Bistable motif: detailed balancing and its consequences

Finding the condition of multistationarity

We consider the following reactions:

```
\begin{split} &K+S\leftrightharpoons KS \to K+S_p\\ &K^{\color{red} *}+S\leftrightharpoons K^{\color{red} *}S\to K^{\color{red} *}+S_p\\ &S_p\to S\\ &K\leftrightharpoons K^{\color{red} *}\\ &KS\leftrightharpoons K^{\color{red} *}S \end{split}
```

The species of the system are:

$${S, S_p, K, K^*, KS, K^*S}$$

In total, there are 11 reations and 6 species.

We firstly construct the ordinary differential equations based on mass-action kinetics. Then compute the determinant of Jacobian, using the solution at critical point (steady state) to calculate the determinant. The (necessary) condition for multistationarity is to make determinant equal to zero (non-zero determinant implys injectivity).

```
ClearAll["Global`*"];
A = Table[0, {11}, {6}];
A[[1]][[1]] = -1;
A[[1]][[3]] = -1;
A[[1]][[5]] = 1;
A[[2]] = -A[[1]];
A[[3]][[3]] = 1; A[[3]][[2]] = 1; A[[3]][[5]] = -1;
A[[4]][[1]] = -1;
A[[4]][[4]] = -1;
A[[4]][[6]] = 1;
A[[5]] = -A[[4]];
A[[6]][[4]] = 1;
A[[6]][[2]] = 1;
A[[6]][[6]] = -1;
A[[7]][[2]] = -1;
A[[7]][[1]] = 1;
A[[8]][[3]] = -1; A[[8]][[4]] = 1; A[[9]] = -A[[8]];
A[[10]][[5]] = -1; A[[10]][[6]] = 1; A[[11]] = -A[[10]];
 stoiM = Transpose[A];
  (* Now we construct the rate vector *)
\mathbf{ks} = \{\mathbf{k}_1 \times \mathbf{x}_3 \times \mathbf{x}_1, \ \mathbf{k}_2 \times \mathbf{x}_5, \ \mathbf{k}_3 \times \mathbf{x}_5, \ \mathbf{k}_4 \times \mathbf{x}_4 \times \mathbf{x}_1, \ \mathbf{k}_5 \times \mathbf{x}_5, \ \mathbf{k}_6 \times \mathbf{x}_6 \times \mathbf{x}_6, \ \mathbf{k}_7 \times \mathbf{x}_7, \ \mathbf{k}_8 \times \mathbf{x}_9 \times \mathbf{x}_{1}, \ \mathbf{k}_8 \times \mathbf{x}_{1}, \ \mathbf{k}_{1} \times \mathbf{x}_{2} \times \mathbf{x}_{2}, \ \mathbf{k}_{2} \times \mathbf{x}_{3} \times \mathbf{x}_{1}, \ \mathbf{k}_{3} \times \mathbf{x}_{2}, \ \mathbf{k}_{4} \times \mathbf{x}_{4} \times \mathbf{x}_{1}, \ \mathbf{k}_{5} \times \mathbf{x}_{1},
                              k_5 \times x_6, k_6 \times x_6, k_7 \times x_2, k_8 \times x_3, k_9 \times x_4, k_{10} \times x_5, k_{11} \times x_6};
 ssEqns = stoiM.ks;
mC = RowReduce[NullSpace[A]];
 subsEqns = {ssEqns[[2]], ssEqns[[4]],
                              sseqns[[5]], sseqns[[6]], x_1 + x_2 + x_5 + x_6 - T_1, x_3 + x_4 + x_5 + x_6 - T_2;
 jacobian = D[subsEqns, \{\{x_1, x_2, x_3, x_4, x_5, x_6\}\}];
 detJ = Collect[Distribute[Det[jacobian]], {x1, x2, x3, x4, x5, x6}];
 solution =
                    Solve[{subsEqns[[1]], subsEqns[[2]], subsEqns[[3]], subsEqns[[4]]} == 0,
                                 \{x_2, x_4, x_5, x_6\}];
 detSubs = Replace[detJ, solution[[1]], {0, Infinity}];
  (* Equivilant to detSubs=detJ/.solution[[1]]; *)
polSubs = Numerator[Together[detSubs]];
 finalSubs = Collect[Distribute[polSubs], x , FactorTerms]
 \texttt{factor} = \mathbf{k}_{1}^{2} \ \mathbf{k}_{3} \ \mathbf{k}_{4} \ \mathbf{k}_{5} \ \mathbf{k}_{9} \ \mathbf{k}_{10} + \mathbf{k}_{1}^{2} \ \mathbf{k}_{3} \ \mathbf{k}_{4} \ \mathbf{k}_{6} \ \mathbf{k}_{9} \ \mathbf{k}_{10} - \mathbf{k}_{1}^{2} \ \mathbf{k}_{4} \ \mathbf{k}_{5} \ \mathbf{k}_{6} \ \mathbf{k}_{9} \ \mathbf{k}_{10} -
                              \mathbf{k}_{1}^{2} \, \mathbf{k}_{4} \, \mathbf{k}_{6}^{2} \, \mathbf{k}_{9} \, \mathbf{k}_{10} - \mathbf{k}_{1}^{2} \, \mathbf{k}_{4} \, \mathbf{k}_{5} \, \mathbf{k}_{6} \, \mathbf{k}_{10}^{2} - \mathbf{k}_{1}^{2} \, \mathbf{k}_{4} \, \mathbf{k}_{6}^{2} \, \mathbf{k}_{10}^{2} - \mathbf{k}_{1}^{2} \, \mathbf{k}_{4} \, \mathbf{k}_{5} \, \mathbf{k}_{7} \, \mathbf{k}_{10}^{2} - \mathbf{k}_{1}^{2} \, \mathbf{k}_{4} \, \mathbf{k}_{6} \, \mathbf{k}_{7} \, \mathbf{k}_{10}^{2} - \mathbf{k}_{1}^{2} \, \mathbf{k}_{4} \, \mathbf{k}_{5} \, \mathbf{k}_{7} \, \mathbf{k}_{10}^{2} - \mathbf{k}_{1}^{2} \, \mathbf{k}_{4} \, \mathbf{k}_{6} \, \mathbf{k}_{7} \, \mathbf{k}_{10}^{2} - \mathbf{k}_{1}^{2} \, \mathbf{k}_{4} \, \mathbf{k}_{5} \, \mathbf{k}_{7} \, \mathbf{k}_{10}^{2} - \mathbf{k}_{1}^{2} \, \mathbf{k}_{10}^{2} - \mathbf{k}_{1}^{2} \, \mathbf{k}_{10}^{2} + \mathbf{k}_{10}^{2} \, \mathbf{k}_{10}^{2} + \mathbf{k}_
                              k_1 k_2 k_3 k_4^2 k_8 k_{11} - k_1 k_3^2 k_4^2 k_8 k_{11} + k_1 k_2 k_4^2 k_6 k_8 k_{11} + k_1 k_3 k_4^2 k_6 k_8 k_{11} -
                              \mathbf{k}_{1}^{2} \; \mathbf{k}_{3} \; \mathbf{k}_{4} \; \mathbf{k}_{5} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1}^{2} \; \mathbf{k}_{3} \; \mathbf{k}_{4} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1} \; \mathbf{k}_{2} \; \mathbf{k}_{4}^{2} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1} \; \mathbf{k}_{3} \; \mathbf{k}_{4}^{2} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1} \; \mathbf{k}_{2} \; \mathbf{k}_{3}^{2} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1} \; \mathbf{k}_{2} \; \mathbf{k}_{3}^{2} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1} \; \mathbf{k}_{2} \; \mathbf{k}_{3}^{2} \; \mathbf{k}_{4} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1} \; \mathbf{k}_{2} \; \mathbf{k}_{3} \; \mathbf{k}_{4} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1} \; \mathbf{k}_{2} \; \mathbf{k}_{3} \; \mathbf{k}_{4} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1} \; \mathbf{k}_{2} \; \mathbf{k}_{3} \; \mathbf{k}_{4} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1} \; \mathbf{k}_{2} \; \mathbf{k}_{3} \; \mathbf{k}_{4} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1} \; \mathbf{k}_{2} \; \mathbf{k}_{3} \; \mathbf{k}_{4} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1} \; \mathbf{k}_{2} \; \mathbf{k}_{3} \; \mathbf{k}_{4} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}_{11} - \mathbf{k}_{1} \; \mathbf{k}_{2} \; \mathbf{k}_{3} \; \mathbf{k}_{4} \; \mathbf{k}_{6} \; \mathbf{k}_{10} \; \mathbf{k}
                              \mathbf{k}_{1} \ \mathbf{k}_{2} \ \mathbf{k}_{4}^{2} \ \mathbf{k}_{7} \ \mathbf{k}_{10} \ \mathbf{k}_{11} - \mathbf{k}_{1} \ \mathbf{k}_{3} \ \mathbf{k}_{4}^{2} \ \mathbf{k}_{7} \ \mathbf{k}_{10} \ \mathbf{k}_{11} - \mathbf{k}_{1}^{2} \ \mathbf{k}_{4} \ \mathbf{k}_{5} \ \mathbf{k}_{7} \ \mathbf{k}_{10} \ \mathbf{k}_{11} - \mathbf{k}_{1}^{2} \ \mathbf{k}_{4} \ \mathbf{k}_{6} \ \mathbf{k}_{7} \ \mathbf{k}_{10} \ \mathbf{k}_{11} - \mathbf{k}_{1}^{2} \ \mathbf{k}_{4} \ \mathbf{k}_{6} \ \mathbf{k}_{7} \ \mathbf{k}_{10} \ \mathbf{k}_{11} - \mathbf{k}_{1}^{2} \ \mathbf{k}_{4} \ \mathbf{k}_{6} \ \mathbf{k}_{7} \ \mathbf{k}_{10} \ \mathbf{k}_{11} - \mathbf{k}_{1}^{2} \ \mathbf{k}_{10} \ \mathbf{k}_{10} \ \mathbf{k}_{11} - \mathbf{k}_{1}^{2} \ \mathbf{k}_{10} 
                              k_1 k_2 k_3 k_4^2 k_{11}^2 - k_1 k_3^2 k_4^2 k_{11}^2 - k_1 k_2 k_4^2 k_7 k_{11}^2 - k_1 k_3 k_4^2 k_7 k_{11}^2;
Factor[factor]
 term = k_1 k_3 k_5 k_9 k_{10} + k_1 k_3 k_6 k_9 k_{10} - k_1 k_5 k_6 k_9 k_{10} - k_1 k_6^2 k_9 k_{10} -
                              k_1 k_5 k_6 k_{10}^2 - k_1 k_6^2 k_{10}^2 - k_1 k_5 k_7 k_{10}^2 - k_1 k_6 k_7 k_{10}^2 - k_2 k_3 k_4 k_8 k_{11} - k_3^2 k_4 k_8 k_{11} +
                              k_2 \; k_4 \; k_6 \; k_8 \; k_{11} \; + \; k_3 \; k_4 \; k_6 \; k_8 \; k_{11} \; - \; k_1 \; k_3 \; k_5 \; k_{10} \; k_{11} \; - \; k_1 \; k_3 \; k_6 \; k_{10} \; k_{11} \; - \; k_2 \; k_4 \; k_6 \; k_{10} \; k_{11} \; - \; k_1 \; k_3 \; k_6 \; k_{10} \; k_{11} \; - \; k_2 \; k_4 \; k_6 \; k_{10} \; k_{11} \; - \; k_1 \; k_3 \; k_6 \; k_{10} \; k_{11} \; - \; k_2 \; k_4 \; k_6 \; k_{10} \; k_{11} \; - \; k_1 \; k_3 \; k_6 \; k_{10} 
                              k_3 \ k_4 \ k_6 \ k_{10} \ k_{11} \ - \ k_2 \ k_4 \ k_7 \ k_{10} \ k_{11} \ - \ k_3 \ k_4 \ k_7 \ k_{10} \ k_{11} \ - \ k_1 \ k_5 \ k_7 \ k_{10} \ k_{11} \ -
                              k_1 k_6 k_7 k_{10} k_{11} - k_2 k_3 k_4 k_{11}^2 - k_3^2 k_4 k_{11}^2 - k_2 k_4 k_7 k_{11}^2 - k_3 k_4 k_7 k_{11}^2;
 simpTerm = FullSimplify[term]
 simplerTerm = Distribute \left[\text{simpTerm} / (k_1 * k_4)\right] / \cdot \left\{ (k_2 + k_3) / k_1 \rightarrow M_1, (k_5 + k_6) / k_4 \rightarrow M_2 \right\}
 This above term larger than 0 should be the necessary condition.
 condition = simplerTerm > 0
```

By mannual simplying the term, we can have:

$$\begin{split} & \text{simpleCond} = (k_3 - k_6) * (M_2 * k_9 * k_{10} - M_1 * k_8 * k_{11}) > \\ & (k_{11} * M_1 + k_{10} * M_2) * ((k_6 * k_{10} + k_3 * k_{11}) + k_7 * (k_{10} + k_{11})) \\ & \text{left} = (k_3 - k_6) * (M_2 * k_9 * k_{10} - M_1 * k_8 * k_{11}) / . \\ & \{M_1 \rightarrow (k_2 + k_3) / k_1, M_2 \rightarrow (k_5 + k_6) / k_4\} \\ & \text{right} = (k_{11} * M_1 + k_{10} * M_2) * ((k_6 * k_{10} + k_3 * k_{11}) + k_7 * (k_{10} + k_{11})) / . \\ & \{M_1 \rightarrow (k_2 + k_3) / k_1, M_2 \rightarrow (k_5 + k_6) / k_4\} \end{split}$$

To fullfile the assumption of thermodynamic conditions for the reversible reactions, we have the the constraint:

$$\frac{k_1 \, k_{10}}{k_2 \, k_{11}} = \frac{k_4 \, k_8}{k_5 \, k_9}$$

This will give us a even simple condition. Then we will example how will this condition result in the parameter space for multistationarity.

$$\begin{split} & \text{oriCond} = \text{simpleCond /. } \left\{ \text{M}_1 \rightarrow \ \left(\text{k}_2 + \text{k}_3 \right) \ / \ \text{k}_1 \ , \ \text{M}_2 \rightarrow \ \left(\text{k}_5 + \text{k}_6 \right) \ / \ \text{k}_4 \right\} \\ & (\text{k}_3 - \text{k}_6) \ \left(\frac{\left(\text{k}_5 + \text{k}_6 \right) \ \text{k}_9 \ \text{k}_{10}}{\text{k}_4} - \frac{\left(\text{k}_2 + \text{k}_3 \right) \ \text{k}_8 \ \text{k}_{11}}{\text{k}_1} \right) > \\ & \left(\frac{\left(\text{k}_5 + \text{k}_6 \right) \ \text{k}_{10}}{\text{k}_4} + \frac{\left(\text{k}_2 + \text{k}_3 \right) \ \text{k}_{11}}{\text{k}_1} \right) \left(\text{k}_6 \ \text{k}_{10} + \text{k}_3 \ \text{k}_{11} + \text{k}_7 \ \left(\text{k}_{10} + \text{k}_{11} \right) \right) \end{split}$$

$$\begin{split} & \textbf{Simplify} \Big[\textbf{oriCond, Assumptions} \rightarrow \frac{k_1}{k_2} \frac{k_{10}}{k_{11}} == \frac{k_4}{k_5} \frac{k_8}{k_9} \Big] \\ & \frac{(k_3 - k_6) \ (k_1}{k_6} \frac{k_6}{k_9} \frac{k_{10} - k_3}{k_1} \frac{k_4}{k_4} \\ & \left(\frac{(k_5 + k_6) \ k_{10}}{k_4} + \frac{(k_2 + k_3) \ k_{11}}{k_1} \right) \ ((k_6 + k_7) \ k_{10} + (k_3 + k_7) \ k_{11}) \end{split}$$

Better to do it manually, then we have the condition with thermodynamic constraint:

thermoCond =

$$\begin{array}{l} \textbf{(k_3-k_6)} \ \ \textbf{(k_6 k_2-k_3 k_5)} \ \ > \ \left(\frac{k_2}{k_9} \times \frac{k_5^2 + k_6}{k_5} + \frac{k_5}{k_8} \times \frac{k_2^2 + k_3}{k_2}\right) \ \textbf{((k_6+k_7)} \ k_{10} + \textbf{(k_3+k_7)} \ k_{11}\textbf{)} \\ \textbf{(k_3-k_6)} \ \ (-k_3 k_5 + k_2 k_6) \ \ > \ \left(\frac{\left(k_2^2 + k_3\right) k_5}{k_2 k_8} + \frac{k_2 \left(k_5^2 + k_6\right)}{k_5 k_9}\right) \ \textbf{((k_6+k_7)} \ k_{10} + \textbf{(k_3+k_7)} \ k_{11}\textbf{)} \\ \end{array}$$

Fromt the above condition, we can get some general idea that in order to satisfy the thermodynamic condition we should have:

Necessarily:

 $k_3 > k_6$ and $k_2 > k_5$

 $k_3 < k_6$ and $k_5 > k_2$

With additional:

 k_8 , $k_9 \gg k_{10}$, k_{11} and k_7 , k_{10} , $k_{11} \approx 0$

Sampling the parameters (without thermodynamic constraint)

Here we try to sampling the parameters by enforcing the thermodynamc constraint. The parameters are sampled in biologically meaningful ranges.

```
(NewKernel) In[546]:=
       ClearAll["Global`*"];
       A = Table[0, {11}, {6}];
```

```
A[[1]][[1]] = -1;
A[[1]][[3]] = -1;
A[[1]][[5]] = 1;
A[[2]] = -A[[1]];
A[[3]][[3]] = 1; A[[3]][[2]] = 1; A[[3]][[5]] = -1;
A[[4]][[1]] = -1;
A[[4]][[4]] = -1;
A[[4]][[6]] = 1;
A[[5]] = -A[[4]];
A[[6]][[4]] = 1;
A[[6]][[2]] = 1;
A[[6]][[6]] = -1;
A[[7]][[2]] = -1;
A[[7]][[1]] = 1;
A[[8]][[3]] = -1; A[[8]][[4]] = 1; A[[9]] = -A[[8]];
A[[10]][[5]] = -1; A[[10]][[6]] = 1; A[[11]] = -A[[10]];
stoiM = Transpose[A];
(* Now we construct the rate vector *)
ks = \{k_1 \times x_3 \times x_1, k_2 \times x_5, k_3 \times x_5, k_4 \times x_4 \times x_1, k_5 \times x_5, k_5 \times x_5 \times x_5, k_5 \times x_5 \times x_5, k_5 \times x_5 \times x_5
           k_5 \times x_6, k_6 \times x_6, k_7 \times x_2, k_8 \times x_3, k_9 \times x_4, k_{10} \times x_5, k_{11} \times x_6};
ssEqns = stoiM.ks;
mC = RowReduce[NullSpace[A]];
subsEqns = {ssEqns[[2]], ssEqns[[4]],
           ssEqns[[5]], ssEqns[[6]], x_1 + x_2 + x_5 + x_6 - T_1, x_3 + x_4 + x_5 + x_6 - T_2;
jacobian = D[subsEqns, \{\{x_1, x_2, x_3, x_4, x_5, x_6\}\}];
detJ = Collect[Distribute[Det[jacobian]], \{x_1, x_2, x_3, x_4, x_5, x_6\}];
solution =
       Solve[{subsEqns[[1]], subsEqns[[2]], subsEqns[[3]], subsEqns[[4]]} == 0},
            \{x_2, x_4, x_5, x_6\}];
detSubs = Replace[detJ, solution[[1]], {0, Infinity}];
 (* Equivilant to detSubs=detJ/.solution[[1]]; *)
polSubs = Numerator[Together[detSubs]];
finalSubs = Collect[Distribute[polSubs], x_, FactorTerms];
 (*The above code is the same as first section*)
bistableKs = {};
bistableParSets = {};
SeedRandom[];
Timing |
   Do [ {
              rands = Exp[RandomReal[{0, 1}, 11] * 2 * Log[1000] - Log[1000]];
              k1 = rands[[1]];
              k2 = rands[[2]];
              k3 = rands[[3]];
              k4 = rands[[4]];
              k5 = rands[[5]];
              k6 = rands[[6]];
              k7 = rands[[7]];
              k8 = rands[[8]];
              k9 = rands[[9]];
              k10 = rands[[10]];
              k11 = rands[[11]];
             left = (k3 - k6) \left( \frac{(k5 + k6) k9 k10}{k4} - \frac{(k2 + k3) k8 k11}{k1} \right);

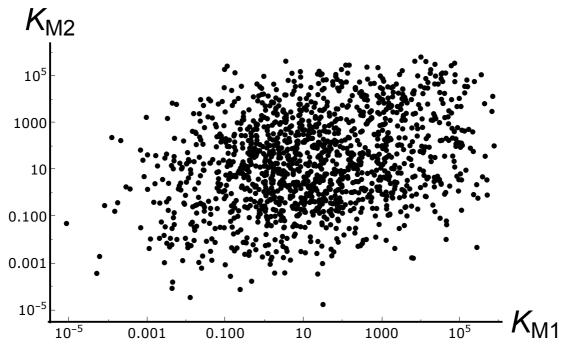
right = \left( \frac{(k5 + k6) k10}{k4} + \frac{(k2 + k3) k11}{k1} \right) (k6 k10 + k3 k11 + k7 (k10 + k11));
              If[left > right, {
                     AppendTo[bistableKs, {k1, k2, k3, k4, k5, k6, k7, k8, k9, k10, k11}];
```

```
(*counter=1;hitQ=0;
                                                                                            While[hitQ=0&&counter≤1000,{
                                                                                                             x1=RandomReal[{0,1000}];
                                                                                                             \texttt{finalSol=NSolve[finalSubs=0/.}\{k_1\rightarrow k1,k_2\rightarrow k2,k_3\rightarrow k3,k_4\rightarrow k4,k_5\rightarrow k5,k_5\rightarrow k5,k_5
                                                                                                                                            k_6{\to}k6 , k_7{\to}k7 , k_8{\to}k8 , k_9{\to}k9 , k_{10}{\to}k10 , k_{11}{\to}k11 , x_1{\to}x1\} , { x_3 } ] ;
                                                                                                           x3=x_3/.finalSol[[1]];
                                                                                                            realSol=solution/. \{k_1\rightarrow k1, k_2\rightarrow k2, k_3\rightarrow k3, k_4\rightarrow k4, k_5\rightarrow k5,
                                                                                                                                    k_6 \rightarrow k6, k_7 \rightarrow k7, k_8 \rightarrow k8, k_9 \rightarrow k9, k_{10} \rightarrow k10, k_{11} \rightarrow k11, x_1 \rightarrow x1, x_3 \rightarrow x3};
                                                                                                           T1=(x_1+x_2+x_5+x_6) /. Flatten [Append[\{x_1\rightarrow x1, x_3\rightarrow x3\}, realSol[[1]]]];
                                                                                                           \texttt{T2} = (x_3 + x_4 + x_5 + x_6) / .\texttt{Flatten} [\texttt{Append}[\{x_1 \rightarrow x1, x_3 \rightarrow x3\}, \texttt{realSol}[[1]]]];
                                                                                                            If [T1≤1000&&T2≤1000, {
                                                                                                                            AppendTo[bistableParSets,
                                                                                                                                     {k1,k2,k3,k4,k5,k6,k7,k8,k9,k10,k11,T1,T2,left,right}];
                                                                                                                          hitQ=1;
                                                                                                                  }];
                                                                                                           counter++;
                                                                                                    }];*)
                                                                                    }];
                                                                     }, {i, 10000}];
(NewKernel) Out[568]=
                                          {0.336731, Null}
(NewKernel) In[545]:=
                                          Length[bistableKs]
(NewKernel) Out[545]=
                                          14 325
(NewKernel) In[490]:=
                                           tKs = Transpose[bistableKs];
                                                                                   tKs[[2]] + tKs[[3]];
                                                                                                                      tKs[[1]]
                                                                                  <u>tKs[[5]] + tKs[[6]]</u>
                                            km2 =
                                                                                                                      tKs[[4]]
                                          kd1 = \frac{tKs[[8]]}{}
                                                                                  tKs[[9]]
                                           kd2 = \frac{tKs[[10]]}{};
```

(NewKernel) In[425]:=

kmPlot = ListLogLogPlot[Transpose[{km1, km2}], ImageSize → Large, PlotRange → Full, $PlotLabel \rightarrow None, LabelStyle \rightarrow \{32, GrayLevel[0]\}, AxesLabel \rightarrow \{"K_{M1}", "K_{M2}"\},$ Ticks → Automatic, TicksStyle → Directive["Label", 14], AxesStyle → Thick, PlotTheme → "Monochrome"]

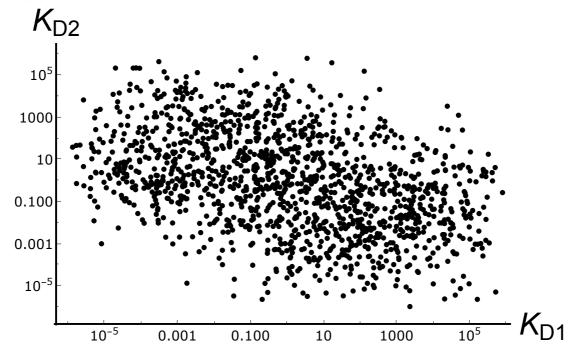
(NewKernel) Out[425]=



(NewKernel) In[426]:=

 $kdPlot = ListLogLogPlot[Transpose[\{kd1,\ kd2\}]\,,\ ImageSize \rightarrow Large,\ PlotRange \rightarrow Full,$ $PlotLabel \rightarrow None, LabelStyle \rightarrow \{32, GrayLevel[0]\}, AxesLabel \rightarrow \{"K_{D1}", "K_{D2}"\}, AxesLabel \rightarrow \{"K_{D1}", "K_{D2}"\}, AxesLabel \rightarrow \{"K_{D1}", "K_{D2}"\}, AxesLabel \rightarrow \{"K_{D1}", "K_{D2}"\}, AxesLabel \rightarrow \{"K_{D1}", "K_{D2}", "K_$ Ticks → Automatic, TicksStyle → Directive["Label", 14], AxesStyle → Thick, PlotTheme → "Monochrome"]

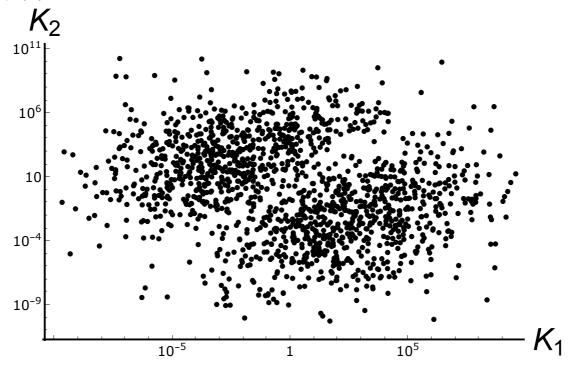
(NewKernel) Out[426]=



```
(NewKernel) In[497]:=
```

```
kdPlot = ListLogLogPlot[Transpose[{tKs[[1]] * tKs[[10]] * tKs[[5]] * tKs[[9]],
       tKs[[2]] * tKs[[11]] * tKs[[4]] * tKs[[8]], ImageSize \rightarrow Large,
   {\tt PlotRange} \rightarrow {\tt Full, PlotLabel} \rightarrow {\tt None, LabelStyle} \rightarrow \{\tt 32, GrayLevel[0]\},\\
    \texttt{AxesLabel} \rightarrow \{\texttt{"K}_1\texttt{", "K}_2\texttt{"}\} \texttt{, Ticks} \rightarrow \texttt{Automatic, TicksStyle} \rightarrow \texttt{Directive}[\texttt{"Label", 14}] \texttt{,} 
   AxesStyle → Thick, PlotTheme → "Monochrome"]
```

(NewKernel) Out[497]=



(NewKernel) In[427]:=

model = LinearModelFit[Transpose[{Log10[kd1], Log10[kd2]}], x, x]

(NewKernel) Out[427]=

FittedModel -0.056131-0.346952

(NewKernel) In[428]:=

InputForm[model["BestFit"]]

(NewKernel) Out[428]//InputForm=

-0.0561309658626419 - 0.34695151867837787 *x

(NewKernel) In[429]:=

model["ParameterTable"]

	Estimate	StandardError	t-Statistic	P- value
1	-0.056131	0.05661	-0.991538	0.321594
Х	-0.346952	0.0208559	-16.6356	7.66607×10 ⁻⁵⁷

```
(NewKernel) In[430]:=
        Show[ListPlot[Transpose[{Log10[kd1], Log10[kd2]}]],
         Plot[model["BestFit"], {x, -6, 6}]]
(NewKernel) Out[430]=
(NewKernel) In[301]:=
       pc = PrincipalComponents[Log10[bistableKs]];
(NewKernel) In[300]:=
       pc[[Range[1, 10]]];
```

Sampling the parameters (with thermodynamic constraint)

Here we try to sampling the parameters by enforcing the thermodynamc constraint. The parameters are sampled in biologically meaningful ranges.

Sampling the parameters related to thermodynamic constraint k1, k2, k4, k5, k8, k9, k10, k11. Using Gamma distribution with $\alpha = 7$, $\beta = 2$, and then uniformly sample 4 random numbers that sum to 1, these are for k1, k5, k9, k10. Sample anther four uniform random number for k2, k4, k8, k11.

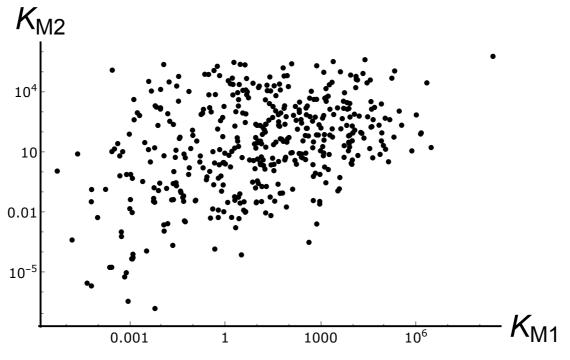
For other parameters:

```
(NewKernel) In[593]:=
                                              ClearAll["Global *"];
                                               A = Table[0, \{11\}, \{6\}];
                                              A[[1]][[1]] = -1;
                                              A[[1]][[3]] = -1;
                                              A[[1]][[5]] = 1;
                                              A[[2]] = -A[[1]];
                                              A[[3]][[3]] = 1; A[[3]][[2]] = 1; A[[3]][[5]] = -1;
                                              A[[4]][[1]] = -1;
                                              A[[4]][[4]] = -1;
                                              A[[4]][[6]] = 1;
                                               A[[5]] = -A[[4]];
                                               A[[6]][[4]] = 1;
                                               A[[6]][[2]] = 1;
                                               A[[6]][[6]] = -1;
                                              A[[7]][[2]] = -1;
                                               A[[7]][[1]] = 1;
                                               A[[8]][[3]] = -1; A[[8]][[4]] = 1; A[[9]] = -A[[8]];
                                               A[[10]][[5]] = -1; A[[10]][[6]] = 1; A[[11]] = -A[[10]];
                                               stoiM = Transpose[A];
                                                 (* Now we construct the rate vector *)
                                               ks = \{k_1 \times x_3 \times x_1, k_2 \times x_5, k_3 \times x_5, k_4 \times x_4 \times x_1, k_5 \times x_5, k_6 \times x_6 \times x_6 \times x_1, k_7 \times x_7 
                                                                         k_5 \times x_6, k_6 \times x_6, k_7 \times x_2, k_8 \times x_3, k_9 \times x_4, k_{10} \times x_5, k_{11} \times x_6};
```

```
ssEqns = stoiM.ks;
mC = RowReduce[NullSpace[A]];
subsEqns = {ssEqns[[2]], ssEqns[[4]],
           ssEqns[[5]], ssEqns[[6]], x_1 + x_2 + x_5 + x_6 - T_1, x_3 + x_4 + x_5 + x_6 - T_2;
jacobian = D[subsEqns, \{\{x_1, x_2, x_3, x_4, x_5, x_6\}\}];
detJ = Collect[Distribute[Det[jacobian]], {x1, x2, x3, x4, x5, x6}];
       Solve[{subsEqns[[1]], subsEqns[[2]], subsEqns[[3]], subsEqns[[4]]} = 0,
            \{x_2, x_4, x_5, x_6\}];
detSubs = Replace[detJ, solution[[1]], {0, Infinity}];
 (* Equivilant to detSubs=detJ/.solution[[1]]; *)
polSubs = Numerator[Together[detSubs]];
finalSubs = Collect[Distribute[polSubs], x , FactorTerms];
(*The above code is the same as first section*)
bistableKs = {};
bistableParSets = {};
SeedRandom[];
Timing |
   Do | {
              others = Exp[RandomReal[{0, 1}, 3] * 2 * Log[1000] - Log[1000]];
              While | (rand1s = RandomReal[{0, 1}, 4];
                      sum = Total@rand1s;
                     psum = Switch[True, 0 \le # \le 1, 1. / 4 * sum^3, 1 < # \le 2, 1 / 4 * (-3 * sum^3 + 12 * sum^5]
                                                   sum^2 - 12 * sum + 4, 2 < \# \le 3, 1 / 4 * (3 * sum^3 - 24 * sum^2 + 60 * sum - 3)
                                               44), 3 < \# \le 4, 1 / 4 * (-sum^3 + 12 * sum^2 - 48 * sum + 64) ] & [sum];
                     RandomReal ≤ psum);
              rand23 = RandomVariate[DirichletDistribution[{1, 1, 1, 1}]];
              rand21 = 1 - Total@rand23;
              k1 = Exp[rand1s[[1]] * 2 * Log[1000] - Log[1000]];
              k2 = Exp[sum * rand23[[1]] * 2 * Log[1000] - Log[1000]];
              k3 = others[[1]];
              k4 = Exp[sum * rand23[[2]] * 2 * Log[1000] - Log[1000]];
              k5 = Exp[rand1s[[2]] * 2 * Log[1000] - Log[1000]];
              k6 = others[[2]];
              k7 = others[[3]];
              k8 = Exp[sum * rand23[[3]] * 2 * Log[1000] - Log[1000]];
              k9 = Exp[rand1s[[3]] * 2 * Log[1000] - Log[1000]];
              k10 = Exp[rand1s[[4]] * 2 * Log[1000] - Log[1000]];
              k11 = Exp[sum * rand21 * 2 * Log[1000] - Log[1000]];
             left = (k3 - k6) \left(\frac{(k5 + k6) k9 k10}{k4} - \frac{(k2 + k3) k8 k11}{k1}\right);

right = \left(\frac{(k5 + k6) k10}{k4} + \frac{(k2 + k3) k11}{k1}\right) (k6 k10 + k3 k11 + k7 (k10 + k11));
              If[left > right, {
                     AppendTo[bistableKs, {k1, k2, k3, k4, k5, k6, k7, k8, k9, k10, k11}];
                      (*counter=1;hitQ=0;
                     While[hitQ==0&&counter≤1000,{
                             x1=Exp[-RandomVariate[
                                               ExponentialDistribution[Log[2]/(-Log[0.0001])]]]*1000;
                             finalSol=NSolve[finalSubs=0/.\{k_1\rightarrow k1, k_2\rightarrow k2, k_3\rightarrow k3, k_4\rightarrow k4, k_5\rightarrow k5, k_1\rightarrow k2, k_2\rightarrow k3, k_3\rightarrow k3, k_4\rightarrow k4, k_5\rightarrow k5, k_1\rightarrow k2, k_1\rightarrow k2, k_2\rightarrow k2, k_3\rightarrow k3, k_4\rightarrow k4, k_5\rightarrow k5, k_1\rightarrow k2, k_1\rightarrow k2, k_2\rightarrow k2, k_3\rightarrow k3, k_4\rightarrow k4, k_5\rightarrow k5, k_1\rightarrow k2, k_1\rightarrow k2, k_1\rightarrow k2, k_1\rightarrow k2, k_1\rightarrow k3, k_1\rightarrow k4, k_1\rightarrow k4
                                           k_6 \rightarrow k6, k_7 \rightarrow k7, k_8 \rightarrow k8, k_9 \rightarrow k9, k_{10} \rightarrow k10, k_{11} \rightarrow k11, x_1 \rightarrow x1}, \{x_3\}];
                             x3=x3/.finalSol[[1]];
                             realSol=solution/.\{k_1\rightarrow k1, k_2\rightarrow k2, k_3\rightarrow k3, k_4\rightarrow k4, k_5\rightarrow k5,
                                        k_6 \rightarrow k6, k_7 \rightarrow k7, k_8 \rightarrow k8, k_9 \rightarrow k9, k_{10} \rightarrow k10, k_{11} \rightarrow k11, x_1 \rightarrow x1, x_3 \rightarrow x3;
                             T1=(x_1+x_2+x_5+x_6) /.Flatten[Append[\{x_1\rightarrow x_1,x_3\rightarrow x_3\}, realSol[[1]]]];
                             T2 = (x_3 + x_4 + x_5 + x_6) / .Flatten[Append[{x_1 \rightarrow x1, x_3 \rightarrow x3}, realSol[[1]]]];
```

```
If [0.0001 \le T1 \le 1000 \& 0.0001 \le T2 \le 1000, {
                                                                                            AppendTo[bistableParSets,
                                                                                                   \{k1, k2, k3, k4, k5, k6, k7, k8, k9, k10, k11, T1, T2, left, right\}];
                                                                                           hitQ=1;
                                                                                      }];
                                                                                counter++;
                                                                          }];*)
                                                              }];
                                                   }, {i, 100 000}];
(NewKernel) Out[615]=
                                 {23.683, Null}
(NewKernel) In[616]:=
                                 Length[bistableKs]
(NewKernel) Out[616]=
                                 4378
(NewKernel) In[455]:=
                                 tKs = Transpose[bistableKs];
                                                              tKs[[2]] + tKs[[3]]
                                 km1 =
                                                                                        tKs[[1]]
                                                              tKs[[5]] + tKs[[6]]
                                 km2 =
                                                                                        tKs[[4]]
                                                              tKs[[8]]
                                 kd1 =
                                 kd2 =
(NewKernel) In[460]:=
                                 kmPlot = ListLogLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogPlot[Transpose[\{km1, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogPlot[Transpose[\{km2, km2\}], \ ImageSize \rightarrow Large, \ PlotRange \rightarrow Full, \\ listLogPlot[Transpose[\{km2, km2\}], \ PlotRange \rightarrow Full, \\ listLogPlot[Transpose[\{km2, 
                                             \label{eq:plotLabel} \texttt{PlotLabel} \rightarrow \texttt{None, LabelStyle} \rightarrow \texttt{\{32, GrayLevel[0]\}, AxesLabel} \rightarrow \texttt{\{"K_{M1}", "K_{M2}"\},}
                                            Ticks → Automatic, TicksStyle → Directive["Label", 14],
                                            AxesStyle → Thick, PlotTheme → "Monochrome"]
(NewKernel) Out[460]=
```



```
(NewKernel) In[461]:=
       kdPlot = ListLogLogPlot[Transpose[{kd1, kd2}], ImageSize → Large, PlotRange → Full,
          PlotLabel \rightarrow None, LabelStyle \rightarrow \{32, GrayLevel[0]\}, AxesLabel \rightarrow \{"K_{D1}", "K_{D2}"\},
          Ticks → Automatic, TicksStyle → Directive["Label", 14],
          AxesStyle → Thick, PlotTheme → "Monochrome"]
(NewKernel) Out[461]=
          K_{D2}
         1000
        0.001
                                                                                10^{\overline{10}}
                                                                10^{6}
                              0.01
                                             100.00
(NewKernel) In[462]:=
       model = LinearModelFit[Transpose[{Log10[kd1], Log10[kd2]}], x, x]
(NewKernel) Out[462]=
       FittedModel 0.372627+0.035499&
(NewKernel) In[463]:=
       InputForm[model["BestFit"]]
(NewKernel) Out[463]//InputForm=
        0.37262682052688595 + 0.035499771883158025*x
(NewKernel) In[464]:=
       model["ParameterTable"]
(NewKernel) Out[464]=
          Estimate StandardError t-Statistic P-Value
          0.372627 0.0877545
                               4.24624 0.0000266342
       x 0.0354998 0.0274304 1.29417 0.196297
(NewKernel) In[465]:=
       Show[ListPlot[Transpose[{Log10[kd1], Log10[kd2]}]],
         Plot[model["BestFit"], {x, -6, 6}]]
```

Conclusion:

These above results show that the parameter set within biological meaningful ranges can be reached by increasing the sampling size even when enforcing the thermodynamic constraint. Comparing to results from the other document (without enforcing thermodynamic constraint), the paramter space is largely reduced.

Conditions	with thermo	with thermo	without thermo	without thermo
Sampling size	only check	bistability &	only check	bistability &
	bistability	concentrations	bistability	concentrations
10 ⁴	396	N / A	1448	N / A
10 ⁵	4378	N / A	14 325	N / A

From the sampling results, thermodynamic constraint indeed shrinks the parameter space for bistability in the motif. Although, the concentration is probably not very well sampled, the concentration is trivial for its purpose here.

Test