Homework 3

Design a producer strain hosting a synthetic production pathway

Jaakko Hassinen

Goal

- To design a heterologous pathway which produces vanillin glucosidase in Saccharomyces cerevisiae.
- To achieve the goal, a heterologous pathway from E. coli is adapted into Saccharomyces cerevisiae.

Software and models used

- Framed in Anaconda (Python 3.6) environment
 - IBM ILOG CPLEX used as a solver for Framed
- XTMS: Pathway design in an eXTended Metabolic Space
 - Used for finding possible metabolic pathways
- Yeast-GEM model
 - Systems and Synthetic Biology at Chalmers University of Technology

Steps

- Choice of pathway
- Insertion into a yeast model
- Optimization

Steps

Choice of pathway

- Insertion into a yeast model
- Optimization

XTMS: Pathway design in an eXTended Metabolic Space

- An online application which finds heterologous pathways for different compounds in E. coli
 - http://xtms.issb.genopole.fr/
- XTMS is used for finding possible pathways for adaption in yeast.



Choose the pathways



XTMS search for vanillin





Select pathway

Rank	Total score	Gene score	Steps	Putatives	Toxicity	Yield	Gibbs	Unfavorable	Pathway
1	332.252	0.253	2	0	-0.415	3.28e-01	-44.070	0	vanillin <- protocatechualdehyde <- <i>trans-</i> resveratrol
2	166.193	0.597	6	0	-0.842	1.65e-01	-19.333	1	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- ferulate <- trans-caffeate <- 4-coumarate <- L-tyrosine
<u>3</u>	166.161	0.585	6	0	-0.863	1.65e-01	-19.333	2	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- trans-caffeate <- 4-coumarate <- L-tyrosine
<u>4</u>	165.481	0.573	8	0	-0.978	1.65e-01	-13.810	2	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- trans-5-O-caffeoyl-D-quinate <- trans-5-O-(4-coumaroyl)-D-quinate <- 4-coumaroyl-CoA <- 4-coumaret <- L-tyrosine
<u>5</u>	165.343	0.452	8	0	-0.995	1.65e-01	-13.810	2	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- caffeoylshikimate <- 4-coumaroylshikimate <- 4-coumaroyl-CoA <- 4-coumarate <- L-tyrosine
<u>6</u>	4.925	0.606	6	0	-0.842	1.00e-03	-41.583	0	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- ferulate <- trans-caffeate <- trans-cinnamate
Z	4.893	0.594	6	0	-0.863	1.00e-03	-41.583	1	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- trans-caffeate <- 4-coumarate <- trans-cinnamate
<u>8</u>	3.575	0.579	8	0	-0.978	1.00e-03	-29.702	1	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- trans-5-O-caffeoyl-D-quinate <- trans-5-O-(4-coumaroyl)-D-quinate <- 4-coumaroyl-CoA <- 4-coumaret <- trans-cinnamate
<u>9</u>	3.437	0.459	8	0	-0.995	1.00e-03	-29.702	1	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- caffeoylshikimate <- 4-coumaroylshikimate <- 4-coumaroyl-CoA <- 4-coumaroyl-CoA <- trans-cinnamate
<u>10</u>	2.729	0.717	7	0	-0.847	1.00e-03	-18.564	1	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- ferulate <- trans-caffeate <- 4-coumarate <- (R+)-3-(4-hydroxyphenyl)lactate <- 4-hydroxyphenylpyruvate
ш	2.702	0.707	7	0	-0.865	1.00e-03	-18.564	2	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- trans-caffeate <- 4-cournarate <- (R+)-3-(4-hydroxyphenyl)lactate <- 4-hydroxyphenylpyruvate
<u>12</u>	2.098	0.669	9	0	-0.966	1.00e-03	-13.923	2	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- trans-5-O-caffeoyl-D-quinate <- trans-5-O-(4-coumaroyl)-D-quinate <- 4-coumaroyl-CoA <- 4-coumare <- (R+)-3-(4-hydroxyphenyl)lactate <- 4-hydroxyphenylpyruvate
<u>13</u>	1.975	0.562	9	0	-0.982	1.00e-03	-13.923	2	vanillin <- 4-hydroxy-3-methoxyphenyl+B-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- caffeoyl-hikimate <- 4-coumaroylshikimate <- 4-coumaroyl-CoA <- 4-coumaroyl-CoA <- (R+)-3-(4-hydroxyphenyl)lactate <- 4-hydroxyphenylpyruvate

Possible reactants

- Protocatechualdehyde
- trans-resveratrol
- 4-hydroxy-3-methoxyphenyl-βhydroxypropionyl-CoA
- feruloyl-CoA
- Ferulate
- trans-caffeate
- 4-coumarate
- L-tyrosine
- caffeoyl-CoA

- *trans*-5-O-caffeoyl-D-quinate
- trans-5-O-(4-coumaroyl)-Dquinate
- 4-coumaroyl-CoA
- caffeoylshikimate
- 4-coumaroylshikimate
- trans-cinnamate
- trans-5-O-caffeoyl-D-quinate
- (R+)-3-(4-hydroxyphenyl)lactate
- 4-hydroxyphenylpyruvate

Reactants available in yeast

- L-tyrosine (s_1051, cytoplasm)
- 4-hydroxyphenylpyruvate (s_0204, cytoplasm)
- Pathways that do not have either of these reactants cannot be used unless the alternate reactants are produced using heterologous pathways.

The pathways possible in yeast

Compound Structure				
vanillin 10	Compound	Structure		
Vanillin Ho		ļ		
	<u>vanillin</u>	HO		

Select pathway

Rank	Total score	Gene score	Steps	Putatives	Toxicity	Yield	Gibbs	Unfavorable	Pathway
2	166.193	0.597	6	0	-0.842	1.65e-01	-19.333	1	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- ferulate <- trans-caffeate <- 4-coumarate <- L-tyrosine
<u>3</u>	166.161	0.585	6	0	-0.863	1.65e-01	-19.333	2	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- trans-caffeate <- 4-coumarate <- L-tyrosine
<u>4</u>	165.481	0.573	8	0	-0.978	1.65e-01	-13.810	2	vanilin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- trans-5-O-caffeoyl-D-quinate <- trans-5-O-(4-coumaroyl)-D-quinate <- 4-coumaroyl-CoA <- 4-coumarate <- L-tyrosine
<u>5</u>	165.343	0.452	8	0	-0.995	1.65e-01	-13.810	2	vanillin <- 4-hydroxy-3-methoxyphenyl-B-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- 4-coumaroylshikimate <- 4-coumaroylshikimate <- 4-coumaroyl-CoA <- 4-coumaroyl-CoA <- 4-coumarot <- L-tyrosine
<u>10</u>	2.729	0.717	7	0	-0.847	1.00e-03	-18.564	1	vanilin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- ferulate <- trans-caffeate <- 4-coumarate <- (R+)-3-(4-hydroxyphenyl)lactate <- 4-hydroxyphenylpyruvate
ш	2.702	0.707	7	0	-0.865	1.00e-03	-18.564	2	vanilin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- trans-caffeate <- 4-coumarate <- (R+)-3-(4-hydroxyphenyl)lactate <- 4-hydroxyphenylpyruvate
<u>12</u>	2.098	0.669	9	0	-0.966	1.00e-03	-13.923	2	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- trans-5-O-caffeoyl-D-quinate <- trans-5-O-(4-coumaroyl)-D-quinate <- 4-coumaroyl-CoA <-
<u>13</u>	1.975	0.562	9	0	-0.982	1.00e-03	-13.923	2	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- caffeoylshikimate <- 4-coumaroylshikimate <- 4-coumaroyl-CoA <- 4-coumaroyl-CoA <- 4-hydroxyphenyl)lactate <- 4-hydroxyphenylpyruvate

Home -> Select compound -> Select pathway -> Pathway info Reaction info Downloads Statistics Help About



Select pathway

Rank	Total score	Gene score	Steps	Putatives	Toxicity	Yield	Gibbs	Unfavorable	Pathway
2	166.193	0.597	6	0	-0.842	1.65e-01	-19.333	1	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- ferulate <- trans-caffeate <- 4-coumarate <- L-tyrosine
<u>3</u>	166.161	0.585	6	0	-0.863	1.65e-01	-19.333	2	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- <i>trans</i> -caffeate <- 4-coumarate <- L-tyrosine
<u>4</u>	165.481	0.573	8	0	-0.978	1.65e-01	-13.810	2	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- trans-5-O-caffeoyl-D-quinate <- trans-5-O-(4-coumaroyl)-D-quinate <- 4-coumaroyl-CoA <- 4-coumarate <- L-tyrosine
<u>5</u>	165.343	0.452	8	0	-0.995	1.65e-01	-13.810	2	vanillin <- 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA <- feruloyl-CoA <- caffeoyl-CoA <- caffeoylshikimate <- 4-coumaroylshikimate <- 4-coumaroyl-CoA <- 4-cou

Pathway info of Path 2



Reactions

Reaction

RXN-9697_1_0_0

RXN-1103_1_0_0

RXN-1104_1_0_0

RXN-10921_1_0_0

6.2.1.34-

RXN_1_0_0

4.1.2.41-

RXN_1_0_0

Precursors

S-aden

L-methionir

L-tyrosine Consumed

cofactors

coenzyme

NADPH

oxygen

Intermediates

4-coumarate 3-metho

trans-caffe ferulate

ferulovI-Co. Intermediate

cofactors

Products

acetyl-CoA

S-adenosyl

L-home

vanillin

hydroxyl radical

ATP



Maximum yield:	1.65e-01 mmol/gDW/h
Main	S-ADENOSYLMETHIONINE,
bottlenecks:	CO-A



Best gene options for the pathway

Top constructs

sbml sbol	Total score	RXN-9697	Score	RXN-1103	Score	RXN-1104	Score	6.2.1.34- RXN	Score	RXN-10921	Score	4.1.2.41-RXN	Score
1	0.597	<u>rsh:Rsph17029_3256</u>	0.501	<u>bja:bll8073</u>	0.559	<u>sme:SM_b20515</u>	1.565	<u>rle:RL0889</u>	0.368	<u>abo:ABO_2150</u>	0.464	<u>dde:Dde_1990</u>	0.126
<u>2</u>	0.574	<u>rsh:Rsph17029_3256</u>	0.501	<u>bja:bll8073</u>	0.559	<u>ret:RHE_PF00076</u>	1.428	<u>rle:RL0889</u>	0.368	<u>abo:ABO_2150</u>	0.464	<u>dde:Dde_1990</u>	0.126
<u>3</u>	0.567	<u>rsh:Rsph17029_3256</u>	0.501	<u>bja:bll8073</u>	0.559	<u>sit:TM1040_1028</u>	1.384	<u>rle:RL0889</u>	0.368	<u>abo:ABO_2150</u>	0.464	<u>dde:Dde_1990</u>	0.126
<u>4</u>	0.557	<u>rsh:Rsph17029_3256</u>	0.501	<u>bja:bll8073</u>	0.559	bid:Bind_0707	1.324	<u>rle:RL0889</u>	0.368	<u>abo:ABO_2150</u>	0.464	<u>dde:Dde_1990</u>	0.126
<u>5</u>	0.557	<u>rsh:Rsph17029_3256</u>	0.501	<u>bja:bll8073</u>	0.559	bid:Bind_3835	1.323	<u>rle:RL0889</u>	0.368	<u>abo:ABO_2150</u>	0.464	<u>dde:Dde_1990</u>	0.126
<u>6</u>	0.547	<u>rsh:Rsph17029_3256</u>	0.501	<u>bja:bll8073</u>	0.559	<u>eba:ebA670</u>	1.265	<u>rle:RL0889</u>	0.368	<u>abo:ABO_2150</u>	0.464	<u>dde:Dde_1990</u>	0.126
Z	0.515	<u>rsh:Rsph17029_3256</u>	0.501	<u>bja:bll8073</u>	0.559	jan:Jann_2564	1.070	<u>rle:RL0889</u>	0.368	<u>abo:ABO_2150</u>	0.464	<u>dde:Dde_1990</u>	0.126
<u>8</u>	0.509	<u>rsh:Rsph17029_3256</u>	0.501	<u>bja:bll8073</u>	0.559	<u>pae:PA2735</u>	1.036	<u>rle:RL0889</u>	0.368	<u>abo:ABO_2150</u>	0.464	<u>dde:Dde_1990</u>	0.126
<u>9</u>	0.499	<u>rsh:Rsph17029_3256</u>	0.501	<u>bja:bll8073</u>	0.559	<u>sit:TM1040_2227</u>	0.978	<u>rle:RL0889</u>	0.368	<u>abo:ABO_2150</u>	0.464	<u>dde:Dde_1990</u>	0.126
<u>10</u>	0.499	<u>rsh:Rsph17029_3256</u>	0.501	<u>bja:bll8073</u>	0.559	<u>mca:MCA0278</u>	0.977	<u>rle:RL0889</u>	0.368	<u>abo:ABO_2150</u>	0.464	<u>dde:Dde_1990</u>	0.126

Steps

- Choice of pathway
- Insertion into a yeast model
- Optimization

Modelling of the pathway

- Framed is used for modeling and analysis of the heterologous pathway in yeast.
- The yeast model is imported and a copy is made for the modified model

Init

In [1]: %matplotlib inline import numpy from framed import load_cbmodel, FBA, FVA, plot_flux_envelope, essential_genes, essential_reactions

Loading yeast model

```
In [2]: model = load_cbmodel('yeast_7.6_cobra.xml')
model_vanillin = model.copy()
```

```
RXN-9697_1_0_0:
L-tyrosine [cytoplasm] => 4-coumarate + ammonium [cytoplasm]
```

RXN-1103_1_0_0: 4-coumarate + H+[cytoplasm] + oxygen[cytoplasm] + NADPH[cytoplasm] => trans-caffeate + H20[cytoplasm] + NADP(+)[cytoplasm]

RXN-1104_1_0_0: trans-caffeate + S-adenosyl-L-methionine [cytoplasm] => ferulate + S-adenosyl-L-homocysteine[cytoplasm] + H+[cytoplasm]

```
6.2.1.34-RXN_1_0_0:
ferulate + coenzyme A [cytoplasm] + ATP [cytoplasm] => feruloyl-CoA + AMP [cytoplasm] + diphosphate [cytoplasm]
```

```
RXN-10921_1_0_0:
feruloyl-CoA + H2O [cytoplasm] => 4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA
```

```
4.1.2.41-RXN_1_0_0:
4-hydroxy-3-methoxyphenyl-β-hydroxypropionyl-CoA => vanillin + acetyl-CoA
```

```
vanillin glucosyltransferase:
UDP-glucose + vanillin [cytoplasm] => UDP + vanillin glucoside [cytoplasm]
```

```
vanillin glucoside transport:
vanillin glucoside [cytoplasm] => vanillin glucoside [extracellular]
```

```
vanillin glucoside exchange:
:vanillin glucoside [extracellular] =>
```

Native metabolite identifiers:

```
s 0373 acetyl-CoA [cytoplasm]
s 0419 ammonium [cytoplasm]
s 0423 AMP [cytoplasm]
s 0434 ATP [cytoplasm]
s 0529 coenzyme A [cytoplasm]
s 0633 diphosphate [cytoplasm]
s 0794 H+ [cytoplasm]
s 0803 H20 [cytoplasm]
s 1051 L-tyrosine [cytoplasm]
s 1207 NADP(+) [cytoplasm]
s 1212 NADPH [cytoplasm]
s 1275 oxygen [cytoplasm]
s 1413 S-adenosyl-L-homocysteine [cytoplasm]
s 1416 S-adenosyl-L-methionine [cytoplasm]
s 1538 UDP [cytoplasm]
s 1543 UDP-D-glucose [cytoplasm]
```

Reactions are inserted into the model

```
In [3]: fadd Vanillin glucoside synthesis pathway to the model
model_vanillin.add_reaction_from_str('r_9998: s_1051 <-> s_9999 + s_0419') #RXN-9697_1_0_0
model_vanillin.add_reaction_from_str('r_9998: s_0794 + s_1212 + s_1275 + s_9999 <-> s_0803 + s_1207 + s_9998') #RXN-1103_1_0_
model_vanillin.add_reaction_from_str('r_9997: s_1416 + s_9998 <-> s_0794 + s_1413 + s_9997') #RXN-1104_1_0_0
model_vanillin.add_reaction_from_str('r_9995: s_9996 + s_0803 <-> s_0995') #RXN-10921_1_0_0
model_vanillin.add_reaction_from_str('r_9995: s_9996 + s_0803 <-> s_9995') #RXN-10921_1_0_0
model_vanillin.add_reaction_from_str('r_9993: s_1543 + s_9994 <-> s_1538 + s_9994') #4.1.2.41-RXN_1_0_0
model_vanillin.add_reaction_from_str('r_9992: s_9993 <-> s_9992')
model_vanillin.add_reaction_from_str('r_9991: s_9992 <-> ')
model_vanillin.reactions.r_2111.set_objective(0) #Growth objective set to 0
model_vanillin.reactions.r_9991.set_objective(1)
```

In [4]: solution_vanillin=FBA(model_vanillin)

print('Vanillin glucoside production:', solution_vanillin.values['r_9991'])

Vanillin glucoside production: 0.3311258278145695

Steps

- Choice of pathway
- Insertion into a yeast model
- Optimization

Essential genes and reactions in vanillin production

In [7]: essential_gns_vanillin = essential_genes(model_vanillin, constraints={'r_9991': numpy.floor(numpy.power(10,9)*solution_vanill. print(essential_gns_vanillin)

['G_Q0045', 'G_Q0080', 'G_Q0085', 'G_Q0105', 'G_Q0130', 'G_Q0250', 'G_Q0275', 'G_YAL044C', 'G_YBL045C', 'G_YBL099W', 'G_YBR 039W', 'G_YBR166C', 'G_YBR196C', 'G_YBR263W', 'G_YBR291C', 'G_YCR012W', 'G_YDL004W', 'G_YDL067C', 'G_YDR019C', 'G_YDR035W', 'G_YDR050C', 'G_YDR127W', 'G_YDR148C', 'G_YDR178W', 'G_YDR226W', 'G_YDR298C', 'G_YDR377W', 'G_YDR529C', 'G_YEL024W', 'G_YER 043C', 'G_YER065C', 'G_YER091C', 'G_YFL018C', 'G_YFL030W', 'G_YFR033C', 'G_YGL148W', 'G_YGL187C', 'G_YGL191W', 'G_YGL202W', 'G_YGR183C', 'G_YGR208W', 'G_YGR240C', 'G_YGR244C', 'G_YHR001W_A', 'G_YHR051W', 'G_YHR137W', 'G_YHR208W', 'G_YIL125W', 'G_Y JL121C', 'G_YJL166W', 'G_YJR095W', 'G_YJR105W', 'G_YJR121W', 'G_YJR148W', 'G_YKL016C', 'G_YKL060C', 'G_YKL067W', 'G_YKL085W ', 'G_YKL141W', 'G_YKL152C', 'G_YLL041C', 'G_YLR038C', 'G_YLR058C', 'G_YLR174W', 'G_YLR295C', 'G_YLR304C', 'G_YLR395C', 'G_ YML042W', 'G_YML081C_A', 'G_YMR189W', 'G_YMR205C', 'G_YMR256C', 'G_YMR267W', 'G_YNL241C', 'G_YOR065W', 'G_YOR095C', 'G_YOR1 42W', 'G_YOR184W', 'G_YPL078C', 'G_YPL262W', 'G_YPL271W', 'G_YPR021C', 'G_YPR060C', 'G_YPR191W']

In [8]: len(essential gns vanillin)

Out[8]: 84

In [12]: essential_rcs_vanillin = essential_reactions(model_vanillin, constraints={'r_9991': numpy.floor(numpy.power(10,9)*solution_vanillin)

< 🗌

['r_0020', 'r_0039', 'r_0040', 'r_0065', 'r_0080', 'r_0091', 'r_0142', 'r_0144', 'r_0148', 'r_0156', 'r_0226', 'r_0252', 'r 0254', 'r_0278', 'r_0279', 'r_0300', 'r_0366', 'r_0438', 'r_0439', 'r_0451', 'r_0452', 'r_0466', 'r_0467', 'r_0471', 'r_04 86', 'r_0502', 'r_0503', 'r_0505', 'r_0534', 'r_0569', 'r_0659', 'r_0662', 'r_0663', 'r_0664', 'r_0713', 'r_0726', 'r_0727' , 'r_0811', 'r_0831', 'r_0832', 'r_0888', 'r_0889', 'r_0891', 'r_0892', 'r_0893', 'r_0917', 'r_0918', 'r_0939', 'r_0982', ' 0984', 'r_0996', 'r_0997', 'r_1021', 'r_1022', 'r_1049', 'r_1050', 'r_1054', 'r_1110', 'r_1127', 'r_1166', 'r_1194', 'r_1 245', 'r_1265', 'r_1277', 'r_1567', 'r_1596', 'r_1696', 'r_1697', 'r_1708', 'r_1714', 'r_1811', 'r_1898', 'r_1965', 'r_1978 ', 'r_1979', 'r_1992', 'r_2032', 'r_2045', 'r_2096', 'r_2100', 'r_9999', 'r_9998', 'r_9997', 'r_9996', 'r_9995', 'r_9994', 'r 9993', 'r 9992', 'r 9991']

In [13]: len(essential rcs vanillin)

Out[13]: 89

Questions