

ENGINEERING

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**Primary Fermenters** 

C. beijerinckii

C. ljungdahlii

Sugars

AO O

#### INTRODUCTION

The essential role of microbial communities for driving nutrient cycles and producing useful products is increasingly appreciated by ecologists, geobiologists, and bioprocess engineers. Even when individual microbial community members are well understood, comprehending communitylevel behavior is challenging. Community level functioning is a result of both system members and their interactions. Due to this complexity, computer (in silico) models are essential. By computing possible metabolite fluxes between individual community members and their role on community-level behavior, in silico methods can be used to interpret and generate hypotheses related to how environmental conditions influence community structure and function. This presentation utilizes in silico techniques to build metabolic models representing six fully sequenced anaerobic organisms and their combined community potential for syntrophic methane and hydrogen production.



### **TRANSFORMATIVE HYPOTHESES**

- Genomic analysis of community organisms will predict competitive strategies for essential nutrients
- Syntrophic relationships will develop through metabolite exchange
- Biofuel production can be optimized through community and nutrient manipulation

# **QUESTIONS AND OBJECTIVE**

#### QUESTIONS

- Natural anaerobic environment
- What drives microbial interactions?
- What metabolic and social strategies are probable?

#### Bioreactor for fuel production

- How can microbial interactions be optimized for biofuel production?
- How can byproducts be controlled?

#### OBJECTIVE

Identification of metabolic modes that contribute to cooperative resource allocation and optimize biofuel production

## APPROACH

- 1. Six in silico metabolic network models were developed to represent the behavior of individual organisms.
- 2. Genomic databases and literature were mined for model input.
- 3. Models were used to generate hypotheses about community interactions.
- 4. Hypotheses were tested or rejected and the model refined.



# Metabolic Network Analysis of an Anaerobic Microbial Community: **Potential for Syntrophic Methane and Hydrogen Production**

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# **COMMUNITY OVERVIEW**

Clostridium beijerinckii NCIMB 8052

- Basic fermentation of a wide variety of sugars, producing mixed acids, alcohols and gases
- Clostridium ljungdahlii DSM 13528 Acetogenic fermentation of a wide variety of sugars,
- producing acetate and ethanol
- Desulfovibrio alaskensis G20
- Incomplete oxidizer of lactate to reduce sulfate, producing acetate,  $H_2$  and sulfide. Desulfotomaculum acetoxidans DSM 771
- Complete oxidizer of acetate to reduce sulfate, producing acetate,  $H_2$  and sulfide.
- Methanospirillum hungatei JF-1 Strict  $CO_2/H_2$  methanogenesis, oxidizing  $H_2$  without cvtochromes
- Methanosarcina barkeri Fusaro Utilizes  $CO_2/H_2$  or acetate for methanogenesis, using cytochromes in electron transport

### **Information Sources**

**Genome-Based Data** Predicts internal metabolic function based on genes identified in each organism's genome.

#### Literature

**Experimental observations** noted in literature ensure that the models are grounded to observed functionality.

#### **Protein and Pathway** Databases

Metabolic potential is not always clear based on the analysis of an individual organism's genome. Protein sequences with known function were compared to the genome of interest to provide evidence for a pathway that is likely to be present but not annotated in the genome.



simultaneously.

# COMMUNITY NETWORK MODEL





Figure 1: Representative anaerobic community comprised of six organisms with sequenced genomes that group into three functional guilds.

#### **CLEAN ENERGY PROSPECTS**

- By feeding the modeled microbial community complex carbohydrates and controlling nutrients, end products can be optimized for biofuel production
- Hydrogen and methane both have substantial energy potential
  - Both can be used for heating, electricity and transportation
  - $H_2$  can be used in fuel cells to generate electricity



# **TRADE-OFF ANALYSIS**



Figure 4: Trade off between hydrogen production and sulfate reduction. The line represents the relationship between the most efficient metabolic strategies for biomass production based on electron acceptor. Lower right strategies represent behavior in which hydrogen is produced, fostering cooperation with methanogens (Table 1). Upper left strategies represent behavior in which hydrogen availability to the community is unaffected. Additional strategies fall on this trade off envelope in which hydrogen is consumed as representative of a competitive strategy (Data not shown). Trade off curves such as these can be generated from model results for inter-species comparison (competitive strategies) or community analysis.

Table 1: Thermodynamic calculations at standard conditions for the phosphorylation of ADP to ATP and calculated free energies associated with the reduction of  $CO_2$  to produce  $CH_4$  at physiologically significant hydrogen partial pressures.

**Stoichiometry**  $ADP + P_i \leftrightarrow ATP$  $CO_2 + 4H_2 \leftrightarrow CH_4 + 2H_2$ 

### DISCUSSION

Depending on environmental conditions, individual metabolic strategies will either succeed or fail based on their thermodynamic favorability. As illustrated in Table 1 a methanogen with specialized energy conservation  $(ATP/CH_{4})$  for survival at low partial pressures of hydrogen may outcompete other methanogens which require higher H<sub>2</sub> concentrations. These concentrations correspond with the upper limits of hydrogen production by SRBs. As shown in Figure 4, nutrient availability dictates community behavior. For example the role of SRBs will change from hydrogen consumers to hydrogen producers in sulfate deplete environments, thereby determining the optimal metabolic strategy for competing methanogens. From a community perspective, all six organisms exchange hydrogen as a metabolite (Figure 3), either utilizing it as an electron donor or producing it as a waste product. How the community shares this metabolite depends on the concentration of available alternatives such as sulfate. In silico models elucidate these trade-offs and provide a framework for system analysis of ecological and engineered systems.

#### **FUTURE WORK**

Develop focused experimental approaches to test additional hypotheses and verify model results. • Genetic and biochemical techniques can be used to verify metabolic pathways of uncertainty.

Expand model-based results to *in situ* experimental systems facilitating model verification and microbial population analysis. • Address scale and commercial feasibility for methane and hydrogen production.

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	Partial Pressure H <sub>2</sub>	$\Delta \mathbf{G}^{\circ}$ (kJ/Mole)	ATP/CH <sub>4</sub>
	Standard Conditions	50	2.5 – 3
H <sub>2</sub> O	1 Pascal	-17	0.34
	10 Pascal	-40	0.8