

# Exploring the impact of irregular metabolic efficiencies and the space environment on the survivability of a regenerative life support system through agent-based modeling

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# UNCERTAIN FUTURES

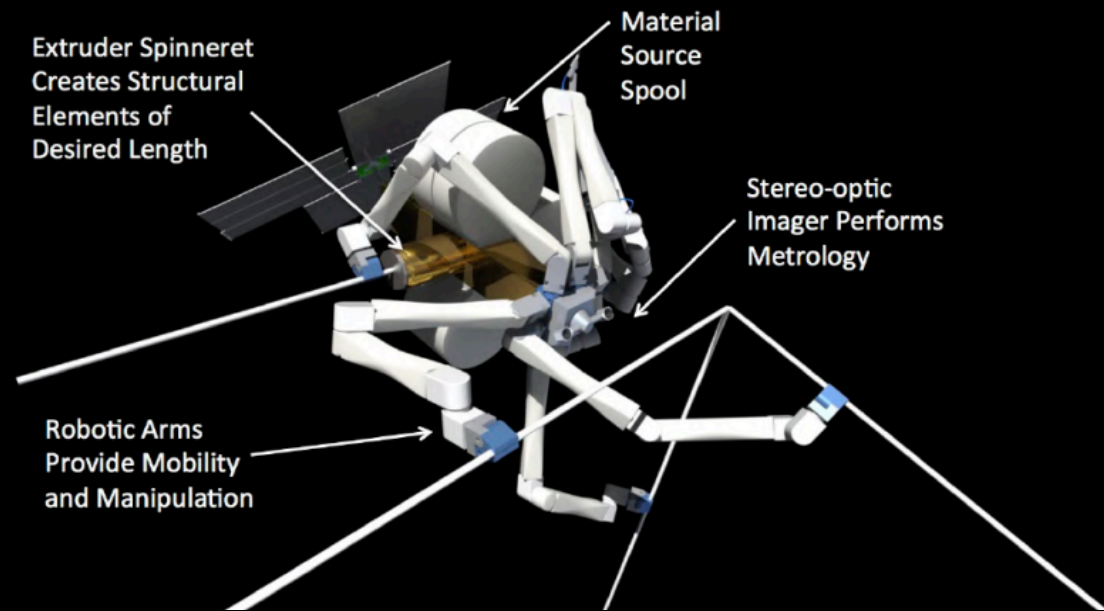


# A GROWING AND EVOLVING SPACECRAFT

## ASTEROID MINING

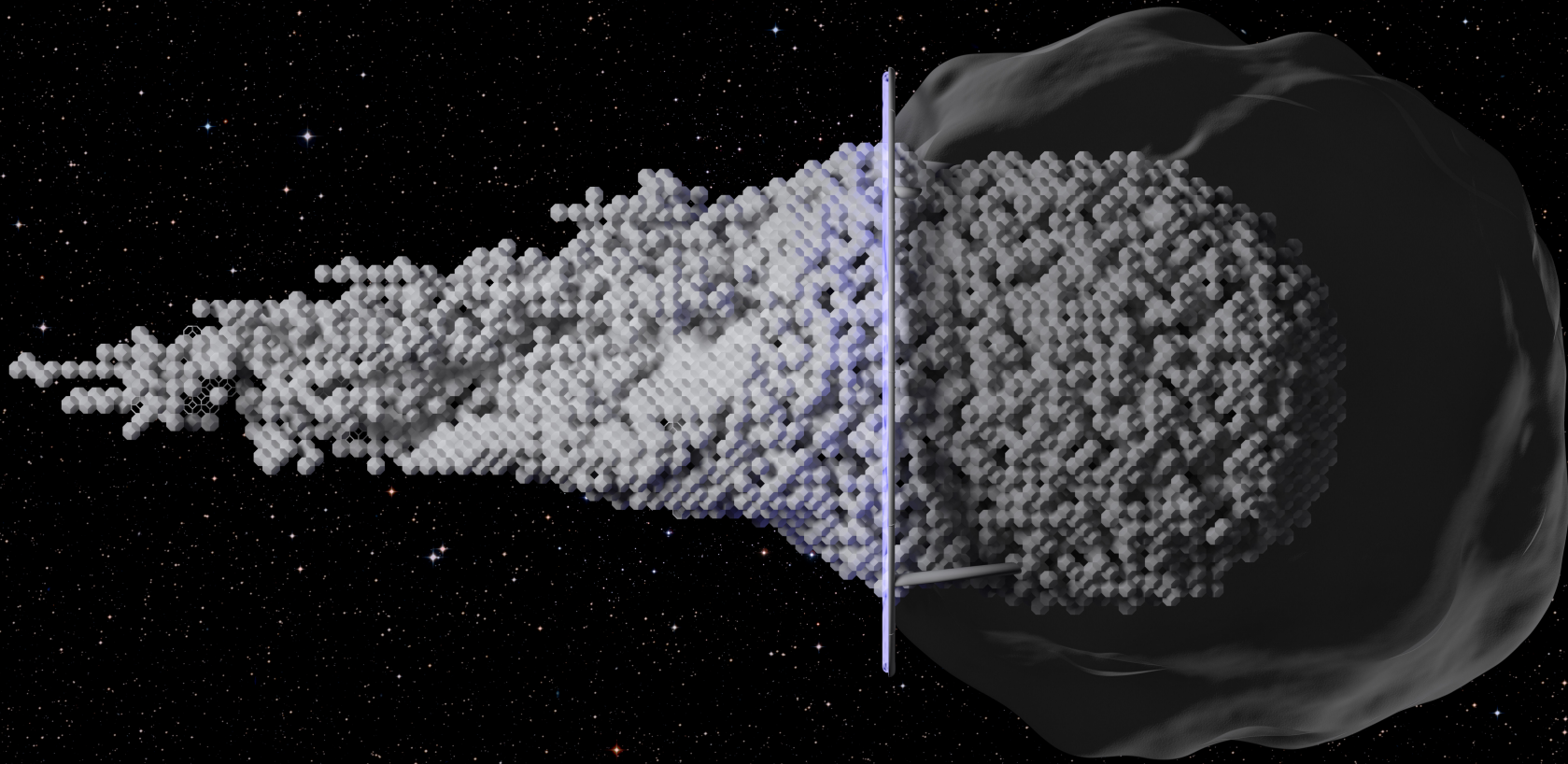


## 3D MANUFACTURING

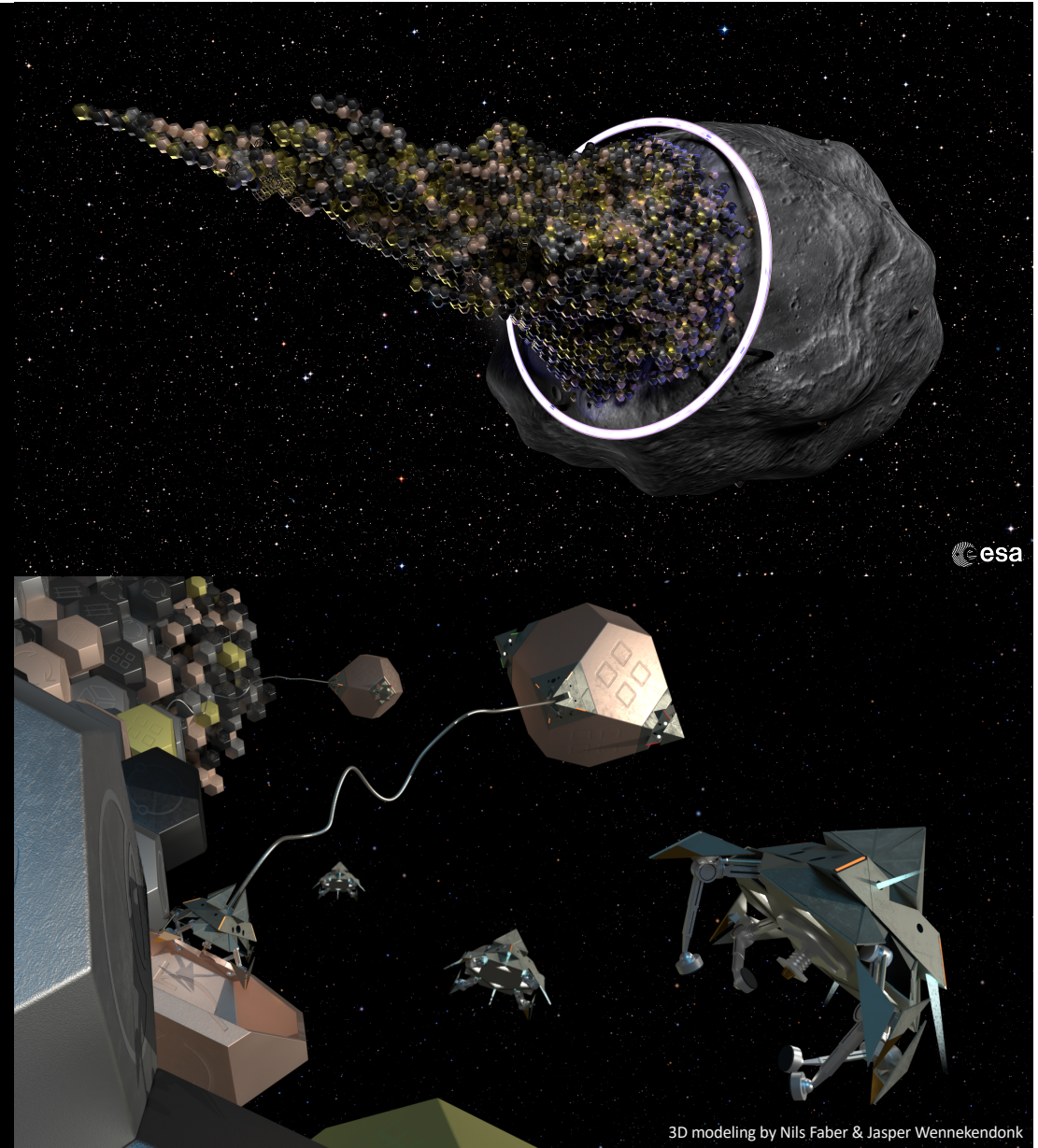


SpiderFab, Tethers Unlimited & NASA, 2013

# MODULAR ARCHITECTURE

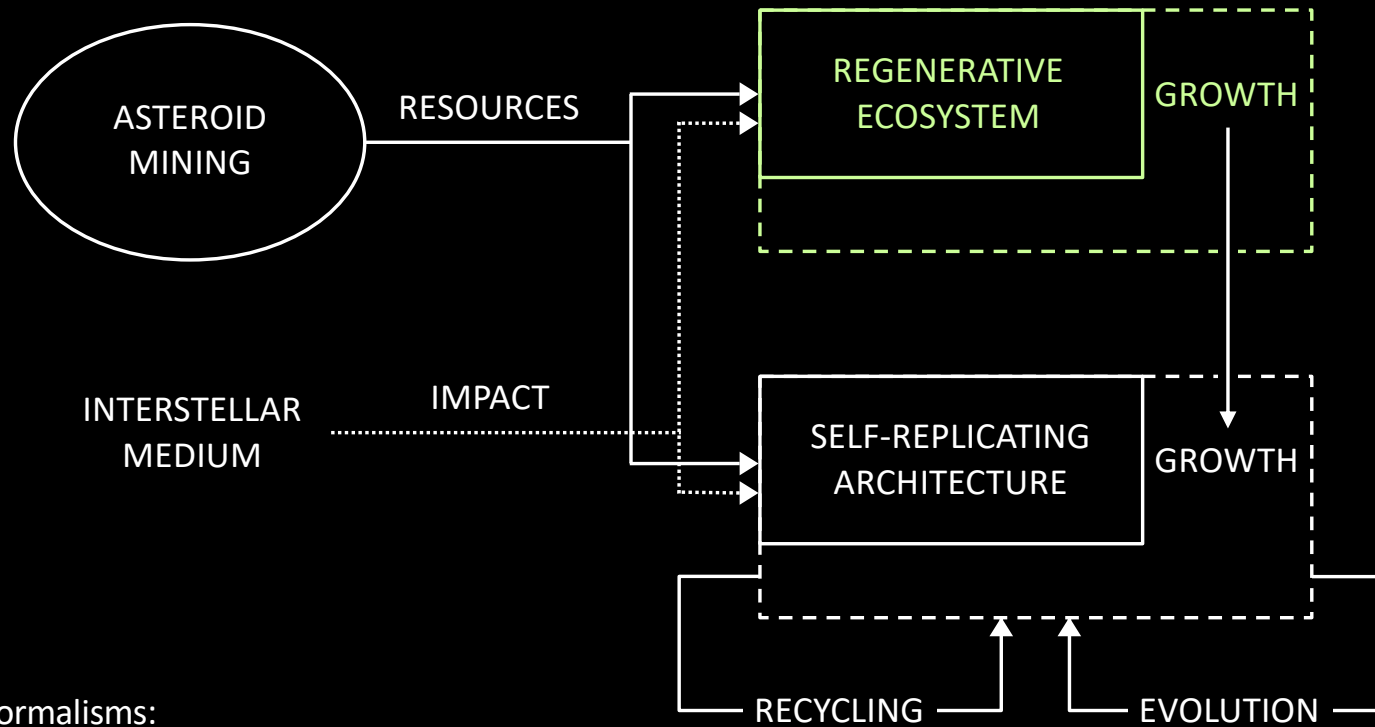


# MORPHOGENETIC ENGINEERING



3D modeling by Nils Faber & Jasper Wennekendonk

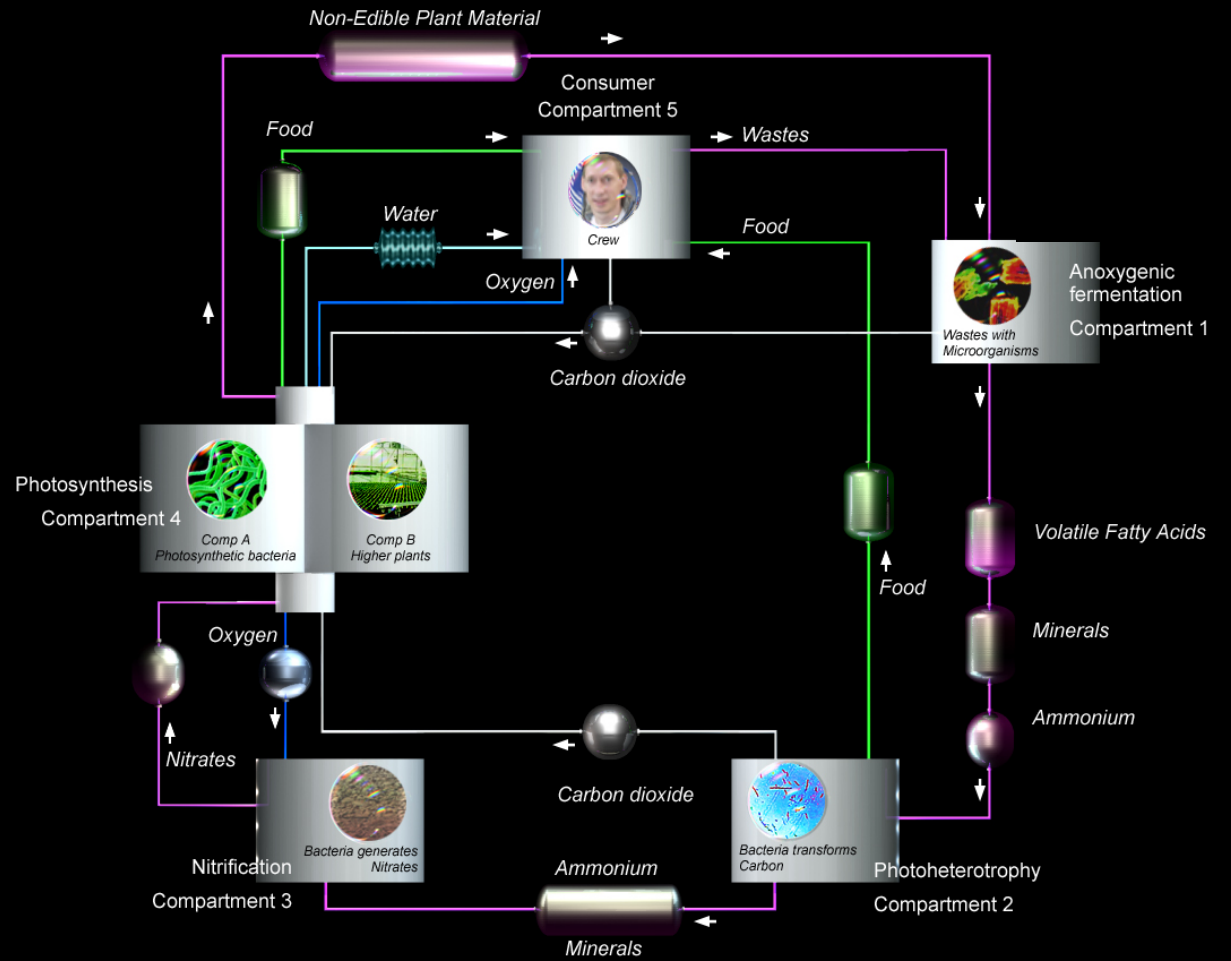
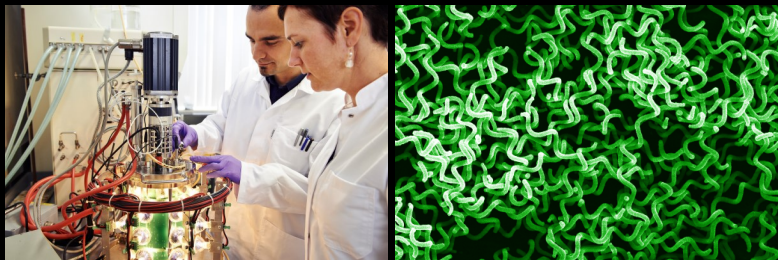
# ECOSYSTEM INTEGRATION



Simulation formalisms:

- ABM (agent-based modeling)
- DEVS (discrete event system specification)
- SD (system dynamics)
- EA (evolutionary algorithms)

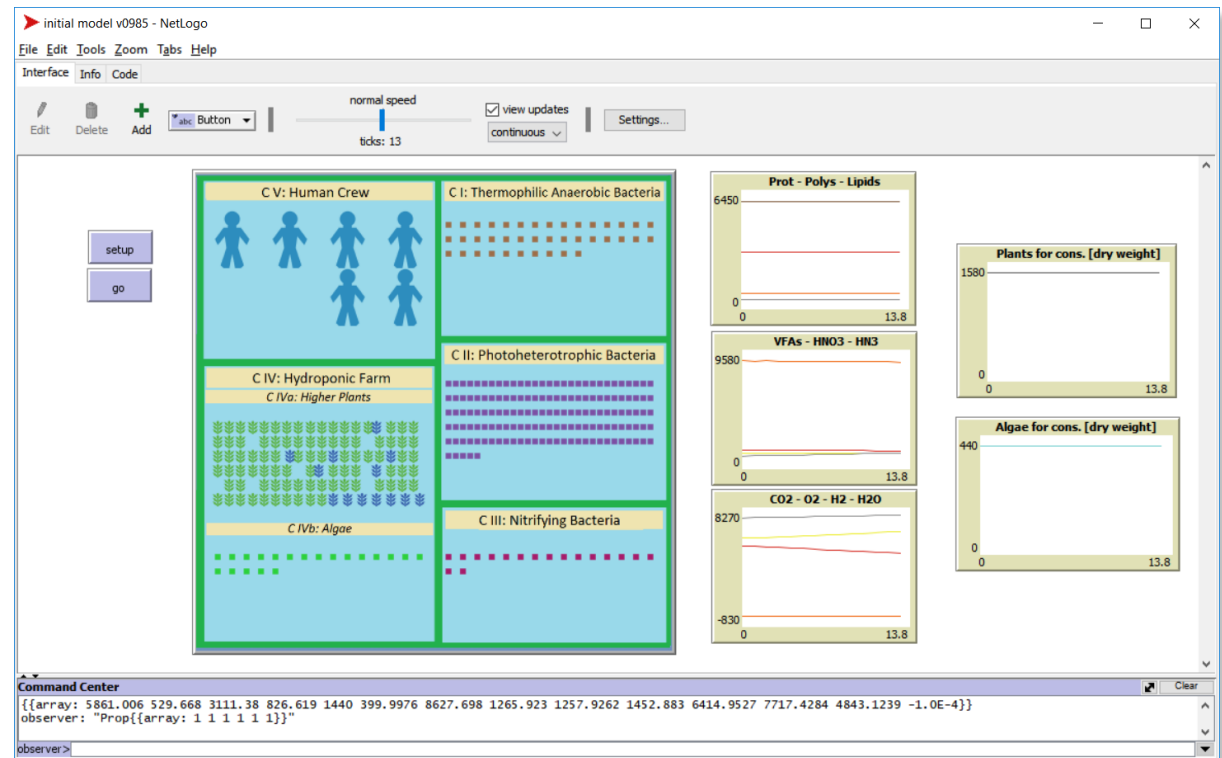




# ECOSYSTEM MODEL

## AGENT-BASED MODELING

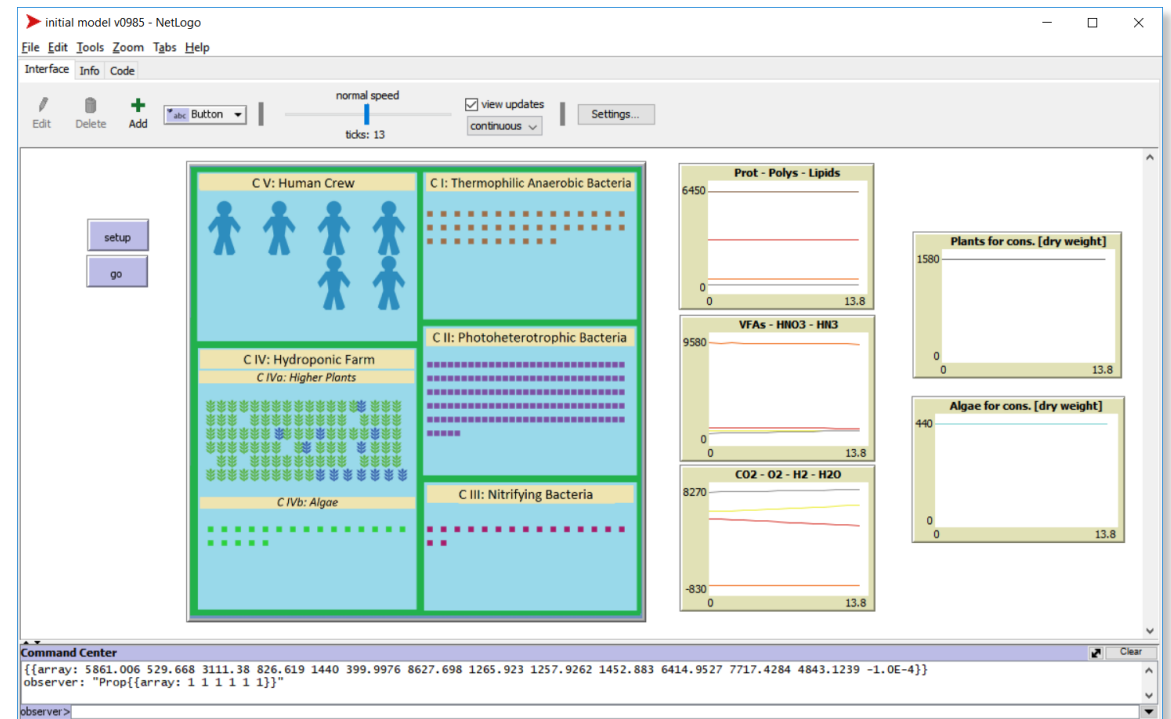
- Works with **agents**
- Focuses on **interactions** and emergent patterns
- High **granularity** and ontological correspondence



# AGENT-BASED MODELING

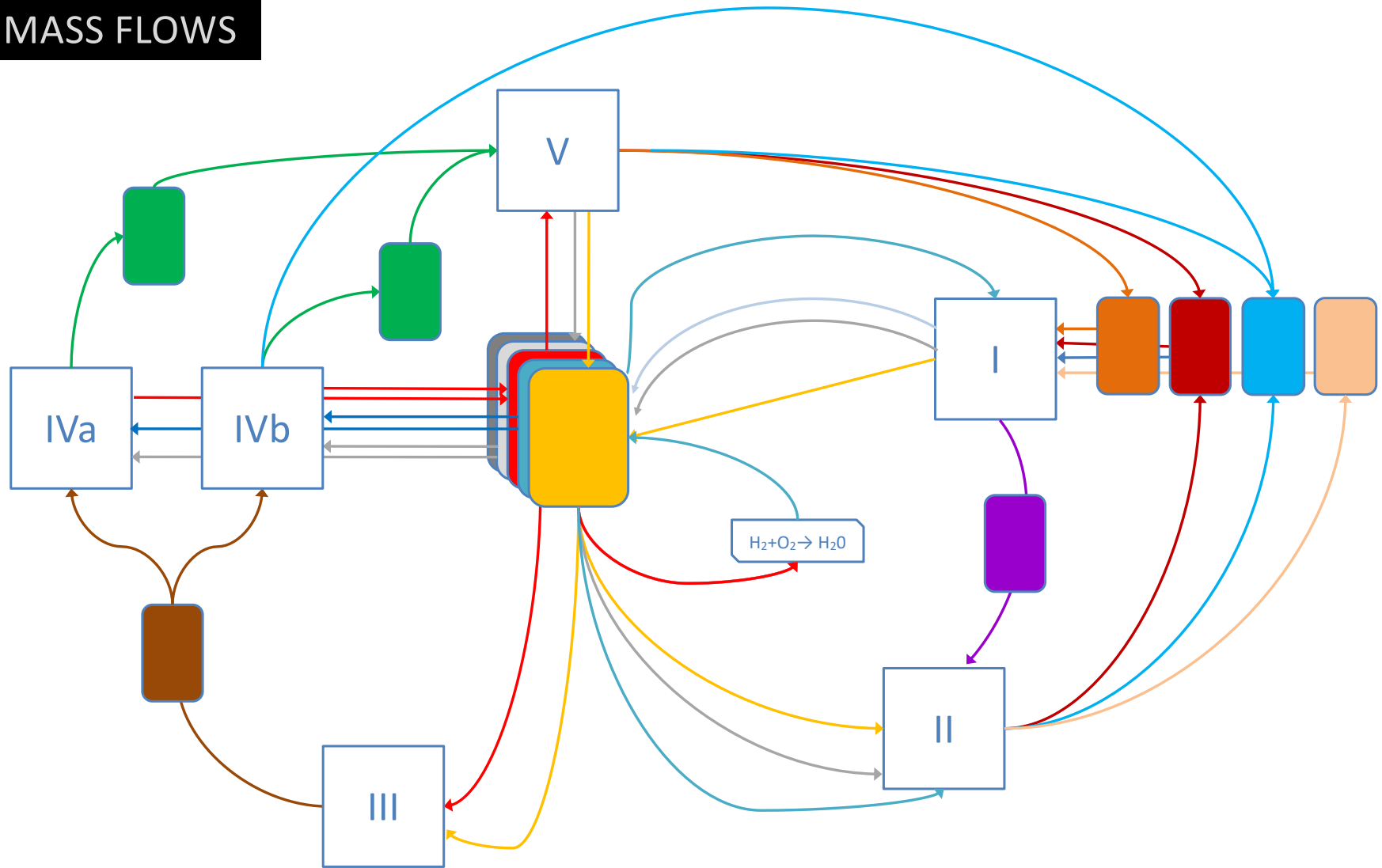
## MODEL COMPONENTS

- **Compartments:**  
MELiSSA compartments, inhabited by agents
- **Reservoirs:**  
centralized storage of all output of each compartment
- **Agents:**  
individual humans, bioreactors and plant plots



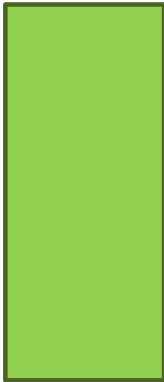
# ECOSYSTEM MASS FLOWS

Bacterial Protein  
Fecal Protein  
Lipids  
Polysaccharides  
Food biomass  
VFAs  
HNO<sub>3</sub>  
NH<sub>3</sub>  
CO<sub>2</sub>  
H<sub>2</sub>O  
H<sub>2</sub>  
O<sub>2</sub>



# BIOREACTOR AGENT

1 AGENT



## ATTRIBUTES

1 bioreactor = 1 agent

Compartments II and IVa create biomass (consumption)

Compartments I and III have no biomass (no consumption)

## BEHAVIOR

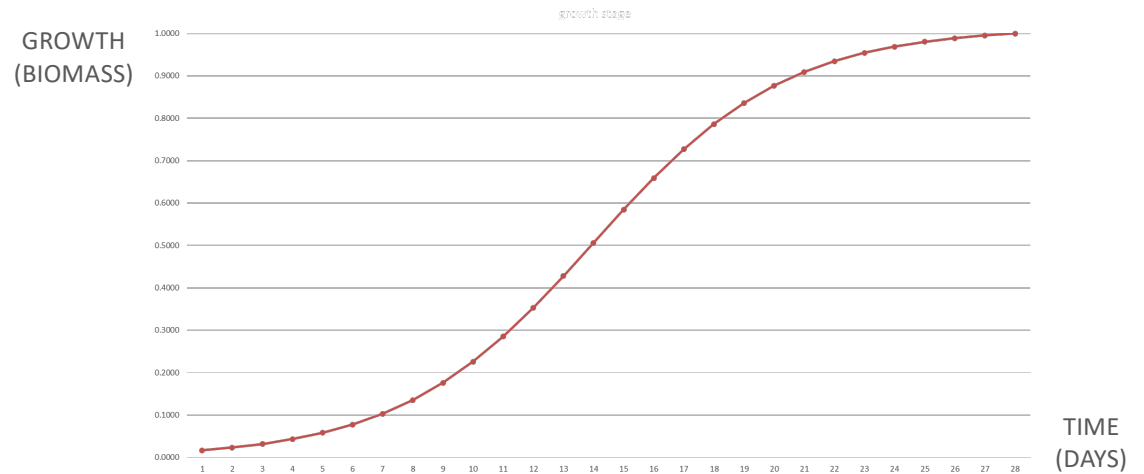
Input-output: stoichiometry

# BIOREACTOR AGENT

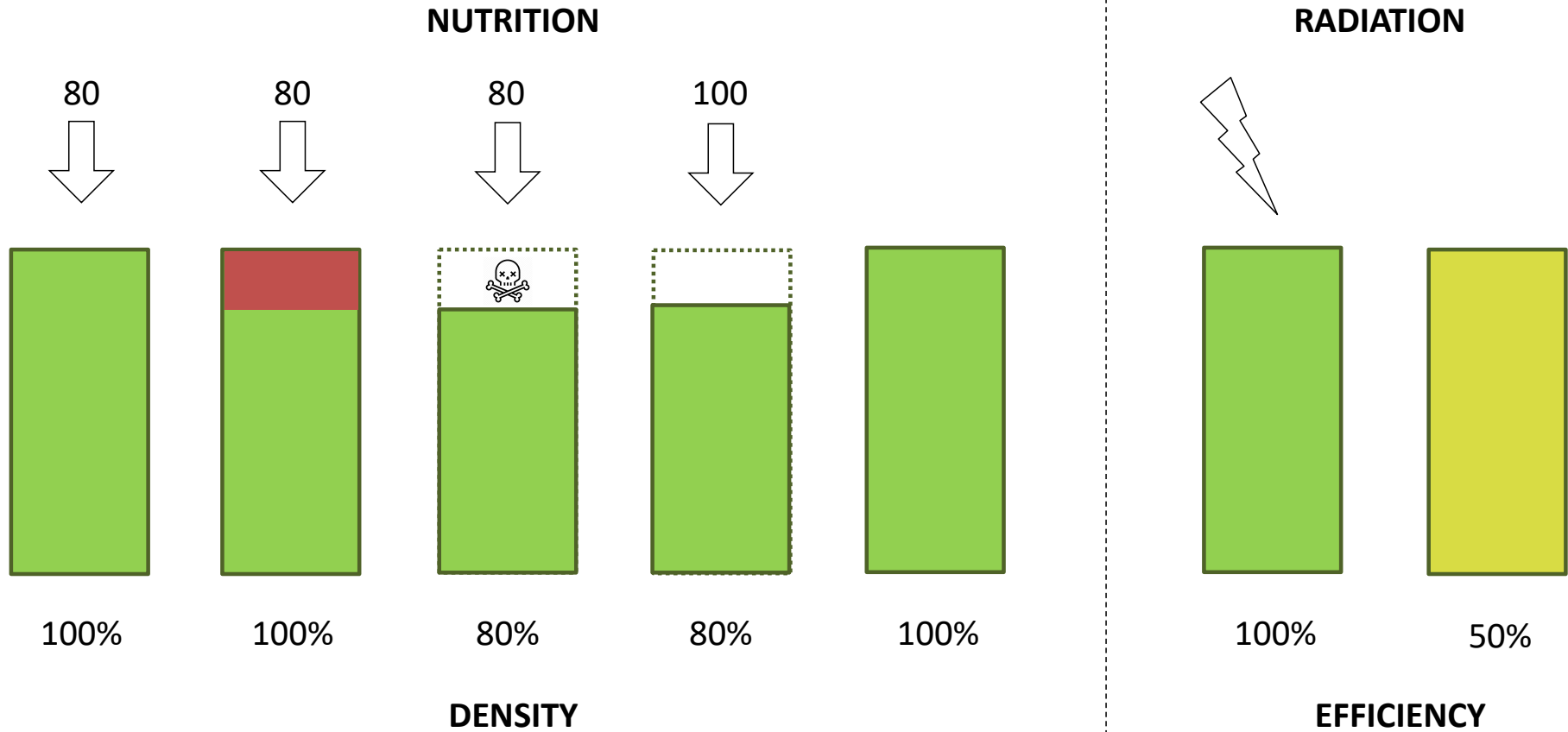
## STATES

- Growth follows a sigmoid curve
- Density reaching 100% in 28 days (10% first and 10% last week)
- 100% density corresponds to maximum productivity, and a specific amount of required nutrients (according to the bioreactor's stoichiometry)\*
- Each < 100% density along the curve requires a proportionally lower amount of nutrients

\* At 100% efficiency.



# BIOREACTOR AGENT

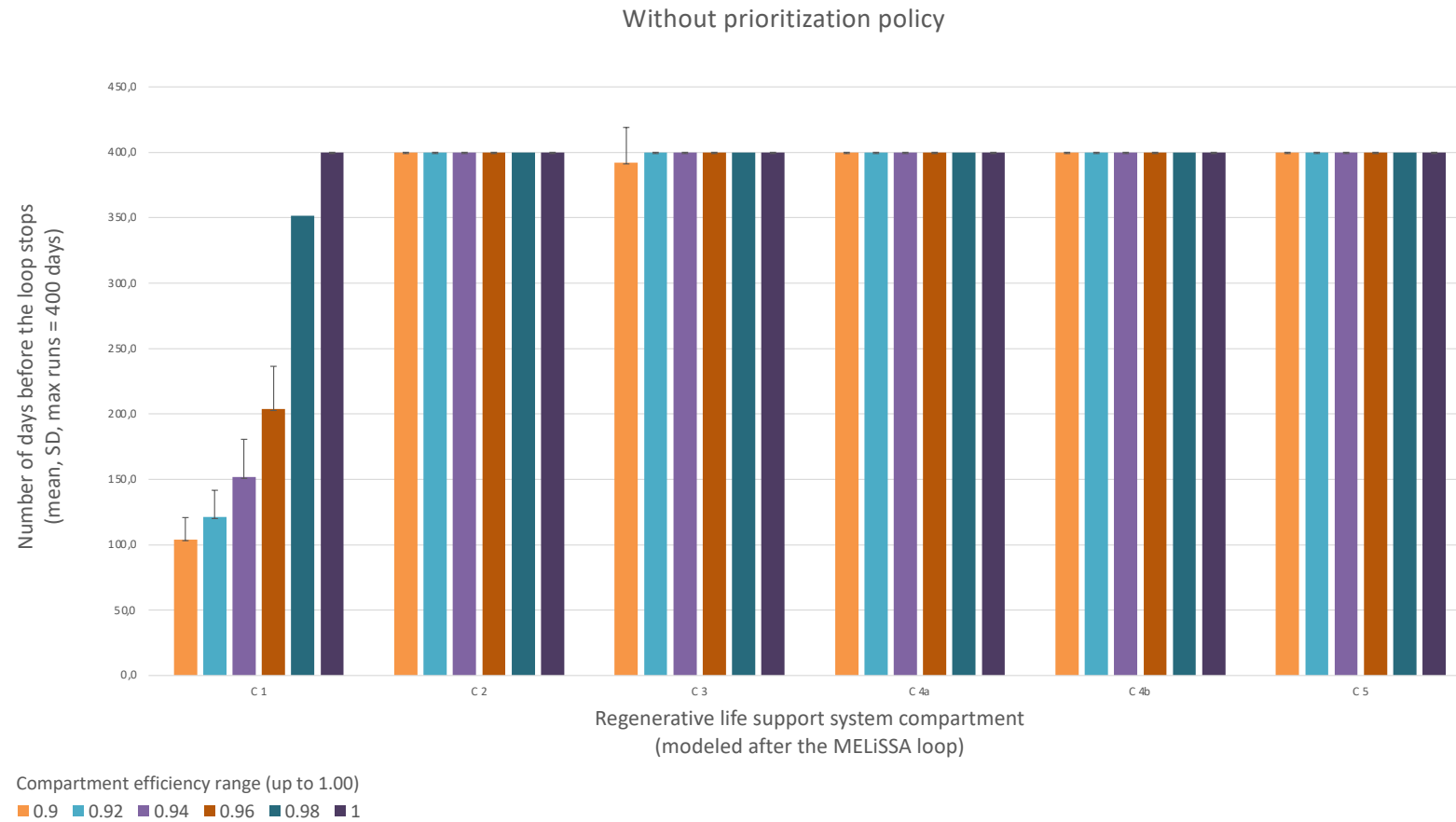


# STOICHIOMETRY

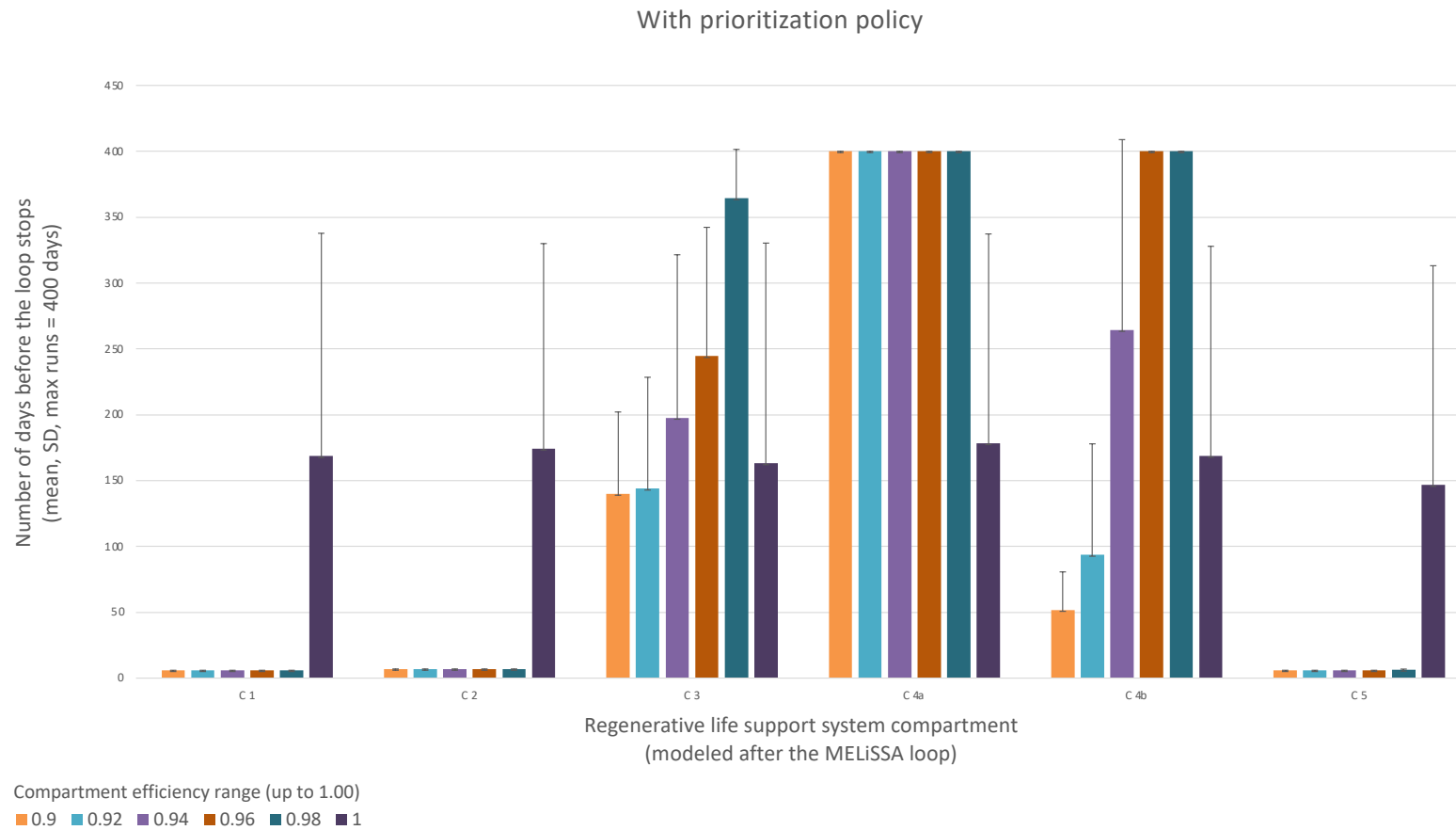
Compartment	Chemical equation	Acting organism
I	<p>Fecal protein  <math>3,2\text{CH}_{1.7600.239}\text{N}_{0.239} + 3,035\text{H}_2\text{O} \rightarrow \text{C}_2\text{H}_4\text{O}_2 + 0,1\text{C}_4\text{H}_8\text{O}_2 + 2.3\text{H}_2 + 0.76\text{NH}_3 + 0,8\text{CO}_2</math></p> <p>Bacterial protein  <math>3,2\text{CH}_{1.4697}\text{O}_{0.34}\text{N}_{0.2807} + 2,712\text{H}_2\text{O} \rightarrow \text{C}_2\text{H}_4\text{O}_2 + 0,1\text{C}_4\text{H}_8\text{O}_2 + 1,3162\text{H}_2 + 0.8982\text{NH}_3 + 0,8\text{CO}_2</math></p> <p>Polysaccharides  <math>3,199\text{CH}_{1.667}\text{O}_{0.833} + 1,134\text{H}_2\text{O} \rightarrow 1\text{C}_2\text{H}_4\text{O}_2 + 0,1\text{C}_4\text{H}_8\text{O}_2 + 1,4\text{H}_2 + 0,8\text{CO}_2</math></p> <p>Lipids  <math>\text{C}_{16}\text{H}_{32}\text{O}_2 + 13,0278\text{H}_2\text{O} \rightarrow 6,5278\text{C}_2\text{H}_4\text{O}_2 + 0,6528\text{C}_4\text{H}_8\text{O}_2 + 0,3333\text{CO}_2 + 13,3611\text{H}_2</math></p>	Thermophilic anaerobic bacteria
II	<p>Volatile fatty acids  <math>50.39\text{C}_2\text{H}_4\text{O}_2 + 5.04\text{C}_4\text{H}_8\text{O}_2 + 25\text{NH}_3 + 0.19\text{CO}_2 \rightarrow 89.06\text{CH}_{1.4697}\text{O}_{0.34}\text{N}_{0.2807} + 18.33\text{CH}_{1.667}\text{O}_{0.833} + 0.86\text{C}_{16}\text{H}_{32}\text{O}_2 + 63.98\text{H}_2\text{O}</math></p>	Photoheterotrophic bacteria
III	<p>Nitrification  <math>\text{NH}_3 + 2\text{O}_2 \rightarrow \text{HNO}_3 + \text{H}_2\text{O}</math></p>	Nitrifying bacteria
IVa	<p>Carbon fixation  <math>5\text{CO}_2 + 3\text{H}_2\text{O} + \text{HNO}_3 \rightarrow \text{C}_5\text{H}_7\text{O}_2\text{N} + 7\text{O}_2</math></p>	Arthrospira algae
IVb	<p>Carbon fixation  <math>5\text{CO}_2 + 3\text{H}_2\text{O} + \text{HNO}_3 \rightarrow \text{C}_5\text{H}_7\text{O}_2\text{N} + \text{CH}_{1.667}\text{O}_{0.833} + 7\text{O}_2</math></p>	Ideal plant
V	<p>Consumption  <math>2.71\text{C}_5\text{H}_7\text{O}_2\text{N} + 4.41\text{O}_2 \rightarrow 4.20\text{CH}_{1.7600.239}\text{N}_{0.239} + 1.48\text{CH}_{1.667}\text{O}_{0.833} + 0.12\text{C}_{16}\text{H}_{32}\text{O}_2 + 5.88\text{CO}_2 + 1.70\text{NH}_3</math></p>	Crew



# IMPACT OF IRREGULAR METABOLIC EFFICIENCIES



# IMPACT OF IRREGULAR METABOLIC EFFICIENCIES



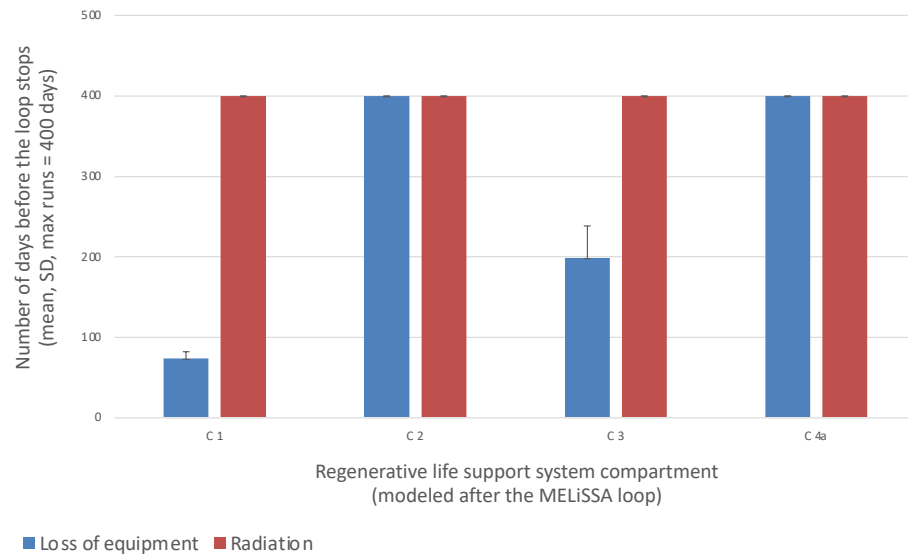
# IMPACT OF THE SPACE ENVIRONMENT

## EXPERIMENT DESIGN

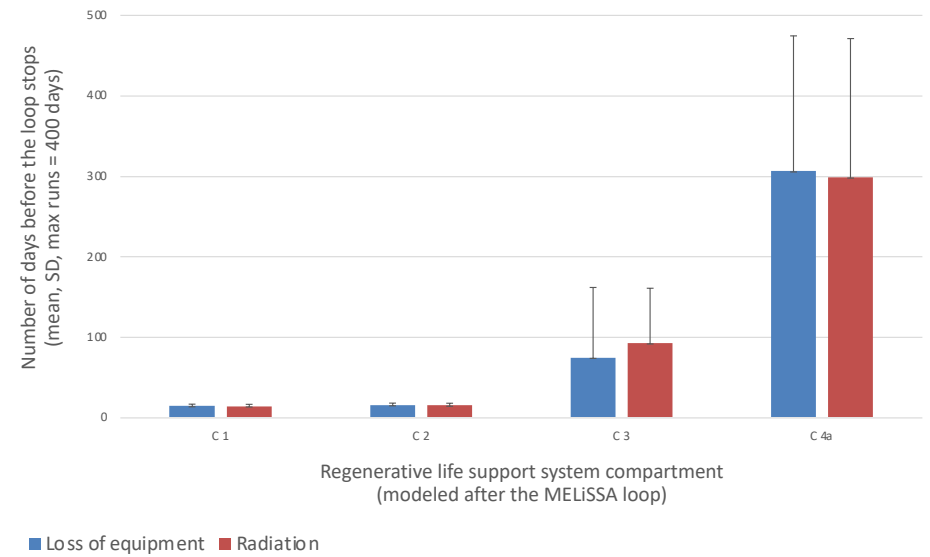
- Loss of equipment: several bioreactors disappear from the system
- Radiation: instant decrease of bioreactor efficiencies to 50%, with slow recovery
- Impact happens on day 10
- 4-6 bioreactors are affected

# IMPACT OF THE SPACE ENVIRONMENT

Without prioritization policy



With prioritization policy



## CONCLUSIONS

- Agent-based model of MELiSSA that can be used to:
  - explore the behavior of the system under different conditions
  - compare different policies regarding mass flow management
- Compartment 1 was the most sensitive compartment
- Using a policy that prioritizes Compartment 5 resulted in reduced system longevity
- Temporary decrease in efficiency: recovery without prioritization policy
- Loss of equipment: only limited recovery

## NEXT STEPS

- Improve the stoichiometry:
  - More VFAs
  - Biomass split up in three streams (P/C/L)
  - Adjust faeces composition
- Increase levels of disruption
- Experiment with additional parameters and parameter combinations
- Use different prioritization policies (between compartments and agents)
- Vary initial conditions

## CONTRIBUTORS & COLLABORATORS

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