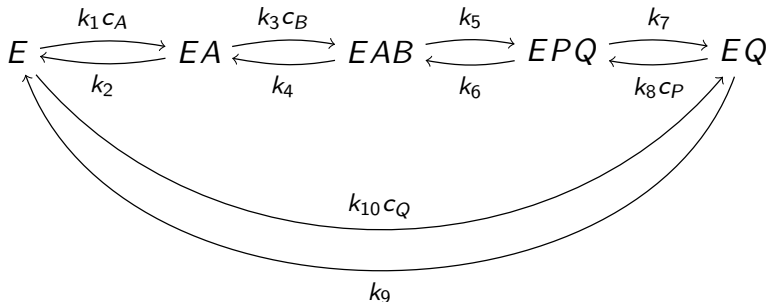
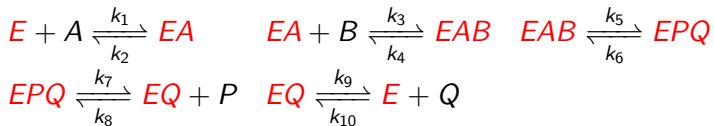
Let a mass-action reaction network and a set of non-interacting species be given. Further suppose

- the eliminated-species graph consists of strongly connected components
- the rate constants of the reactions involving non-interacting species in the reactant scale as $k_i = \frac{1}{\epsilon} \kappa_i$
- the conserved quantity of any conservation law involving only non-interaction species fulfils $T = \epsilon \tau$

The trajectories of the ODE system converge to the trajectories of the reduced ODE system on finite time intervals $[t_1, t_2]$, $0 < t_1 < t_2$, as $\epsilon \rightarrow 0$. The reaction rates of the reduced system depend on κ_i, τ_i

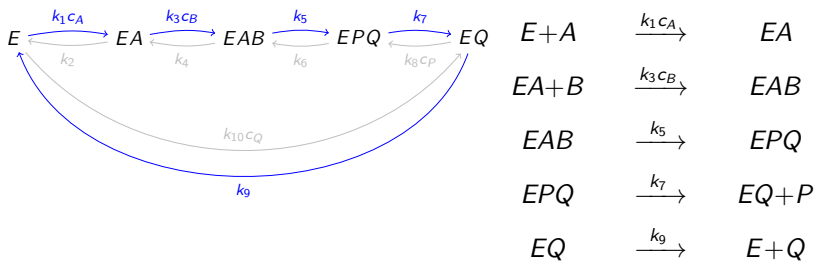
¹Feliu, Walcher & Wiuf (2018)

Eliminated-species graph



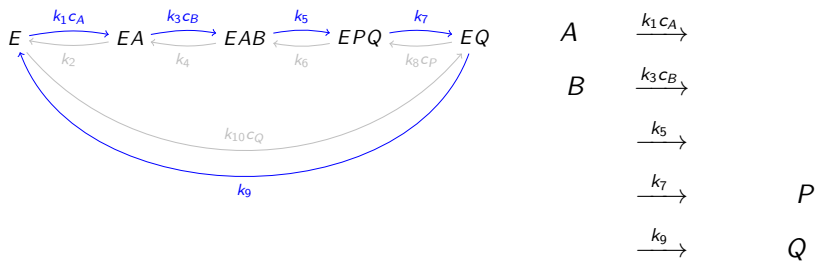
Reactions in the reduced reaction network

i) Consider a directed cycle and the corresponding reactions



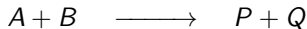
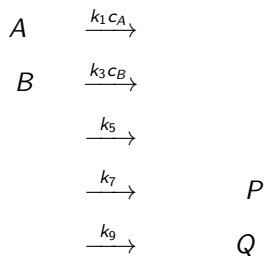
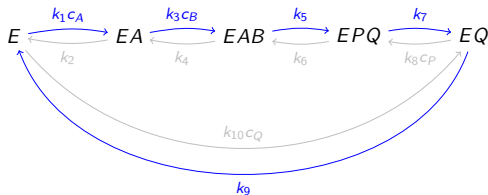
Reactions in the reduced reaction network

- Consider a directed cycle and the corresponding reactions
- Cancel the eliminated species on both sides



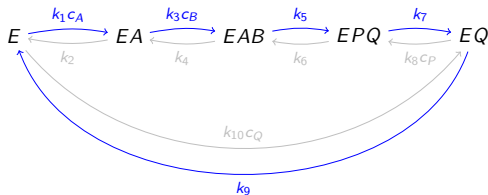
Reactions in the reduced reaction network

- i) Consider a directed cycle and the corresponding reactions
- ii) Cancel the eliminated species on both sides
- iii) Add the remaining reactants and products

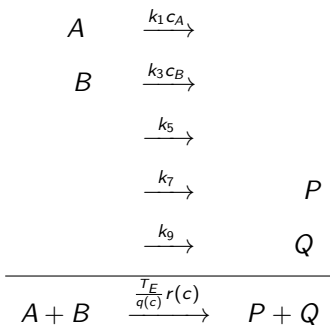


Reactions in the reduced reaction network

- i) Consider a directed cycle and the corresponding reactions
- ii) Cancel the eliminated species on both sides
- iii) Add the remaining reactants and products
- iv) Define the rate function as $\frac{T_E}{q(c)} r(c)$



$$r(c) = k_1 k_3 k_5 k_7 k_9 c_A c_B$$



Reactions in the reduced reaction network

Reduced reaction network (non-interacting species)¹

The reduced ODE system can always be interpreted as a reaction network on the core species.

The reactions are derived from the cycles of the eliminated-species graph

Kinetic of the reduced reaction network (non-interacting species)¹

If the original system has mass-action kinetics then the reaction rates are of the form $\frac{p(c)}{q(c)}$, where p, q are polynomials in c , and $\frac{p(c)}{q(c)}$ is irreducible. Furthermore, the numerator $p(c)$ has mass-action form

¹Sáez, Wiuf & Feliu (2017)

King & Altman (1956); Horiuti & Nakamura (1957); Wong & Hanes (1962); Temkin (1965); Temkin & Bonchev (1992)