

2015/10/21 計算生命科学の基礎Ⅱ

「生物システムの設計：システム生物学から合成生物学へ」

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Organization of Advanced Science and Technology
Kobe University

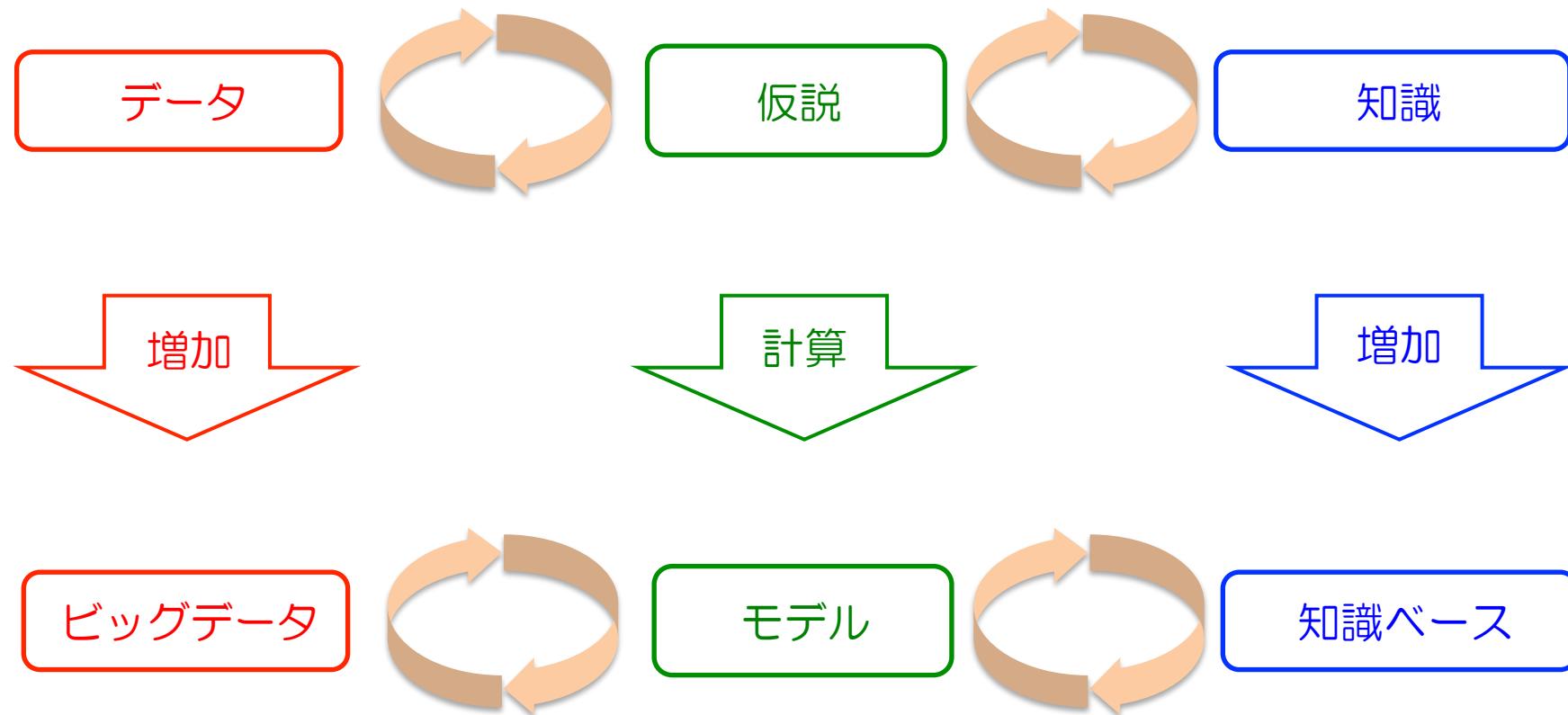
内容

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- はじめに
- 遺伝子回路設計
- 代謝経路設計

はじめに

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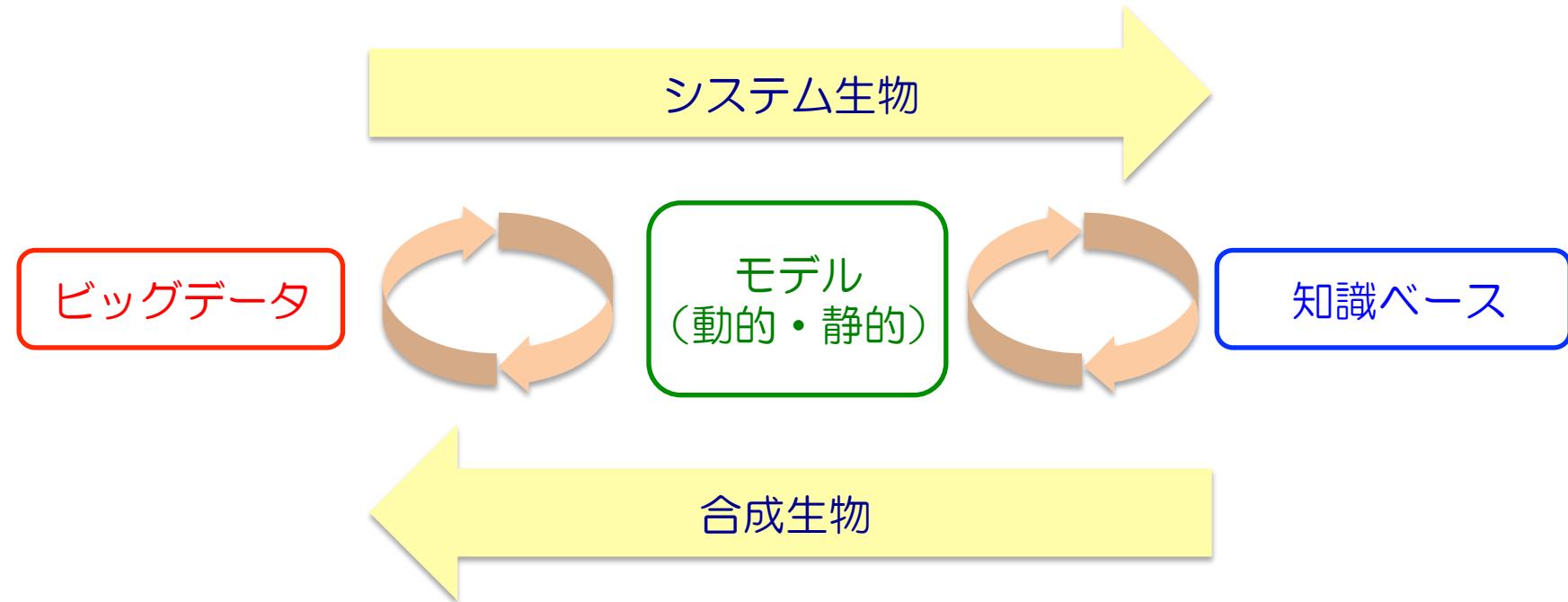
計算・情報科学の必要性

はじめに

4

キーワード)

要素同定、アノテーション、データベース、ネットワーク解析、システム
解析、パラメータ同定、シミュレーション、階層性、モチーフなど



キーワード)

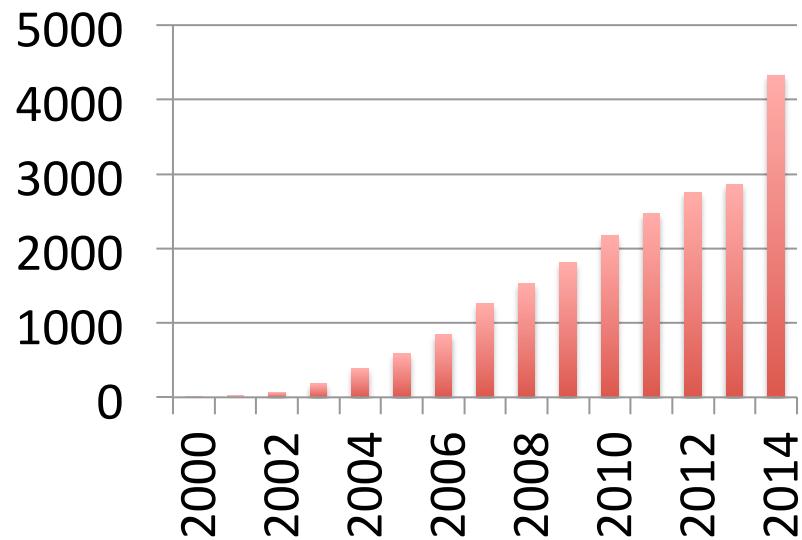
ゲノム細胞工学（ミニマムゲノム、ゲノム合成）、非天然塩基・アミノ酸、
ゲノム編集、BioBrick、人工細胞、遺伝子回路設計、代謝経路設計など

はじめに

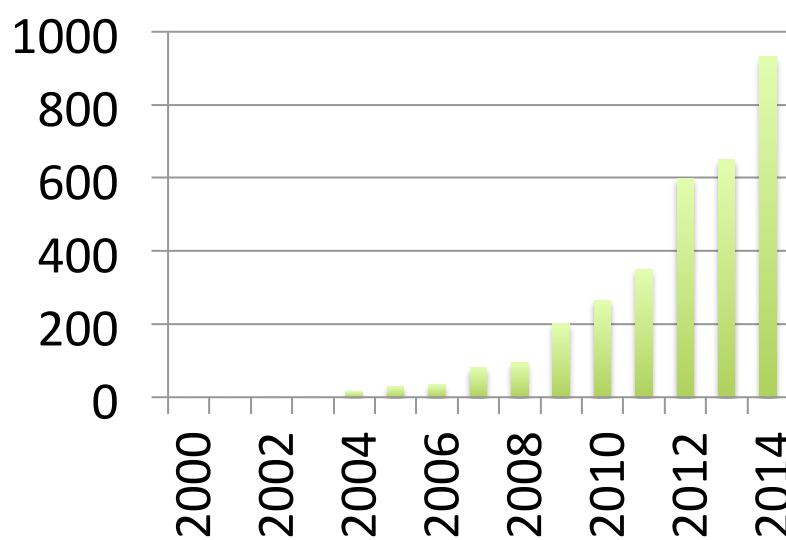
5

PubMed検索の結果

システム生物学
Systems Biology



合成生物学
Synthetic Biology

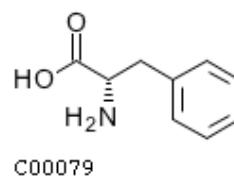
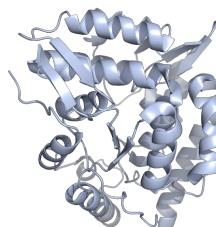


分子情報

- 塩基配列
 - DNA、RNA
- アミノ酸配列
 - タンパク質
- 立体構造
 - タンパク質
- 化学構造
 - 化合物

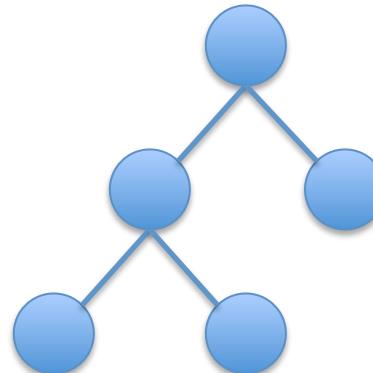
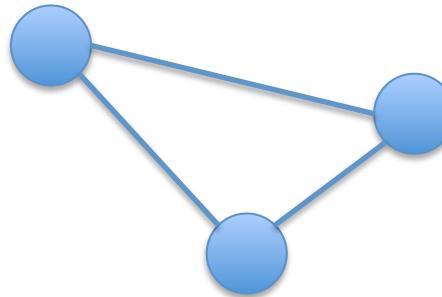
atgtccactgcggcctggaaaaccaggctggc
aggaaactctctgactttggacag

MSTAVLENPGLGRKLSDFGQETSYIED
NCNQNGAISLIFSLKEEVGALAKVLRLF



ネットワーク情報

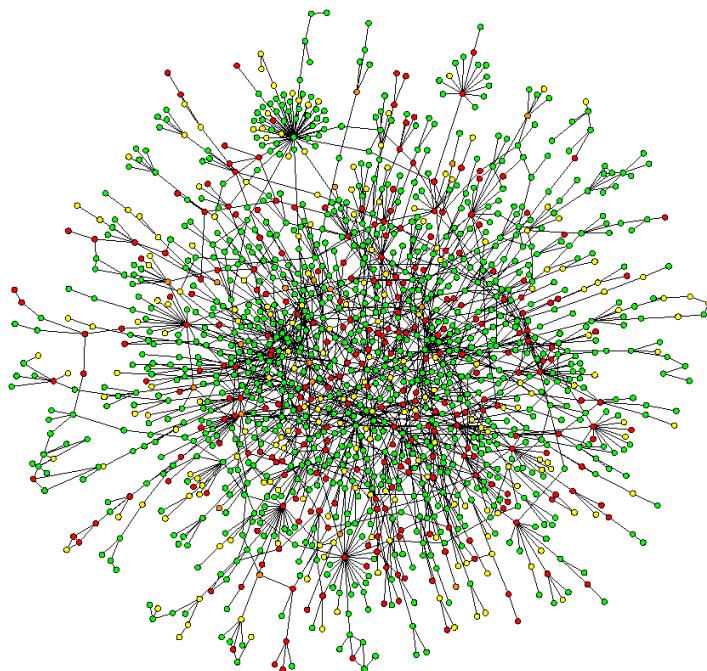
- グラフ
 - ペア情報
 - パスウェイ
- ツリー
 - 分類情報
 - オントロジー



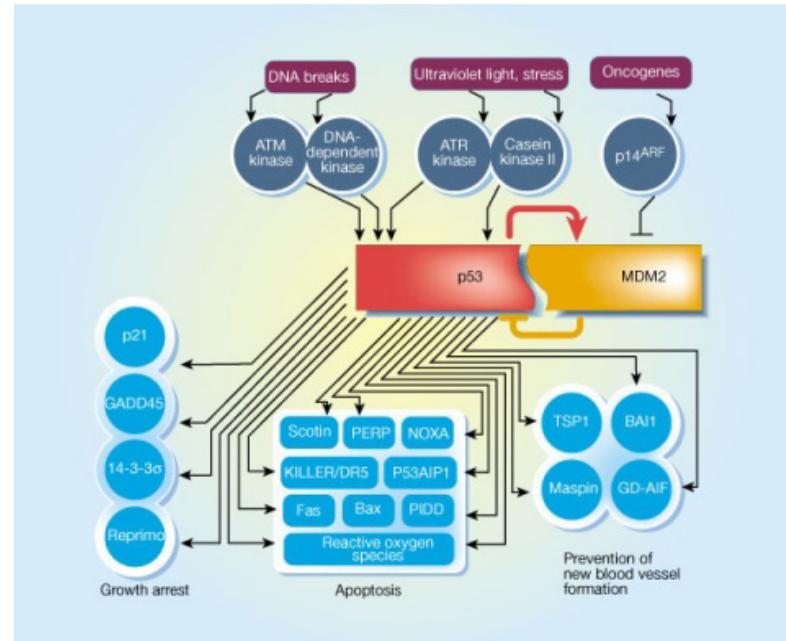
表現方法：データベース

- 要素
 - 遺伝子、タンパク質、化合物
- ペア
 - 相互作用、制御関係、反応
- グラフ
 - パスウェイ
- 階層リスト
 - オントロジー

遺伝子回路



Barabasi A-L *et al.*

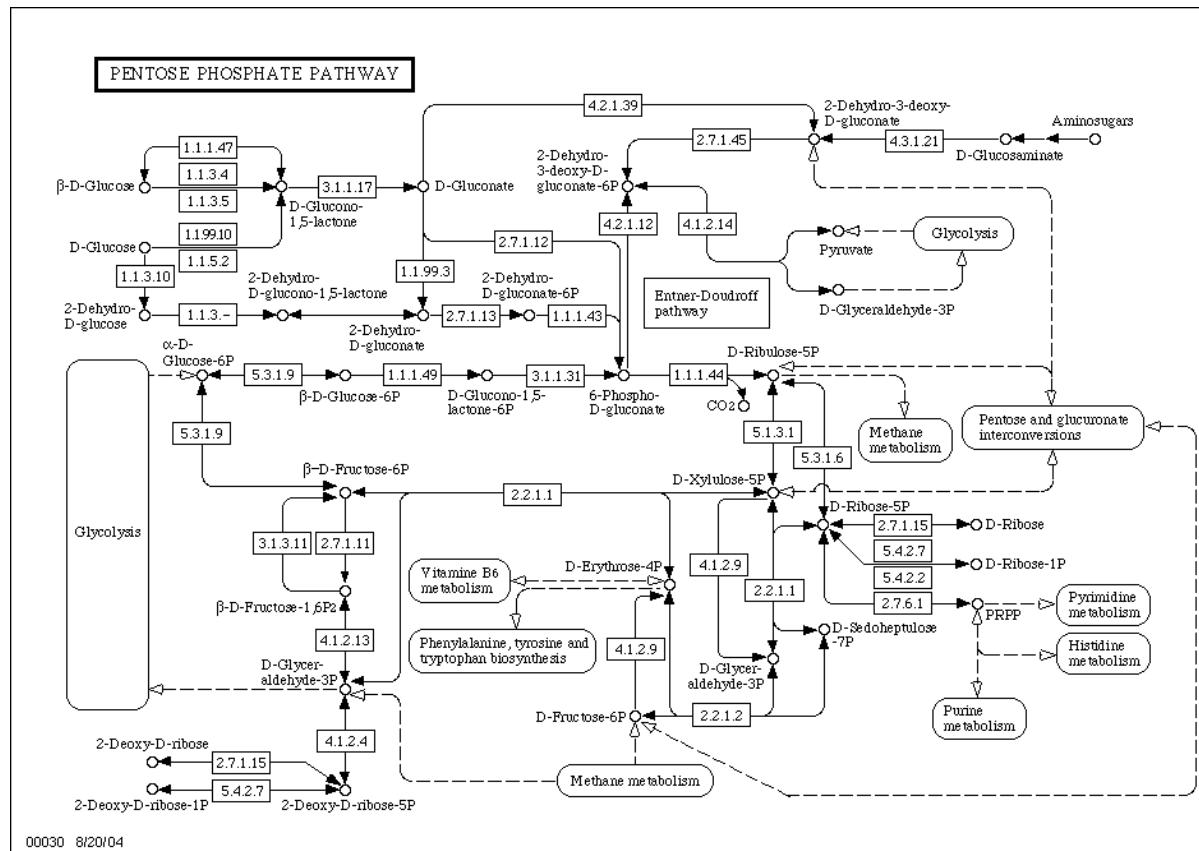


Vogelstein B *et al.*

ランダムな進化 → 一般的な法則・モデル? → 遺伝子回路設計?

代謝経路

KEGG PATHWAY



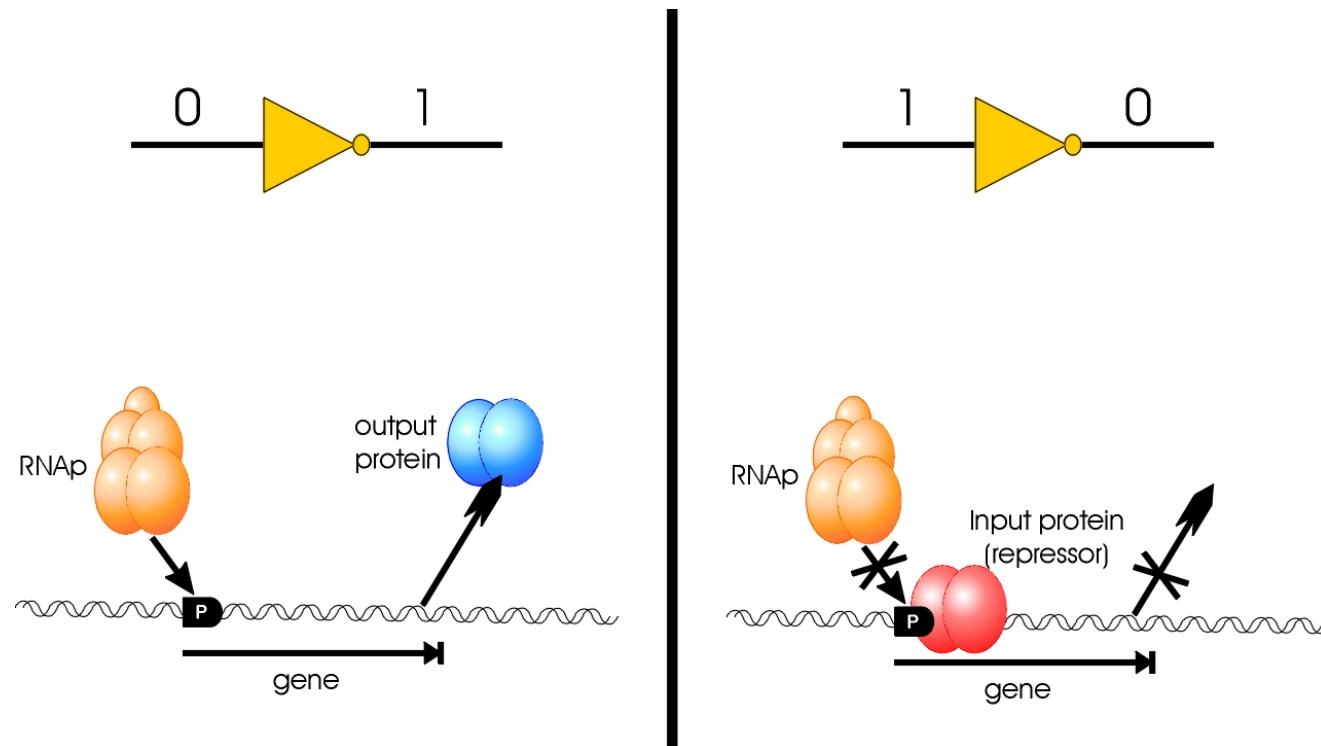
代謝経路制御・拡張 → 一般的な解析モデル? → 代謝経路設計?

- はじめに
- 遺伝子回路設計
- 代謝経路設計

遺伝子回路：転写制御

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例) リプレッサー



転写制御モデル

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- 入力関数：転写因子の効果の強さ

$$Y \text{ の產生速度} = f(X^*)$$

- アクチベーターのヒル関数

$$f(X^*) = \frac{\beta X^{*n}}{K^n + X^{*n}}$$

$$f(X^*) = \beta \theta(X^* > K)$$

- リプレッサーのヒル関数

$$f(X^*) = \frac{\beta}{1 + (\frac{X^*}{K})^n}$$

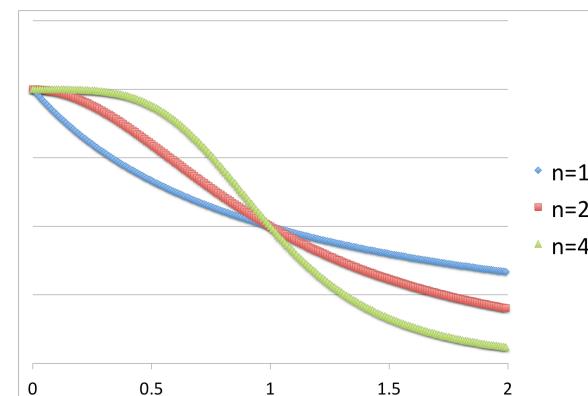
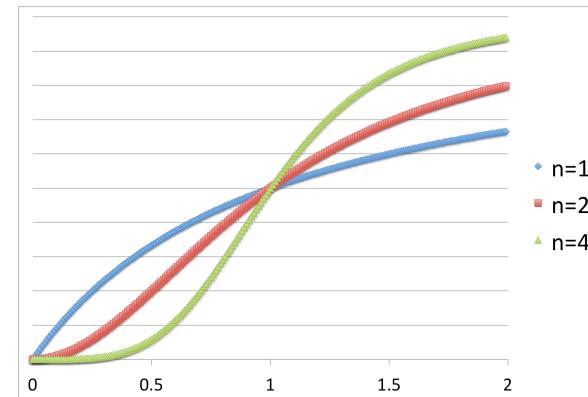
$$f(X^*) = \beta \theta(X^* < K)$$

β : 最大発現レベル

K : 活性化係数

n : ヒル係数

Θ : ステップ関数

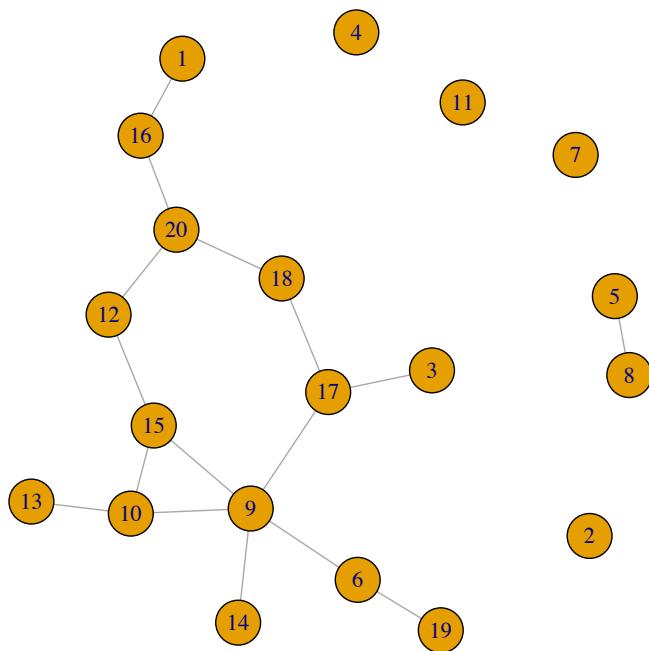


X*/K

ネットワーク

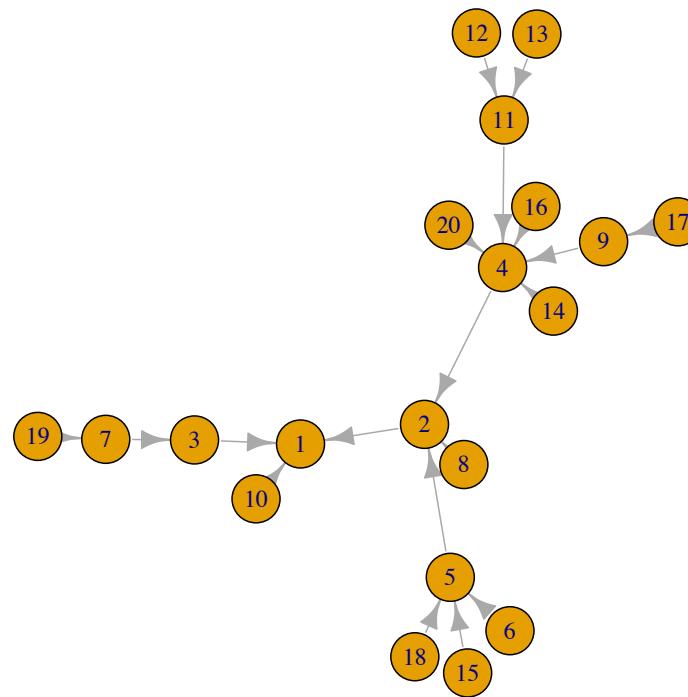
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ランダムネットワーク



$G(n,p)$ or $G(n,m)$ graph:
n個のvertices
任意の2vertices間にedgeがある確率p
任意の2vertices間にm個のedgeがある

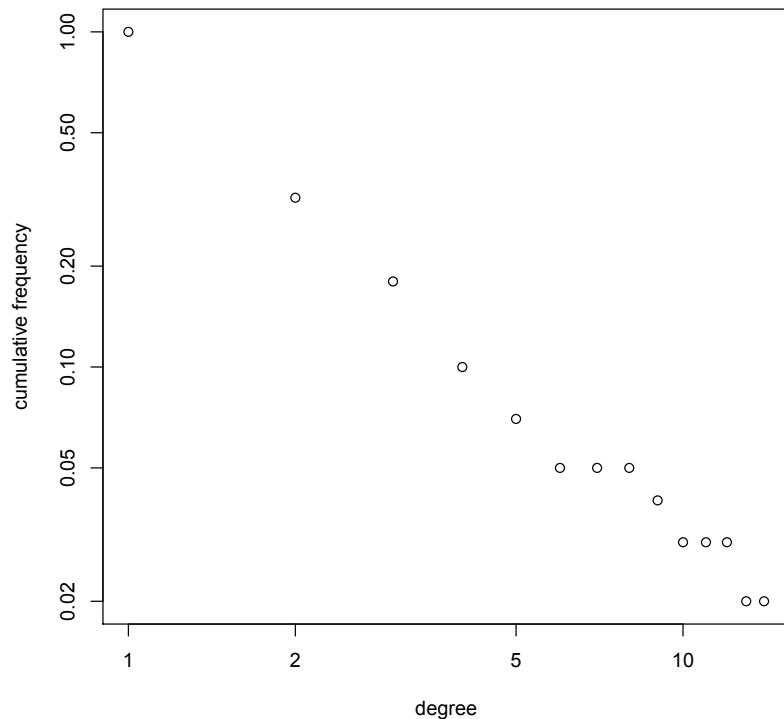
実際のネットワーク



一つのvertexからスタートしてvertexを追加
vertexが選ばれる確率：
 $P[i] \sim k[i]^{\alpha} + a$

スケールフリー性

- エッジの数をノード毎に数えてプロット



例)

WWW
Social network
Biological network

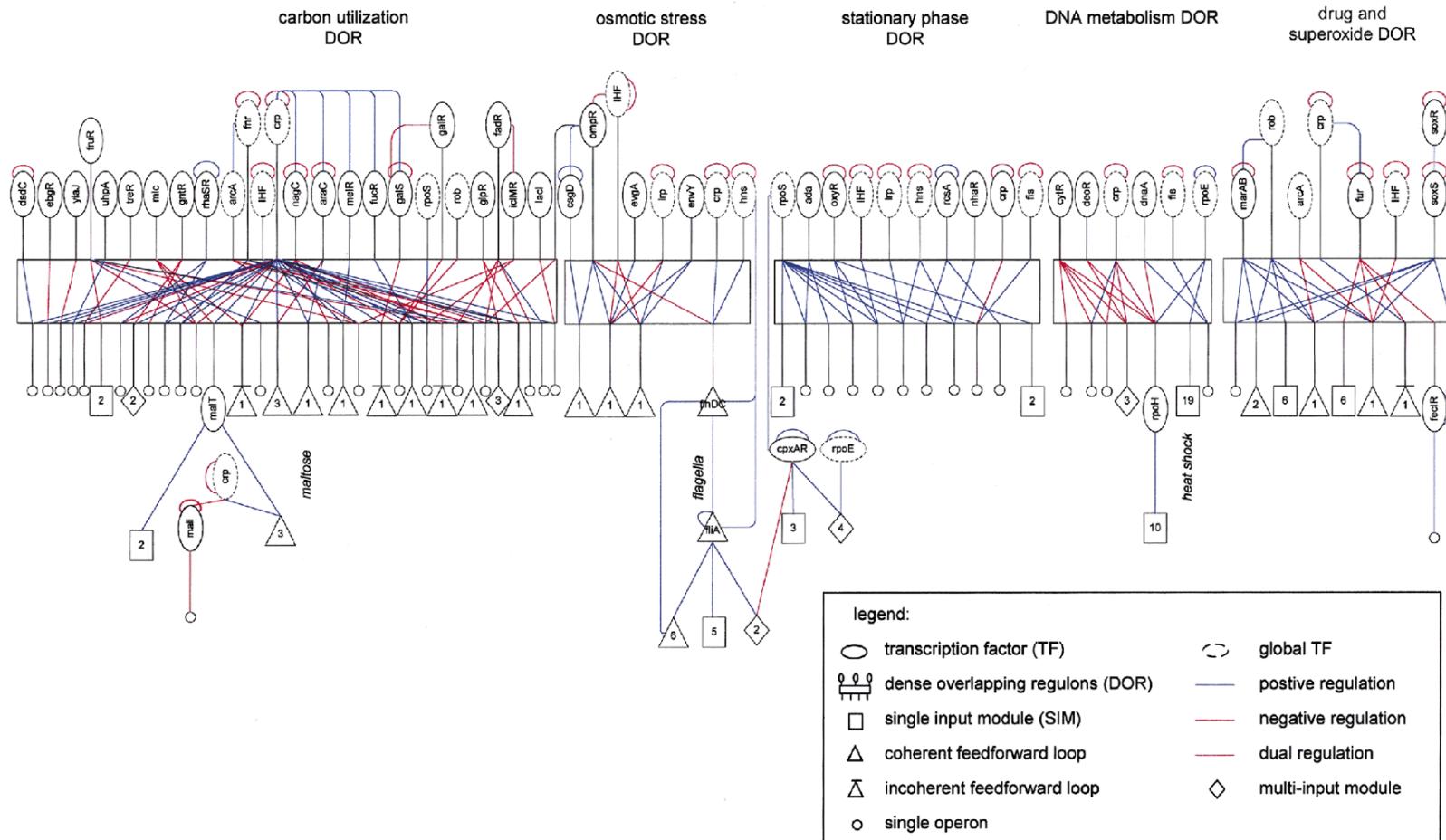
特徴)

Modular structure
ハブの存在
短い経路
冗長性

転写制御ネットワーク

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例) 大腸菌 : Regulon DB

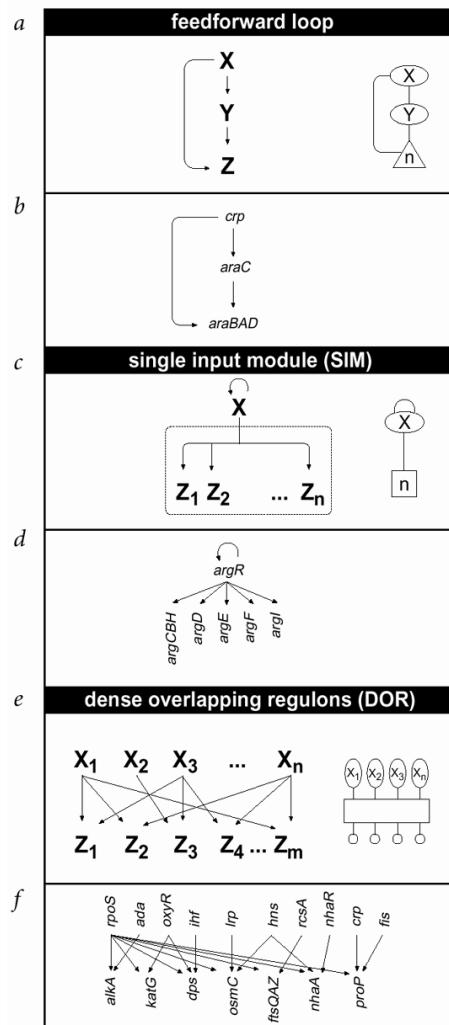


Shen-Orr et al. Nat Genet 31, 64-68 (2002)

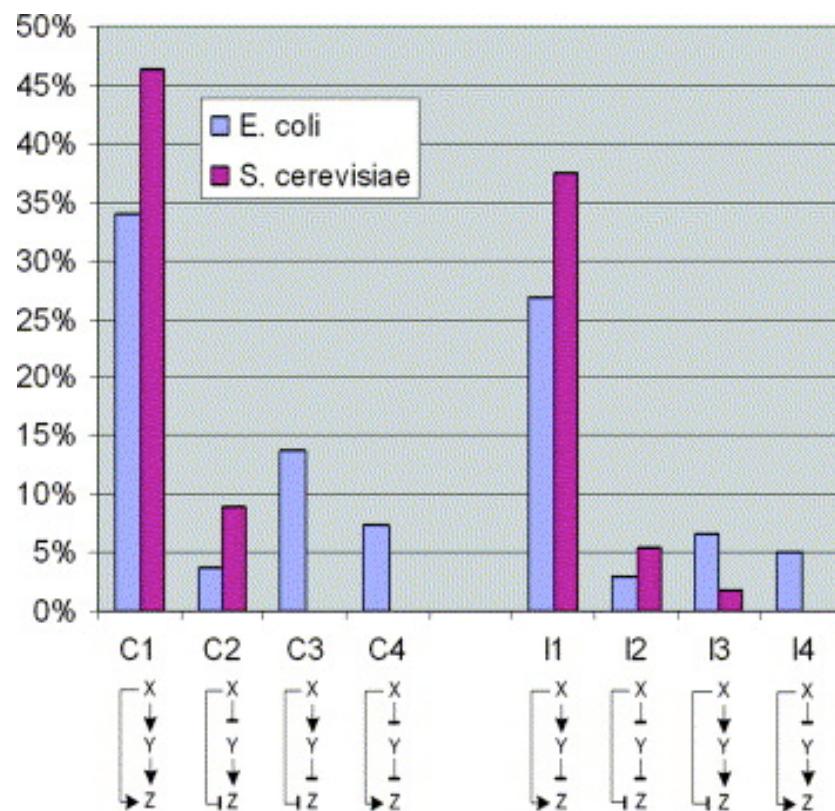
ネットワークモチーフ

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モチーフ



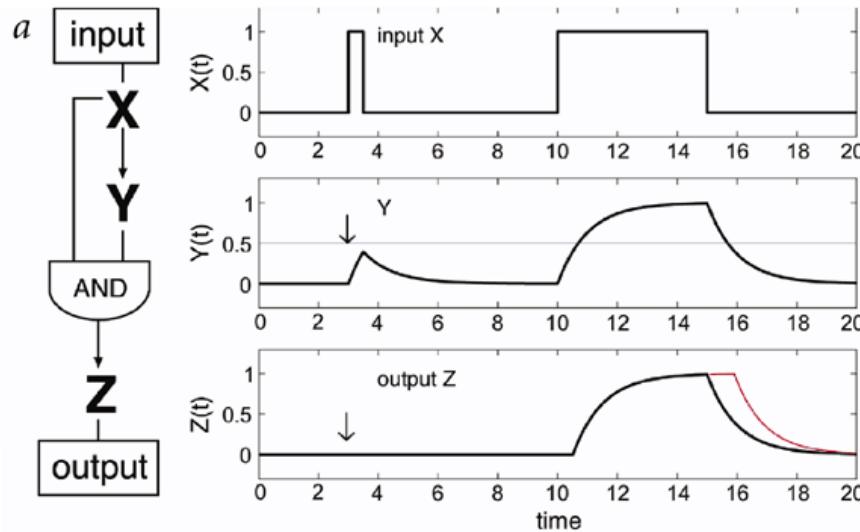
フィードフォワード



Shen-Orr et al. Nat Genet 31, 64-68 (2002)
Mangan and Alon JMB 356, 1073-1081 (2006)

ネットワークモチーフ

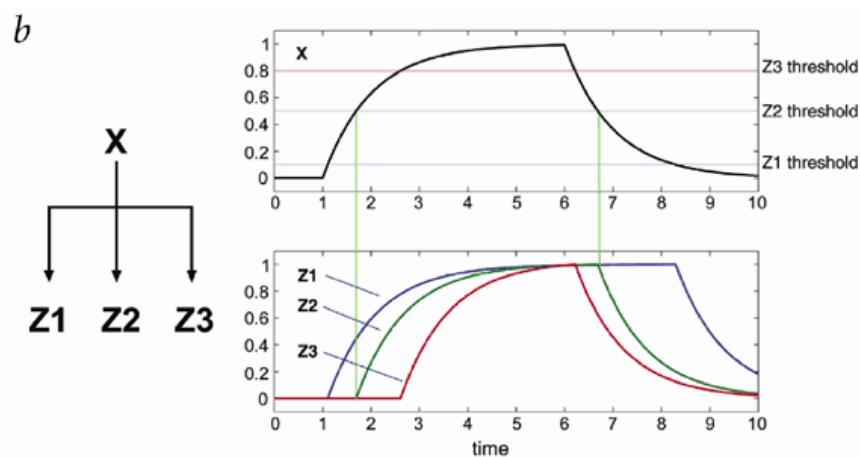
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フィードフォワード (FFL)

$$\frac{dZ}{dt} = \beta_z \theta(X^* > K_{xz}) \theta(Y^* > K_{yz}) - \alpha_z Z$$

オンオフ感知性の遅延



単入力モジュール (SIM)

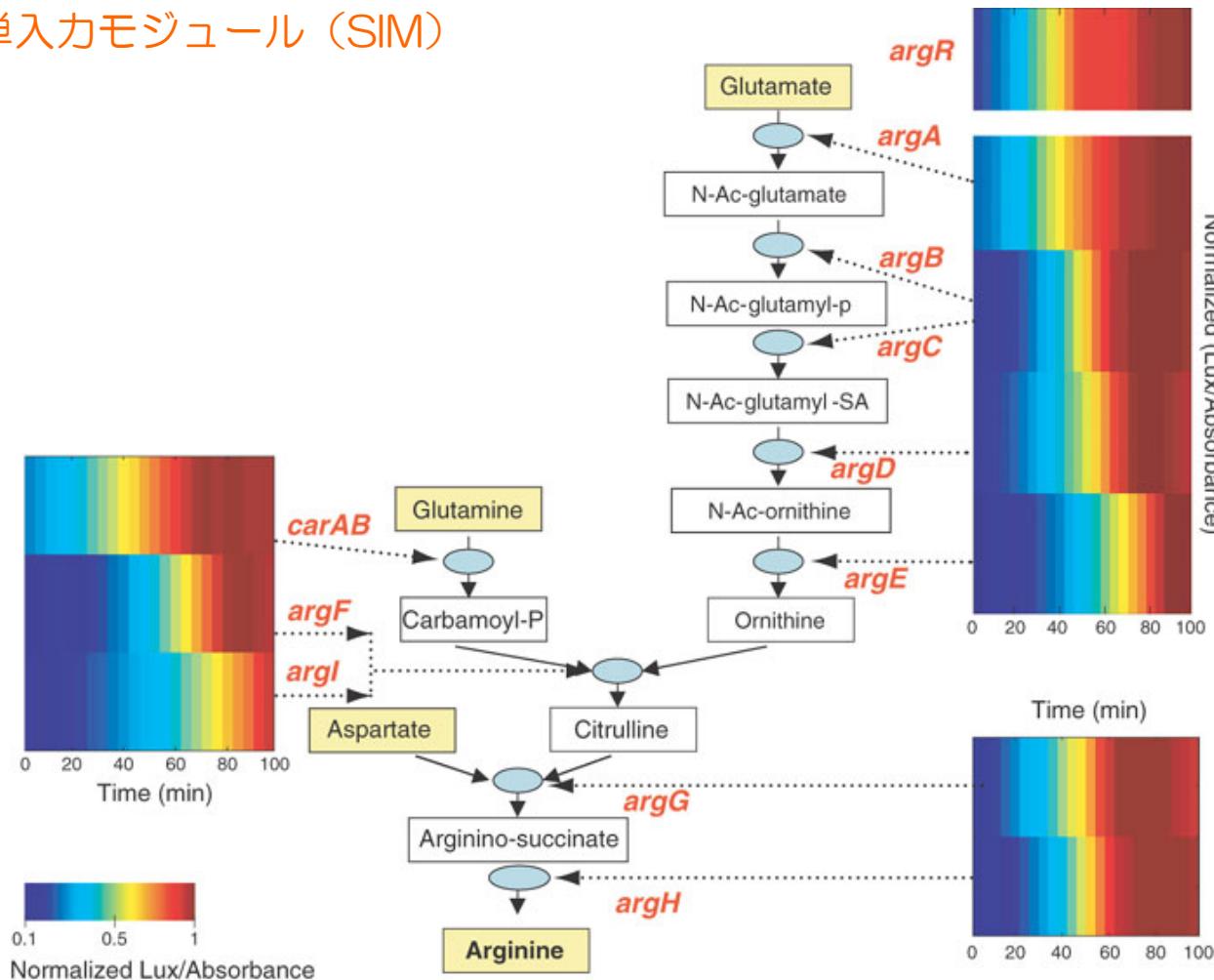
$$\frac{dZ_i}{dt} = \beta_{Zi} \theta(X^* > K_{xz_i}) - \alpha_{z_i} Z_i$$

遺伝子発現の時間プログラム

ネットワークモチーフ

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事例) 単入力モジュール (SIM)

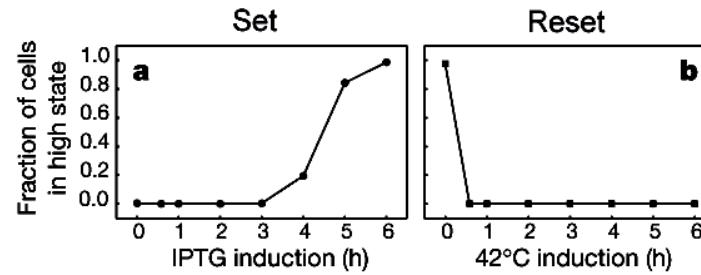
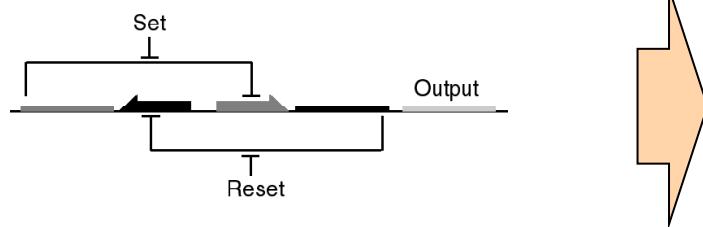


Zaslaver A et al. Nat Genet 36, 486-491 (2004)

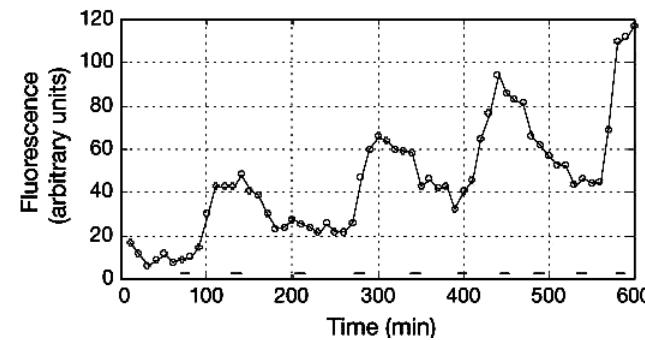
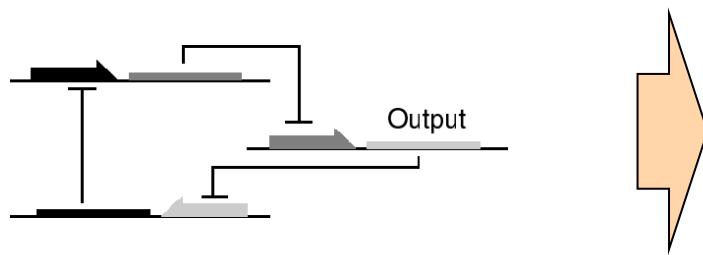
遺伝子回路設計：Toy Model

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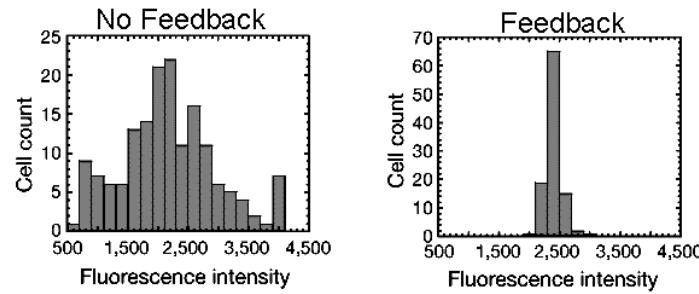
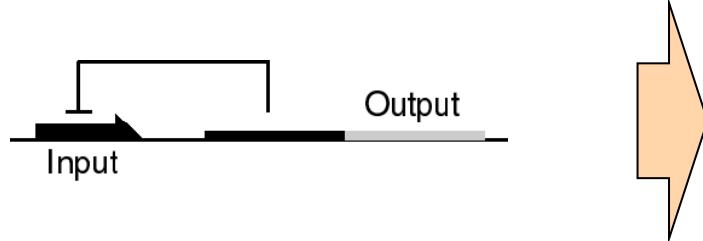
Memory (Gardner, *et al.*)



Clock (Elowitz, *et al.*)



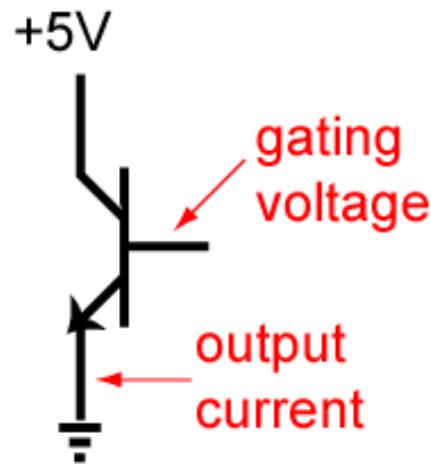
Noise Reduction (Becskei, *et al.*)



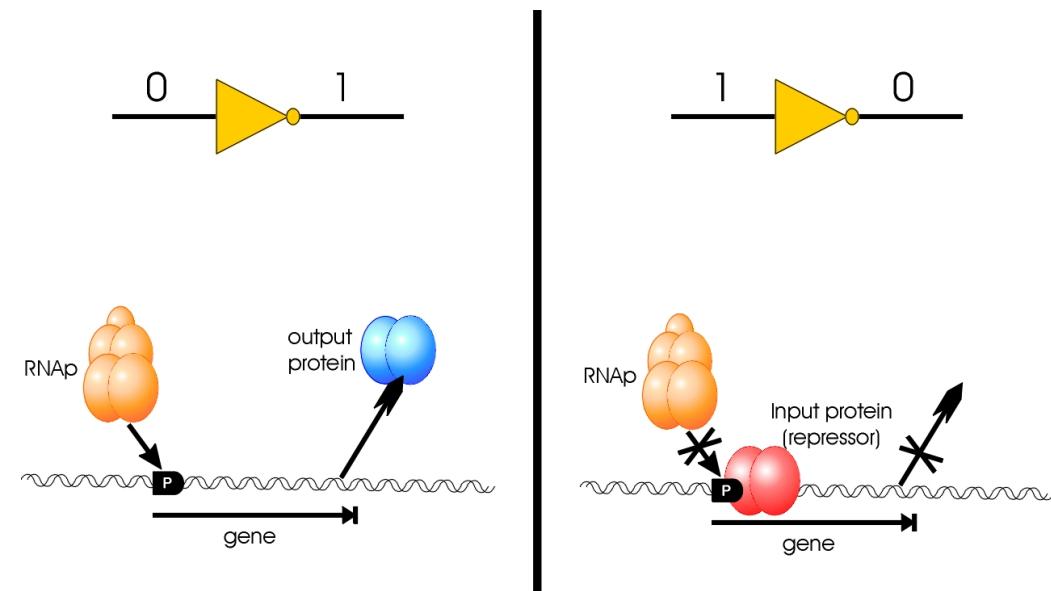
工学スイッチと遺伝子スイッチ

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Electronic switch



Genetic switch

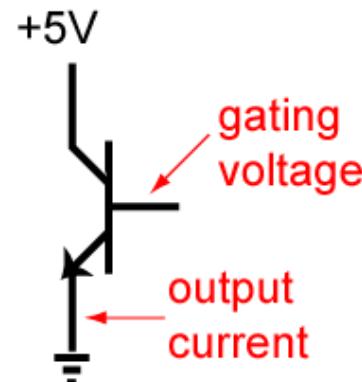


遺伝子トグルスイッチ

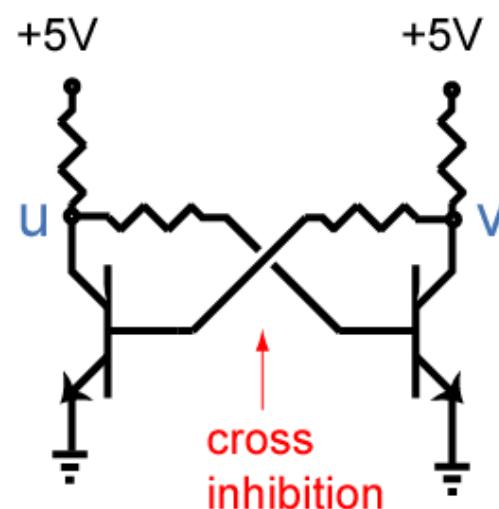
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Electronic memory

Transistor

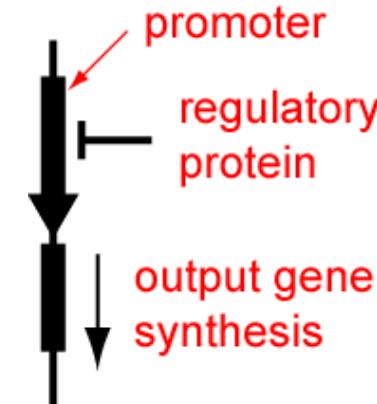


RS latch (bistable)

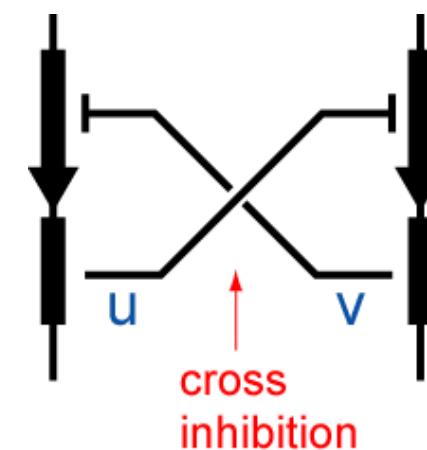


Biochemical memory

Repressible promoter



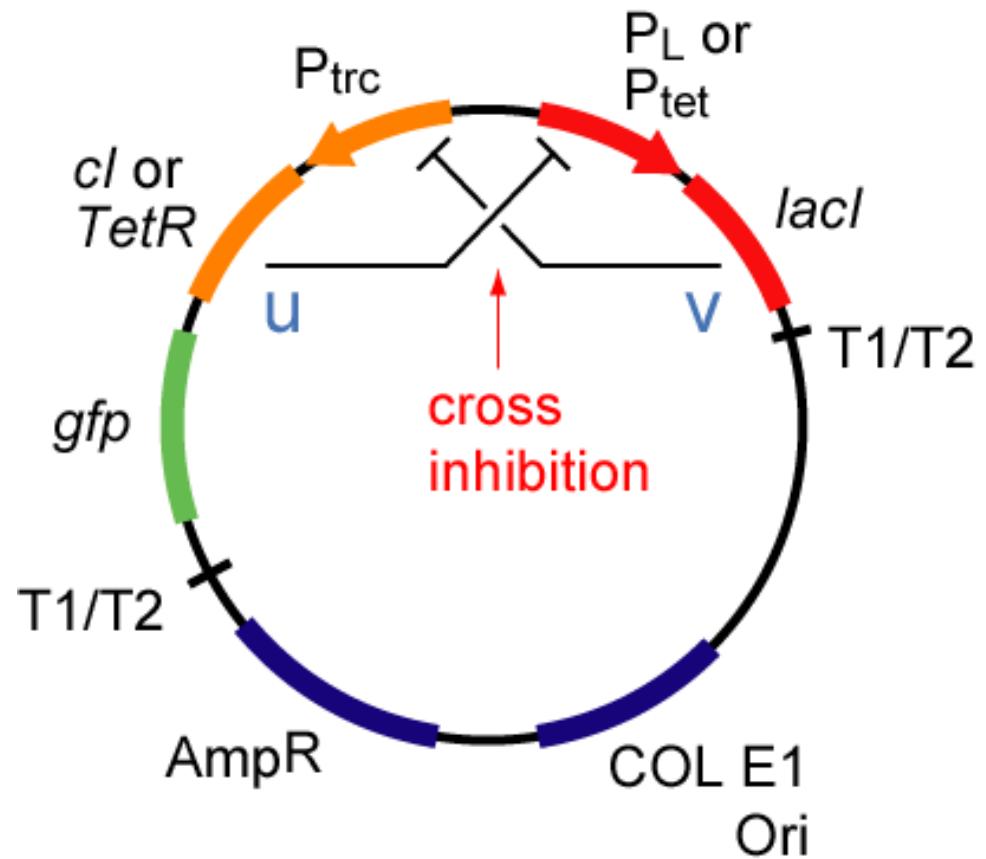
Genetic toggle switch
(bistable)



遺伝子トグルスイッチ

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Development of a genetic toggle switch in *E. coli* (biochemical memory)



Gardner TS, Cantor CR, Collins JJ
Nature 403, 339-342 (2000)

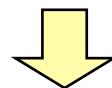
トグルモデル

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Nonlinear ODE model: reduced rate equations for transcription and translation

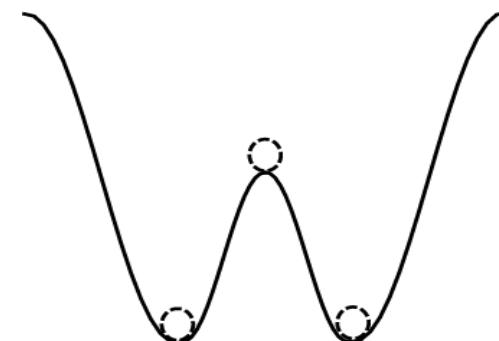
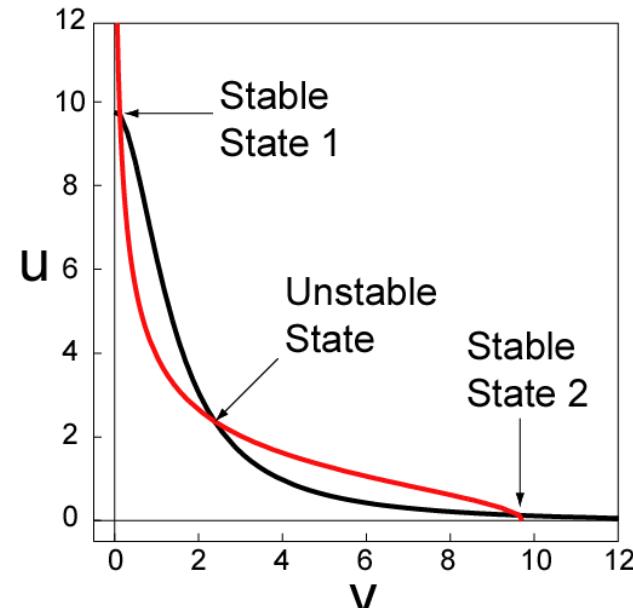
$$\dot{u} = \frac{\alpha_1}{1 + v^\beta} - u$$

$$\dot{v} = \frac{\alpha_2}{1 + u^\gamma} - v$$



$$u = \frac{\alpha_1}{1 + v^\beta}$$

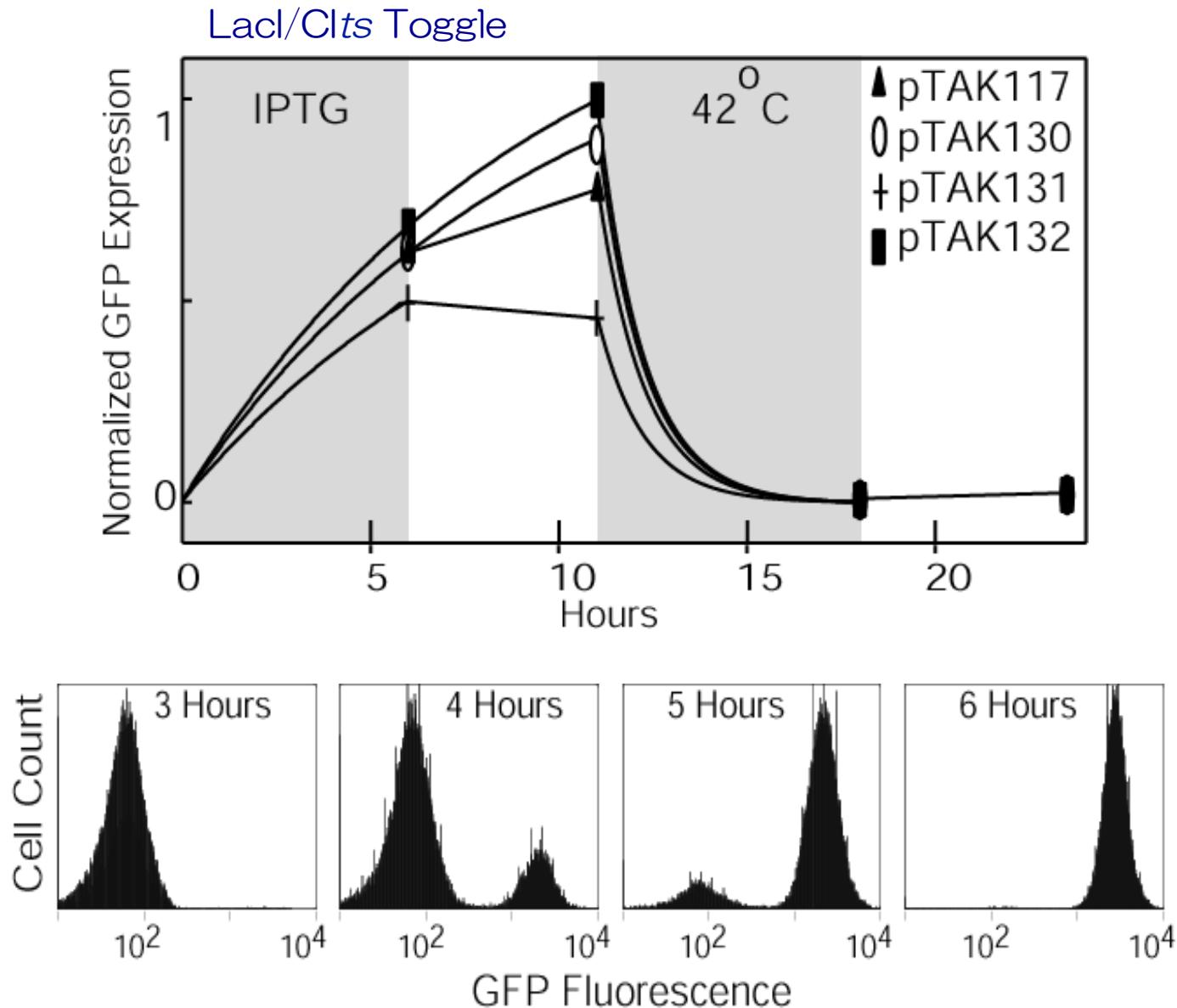
$$v = \frac{\alpha_2}{1 + u^\gamma}$$



双安定状態 (Bistability)

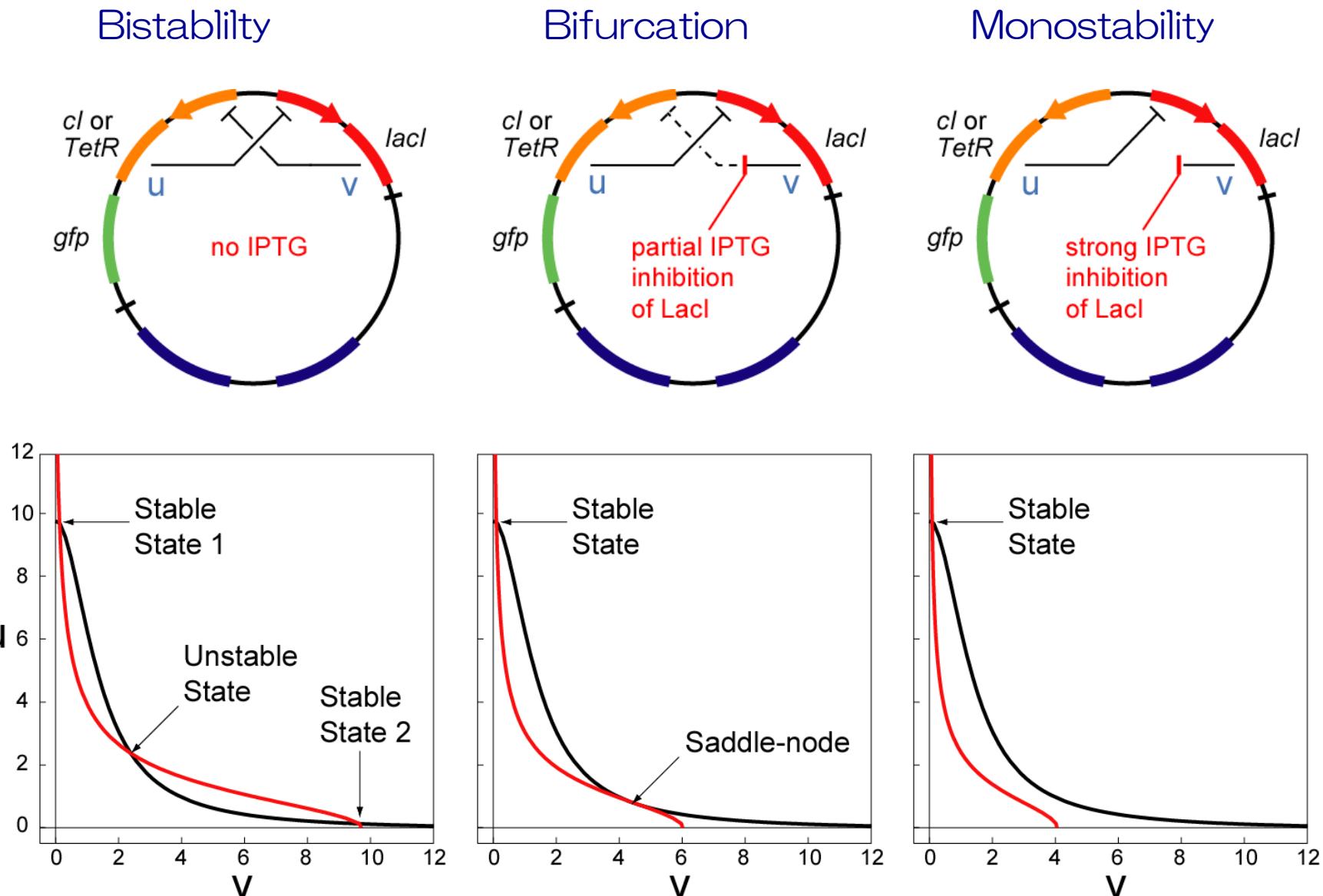
Bistable Switch

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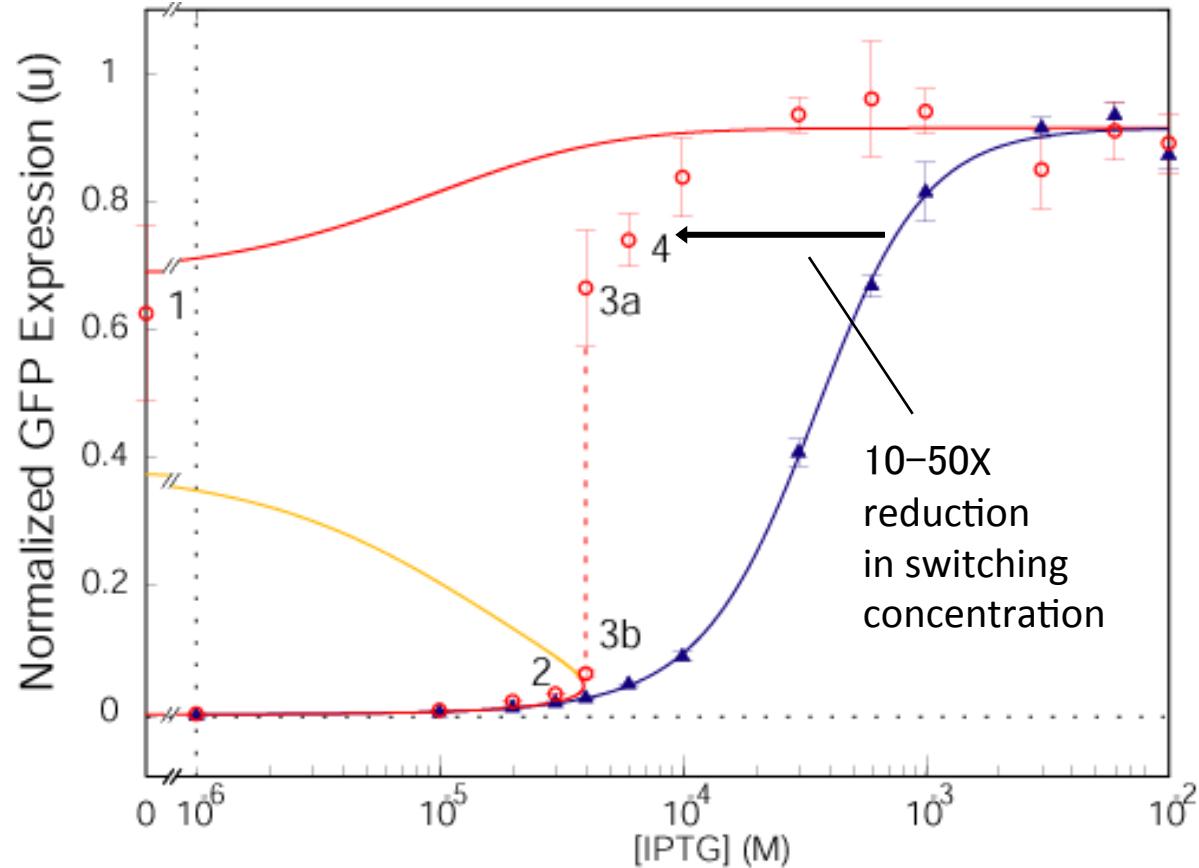
Control of Bistability

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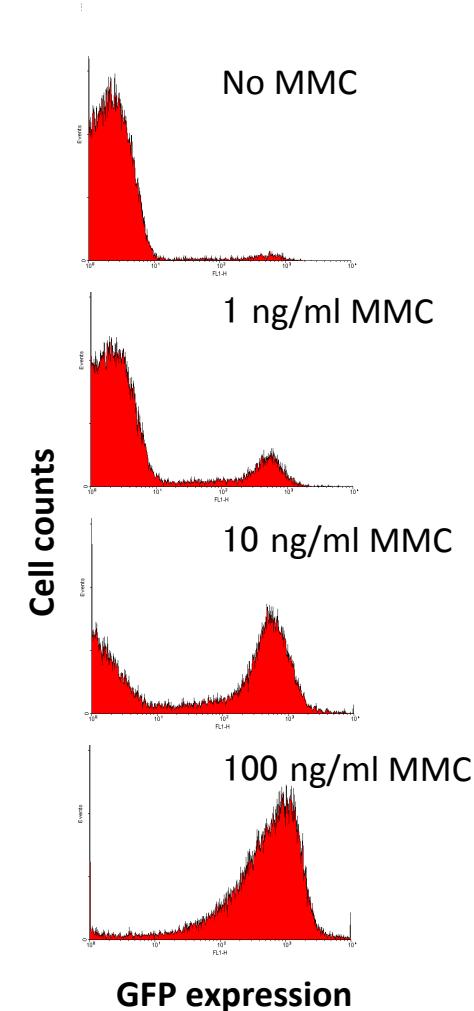
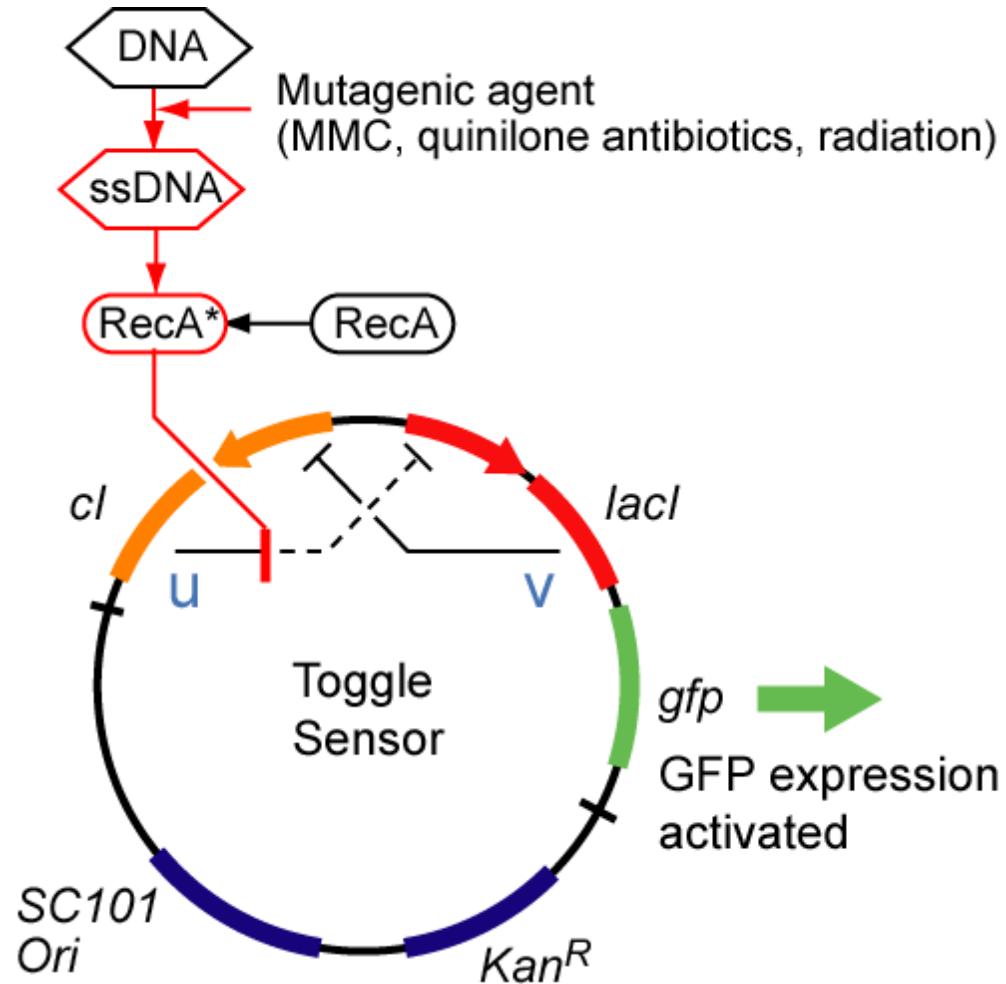
All-or-none switching

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Programmable Cells

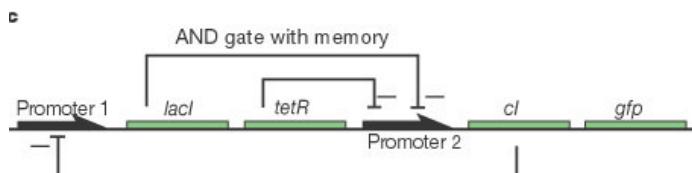
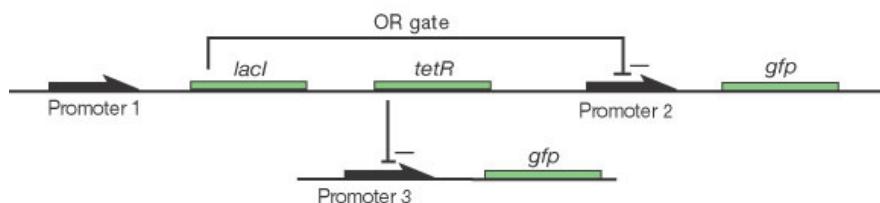
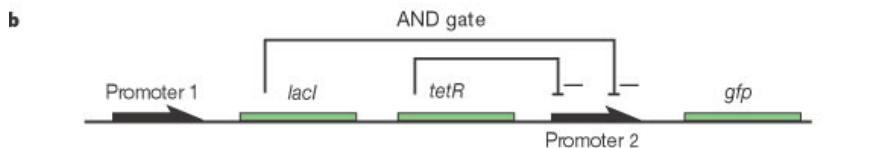
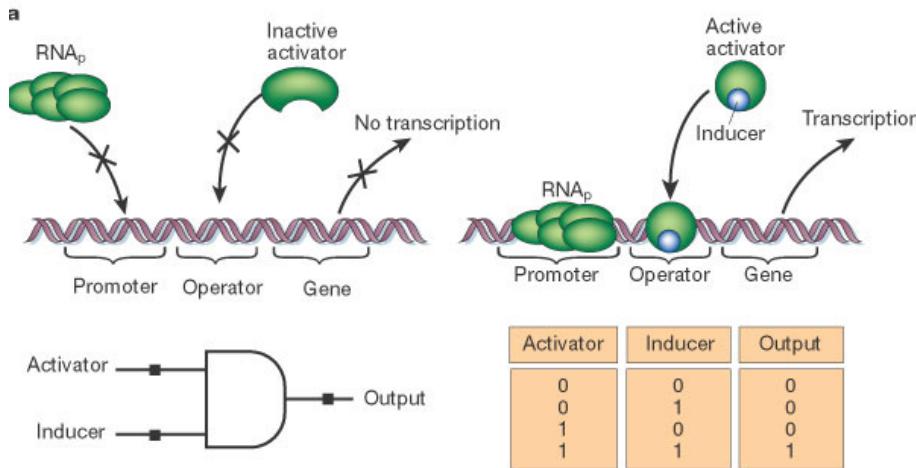
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Kobayashi H, Kaern M, Araki M et al.
PNAS 101(22):8414-8419 (2004)

AND/OR GATE

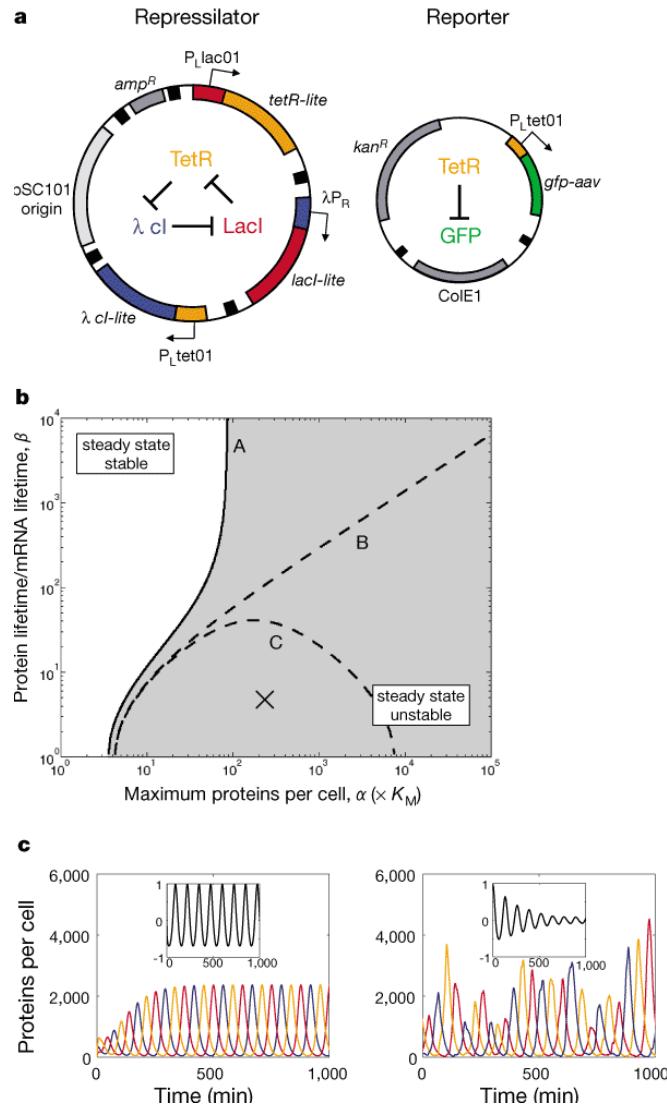
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Hasty J, McMillen D, Collins JJ
Nature 420, 224-230 (2002)

Genetic Clock

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$$\dot{m}_i = -m_i + \frac{\alpha}{(1+p_j^n)} + \alpha_0$$

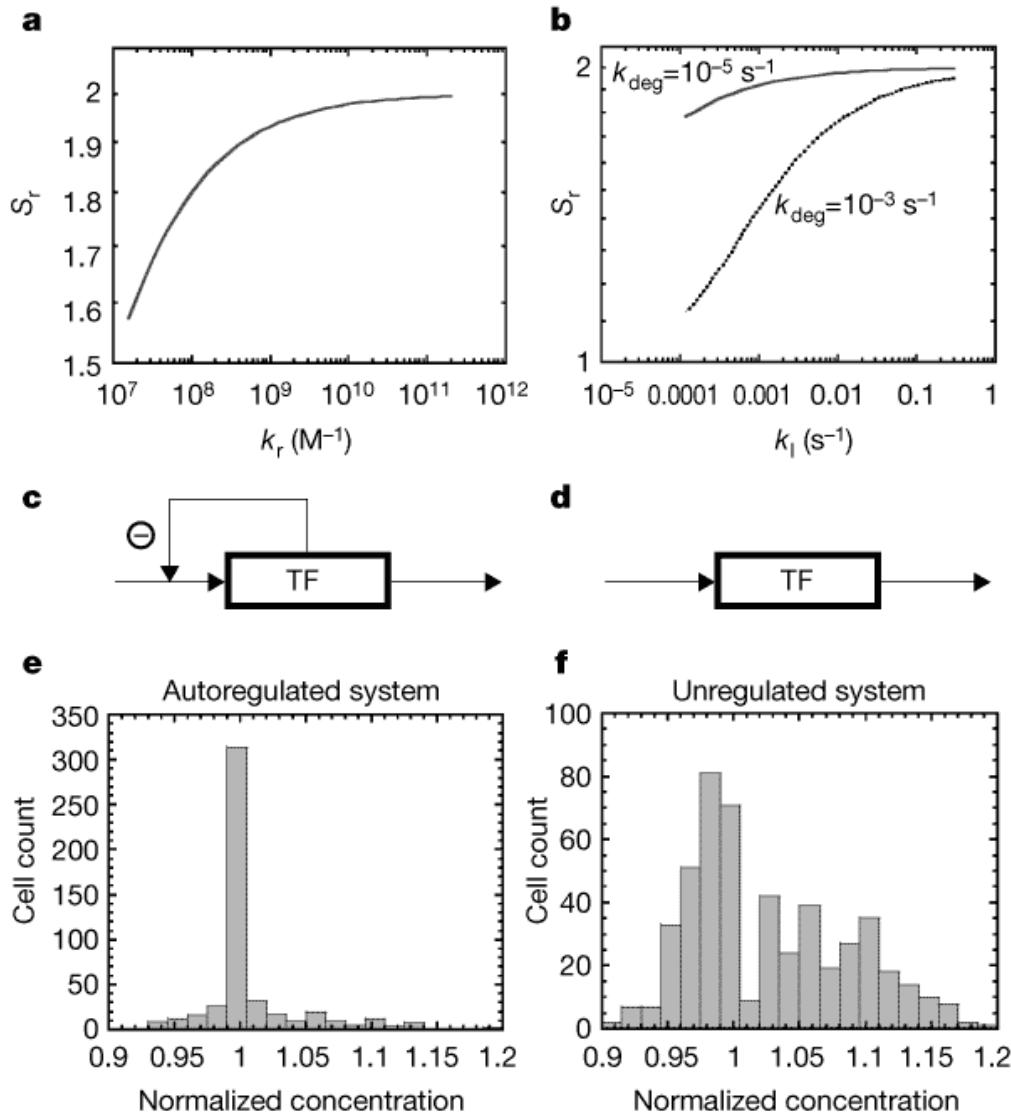
$$\dot{p}_i = -\beta(p_i - m_i)$$

Repressor-protein concentrations: p_i
mRNA concentrations: m_i
(where i is lacI, tetR or cl)

Elowitz M, Leibler S
Nature 403, 335-338 (2000)

Noise Reduction

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$$S_{unreg} = f'_{unreg}(R^*) = -k_{deg}$$

$$S_{auto} = f'_{auto}(R^*) = -\frac{nk_p P k_I a k_r}{(1 + k_p P + k_r R^*)^2} - k_{deg}$$

$$S_r = \frac{S_{auto}}{S_{unreg}}$$

Repressor-protein concentrations: R
 RNA polymerase concentrations: P
 Binding constant of polymerase: k_p
 Binding constant of repressor: k_r
 Promoter isomerization rate: k_i

Becskei A, Serrano L
 Nature 405, 590-593 (2000)

- はじめに
- 遺伝子回路設計
- 代謝経路設計

KEGG REACTION

KEGG

REACTION: R00959

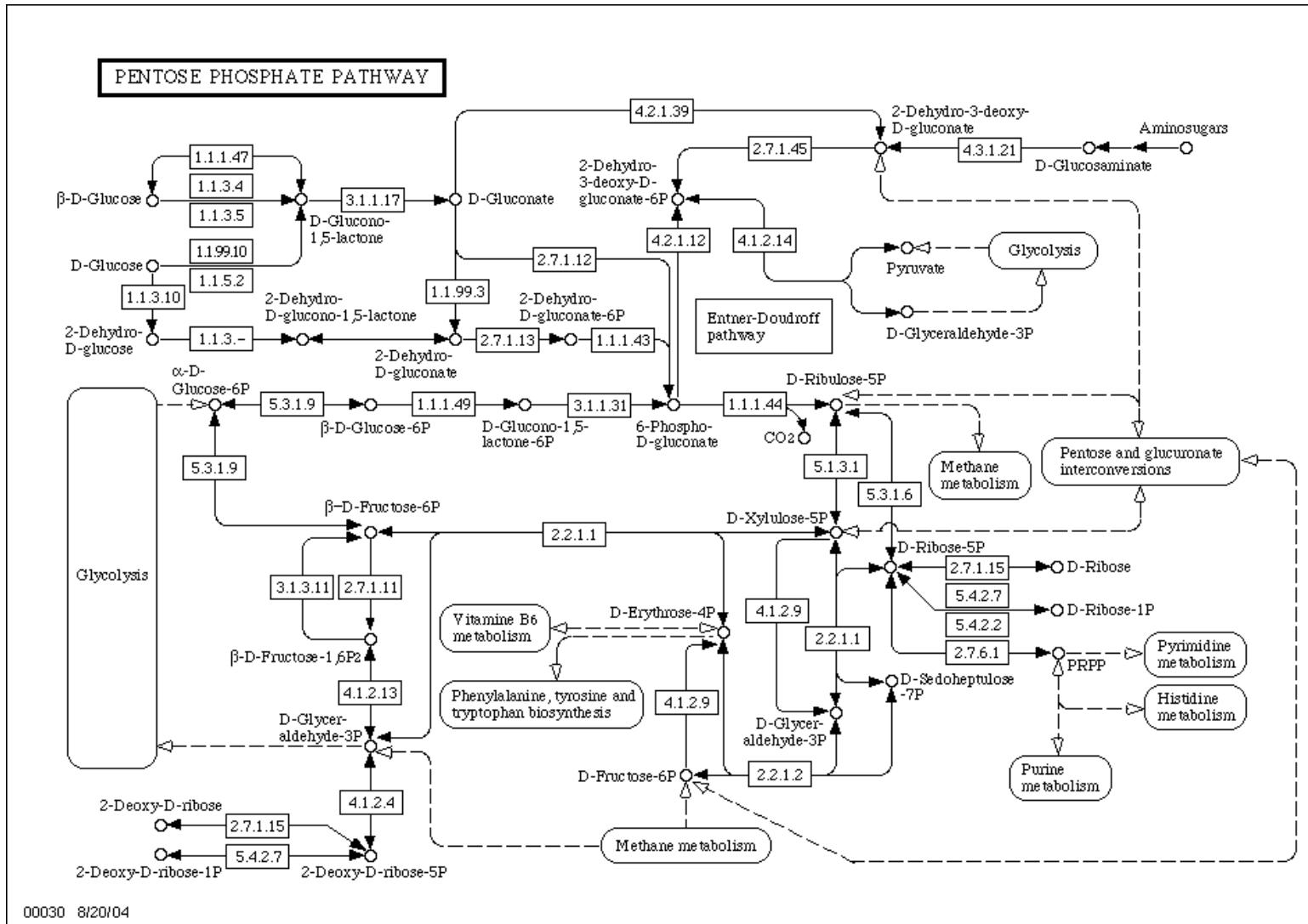
[Help](#)

Entry	R00959	Reaction
Name	alpha-D-Glucose 1-phosphate 1,6-phosphomutase	
Definition	D-Glucose 1-phosphate \leftrightarrow alpha-D-Glucose 6-phosphate	
Equation	C00103 \leftrightarrow C00668	
	<p>The diagram shows the reversible equilibrium between D-Glucose 1-phosphate (C00103) and alpha-D-Glucose 6-phosphate (C00668). The reaction is catalyzed by alpha-D-Glucose 1-phosphate 1,6-phosphomutase. The equilibrium arrow points from C00103 to C00668.</p>	
RPair	RP01197	C00103_C00668 main [RC: RC00408]
Enzyme	5.4.2.2	5.4.2.5
Pathway	rn00010 Glycolysis / Gluconeogenesis rn00052 Galactose metabolism rn00500 Starch and sucrose metabolism rn00520 Amino sugar and nucleotide sugar metabolism rn01100 Metabolic pathways rn01110 Biosynthesis of secondary metabolites rn01120 Microbial metabolism in diverse environments rn01130 Biosynthesis of antibiotics	
Module	M00549	Nucleotide sugar biosynthesis, glucose => UDP-glucose
Orthology	K01835 phosphoglucomutase [EC: 5.4.2.2] K15778 phosphomannomutase / phosphoglucomutase [EC: 5.4.2.8 5.4.2.2] K15779 phosphoglucomutase / phosphopentomutase [EC: 5.4.2.2 5.4.2.7]	

代謝パスウェイ

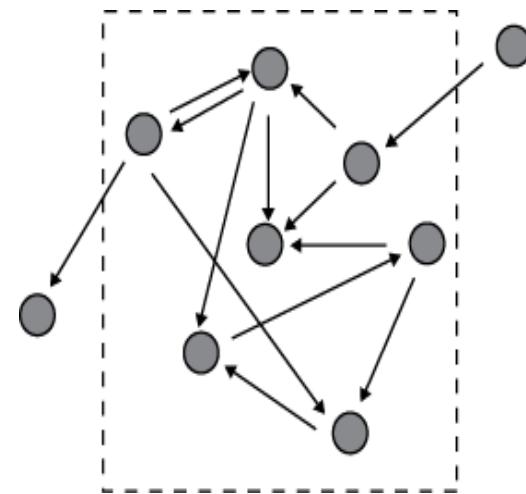
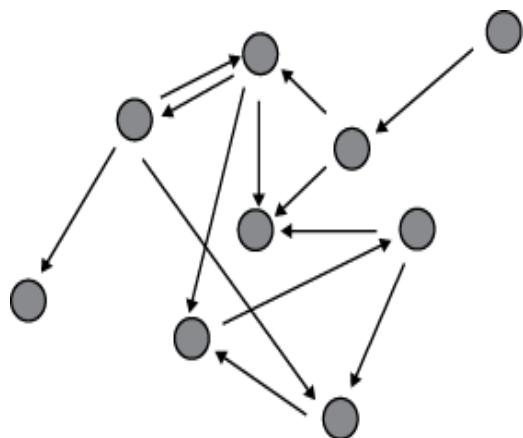
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KEGG PATHWAY

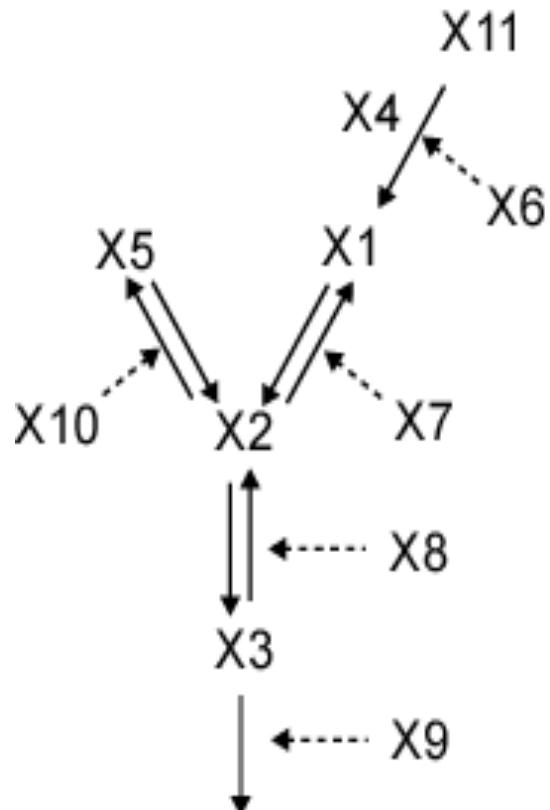


- 生化学反応系のモデル化
- 数学モデルの作成：仮定と近似
- パラメーター推定、感度解析
- 実験値と計算値の比較
- モデルの適否判定
- モデルの最適化

- 構成物質の決定
- 相互作用の決定
- 記述方法の決定



Example of proper map: Glycolysis



Dependent Variables:

X1 = Glucose-1-phosphate
X2 = Glucose-6-phosphate
X3 = Fructose-1-phosphate
X4 = Pi

Independent Variables:

X5 = Glucose
X6 = Phosphorylase
X7 = Phosphoglucomutase
X8 = Phosphoglucose isomerase
X9 = Phosphofructokinase
X10 = Glucokinase
X11 = Glycogen

数値解法

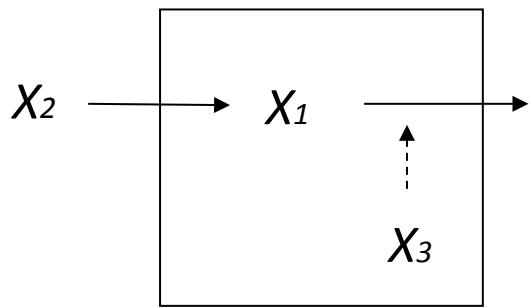
$$\begin{aligned} dy/dt &= f(y, t) \\ y(t_0) &= y_0 \end{aligned}$$

- 離散的な点列 $\{t_i\}$ 上での正しい解 $\{y(t_i)\}$ の近似解 $\{y_i\}$
- 代表的な方法
 - オイラー法
 - 2次のルンゲークッタ法
 - 4次のルンゲークッタ法
 - など
- 数値解法は様々なソフトに組み込まれている

General equation

$$dX_i / dt = \alpha_i \prod_{j=1}^{n+m} X_j^{g_{ij}} - \beta_i \prod_{j=1}^{n+m} X_j^{h_{ij}} \quad \text{for } i = 1, 2, \dots, n$$

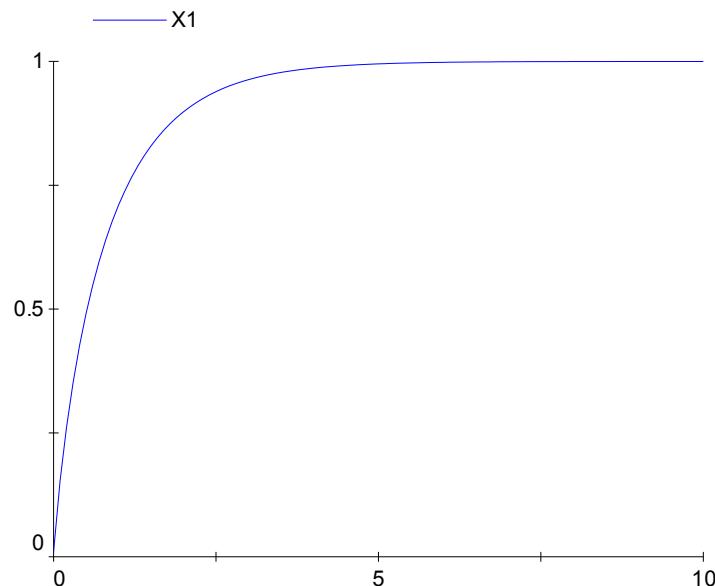
Example



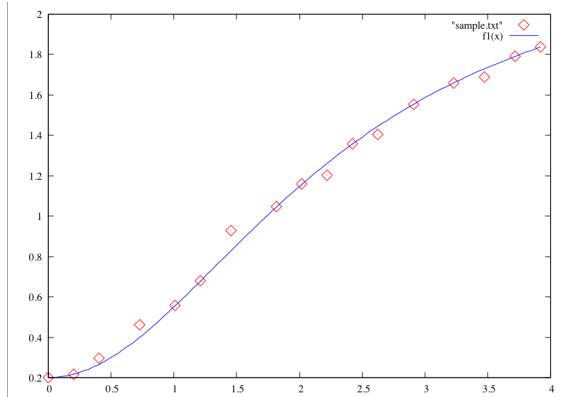
$$dX_1 / dt = \alpha_1 X_2 - \beta_1 X_1^{0.5} X_3^{-1}$$

$$dX_2 / dt = 2$$

$$dX_3 / dt = 0.5$$

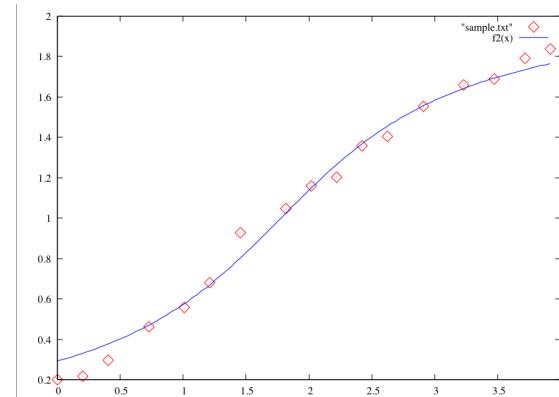


Hill function



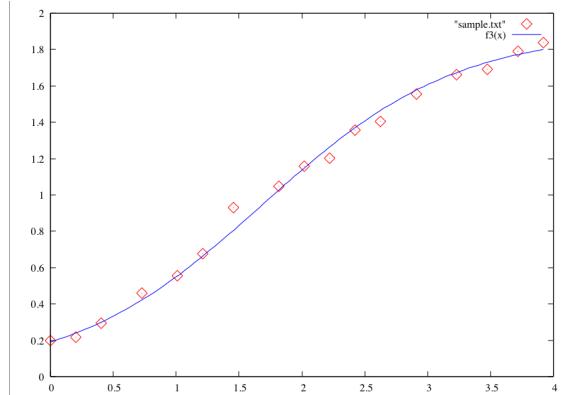
$$f_1(x) = 2.2x^2/(2.3^2+x^2)+0.2$$

Arctangent function



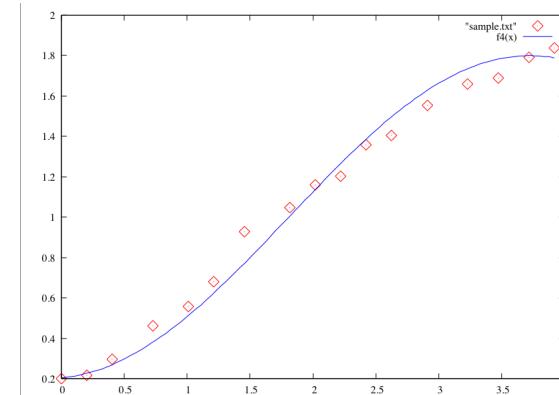
$$f_2(x) = 0.7*\text{arctg}(0.9x-1.6)+1$$

Logistic function



$$f_3(x) = 1.9/(1+\exp(2.2-1.3x))$$

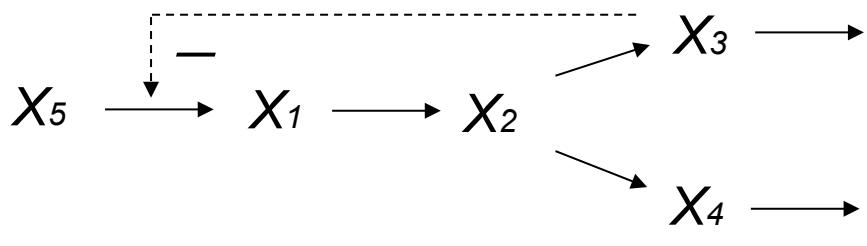
Sine function



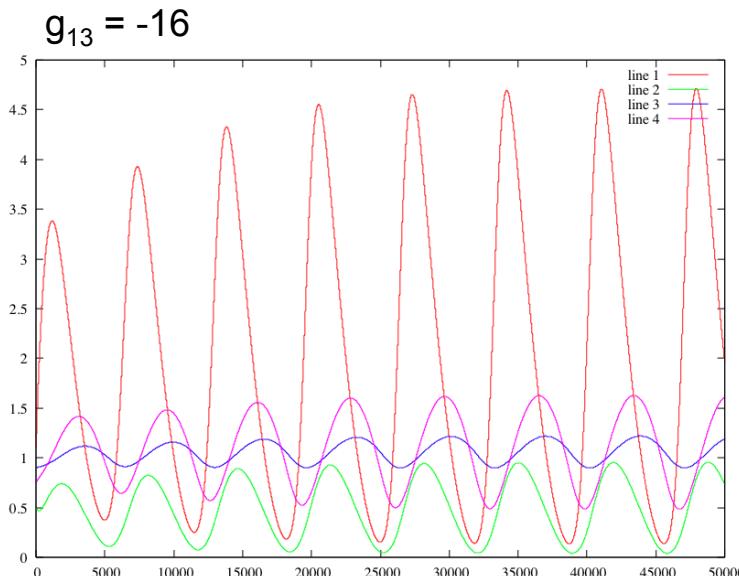
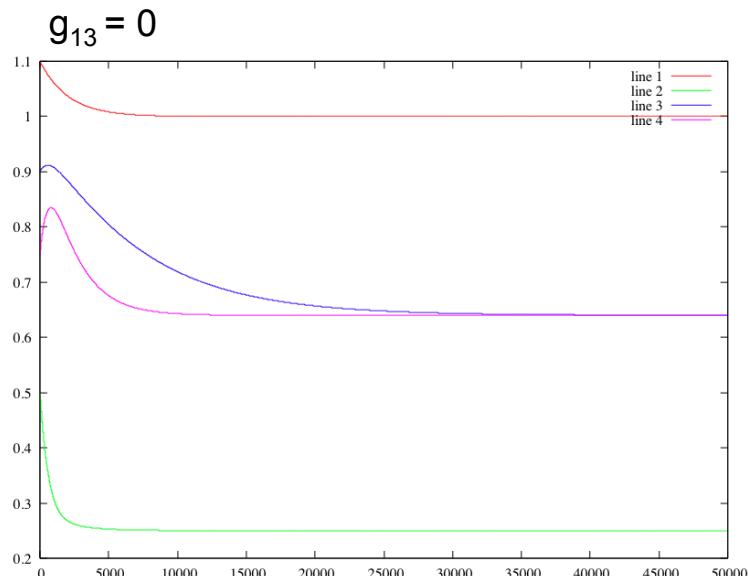
$$f_4(x) = 0.8\sin(0.82x+4.8)+1$$

パラメータ依存性

41



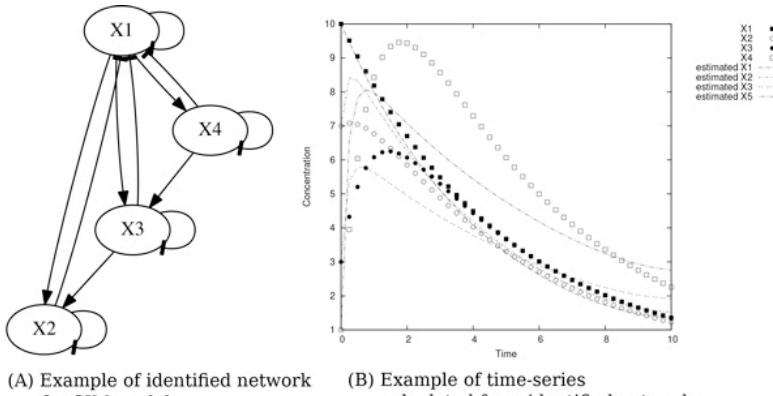
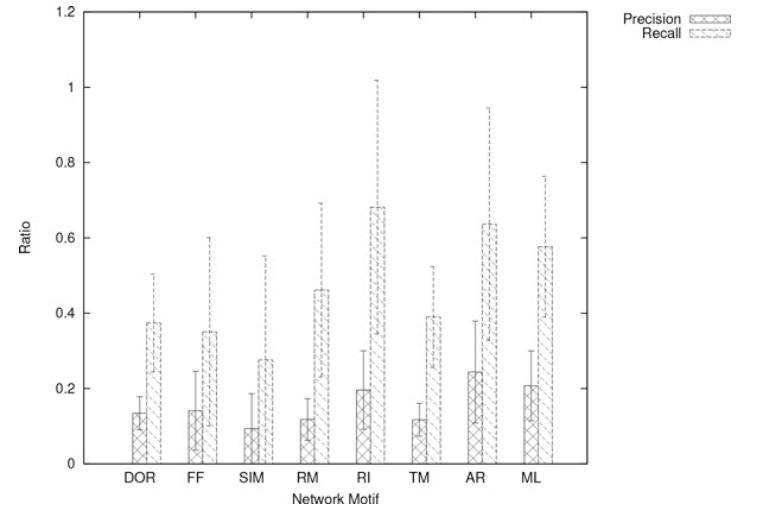
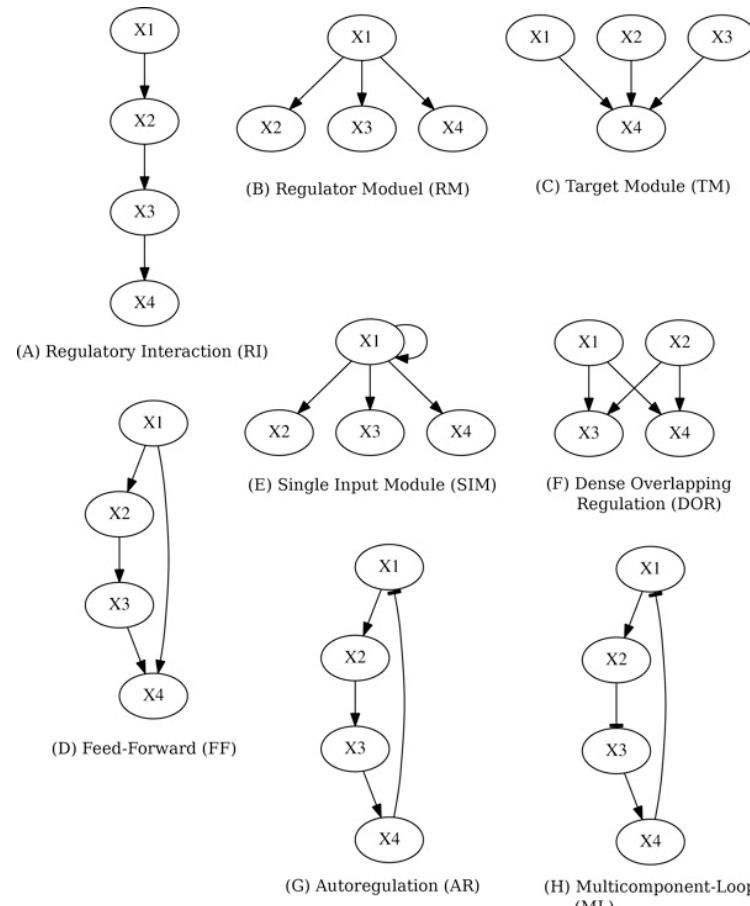
$$\begin{aligned}
 dX_1 / dt &= 10X_3^{g_{13}} X_5 - 5X_1^{0.5} \\
 dX_2 / dt &= 5X_1^{0.5} - 10X_2^{0.5} \\
 dX_3 / dt &= 2X_2^{0.5} - 1.25X_3^{0.5} \\
 dX_4 / dt &= 8X_2^{0.5} - 5X_4^{0.5} \\
 dX_5 / dt &= 0.5
 \end{aligned}$$



パラメータ推定

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S-system解析：時系列データからのパラメータ最適化・ネットワーク推定



(C) Example of estimated S-system parameter values.

7.50	-2.58	-0.87	-1.28	-1.49	0.22	1.00	0.00	0.00	0.00
8.98	1.96	-1.68	0.75	0.00	8.60	1.00	0.00	0.00	0.00
7.93	1.59	0.00	-2.90	1.28	3.74	0.00	0.00	1.00	0.00
9.59	0.94	0.00	0.00	-0.60	2.56	0.00	0.00	0.00	1.00

Systems Biology Markup Language (SBML)

XML形式で生化学反応を記述

Compartiment
Species
Reaction
Parameter
Unit Definition
Rule

$$k = \frac{k_3}{k_2}, \quad s_2 = \frac{kx}{1 + k_2}, \quad A = 0.10x$$

```
<model>
  ...
  <listOfRules>
    <assignmentRule variable="k">
      <notes>
        <xhtml:p>
          k = k3/k2
        </xhtml:p>
      </notes>
      <math xmlns="http://www.w3.org/1998/Math/MathML">
        <apply>
          <divide/>
          <ci> k3 </ci>
          <ci> k2 </ci>
        </apply>
      </math>
    </assignmentRule>
    <assignmentRule variable="s2">
      <notes>
        <xhtml:p>
          s2 = (k * x)/(1 + k2)
        </xhtml:p>
      </notes>
      <math xmlns="http://www.w3.org/1998/Math/MathML">
        <apply>
          <divide/>
          <apply>
            <times/>
            <ci> k </ci>
            <ci> x </ci>
          </apply>
          <apply>
            <plus/>
            <cn> 1 </cn>
            <ci> k2 </ci>
          </apply>
        </apply>
      </math>
    </assignmentRule>
  </listOfRules>
</model>
```

シミュレーション方法

44

Process	Phenomena	Models
Metabolism	Enzymatic reaction	ODE, S-systems, FBA
Signal transduction	Molecular binding Enzymatic reaction	DAE Stochastic algorithms
Gene expression	Molecular binding Polymerization Degradation	DAE, S-systems Boolean networks Stochastic algorithms

シミュレータ

45

	Capabilities						Frameworks						API	Dep.	Platforms	SBML	Availabil.			
	Creation	Simulation	Analysis	Database	Utility	ODE	DAE	PDE	Stochastic	Events	Logical	Other					Import	Export	Open source	Academic use
acsIXtreme	•															W	•	\$	\$	
ALC	•					•	•		•			•				L, W, M, B	•	•	F	F
Asmparts	•			•		•										L,W	•	•	F	F
Antimony	•			•												L, W, M	•	•	F	F
AutoSBW		•				•										SBW	•	•	F	F
AVIS											•					various	•		F	F
BALSA	•															Sigtran				
BASIS	•	•	•	•					•	•						B	•	•	F	F
BetaWB	•	•	•						•	•						L,W,M	•		F	F
BiGG			•													B	•		F	
BiNoM	•	•	•	•							•					L, W, M	•	•	F	F
BiNoM Cytoscape Plugin	•	•	•	•							•					Cytoscape	•	•	F	F
BIOCHAM		•		•		•										L,W,M	•	•	F	F
BioCharon	•	•	•	•		•										CHARON				
Biological Networks	•	•	•	•												L,W,M	•	•	F	\$
BioCyc				•													•		F	\$
BioGrid																				

化学量論的解析

46

フラックスバランス解析 (FBA)

I. Reaction network formalism

Chemical reactions

Internal	Exchange
$R1: -1A \rightarrow 1B$	$R4: 1A$
$R2: -1B \rightarrow 1C$	$R5: -1B$
$R3: -1C \rightarrow 1B$	$R6: -1C$
	$R7: 1C$

$S =$

	$R1$	$R2$	$R3$	$R4$	$R5$	$R6$	$R7$
A	-1	0	0	1	0	0	0
B	1	-1	1	0	-1	0	0
C	0	1	-1	0	0	-1	1

II. FBA formulation

Dynamic mass balance

$$\frac{dC}{dt} = Sv$$

C : Concentration
 t : Time
 S : Stoichiometric matrix
 v : Flux vector

Steady-state assumption

$$Sv = 0$$

LP formulation

Objective: $\max Z = v_5$

Constraints:

$$A \begin{bmatrix} R1 & R2 & R3 & R4 & R5 & R6 & R7 \end{bmatrix} \begin{bmatrix} v_1 \\ \vdots \\ v_7 \end{bmatrix} = 0 \quad 0 \leq v_1, \dots, v_7 \leq 10$$

A $\begin{bmatrix} -1 & 0 & 0 & 1 & 0 & 0 & 0 \\ 1 & -1 & 1 & 0 & -1 & 0 & 0 \\ 0 & 1 & -1 & 0 & 0 & -1 & 1 \end{bmatrix}$

III. Hypothetical flux distribution at steady-state

$Z = 10$

$v = [6.67 \ 3.33 \ 6.67 \ 6.67 \ 10.0 \ 3.33 \ 6.67]^T$

反応マトリックス記述

定常状態仮定
定式化

線形計画法

Lee JM, Gianchandani EP, Papin JA
Brief Bioinformatics 7, 140-150 (2006)

ゲノムスケールモデル

47

SBMLによる記述

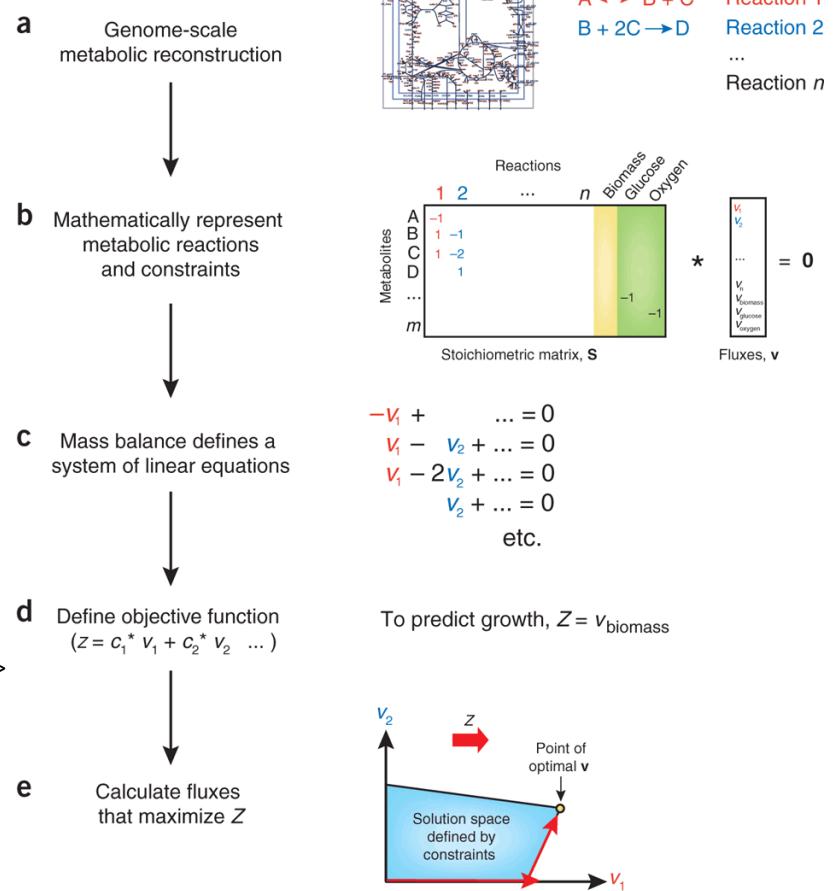
```

<reaction id="R_ACKr" name="acetate kinase">      反応 (酵素名称)
  <notes>
    <html xmlns="http://www.w3.org/1999/xhtml">
      <p>GENE_ASSOCIATION: (b3115 or b2296 or b1849)</p>
      <p>GENE_LIST: b1849 b2296 b3115</p>
      <p>SUBSYSTEM: Pyruvate Metabolism</p></html>
    </notes>
    <listOfReactants>
      <speciesReference species="M_ac_c"/>
      <speciesReference species="M_atp_c"/>
    </listOfReactants>
    <listOfProducts>
      <speciesReference species="M_actp_c"/>
      <speciesReference species="M_adp_c"/>
    </listOfProducts>
    <kineticLaw>
      <math xmlns="http://www.w3.org/1998/Math/MathML">
        <ci> FLUX_VALUE </ci>
      </math>
      <listOfParameters>
        <parameter id="LOWER_BOUND" value="-1000" units="mmol_per_gDW_per_hr"/>
        <parameter id="UPPER_BOUND" value="1000" units="mmol_per_gDW_per_hr"/>
        <parameter id="OBJECTIVE_COEFFICIENT" value="0"/>
        <parameter id="FLUX_VALUE" value="0" units="mmol_per_gDW_per_hr"/>
      </listOfParameters>
    </kineticLaw>
  </reaction>

```

遺伝子ID
反応種 (化合物)
計算パラメータ

ゲノムスケールモデル



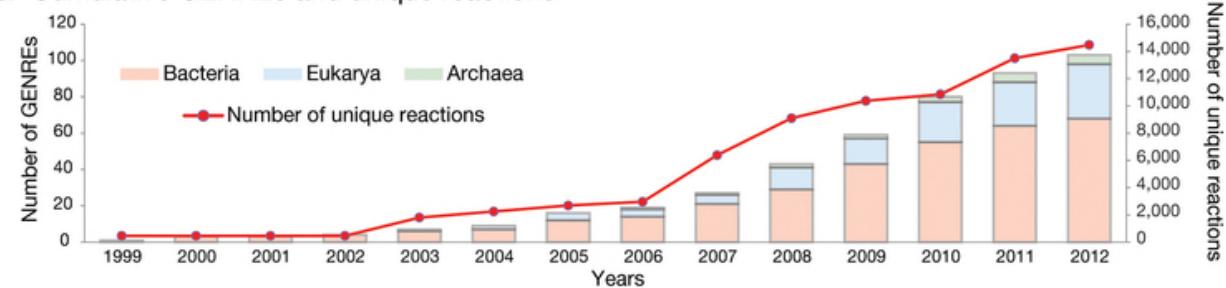
Oath JD, Thiele I, Palsson BO
Nature Biotechnology 28, 245-248 (2010)

ゲノムスケールモデル

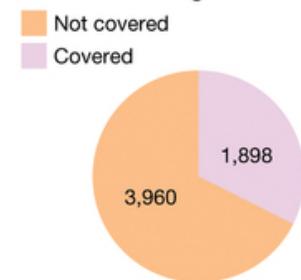
48

Genome-scale network reconstruction (GENRE)

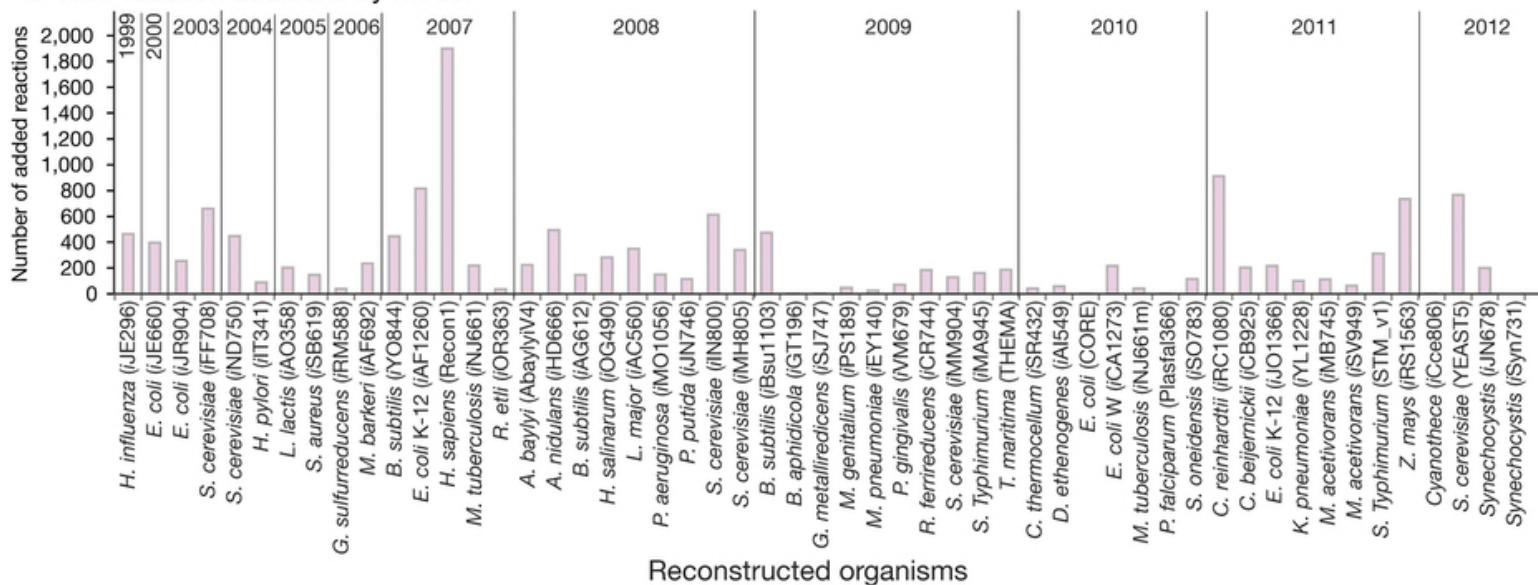
a Cumulative GENREs and unique reactions



b EC coverage



c New reaction additions by model

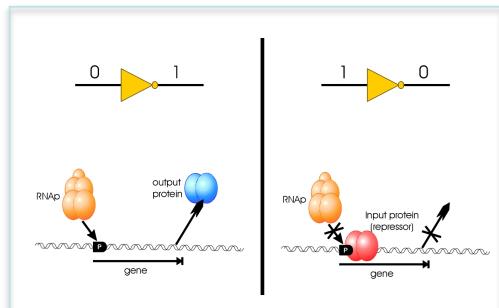


Monk J, Nogales J, Palsson BO
Nature Biotechnology 32, 447-452(2014)

代謝経路設計：化学情報解析

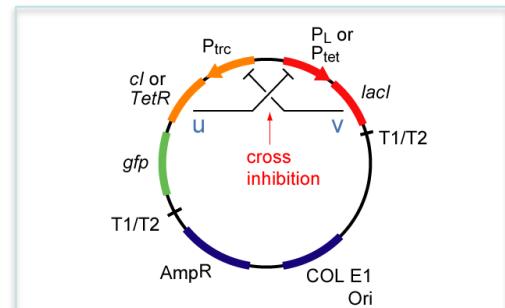
49

単位/部品



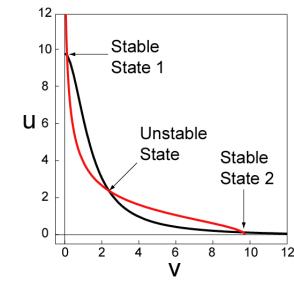
遺伝子/プロモータ

組合せ/再構築



遺伝子回路

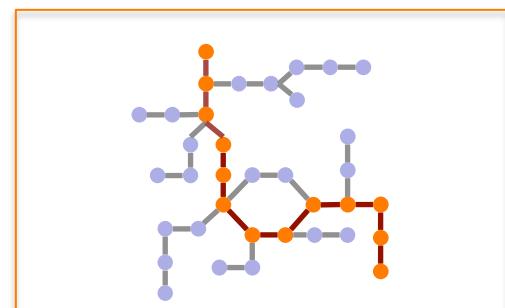
表現型/構造



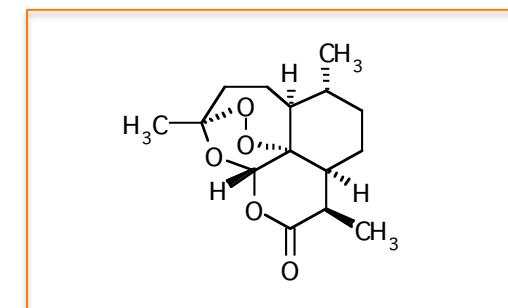
スイッチ



反応/酵素



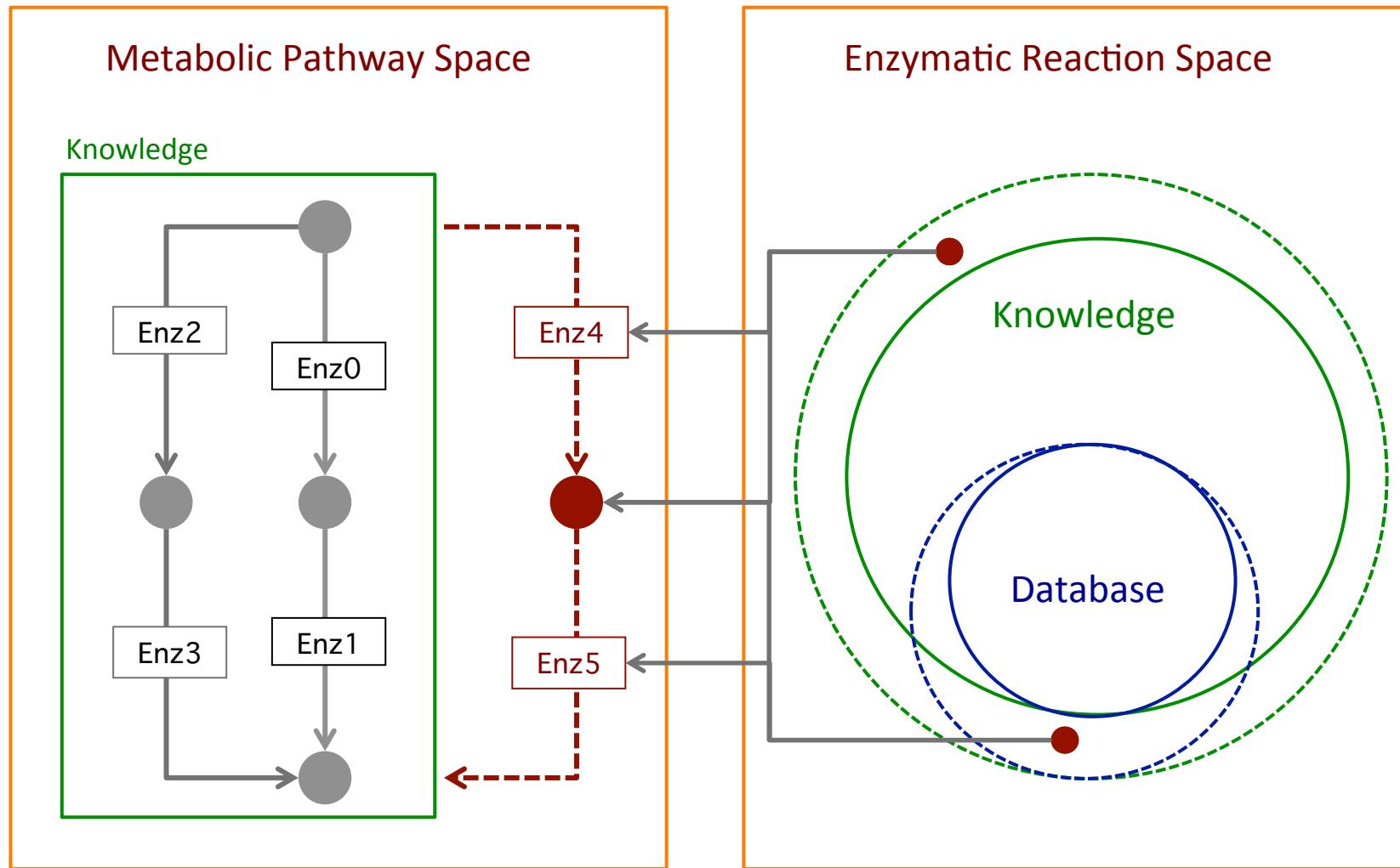
代謝経路



代謝化合物

代謝パスウェイの知識拡張

50



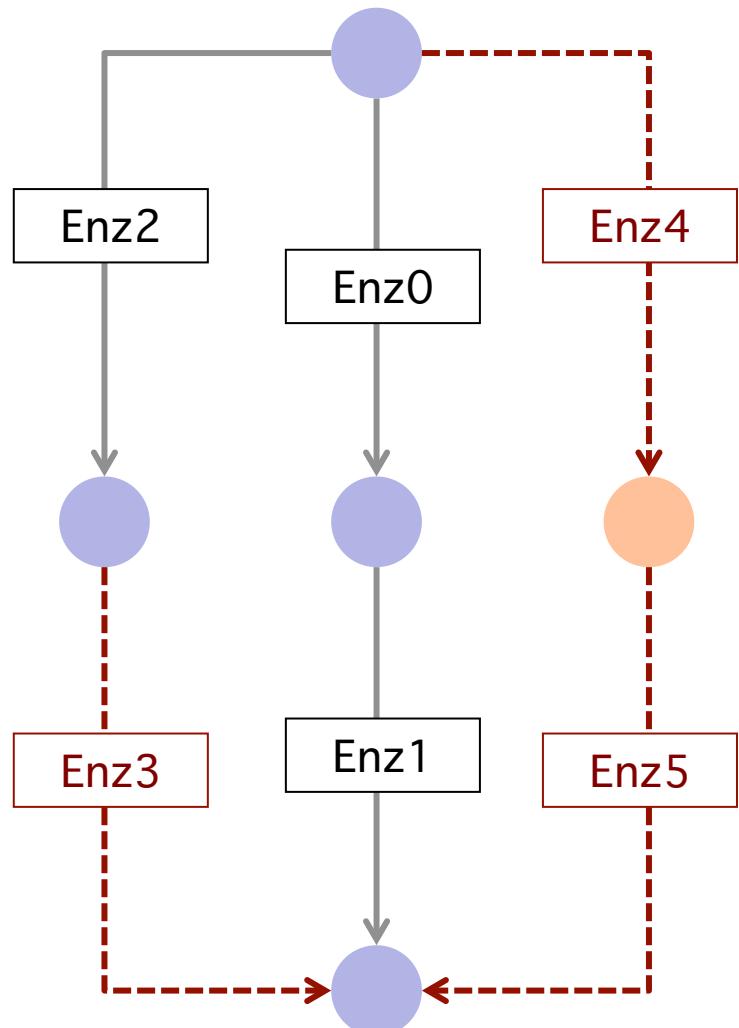
代謝反応データベース

51

Database	Entries	Description
KEGG COMPOUND	17,091	Compounds
PubChem	~50,000,000	Compounds
KEGG REACTION	9,400	Reactions
KEGG RPAIR	14,218	Reactant Pairs
KEGG ENZYME	6,118	EC Numbers
BRENDA	6,130	Different Enzymes

代謝経路設計

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Known:



Unknown:



PATH_0 (Enz0_Enz1) : Known

PATH_1 (Enz2_Enz3) : Unknown Ez

PATH_2 (Enz4_Enz5) : Unknown Ez, Co

OMIC tools

Home Reviews News FAQ Media About Submit tools Search

A workflow for omic data analysis (NGS, microarray, PCR, MS, NMR)

OMICtools can help a) experimental researchers/clinicians find appropriate tools for their needs b) developers to stay up to date and to avoid redundancy c) funding agencies to ensure that the submitted projects are high value-added. Do you want help us to improve OMICtools? [Call for curators](#)

(Henry et al., 2014) OMICtools: an informative directory for multi-omic data analysis. Database.

Browse by omic applications

 Sequencing (2256)	 Microarray (504)	 Mass spectrometry (349)
 NMR spectroscopy (98)	 PCR (113)	 nCounter System (4)
 Cytometry (70)	 Thermal shift assay (4)	 Common omic tools (290)

Browse by functional analysis

 Functional analysis (1361)	 Drug discovery (417)	 Genome editing (38)
 Transcriptomics (344)	 Proteomics (364)	 Epigenomics (35)
 Fluxomics (41)	 Biomolecular structure (386)	 Health & Diseases (203)
 Immunology (72)	 Educational resources (198)	

設計方法

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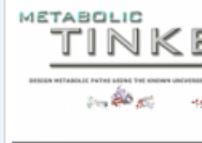
Home > Functional analysis > Synthetic biology > Metabolic pathways

Synthetic metabolic pathway tools

 **M-path** Designing a Synthetic Metabolic Pathway

M-path NEW

A computational platform, M-path, to explore synthetic metabolic pathways including putative enzymatic reactions and compounds. M-path is an iterative random algorithm which makes efficient use of chemical and...

 **Metabolic tinker**

Aims to guide the design of synthetic metabolic pathways between any two desired compounds.

 **MetRxn** NEW

A knowledgebase that includes standardized metabolite and reaction descriptions by integrating information from BRENDA, KEGG, MetaCyc, Reactome.org and 44 metabolic models into a single unified data set. All...

Related sites M-path

PathPred

A web-based server to predict plausible enzyme-catalyzed reaction pathways from a query compound...

Desharky

A Monte Carlo algorithm that finds a metabolic pathway from a target compound by exploring a...

FMM

It can reconstruct metabolic pathways form one metabolite to another metabolite among different...

MetRxn

A knowledgebase that includes standardized metabolite and reaction descriptions by integrating...

MRSD

A tool to search and design routes based on the weighted compound transform diagram.

SobolHDMR

A general purpose metamodeling software.

FindPath

An unified system predicting and ranking the possible pathways according to their metabolic...

XTMS

A web-based pathway analysis platform which provides full access to the set of pathways that can...

Metabolic tinker

Aims to guide the design of synthetic metabolic pathways between any two desired compounds.

Network (knowledge) based approaches

- Handorf *et al.*, 2005; Noor *et al.*, 2010; Chou *et al.*, 2009; McClymont and Soyer, 2013; Kumar *et al.*, 2012; Xia *et al.*, 2011; Rodrigo *et al.*, 2008

The methods are effective in finding known heterologous enzymatic reactions, but it ignores any pathway with an unknown reaction step.

Reaction (chemical) rule based approaches

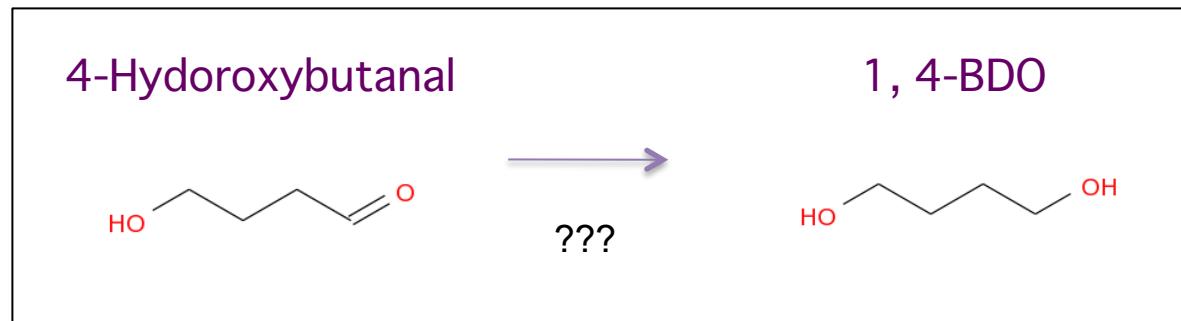
- Yim *et al.*, 2011; Hatzimanikatis *et al.*, 2005; Carbonell *et al.*, 2012, 2014; Henry *et al.*, 2010; Cho *et al.*, 2010
- Araki *et al.*, 2015

These methods have been limited to a small number of either reactions or compounds to avoid combinatorial explosion in reconstructing synthetic metabolic pathways.

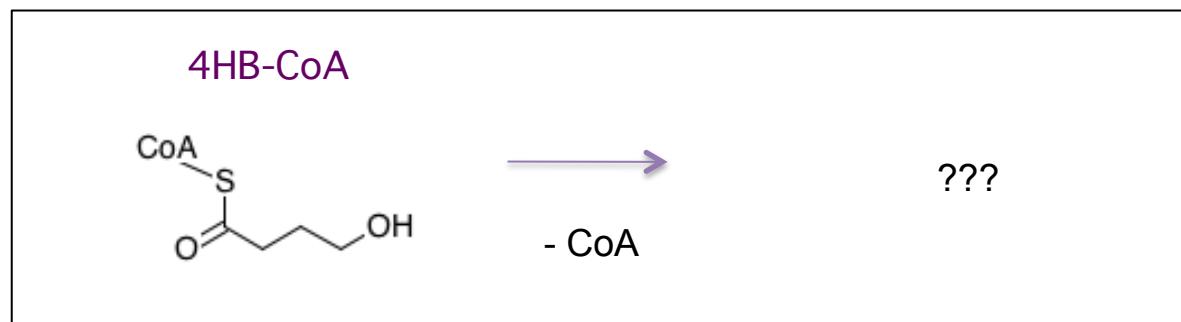
問題設定

57

Reaction



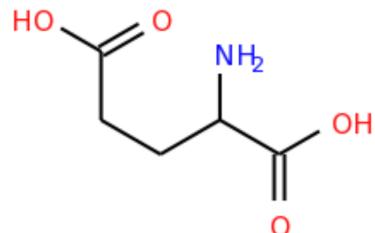
Compound



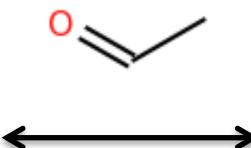
化学・反応表現

58

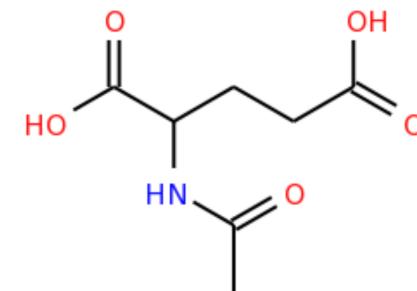
① Glutamate



② Acetyl group



③ N-acetyl glutamate



Mol_Code

Glutamate
(2 3 0 0 1 2 0)

Feature vector
(Chemical feature)

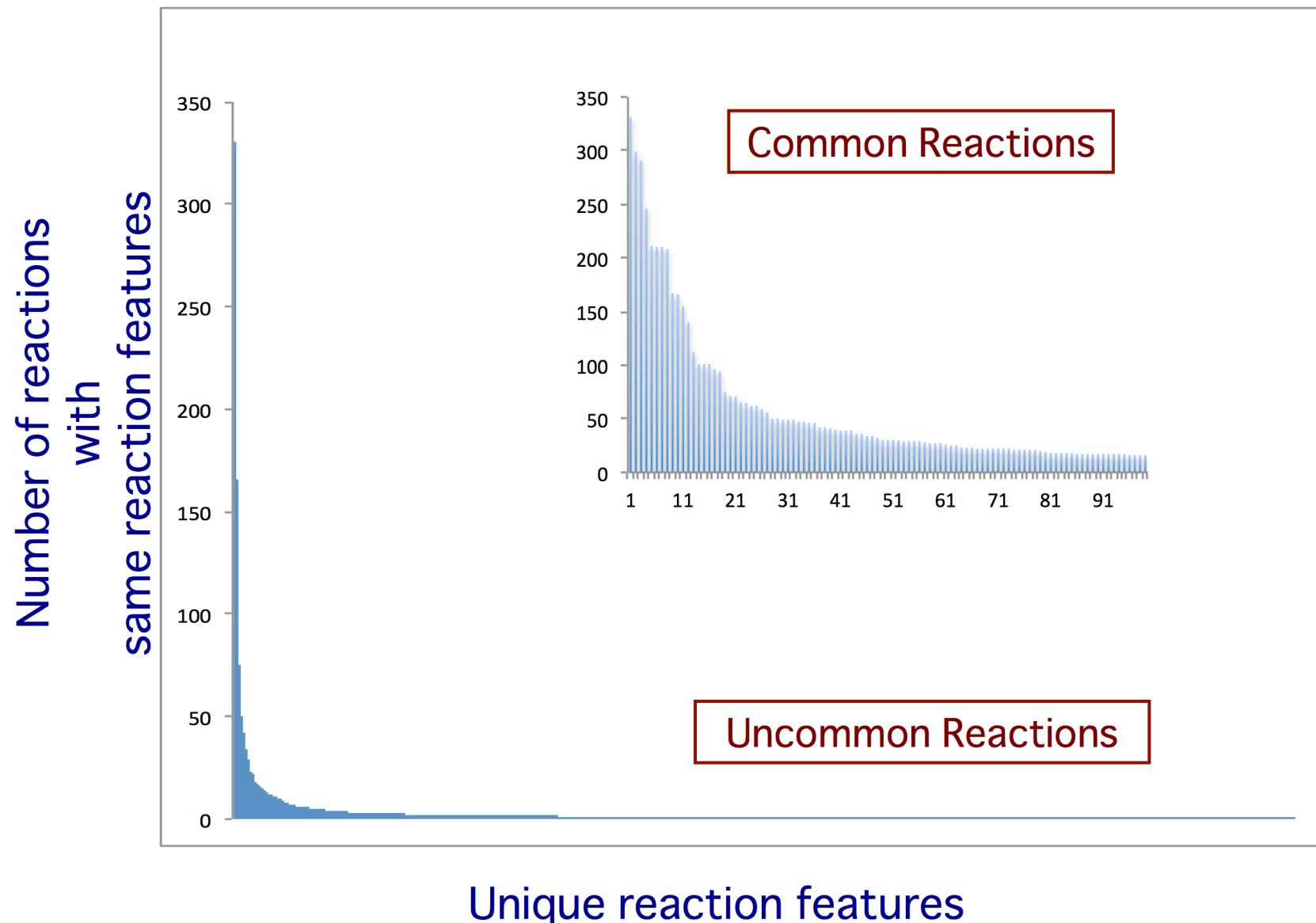
Acetylation
(1 1 0 0 0 0 1)
↔

(-1 -1 0 0 0 0 -1)
Deacetylation

N-acetyl glutamate
(3 4 0 0 1 2 1)

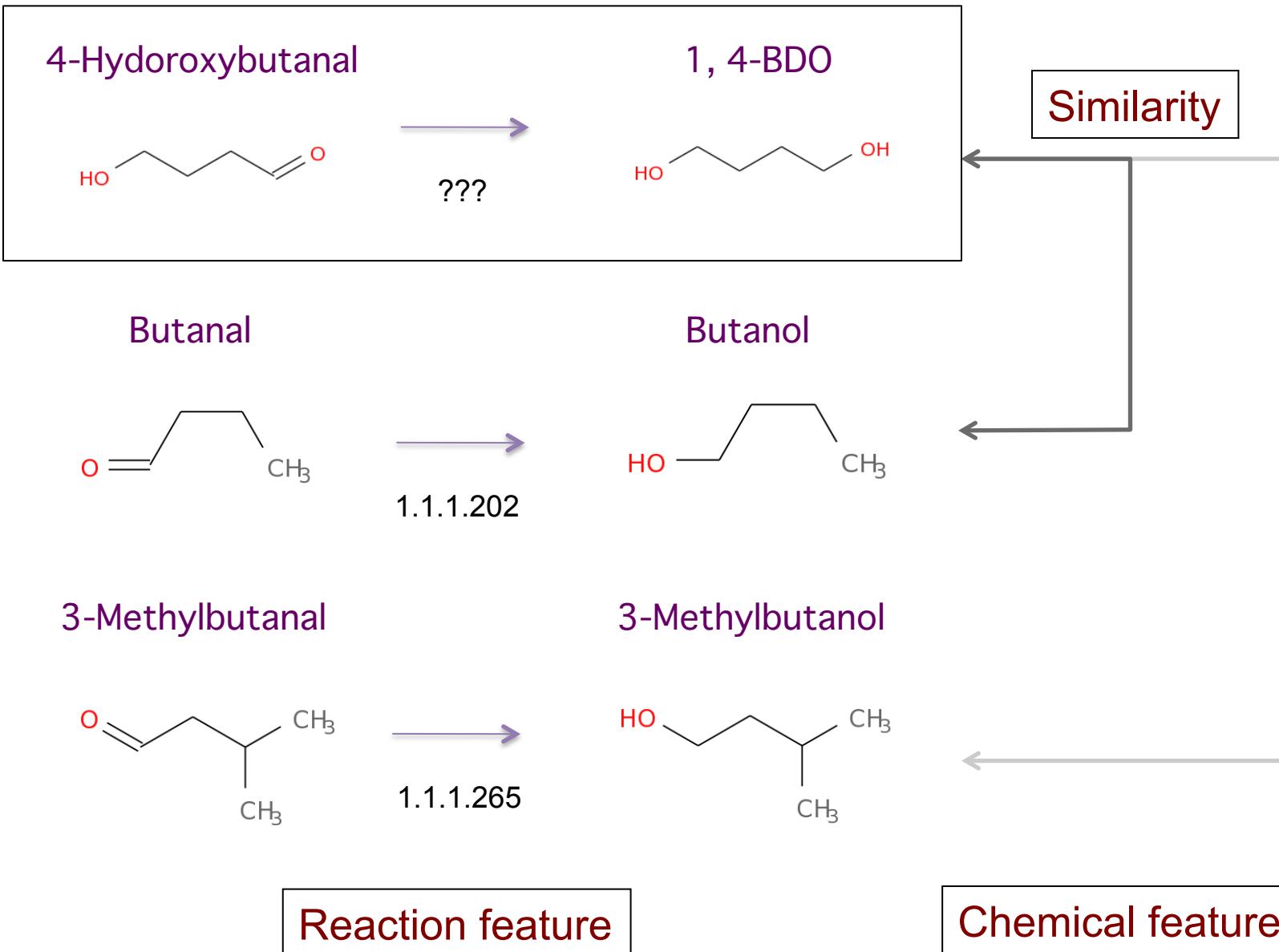
Feature vector
(Chemical feature)

Feature vector differences
(Reaction feature)



反应推定

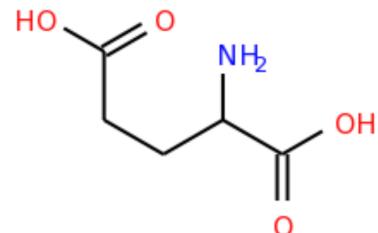
60



化合物推定

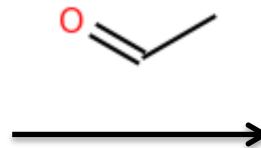
61

① Glutamate



(2 3 0 0 1 2 0)

② Acetyl group

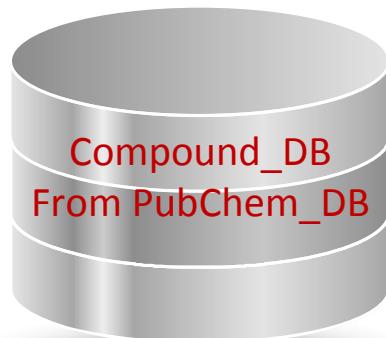
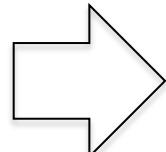


(1 1 0 0 0 0 1)

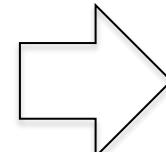
???

(3 4 0 0 1 2 1)

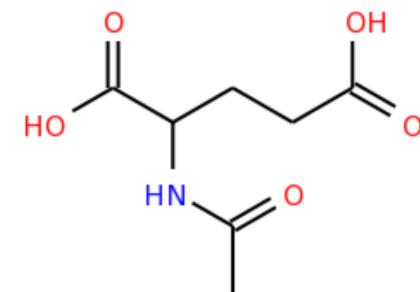
Structure
Search



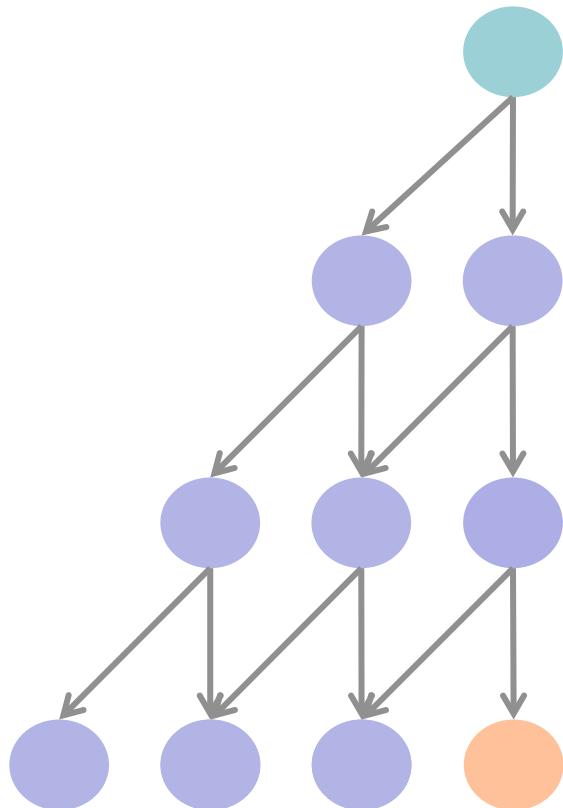
Assignment



③ N-acetyl glutamate



Brute-force method



Incorrect

Correct

Reaction

1,000

1,000

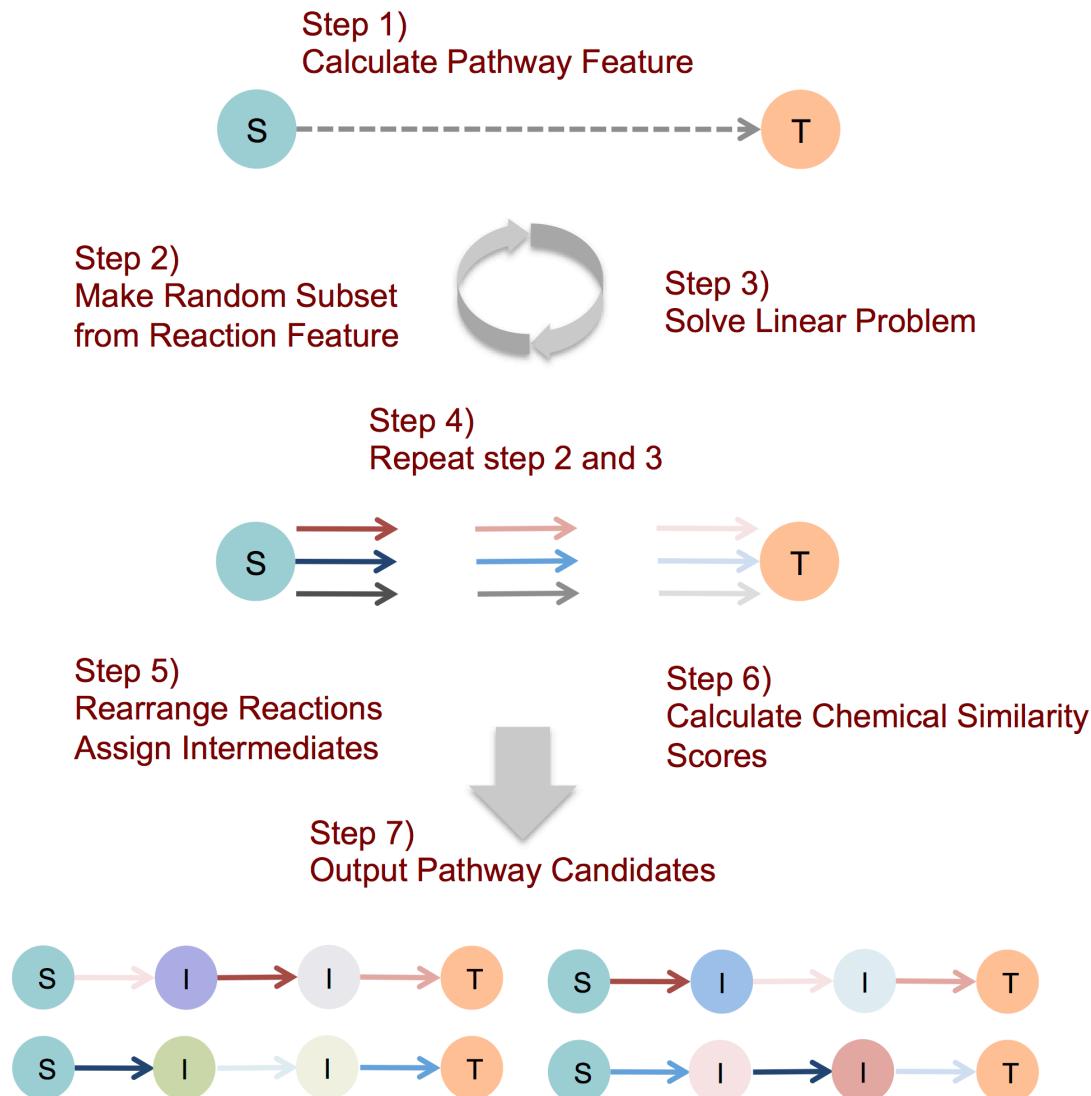
1,000,000

1,000

1,000,000,000

Compound

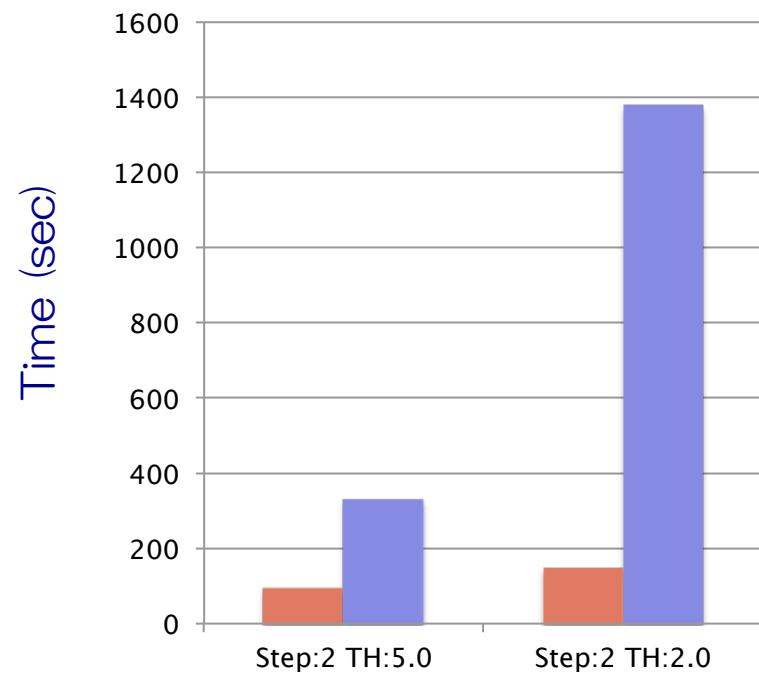
1,000



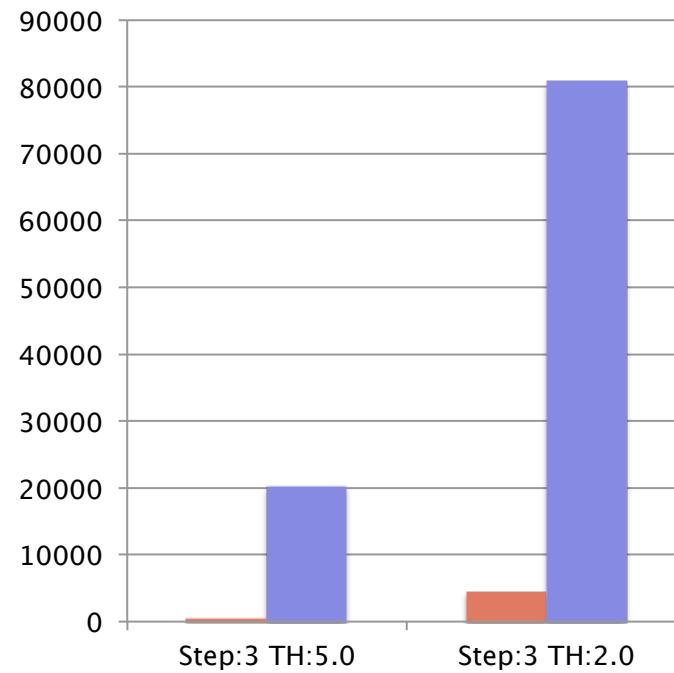
Example) Glucose ~ Succinate

Proposed (■) vs Sequential (■)

Reaction Data
— 1553 (TH: 2)
— 599 (TH: 5)



Reaction Steps : 2



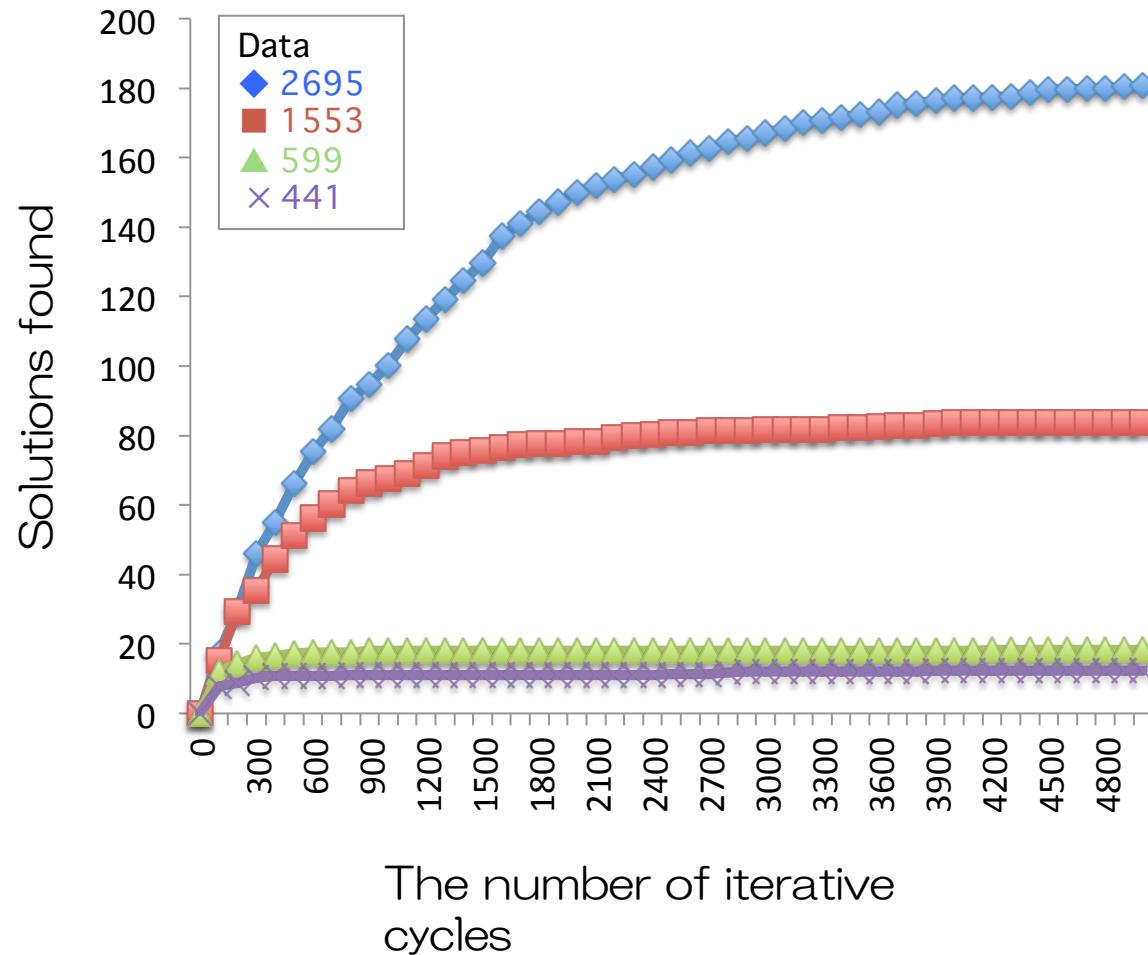
Reaction Steps : 3

Iterative Enumeration

65

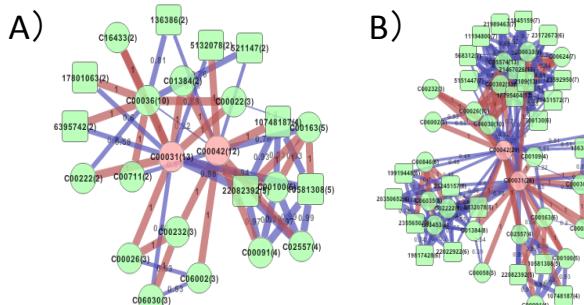
Example) Glucose \sim Succinate

Reaction step: 3

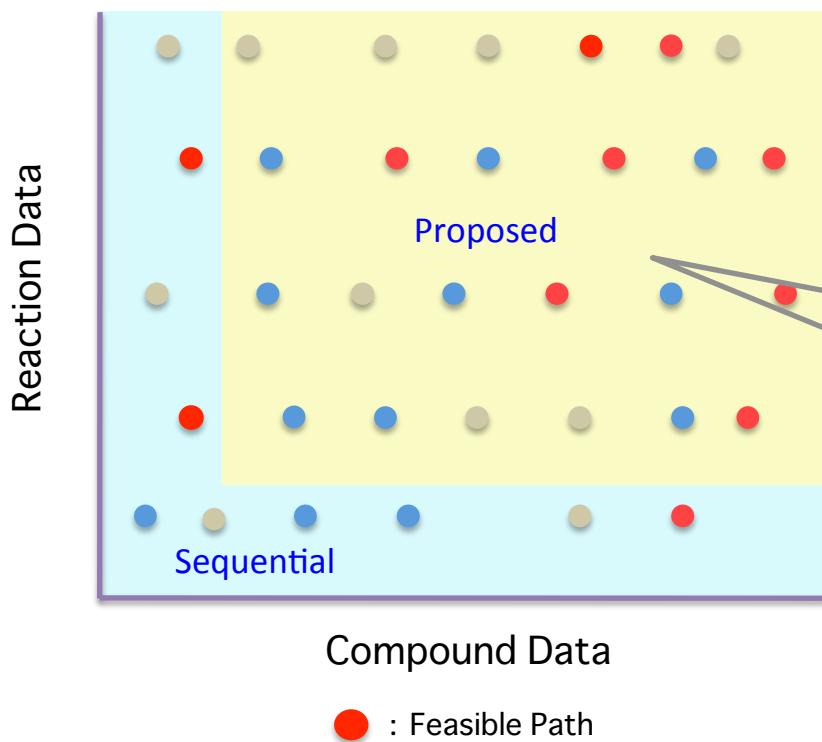


Advantage

66



Reaction Data: A < B < C < D



Increasing network diversity with putative compounds and reactions

Expanding the diversity of chemical and reaction information available for finding novel metabolic pathways

M-path

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<http://bp.scitec.kobe-u.ac.jp/m-path/server/>

Input interface

KEGG_ID
PubChem_ID

Job Register Form

CompoundID (Start):	C00031
CompoundID (Last):	C00042
Step Num:	3
Threshold:	2
Cycle Num:	1000
Hub:	<input checked="" type="radio"/> First <input type="radio"/> All <input type="radio"/> non
Option	
Feature Type:	<input type="radio"/> mol2 <input checked="" type="radio"/> mol2+ <input type="radio"/> mol2c+
Mode:	<input checked="" type="radio"/> Standard <input type="radio"/> Sequential
Rand Num:	500
Limit Num:	500
Add Reaction:	<input type="button"/>
Del Reaction:	<input type="button"/>

Compound List

CompoundID	SMILES	Type
TestCase	OC(=O)CC/C=C/C(=O)O	mol2+
CR00011	CC(=O)CCC	mol2+
CR00010	CC(=O)C=C	mol2+
CID8065	C(C=CCO)O	mol2+
CID8064	C(CCO)CO	mol2+

Reset Submit

Reaction_Step

Reaction_Diversity

Iteration_Number

Hub_Compound

Options

Start_Calculation

Example) Glucose ~ Succinate

Start Compound

Hub Compound

Reaction List

Pathway List

Reaction

Chemical Transition

Compound List

Path List

pid	Name	Score
PATH:1-1	Fumarate -- Succinate	1.0
1	C00031 -- C00122	1
1	C00122 -- C00042	1
PATH:4-2	2-Maleylacetate -- 3-Oxoadipate	0.704348
PATH:6-1	(2E)-5-Methylhexa-2,4-dienoyl-Co -- 5-Methylhex-4-en...	0.1145276
PATH:6-2	3,4-Dehydrolycopene -- Lycopene	0.10054965
PATH:3-2	Phytofluen -- Phytofen	0.09411205
PATH:5-2	zeta-Caroten -- Phytofluor	0.09411205
PATH:2-2	Neurosporen -- zeta-Caroten	0.09411205
PATH:3-1	Lycopene -- Neurosporen	0.09411205
PATH:7-1	gamma-Caroten -- beta-Zeacaroten	0.0787879
	delta-Caroten -- alpha-Zeacaroten	0.07545455

Path View

The Path View section displays a pathway diagram where Glucose (C00031) is converted to Succinate (C00042) through several intermediates and reactions. The diagram includes chemical structures for each compound and reaction arrows indicating the flow of the pathway.

Control

Reaction List

ID	RE	Name	Score	EC
1	C00042_C00122	Fumarate -- Succinate	1.0	1.3.1.6 1.3.99.1 1.3.5.1
2	C00846_C02222	2-Maleylacetate -- 3-Oxoadipate	0.704348	1.3.1.32
10	C16470_C16468	(2E)-5-Methylhexa-2,4-dienoyl-Co -- 5-Methylhex-4-en...	0.1145276	1.3.99-
7	C05432_C15867	3,4-Dehydrolycopene -- Lycopene	0.10054965	1.14.99-
3	C05413_C05414	Phytofluen -- Phytofen	0.09411205	1.14.99-
4	C05414_C05430	zeta-Caroten -- Phytofluor	0.09411205	1.14.99-
5	C05430_C05431	Neurosporen -- zeta-Caroten	0.09411205	1.14.99.30
6	C05431_C05432	Lycopene -- Neurosporen	0.09411205	1.14.99.30
8	C05404_C05435	gamma-Caroten -- beta-Zeacaroten	0.0787879	1.14.99.30
9	C14146_C08586	delta-Caroten -- alpha-Zeacaroten	0.07545455	1.14.99.30

Compound List

ID	KEGG	CID	Name	Similarity	C match
1	C00042	1110	butanedioic acid	1.0	1

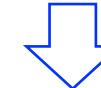
M-path

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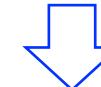
Enzymatic Reactions

Reaction		ID	RE	Name	Score	EC
40	C11062_C00989			4-Hydroxybutanoic acid – 4-Hydroxybutyryl-CoA	1.0	3.1.2.6.2.1.2.8.3 u...
42	C05668_C01013			3-Hydroxypropanoate – 3-Hydroxypropionyl-CoA	1.0	3.1.2.6.2.1.2.8.3 u...
44	C04047_C01188			3-Hydroxy-2-methylpropanoate – 3-Hydroxy-2-methylbutyryl-CoA	1.0	3.1.2.6.2.1.2.8.3 u...
69	C06000_C06001			(S)-3-Hydroxyisobutyrate – (S)-3-Hydroxyisobutyryl-CoA	1.0	3.1.2.6.2.1.2.8.3 u...
9	C00136_C00246			Butanoic acid – Butanoyl-CoA	0.990338	3.1.2.6.2.1.2.8.3 u...
95	C16268_C16267			Cyclopropanecarboxylat – Cyclopropanecarboxylic acid – Cyclopropanecarboxyl-CoA	0.990338	3.1.2.6.2.1.2.8.3 u...
2	C00091_C00042			Succinate – Succinyl-CoA	0.985714	3.1.2.6.2.1.2.8.3 u...
4	C00083_C00383			Malonate – Malonyl-CoA	0.985646	3.1.2.6.2.1.2.8.3 u...
16	C00827_C00186			(S)-Lactate – Lactoyl-CoA	0.985646	3.1.2.6.2.1.2.8.3 u...
34	C00683_C02170			Methylmalonate – (S)-Methylmalonyl-CoA	0.985646	3.1.2.6.2.1.2.8.3 u...
45	C01213_C02170			Methylmalonate – (R)-Methylmalonyl-CoA	0.985646	3.1.2.6.2.1.2.8.3 u...
60	C03188_C04025			alpha,omega-Dicarboxylic acid – omega-Carbonyl-CoA	0.985646	3.1.2.6.2.1.2.8.3 u...
6	C00100_C00163			Propanoate – Propanoyl-CoA	0.980583	3.1.2.6.2.1.2.8.3 u...
10	C04348_C00149			(S)-Malate – (3S)-3-Carboxy-3-hydroxypropanoyl-CoA	0.976636	3.1.2.6.2.1.2.8.3 u...
36	C00904_C00815			Citramalate – Citramalyl-CoA	0.976636	3.1.2.6.2.1.2.8.3 u...
37	C01011_C00815			Citramalate – (3S)-Citramalyl-CoA	0.976636	3.1.2.6.2.1.2.8.3 u...
41	C01011_C02614			(S)-2-Methylmalate – (3S)-Citramalyl-CoA	0.976636	3.1.2.6.2.1.2.8.3 u...
14	C00332_C00164			Acetoacetate – Acetoacetyl-CoA	0.97619	3.1.2.6.2.1.2.8.3 u...
22	C00356_C03761			3-Hydroxy-3-methylglutarate – (S)-3-Hydroxy-3-methylglutaryl-CoA	0.972093	3.1.2.6.2.1.2.8.3 u...
55	C03058_C02630			2-Hydroxyglutarate – 2-Hydroxyglutaryl-CoA	0.972093	3.1.2.6.2.1.2.8.3 u...
7	C00000_C00000			beta-Alanide – beta-Alanyl-CoA	0.974454	3.1.2.6.2.1.2.8.3 u...

EC_number



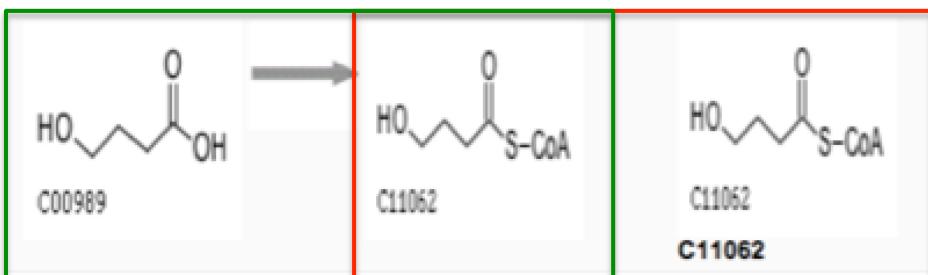
Multiple Alignment
Find Motifs



Genome mining



Enzyme/Gene Selection

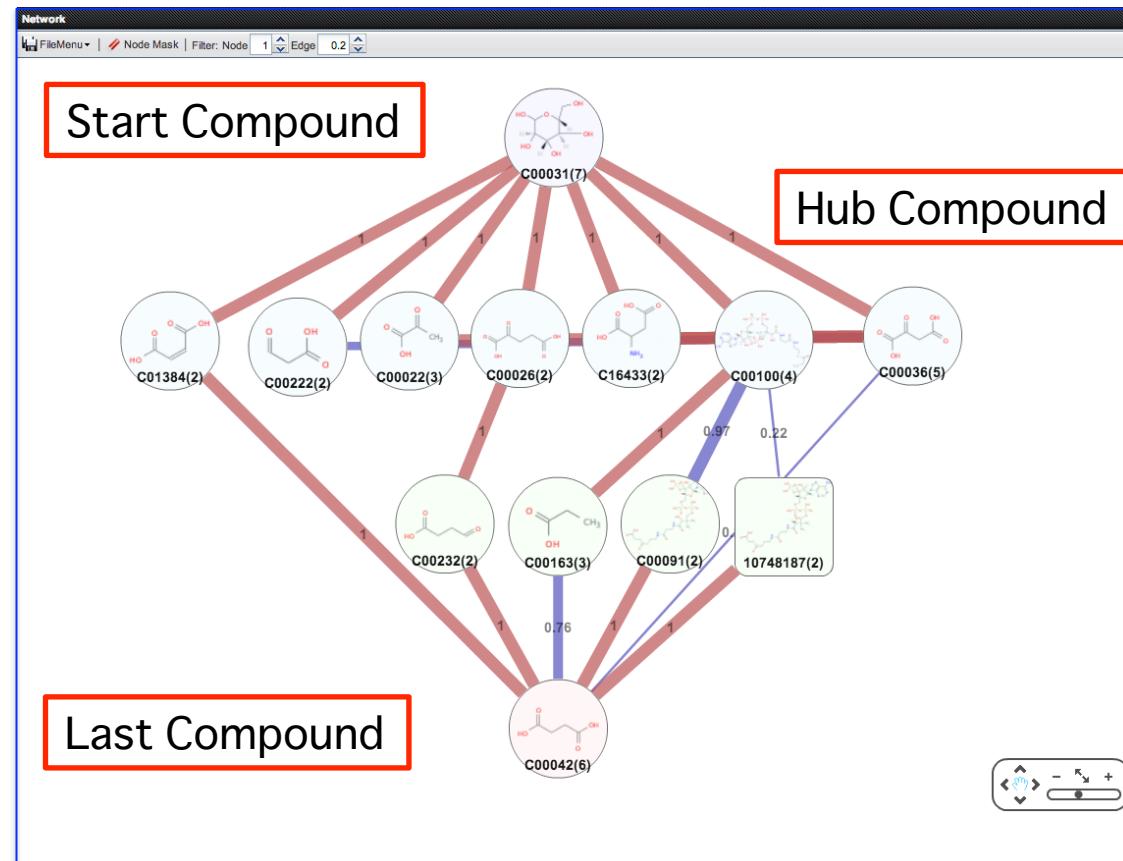
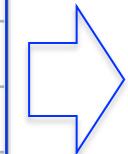


M-path

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Example) Glucose ~ Succinate

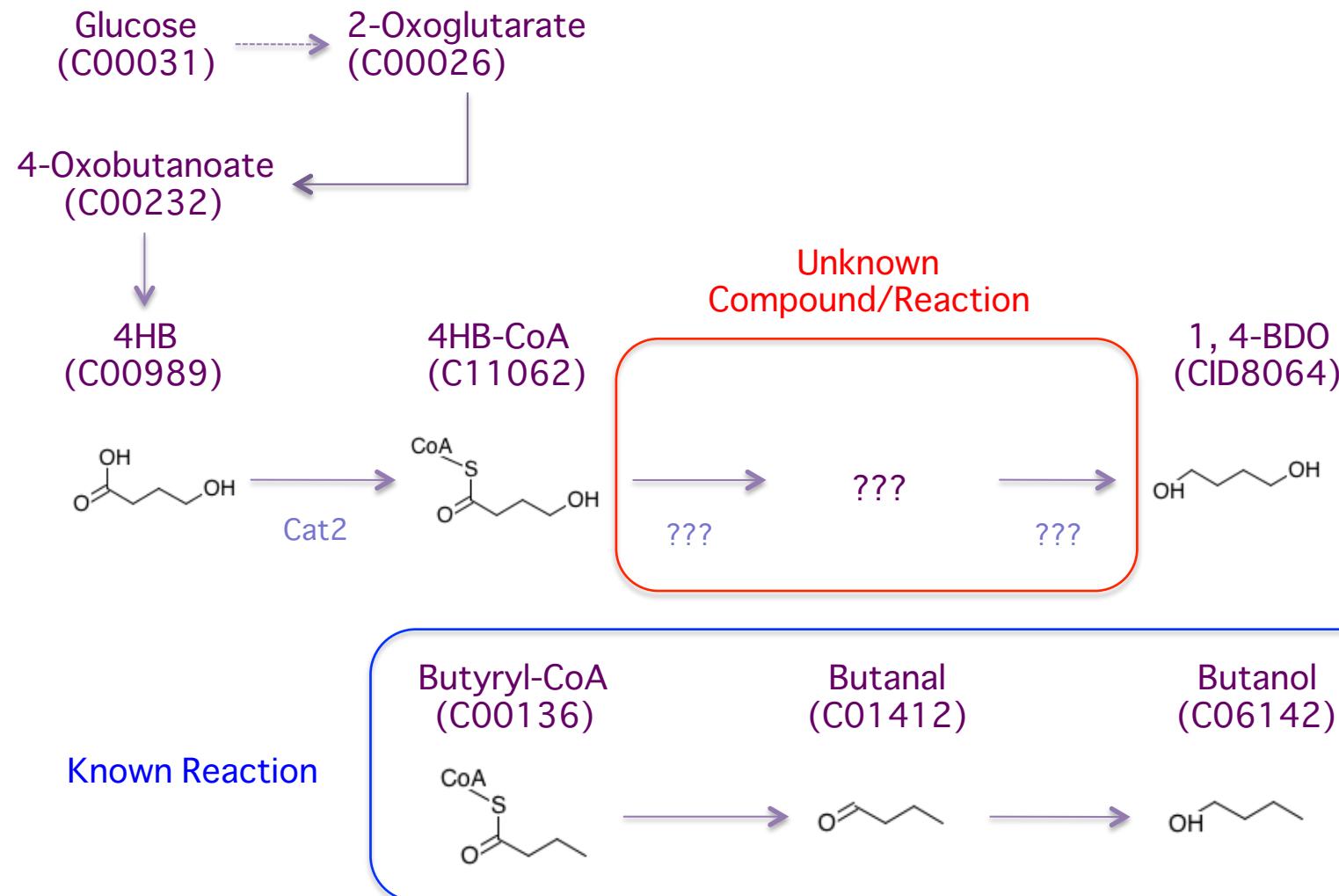
Path List		
pid	Name	Score
PATH:1-1	Total Score: 1, Step: 2	<input type="checkbox"/> passed <input type="checkbox"/> failed
PATH:4-2	Total Score: 1, Step: 3	<input type="checkbox"/> passed <input type="checkbox"/> failed
PATH:6-2	Total Score: 0.92, Step: 3	<input type="checkbox"/> passed <input type="checkbox"/> failed
PATH:3-2	Total Score: 0.74, Step: 3	<input type="checkbox"/> passed <input type="checkbox"/> failed
PATH:5-2	Total Score: 0.74, Step: 3	<input type="checkbox"/> passed <input type="checkbox"/> failed
PATH:6-1	Total Score: 0.74, Step: 3	<input type="checkbox"/> passed <input type="checkbox"/> failed
PATH:2-2	Total Score: 0.65, Step: 3	<input type="checkbox"/> passed <input type="checkbox"/> failed
PATH:3-1	Total Score: 0.65, Step: 3	<input type="checkbox"/> passed <input type="checkbox"/> failed
PATH:7-1	Total Score: 0.61, Step: 2	<input type="checkbox"/> passed <input type="checkbox"/> failed
PATH:4-1	Total Score: 0.63, not hit: 1, Step: 3	<input type="checkbox"/> passed <input type="checkbox"/> failed
PATH:5-1	Total Score: 0.59, not hit: 1, Step: 3	<input type="checkbox"/> passed <input type="checkbox"/> failed



- 1) Design metabolic pathways for specified target compounds
- 2) Enumerate reachable compounds from specified start compounds
- 3) Expand the scope of metabolic pathways
- 4) Find genes/metabolites using omics data

事例) 1,4-Butanediol

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Genomatica (Nat. Chem. Biol. 2011)

事例) 1,4-Butanediol

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Path Tree	
path_vc_C00031_CID8064_50000	ScoreReset
Name	Score
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 1, Yield: 150
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 1, Yield: 150
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 1, Yield: 150
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 1, Yield: 150
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.97, Yield: 150
D-Glucose -- 2-Oxoglutarate	1
Pyruvate - Acetaldehyde	1
2-Aminomalonate semialdehyde - L-Serine	1
Acetate - Acetyl-CoA	1
Acetyl-CoA - Acetaldehyde	0.82
2-Aminomalonate semialdehyde - L-Serine	1
2-Amin... Total Score: 1, Yield: 150	
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.96, Yield: 150, not hit: 1
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.96, Yield: 150, not hit: 1
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.96, Yield: 150, not hit: 1
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.96, Yield: 150, not hit: 1
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.96, Yield: 150
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.96, Yield: 150
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.95, Yield: 0
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.95, Yield: 0
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.95, Yield: 1
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.95, Yield: 1
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.94, Yield: 150, not hit: 1
2-Aminomalonate semialdehyde -- 2-Oxoglutarate	Total Score: 0.94, Yield: 150, not hit: 1

Pathway List

Path View

Control

ID	RE	Name	Score	EC
40	C11062_C00989	4-Hydroxybutanoic acid - 4-Hydroxybutyryl-CoA	1.0	3.1.2.6.2.1.2.8.3 u...
42	C05668_C01013	3-Hydroxypropanoate - 3-Hydroxypropionyl-CoA	1.0	3.1.2.6.2.1.2.8.3 u...
44	C04047_C01188	3-Hydroxy-2-methylpropanoate - 3-Hydroxy-2-methylbutyryl-CoA	1.0	3.1.2.6.2.1.2.8.3 u...
69	C08600_C06001	(S)-3-Hydroxyisobutyryl - (S)-3-Hydroxyisobutyryl-CoA	1.0	3.1.2.6.2.1.2.8.3 u...
9	C00136_C00246	Butanoic acid - Butanoyl-CoA	0.990338	3.1.2.6.2.1.2.8.3 u...
95	C16268_C16267	Cyclopropanecarboxylat - Cyclopropanecarboxyl-CoA	0.990338	3.1.2.6.2.1.2.8.3 u...
2	C00091_C00042	Succinate - Succinyl-CoA	0.985714	3.1.2.6.2.1.2.8.3 u...
4	C00083_C00383	Malonate - Malonyl-CoA	0.985646	3.1.2.6.2.1.2.8.3 u...
16	C00827_C00186	(S)-Lactate - (S)-Lactyl-CoA	0.985646	3.1.2.6.2.1.2.8.3 u...
34	C00683_C02170	Methylmalonate - (R)-Methylmalonyl-CoA	0.985646	3.1.2.6.2.1.2.8.3 u...
45	C01213_C02170	Methylmalonate - (R)-Methylmalonyl-CoA	0.985646	3.1.2.6.2.1.2.8.3 u...
60	C03188_C04025	alpha,omega-Dicarboxylic acid - omega-Carbonyl-CoA	0.985646	3.1.2.6.2.1.2.8.3 u...
6	C00100_C00163	Propanoate - Propanoyl-CoA	0.980583	3.1.2.6.2.1.2.8.3 u...
10	C04348_C00149	(S)-Malate - (3S)-3-Carboxy-3-hydroxypropanoyl-CoA	0.976636	3.1.2.6.2.1.2.8.3 u...
36	C00904_C00815	Citramalate - Citramalyl-CoA	0.976636	3.1.2.6.2.1.2.8.3 u...
37	C01011_C00815	Citramalate - (3S)-Citramalyl-CoA	0.976636	3.1.2.6.2.1.2.8.3 u...
41	C01011_C02614	(S)-2-Methylmalate - (3S)-Citramalyl-CoA	0.976636	3.1.2.6.2.1.2.8.3 u...
14	C00332_C00164	Acetoacetate - Acetoacetyl-CoA	0.97619	3.1.2.6.2.1.2.8.3 u...
22	C00356_C03761	3-Hydroxy-3-methylglutamate - (S)-3-Hydroxy-3-methylglutaryl-CoA	0.972093	3.1.2.6.2.1.2.8.3 u...
55	C03058_C02630	2-Hydroxyglutarate - 2-Hydroxyglutaryl-CoA	0.972093	3.1.2.6.2.1.2.8.3 u...

Assigned Reaction

Assigned Compound

Chemical Transition

Reaction List

Compound List

Reachable compounds

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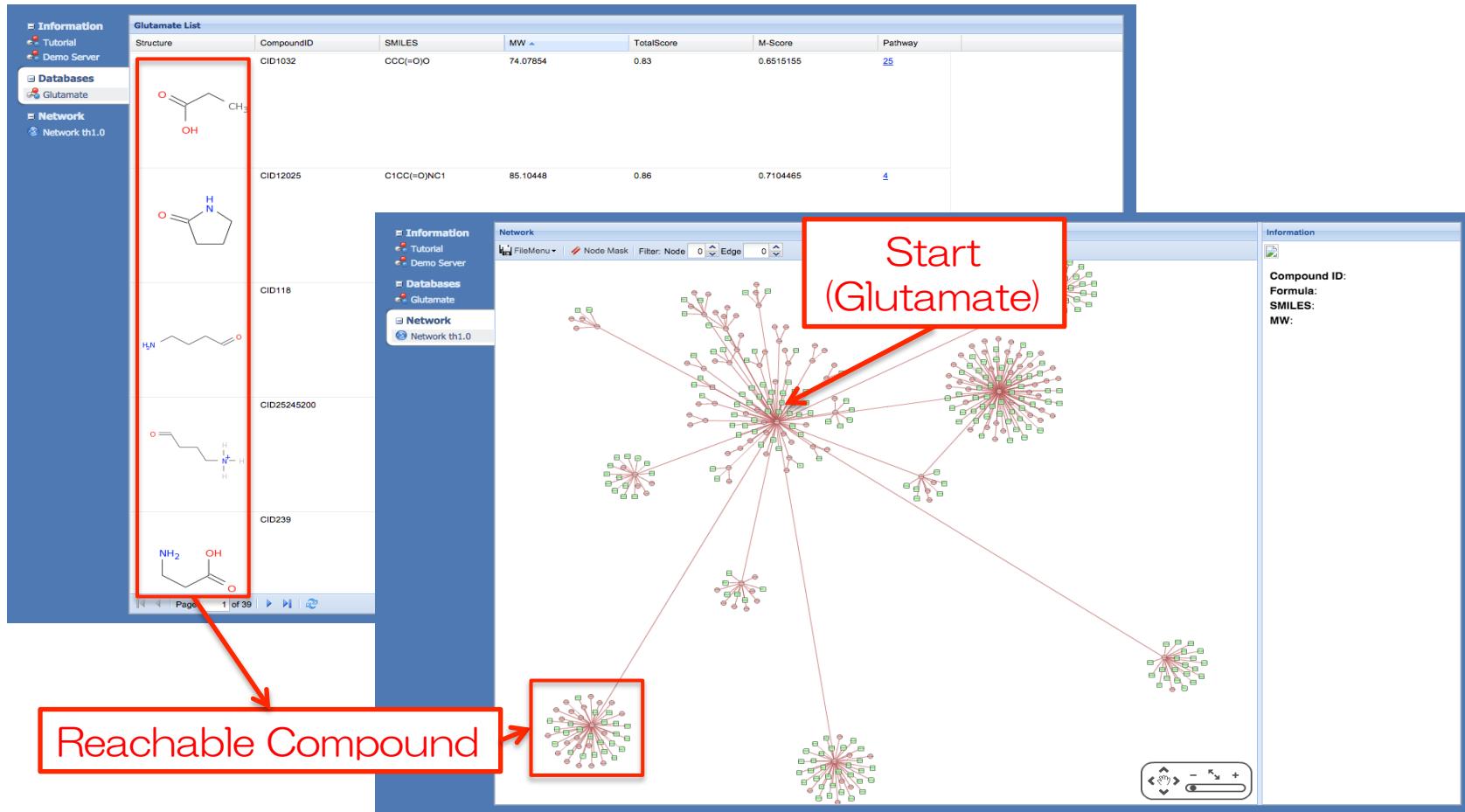
Calculate N steps from start compounds (eg. glutamate)

Glutamate List						
Structure	CompoundID	SMILES	MW ▲	TotalScore	M-Score	Pathway
	CID1032	CCC(=O)O	74.07854	0.83	0.6515155	25
	CID12025	C1CC(=O)NC1	85.10448	0.86	0.7104465	4
	CID118	C(CC=O)CN	87.12036	1.0	1.0	8

Reachable compounds

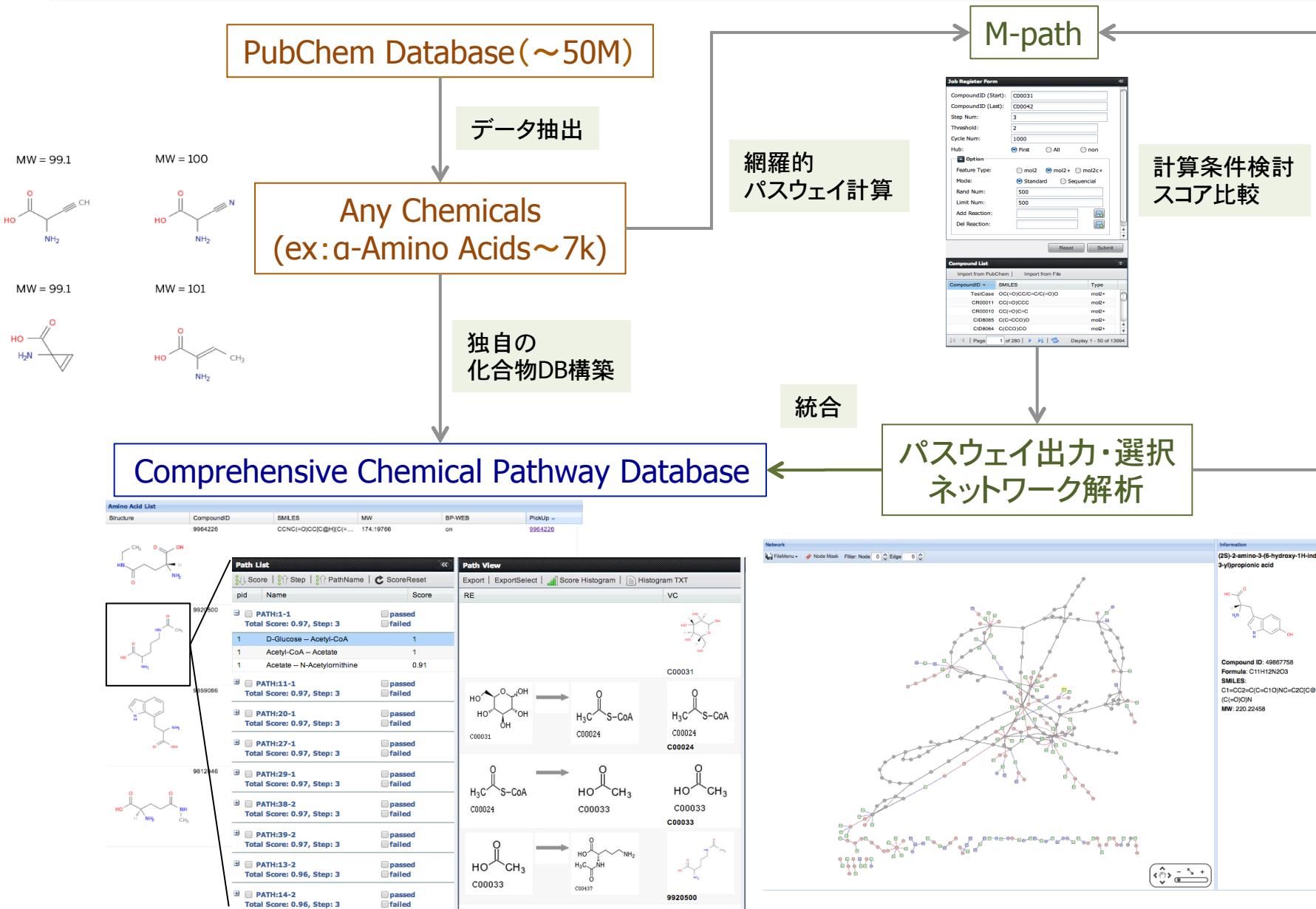
75

Integrate all pathways from glutamate



Expanding Metabolic Pathway

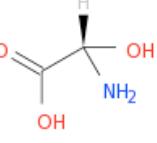
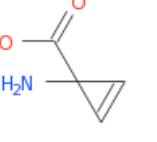
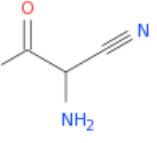
76



Expanding Metabolic Pathway

77

<http://bp.scitec.kobe-u.ac.jp/m-path/db/>

Amino Acid List						
Structure	CompoundID	SMILES	MW ▲	TotalScore	M-Score	Pathway
	CID18976960	C(C(=O)O)(N)N	90.08124	<div style="border: 1px solid #ccc; padding: 2px;">A  Sort Ascending Z  Sort Descending Columns  Filters </div>	0.430622	yes
	CID16744473	[C@H](C(=O)O)(N)O	91.066	0.88		yes
	CID10996968	C1=CC1(C(=O)O)N	99.088	0.77	0.3058555	yes
	CID533486	C(#N)C(C(=O)O)N	100.07606	0.86	0.6555185	yes

Expanding Metabolic Pathway

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<http://bp.scitec.kobe-u.ac.jp/m-path/db/>

Path List		
pid	Name	Score
PATH:3-1 passed		
Total Score: 0.97, Step: 3 failed		
4	D-Glucose -- L-Serine	1
4	L-Serine -- L-Tryptophan	1
4	C00078 -- C00643	0.92
PATH:8-1 passed		
Total Score: 0.97, Step: 3 failed		
9	D-Glucose -- Formate	1
9	C00058 -- C05648	1
9	C05648 -- C00643	0.92
PATH:10-1 passed		
Total Score: 0.71, Step: 3 failed		
PATH:15-1 passed		
Total Score: 0.66, Step: 3 failed		
PATH:11-1 passed		
Total Score: 0.58, Step: 3 failed		
PATH:7-1 passed		
Total Score: 0.57, Step: 3 failed		
PATH:4-1 passed		
Total Score: 0.47, not hit: 1, Step: 3 failed		

Path View

Export ExportSelect Score Histogram Histogram TXT

RE

C00031

VC

C000716

C00065

C00078

C00806

C00643

589768

Control

Reaction List

ID	RE	Name	Score	EC
1	C00643_C00078	L-Tryptophan -- 5-Hydroxy-L-tryptophan	0.92406	1.14.16.4
2	C00082_C00079	L-Phenylalanine -- L-Tyrosine	0.6013515	1.14.16.1
67	C05643_C01598	Melatonin -- 6-Hydroxymelatoni	0.6001985	1.14.14.1
3	C00355_C00082	L-Tyrosine -- 3,4-Dihydroxy-L-phenylalanine	0.595226	1.10.3.1 1.14.18.1...
16	C03227_C00328	L-Kynurenin -- 3-Hydroxy-L-kynurenin	0.559275	1.14.13.9
22	C05658_C00463	Indole -- Indoxy	0.5027315	1.14.16.-
69	C01717_C06325	2-Quinoliniccarboxylic acid -- 4-Hydroxy-2-quinol...	0.494649	1.3.99.18
94	C11457_C05629	Phenylpropanoate -- 3-(3-Hydroxy-phenyl)-prop...	0.4627745	
57	C15986_C01297	6-Hydroxypseudooxynicotine -- 2,6-Dihydroxyp...	0.4550825	1.14.18.-
115	C09239_C11635	10-Deoxysarpagine -- Sarpagin	0.4489245	1.14.13.91
55	C04044_C01198	3-(2-Hydroxyphenyl)propanoate -- 3-(2,3-Dihyd...	0.4460225	1.14.13.4
86	C04044_C11457	3-(3-Hydroxy-phenyl)-propanoic acid -- 3-(2,3-Di...	0.4460225	1.14.13.-
5	C00632_C00108	Anthranilate -- 3-Hydroxyanthranilate	0.4431685	1.14.16.3
102	C06330_C06343	Quinolin-4-o -- Quinoline-3,4-diol	0.43378	1.14.13.62

Compound List

ID	KEGG	CID	Name	Similarity	C match
11		589768	2-amino-3-(4-hydroxy-1H-indol-3-yl)propanoic acid	0.92406	0.27

Expanding Metabolic Pathway

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<http://bp.scitec.kobe-u.ac.jp/m-path/aa/>

Network

FileMenu | Node Mask | Filter: Node 0 Edge 0

Data from amino acids with top 100 M-scores

Information

(2S)-2-amino-3-(6-hydroxy-1H-indol-3-yl)propionic acid

ありがとうございました

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Organization of Advanced Science and Technology
Kobe University