



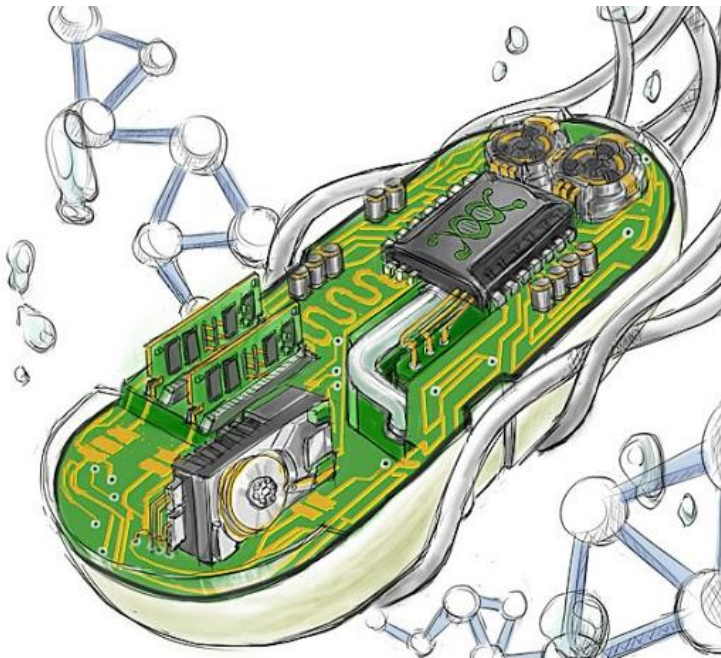
Webinar BEM Biologi 11-03-2021
Brainstorming BIOS

Pengantar *Computer Aided Cell Factory Design*

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Matin Nuhamunada

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Natural Products Genome Mining



Danmarks
Tekniske
Universitet

Luaran

- Peserta dapat menjelaskan *Genome-Scale Metabolic Models (GSM)*
- Peserta dapat mencari GSM di database online
- Peserta mengenal Constraint Based Analysis dengan menggunakan COBRApy*
- Peserta dapat memberikan contoh desain *Cell Factory* dengan melakukan manipulasi GSM

Outline

- Perkenalan
- Kompetisi Bioengineering
- Cell Factory & Novo Nordisk
- Systems Biology & Flux Balance Analysis
- *Hands-on Session*



The Novo Nordisk Foundation
Center for Biosustainability

novo
nordisk
fonden



Danmarks
Tekniske
Universitet

Bioteknologi
Systems & Synthetic Biology
(Meta) Genome Mining
Cell Factory Engineering



جامعة الملك عبد الله
للعلوم والتقنية
King Abdullah University of
Science and Technology

sagasitas

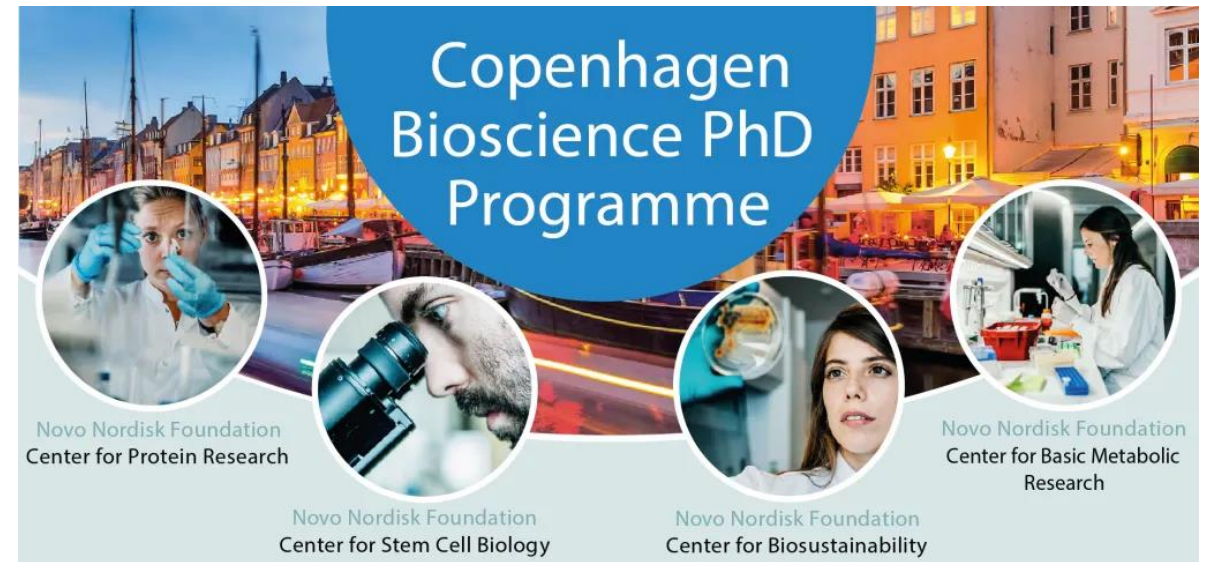


BEASISWA UNGGULAN



<https://cphbiosciencephd.org/>

The 2021 call for applications
close on January 12, 2021!



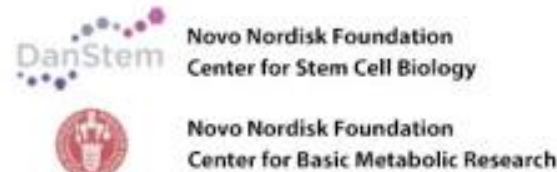
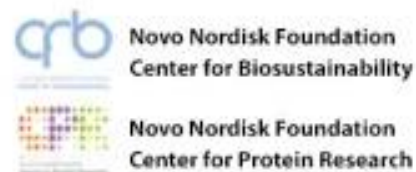
Copenhagen
Bioscience PhD
Programme

Novo Nordisk Foundation
Center for Protein Research

Novo Nordisk Foundation
Center for Stem Cell Biology

Novo Nordisk Foundation
Center for Biosustainability

Novo Nordisk Foundation
Center for Basic Metabolic
Research



Kompetisi Bioengineering

Kompetisi Bioengineering

- Menyelesaikan masalah dengan merekayasa sistem hayati
 - **Problem solving**
 - **Engineering**
 - **Biological systems**

*“Find a problem which is dear
and near to your heart”*



<https://2021.igem.org/>

BIOMOD

<http://biomod.net/>



<https://synbio.id/bios/>

Kompetisi Bioengineering



<https://igem.org/>

BIOMOD

<http://biomod.net/>



<https://synbio.id/bios/>

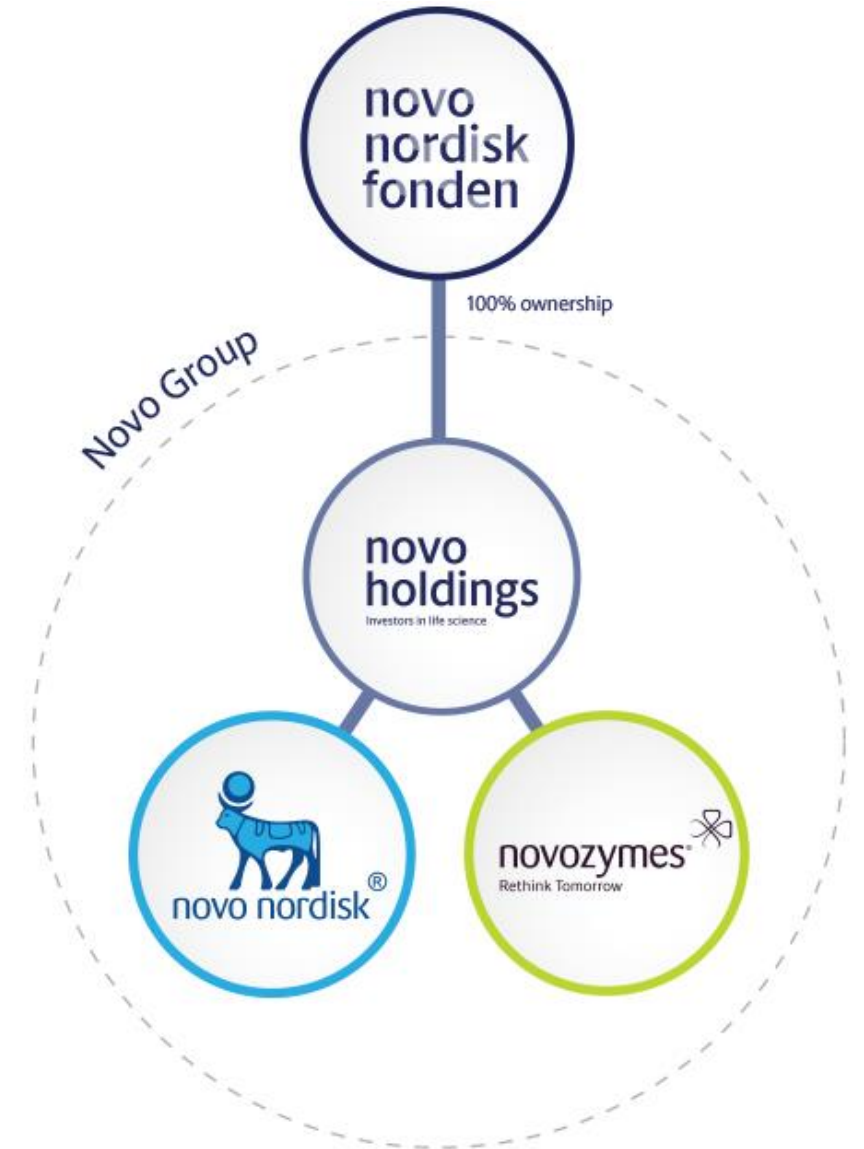
- To Do:
 - Look at past projects, find inspiration **NOT plagiarize!**
 - Ask these questions:
 - What is the problem they are solving? Do they have the same problem as us?
 - How do they solve the problem? What kind of **approach** / **technology** they use?
 - **What can we do better?**

Cell Factories & Novo Nordisk

Novo Nordisk Foundation



- dates back to 1922
- Nobel laureate August Krogh
- Produce insulin in the Nordic countries
- 4,893 Million DKK Awarded grants for research & education in 2019



NNF Research Centers

 Copenhagen Bioscience Cluster

The Cluster

Four major research centers, two infrastructures and a number of supporting initiatives form the backbone of the Copenhagen Bioscience Cluster. Located in Greater Copenhagen, the Cluster is surrounded by a rich life science environment including other Novo Nordisk Foundation initiatives that provide multiple opportunities for interaction and collaboration.

THE CLUSTER



Novo Nordisk Foundation Center for Protein Research

Proteins are deeply involved in diseases processes. Understanding disease at a protein level is therefore imperative in order to develop future generations of diagnostics and treatment.



Novo Nordisk Foundation Center for Basic Metabolic Research

The Center explores the molecular mechanisms and gene-environment interactions that underlie causes of diabetes and obesity with the ultimate aim of contributing to the development of new ways of treating and preventing diabetes and obesity.



The Novo Nordisk Foundation Center for Stem Cell Biology, DanStem

The Section unites leading scientists within stem cell biology to understand how stem cells contribute to the formation and maintenance of organs and tissues and how their aberrant behaviour explains such diseases as cancer.



Novo Nordisk Foundation Center For Biosustainability

The Center develops novel and innovative technologies for cell-based production of a broad range of chemicals and pharmaceuticals as a contribution to promoting the transformation from an oil-based chemical industry to a more sustainable bio-based industry.



Copenhagen Bioscience Cluster

NNF CfB 2.0 (2021 – 2025)



The Novo Nordisk Foundation
Center for Biosustainability

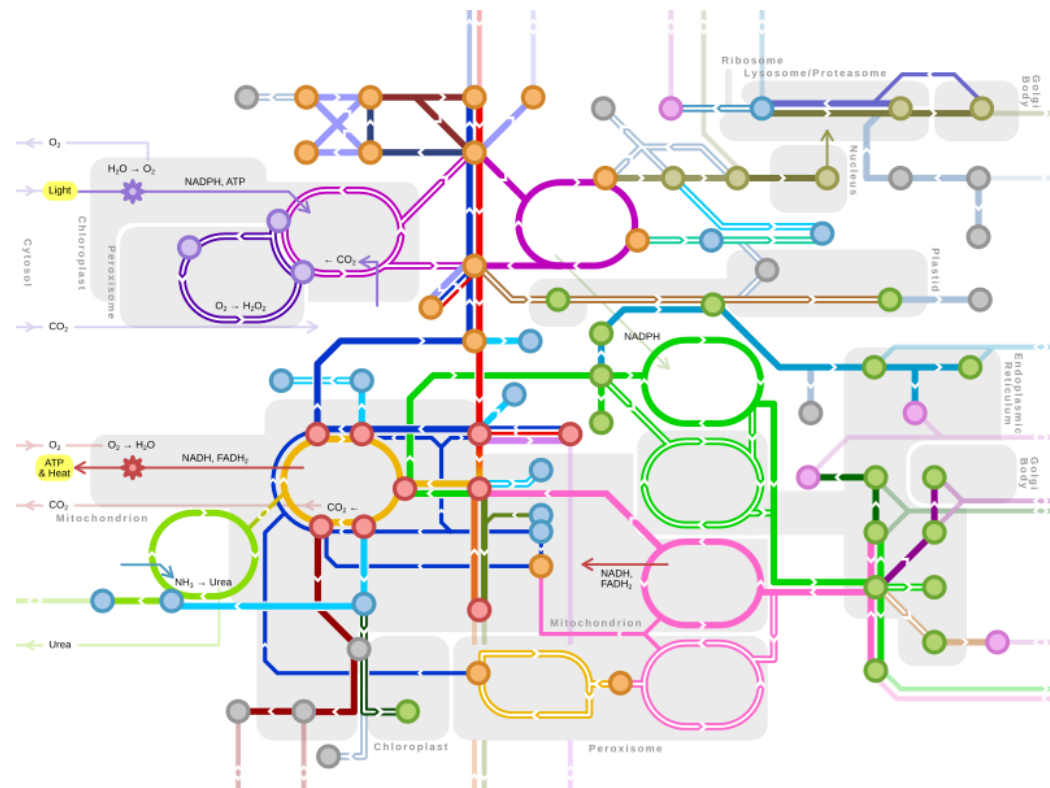
- Develop new knowledge and technologies to a **sustainable bio-based industry**.
- Chemicals and other products are produced using microbial production hosts – **cell factories**.
- **Design** the next generation of cell factories using:
 - High-quality **big data** generation and analysis
 - **Synthetic biology**
 - **Machine learning** and **AI**
 - **Metabolic modelling** and **engineering**
- We do this with “**the end in mind**”
 - Commercial and industrial approach in order to take products to market faster for the benefit of consumers.

<https://www.biosustain.dtu.dk/about>

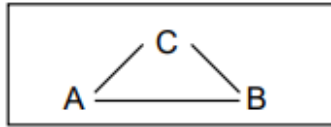
Systems Biology & FBA

Systems Biology

- Studying the relationship and **interactions** between various **parts** of biological objects to create understandable **model** of **the whole system**
- Biological Components:
 - Gene
 - Metabolites
 - Reactions
 - Proteins
 - Etc.



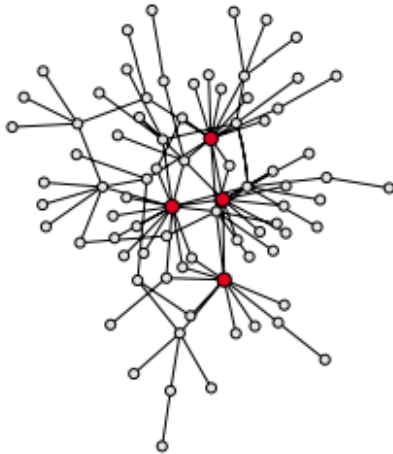
(a) Interaction-based



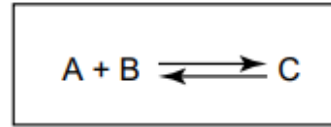
Static models

No stoichiometry

No parameters



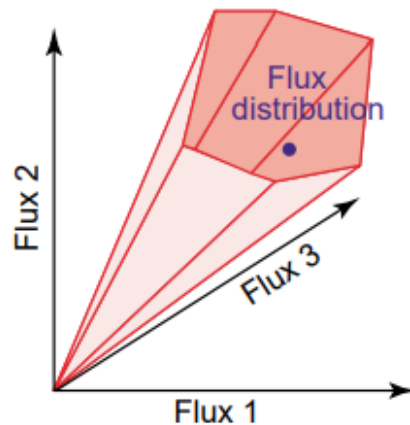
(b) Constraint-based



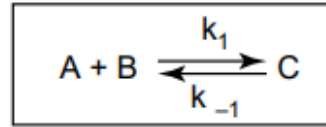
Static models

Stoichiometry

No parameters



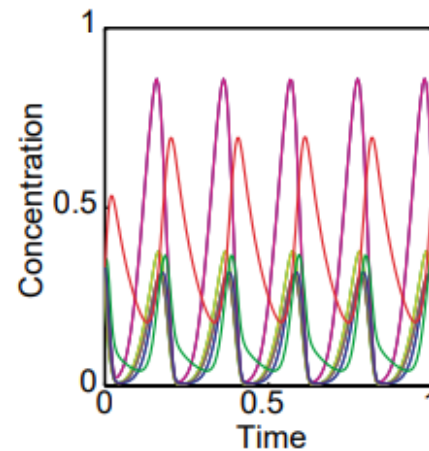
(c) Mechanism-based



Dynamic models

Stoichiometry

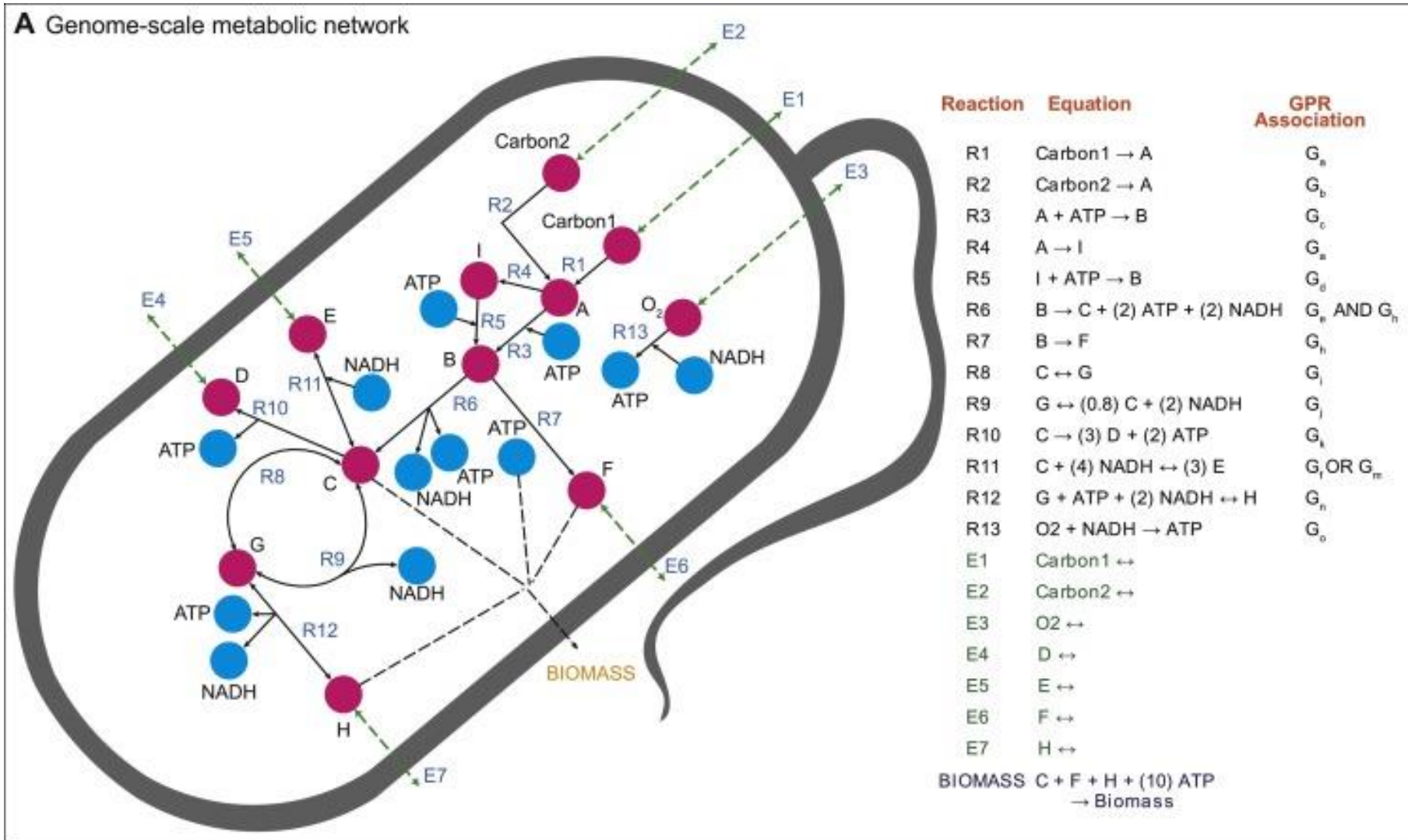
Kinetic parameters



Current Opinion in Microbiology

- Mathematical models of cellular networks can start from network representations based on:
 - interactions alone
 - constraints, including network topology, stoichiometries and reaction reversibilities → **Flux Analysis**
 - (detailed) reaction mechanisms → **Kinetic Models**

Genome-Scale Metabolic Models



List of :

- metabolic reactions
- transport reactions
- biomass reaction

Stoichiometric Matrix

B Mathematical representation and constraints

Balances
Stoichiometric constraints

Bounds

Thermodynamic and other constraints

	R1	R2	R3	R4	R5	R6	R7	R8	R9	R10	R11	R12	R13	E1	E2	E3	E4	E5	E6	E7	Biomass
Carbon1	-1	0	0	0	0	0	0	0	0	0	0	0	0	-1	0	0	0	0	0	0	0
Carbon2	0	-1	0	0	0	0	0	0	0	0	0	0	0	0	-1	0	0	0	0	0	0
A	1	1	-1	-1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
B	0	0	1	0	1	-1	-1	0	0	0	0	0	0	0	0	0	0	0	0	0	0
C	0	0	0	0	0	1	0	-1	0.8	-1	-1	0	0	0	0	0	0	0	0	0	-1
D	0	0	0	0	0	0	0	0	0	3	0	0	0	0	0	0	-1	0	0	0	0
E	0	0	0	0	0	0	0	0	0	0	3	0	0	0	0	0	0	-1	0	0	0
F	0	0	0	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	-1	0	-1
G	0	0	0	0	0	0	0	1	-1	0	0	-1	0	0	0	0	0	0	0	0	0
H	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	0	0	0	0	-1	-1
I	0	0	0	1	-1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
O ₂	0	0	0	0	0	0	0	0	0	0	0	0	-1	0	0	-1	0	0	0	0	0
ATP	0	0	-1	0	-1	2	0	0	0	2	0	-1	1	0	0	0	0	0	0	0	-10
NADH	0	0	0	0	0	2	0	0	2	0	-4	-2	-1	0	0	0	0	0	0	0	0

Number of metabolites m: 14

Number of reactions n: 21

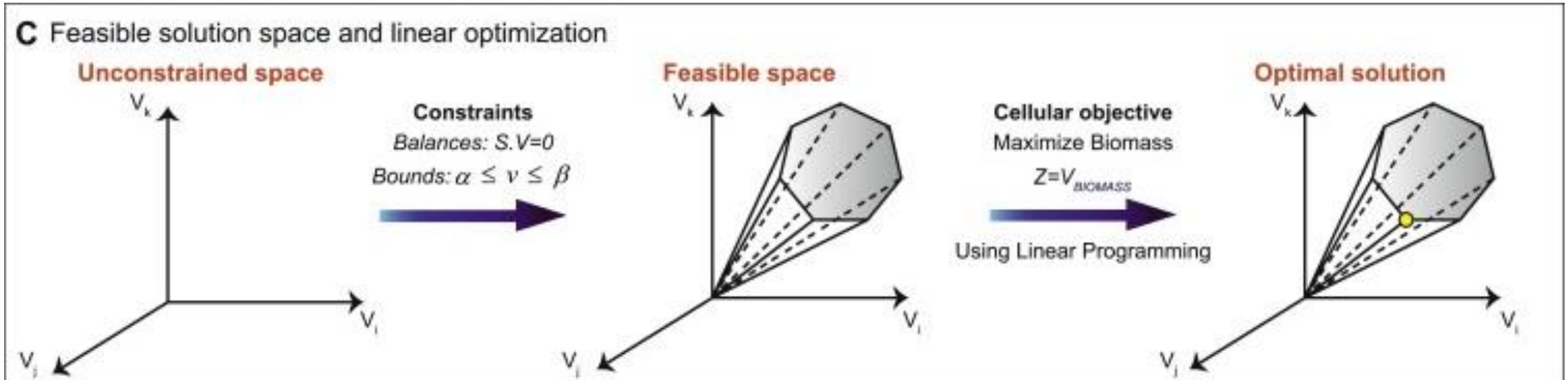
n x 1
Flux vector

V_{R1}
 V_{R2}
 V_{R3}
 V_{R4}
 V_{R5}
 V_{R6}
 V_{R7}
 V_{R8}
 V_{R9}
 V_{R10}
 V_{R11}
 V_{R12}
 V_{R13}
 V_{E1}
 V_{E2}
 V_{E3}
 V_{E4}
 V_{E5}
 V_{E6}
 V_{E7}
 $V_{BIOMASS}$

$\cdot V = 0$

Flux	LB	UB	Constraint
V_{R1}	0	∞	Irreversible
V_{R2}	0	∞	Irreversible
V_{R3}	0	∞	Irreversible
V_{R4}	0	∞	Irreversible
V_{R5}	0	∞	Irreversible
V_{R6}	0	∞	Irreversible
V_{R7}	0	$-\infty$	Irreversible
V_{R8}	$-\infty$	∞	Reversible
V_{R9}	0	10	Enzyme capacity
V_{R10}	0	∞	Irreversible
V_{R11}	0	∞	Reversible
V_{R12}	$-\infty$	∞	Reversible
V_{R13}	0	∞	Irreversible
V_{E1}	-10	0	Uptake
V_{E2}	0	1000	Excretion
V_{E3}	-1000	1000	Uptake/Excretion
V_{E4}	0	∞	Reversible
V_{E5}	0	∞	Reversible
V_{E6}	0	∞	Reversible
V_{E7}	0	∞	Reversible
$V_{BIOMASS}$	0	∞	Irreversible

Solution Space



Flux-Balance Analysis framework:

- Prepare a genome-scale metabolic network
- Set stoichiometric matrix and bounds
- Uses linear programming (or other approaches) to maximize objective within the allowable space

Hands On Session

Link to the jupyter notebook will be updated