

# DISCOVR PROJECT BETO PEER REVIEW

### U.S. Department of Energy (DOE) Bioenergy Technologies Office (BETO) 2017 Project Peer Review

Algae DISCOVR Project: <u>Development of Integrated Screening, Cultivar</u> <u>Optimization, and Validation Research</u>

> March 7, 2017 Advanced Algal Systems

Michael Huesemann, PI PNNL / LANL / SNL / NREL



Energy Efficiency & Renewable Energy

BETO Peer Review Meeting – March 2017

### The Microalgae Biofuels Challenge

- Reduce total microalgae biofuels production costs to \$3/GGE by 2030 with or without co-products (MYPP 2016)
- Double 2016 BETO State of Technology (SOT) Biomass Productivities by 2020 (based on recent PEAK FOA)

Season	2016 BETO SOT (g/m²/day), ash free basis	2020 PEAK Performance Target		
Contine -		(g/m²/day)		
Spring	11.1 (Nanno)	22		
Summer	13.3 (Desmo)	26		
Fall	7.0 (Desmo)	14		
Winter	5 (Nanno)	10		
Annual average	9.1	18		
*Nanno refers to Nannochloropsis maritima KA32 (saline media) and Desmo refers				
to Desmodesmus sp. CO46 (saline media)				



### **DISCOVR Project Goals and Outcomes**

### Goals

- Reduce total microalgae biofuels production costs to \$3/GGE by 2030 by developing an integrated screening platform for the rapid identification of high productivity strains with cellular composition suitable for biofuels and bioproducts for resilient, year-round outdoor cultivation via crop rotation.
- Overcome limitations of previous strain prospecting efforts such as low success rate and unrealistic laboratory test conditions.

#### Outcomes

Standardized identification, deep characterization, and delivery of robust, high productivity microalgae strains to the bioenergy and bioproducts communities, such as industry and BETO funded projects.

Streamlined, coordinated effort to capitalize on consortium labs' complementary core capabilities in environmental simulation and productivity prediction, robustness evaluation, biomass valorization, and strain improvements.



**Renewable Energy** 

### **Quad Chart**

### Timeline

- Start date: 10-1-2016
- End date: 9-30-2019
- Percent Complete: 10%

### **Targets and Barriers**

- MYPP 2030 Target: \$3/GGE
- Aft-C Biomass Genet. & Development
  - The productivity and robustness of algae strains...could be improved by screening
- Aft-E Algal Biomass Characterization
  - Strain library of biochemical composition

### Budget

	FY 16 Costs	FY 17 Costs	Total Planned Funding (FY 17-Project End Date)
DOE	\$0 K	\$1.5M	\$6.1M

#### **Partners**

- LANL (Taraka Dale, 21%)
- SNL (Todd Lane, 29%)
- NREL (Lieve Laurens, 16%)
- ATP<sup>3</sup> (John McGowen, 4%)



### **DISCOVR Project Management Structure**



#### **Meetings**

- Biweekly teleconferences with Pl and technical leads
- Quarterly meetings with TAB
- Annual face to face meetings

# Quarterly Reports and Tracking of Milestones

- Data flows through the PI
- PI tracks milestones and generates all reports with input from technical leads
- Synthesis of results into publication and solutions tracked and mediated by PI
- Decision making is through consensus of PI and technical leads
- Technical leads are responsible for achieving task milestones
- PI retains ultimate decision-making authority



### **Acknowledgements**

### BETO ALGAE TEAM

- LANL
  - Taraka Dale
  - Amanda Barry
  - Tari Kern
  - Hajnalka Daligault
  - Sangeeta Negi

### NREL

- Philip Pienkos
- Lieve Laurens
- Ed Wolfrum
- Mike Guarnieri
- Stefanie Van Wychen

### PNNL

- Scott Edmundson
- Will Louie
- Rob Kruk
- SNL
  - Todd Lane
  - Pamela Lane
  - Jeri Timlin
  - Tom Reichardt
  - Carolyn Fisher
  - Deanna Curtis
  - Kumal Poorey
  - Jaclyn Murton



BETO Peer Review Meeting – March 2017

### **Technical Advisory Board (TAB)**

### **TAB Members**

Philip Pienkos, Chair (NREL)

#### John Benemann

(MicroBio Engineering)

Louis Brown

(Synthetic Genomics)

Valerie Harmon

(Harmon Consulting)

- Craig Behnke (Sapphire)
- Juergen Polle (CUNY)

## Role of the TAB

- Review results and progress in comparison with work plans
- Maintain an industry-relevant focus and knowledge of recent technology advances and challenges
- Provide input on strategic goals and directions

**U.S. DEPARTMENT OF** 

Meet quarterly by webinar and annually in person

- **First TAB meeting** was held on February 21, 2017
- Discussed Tier I strain selection and DISCOVR media composition

February 17, 2017







#### **DISCOVR Delivers Comprehensively Characterized Strains**

Characterization of Productivity and Robustness				Strategy	
DISCOVR Genome Sequencing, Functional 'Omics, Metabolic Mapping				,	Use a multi-lab consortium approach to establish a state-of-the-art platform for the deep characterization of new strains under outdoor-relevant conditions
Greenhouse: Comprehensive Knowledge Base of Algal Feedstocks Genetic Blueprint of Microalgae Carbon Productivity				Leverage the expertise at LANL and LBNL/JGI to deliver the <i>data and tools</i> required to understand algae metabolism and develop GM tools	
Strain Improv	vement: Genetic	Modification &	Non-GM Strate	gies	5
Algae Biotechnology Partnership	Functional Characterization of Cellular Metabolism	Multi-scale Characterization of Improved Algae Strains	Breeding Algae for Long Term Stability& Enhanced Biofuel Prod'n		Use a range of expertise & approaches across Labs to deliver <i>improved algae</i> <i>strains, and a suite of tools</i> that are effective in our top strains of interest and are also broadly applicable to new strains of interest (from DISCOVR or external stakeholders)

**GOAL:** Deliver deeply characterized and improved strains, with accompanying data and tools, to stakeholders including industry, academics, and other BETO projects (e.g. BioFoundry)

February 17, 2017

9 | Bioenergy Technologies Office





Energy Efficiency &

**Renewable Energy** 

### **DISCOVR Synergistically Leverages Core Capabilities**

#### DISCOVR builds on national lab core capabilities developed separately and using different strains in other BETO-funded projects:

- Climate-Simulated Culturing and Growth Modeling (PNNL)
  - NAABB Consortium Project
  - Microalgae Analysis AOP (1.3.1.102) (FY15-FY16)
  - Regional Algae Testbed Partnership, RAFT (1.3.5.111) (FY14-FY17)

#### Biological Protection and Control of Algal Pond Productivity (SNL)

- ATP<sup>3</sup> Consortium Project (1.3.5.101) (FY14-FY16)
- TABB Project (1.3.2.300)
- Algae Polyculture Production and Analysis AOP (1.3.1.103) (FY16)
- Strain Improvement by Non-GMO Techniques (LANL)
  - 1.3.2.100 Multi-scale Characterization of Improved Algae Strains (1.3.2.100)
- Advanced Tools for Biomass Compositional Analyses (NREL)
  - Algal Biomass Valorization (ABV, 1.3.4.300)



## **Approach Project Overview and Work Flow\***



#### **Critical Success Factors**

- Very unique state-of-the-art technical capabilities are employed at each TIER.
- Complementary core competencies of the consortium national labs are applied together to make progress towards BETO's \$3/GGE target.
- Team members have track record of successful collaboration.

"The Whole is Greater than the Sum of its Parts" (Aristotle)

> \*Numbers in **red** designate the number of strains tested at each **TIER** for both rounds of screening.



Energy Efficiency & Renewable Energy

## Approach Rapid Strain Screening in Microplates

### Challenges

- Very few strains so far have been rigorously characterized in terms of their suitability for high productivity outdoor cultivation:
  - Temperature and salinity tolerance range
  - Maximum specific growth rate (related to productivity)
  - Tolerance to high O<sub>2</sub> and low pH
- Current methods are non-standardized and labor intensive

### Approach

- Use semi-automated temperature-controlled wellplate incubation system and BioTek microplate reader
- Measure the maximum specific growth rate as a function of temperature, salinity, O<sub>2</sub>, pH, C-source



U.S. DEPARTMENT OF

Energy Efficiency & Renewable Energy



6 7 6 7 6 V 🔤







### **Approach** Climate-Simulated Culturing

### Challenge



- Quantify seasonal areal biomass productivities in the laboratory under conditions simulating outdoor testbeds in Arizona.
- There are currently no outdoor pond simulator photobioreactors that accurately predict biomass productivity in outdoor ponds.

#### Approach

Culture Tier II strains in PNNL's validated Laboratory Environmental Algae Pond Simulator (LEAPS) photobioreactors using light and temperature scripts generated by PNNL's Biomass Assessment Tool (BAT) for Arizona testbeds.





### **Approach** Climate-Simulated Culturing

### **LEAPS Accurately Simulates Outdoor Ponds**



- Executes seasonal light and temperature scripts accurately
- Performance has been validated by repeating three outdoor pond experiments for different strains in the LEAPS
- Biomass productivity in LEAPS was the same as in outdoor ponds
- Currently the world's most reliable pond simulator photobioreactor









Energy Efficiency & Renewable Energy

### **Approach** Biomass Compositional Analysis

### Challenges



- Critical need for compositional comparisons of strains with integrated valuable co-product characterization to reduce cost of biofuels
- Evaluate suitability of microalgae strains for
  - **HTL pathway** (rapid biomass growth unconstrained by co-products)
  - CAP pathway (rapid biomass growth and early transition to high carbohydrate and lipid content)

### Approach

- Tier II Strains: Determine biomass composition of nutrient replete and deplete samples taken from LEAPs bioreactors:
  - Total carbohydrates and sugar profile
  - Protein content
  - Lipid content and fatty acid profile



Renewable Energy

- Tier III Strains: Analyze biomass samples for co-products such as sterols, carotenoids, omega-3-fatty acids, phycocyanin, etc.
- \* HTL = hydrothermal liquifaction, CAP = Combined Algal Processing (extraction of lipids for fuels, anaerobic digestion of waste biomass)

## Approach Culture Stability/Resilience Testing

### Challenges

- Eliminate or reduce risk of pond crashes
- Identify strains' resistance to predation (e.g., rotifers) and fungal infections prior to conducting outdoor testbed trials

### Approach

- Tier II Strains: Use previously developed assays to quantify resistance of algal communities to predation and infections
- Tier III Strains: Conduct tests in the SNL Algal Testbed (Crash Lab):
  - Induce pond culture crashes via addition of deleterious species identified in TIER II testing
  - Determine conditions under which resistance persists
  - Use spectroradiometric monitoring for creation of robust signatures of pond infection
  - Use data combined with machine learning to inform cultivation decision making







Sandia

National

aboratories



#### Approach Strain Improvement

### Challenge



- Significantly increase (>20%) biomass and/or lipid productivity of top performing Tier III strains
- **Increase environmental robustness** (e.g., temp/salinity tolerance)

#### Approach

- Apply approaches already developed at LANL to improve strain phenotypes without genetic modification:
  - Fluorescence activated cell sorting
  - Adaptive evolution
- Test new phenotypes in **LEAPS** to validate improved productivity



### Approach Testing in Outdoor Ponds

### **Objectives**



- Quantify seasonal biomass productivities in outdoor ponds in Arizona
- Demonstrate at least 20% greater productivities relative to benchmarks
- Evaluate co-product generation at scale
- Harvest sufficient biomass for conversion studies (by others)

#### Approach

 Conduct outdoor cultivation studies at the Algae Testbed Public Private Partnership site in Mesa, Arizona (ATP<sup>3</sup>)





Energy Efficiency & Renewable Energy

BETO Peer Review Meeting – March 2017

## Approach Productivity Mapping for TEAs/LCAs

#### **Objectives**



- Generate areal biomass productivity maps for those strains performing best in outdoor ponds
- Identify geographic regions of maximum annual biomass productivity using crop rotation and optimized pond operational strategies
- Provide input data for TEAs and LCAs (conducted by other projects)

#### Approach

- Experimentally determine all required biomass growth model input parameters
- Run the species-specific Biomass Assessment Tool (BAT) to generate maps for different crop rotation and pond operation scenarios



Annual biomass productivity map for *Chlorella sorokiniana* DOE 1412



Energy Efficiency & Renewable Energy

### **Approach** Data Management and Dissemination

- Interlaboratory collaborative data management system is established for sharing documents and raw data (NREL Sharepoint)
- Scientific Data Management system for productivity and composition will be leveraged from ATP<sup>3</sup> established system with curated data made available on **OpenEl.org**
- Strain sequence data will be hosted at LANL's Greenhouse.lanl.gov

Discovr - Home   Discovr - Home    Discovr - Home    Discovr - Home     Discovr - Home		
Laurens, Lieve	• @ ?	
🖸 SHARE 🟠 FOLLOW 🗔 STAC 🖌	edit 💬	
Search this site	م	
DISCOVR collaboration site! Calendar • • February 2017		
nis list SUNDAY MONDAY TUESDAY WEDNESDAY THURSDAY FRIDAY SAT 29 30 31 1 2 3 4	URDAY	
his view of the "Announcements" list.		
5 6 7 8 9 10 11		
here		
1By 12 13 14 15 16 17 18		
view.		
19 20 21 22 23 24 25		





Energy Efficiency & Renewable Energy

BETO Peer Review Meeting – March 2017

### **Future Work and Early Accomplishments**



#### **Go/No Go Decision**

- Successfully completed TIER I, II, and III testing of the first batch (round) of strains (3/2018)
- Demonstrated at least 20% improvement in biomass productivity relative to benchmark strains (3/2018)



Energy Efficiency & Renewable Energy

### **TIER I** Strain Acquisition for Screening

#### Outcome



Energy Efficiency & Renewable Energy

Acquire and revive at least 30 strains existing in culture collections and the algae community with the potential to meet BETO's algae productivity goals via improved growth, biochemical composition, and outdoor robustness.

#### Approach

- Identify, order, and revive strains from culture collections
- Conduct 16S/18S sequencing to determine level of contamination
- Clean-up cultures and confirm using 16/18S sequencing
- Adapt strains to DISCOVR low cost media and deliver to PNNL

#### Milestones

- Identify, order, receive, revive 1<sup>st</sup> batch of TIER I strains (12/2016)
- Identify, order, receive, revive 2<sup>nd</sup> batch of TIER I strains (6/2017)



### **TIER I** Strain Acquisition for Screening

### **Batch 1 Strains (FY17)**

- Screen at least 15 strains (21 have been selected)
- 12 are marine or brackish water strains
- 9 are freshwater strains, including from the NAABB program
- Benchmark strains:
  - Warm Season (fresh water): *Chlorella sorokiniana* DOE 1412 (NAABB)
  - Cold Season (fresh water): Scenedesmus obliquus DOE 0152.Z (NAABB)

Strain No.	Alga Strain	Brief Taxonomy	Collection	Characteristic
1	Chlorella sorokiniana DOE 1412	Green- Trebouxiophyceae	CUNY	BENCHMARK STRAIN freshwater, cold-sensitive, Max ~42°C
2	Chlorella autotrophica CCMP243	Green- Trebouxiophyceae	NCMA	Euryhaline/marine- Milford, Connecticut
3	Stichococcus minor CCMP819	Green- Trebouxiophyceae	NCMA	Brackish, Florida Keys
4	Stichococcus minutus CCALA727	Green- Trebouxiophyceae	CCALA	Cold tolerant, Svalbard, Arctic circle, subglacial
5	Chloromonas reticulata CCALA870	Green- Chlorophyceae	CCALA	Cold Tolerant, Scotland, Alpine
6	Synechococcus elongatus UTEX 2973-sub. 1	Cyanobacteria	UTEX	Brackish, thermotolerant (40 C), sub. 1 is stable at 20 C
7	Synechococcus elongatus CCMP 1630	Cyanobacteria	NCMA	Marine, Max ~40°C, Tyrrhenian Sea, Robust
8	Picochlorum oklahomensis CCMP 2329	Green- Trebouxiophyceae	NCMA	Brine pool, Max ~40°C
9	Stichogloea doederleinii CCMP823	Phaeothamniophy ceae	NCMA	Plankton bloom Freshwater, Max ~35°C (Not yet received from NCMA)
10	Pleurochrysis carterae CCMP647	Coccolithophore	NCMA	Salton Sea, robust
11	Agmenellum quadruplicatum UTEX2268	Cyanobacteria	UTEX	Marine, isolated from fish-pens mud, Puerto Rico

12	Chlorococcum minutum UTEX 117	Green- Chlorophyceae	UTEX	Terrestrial, (Bombay, India)
13	Coelastrella sp. DOE0202	Green- Sphaeropleales	CUNY	Freshwater, high harvestibility, CUNY
14	Unknown Green Alga DOE1044	Green- Chlorophyceae	UTEX	(high biomass productivity- CUNY/NAABB)
15	Desmodesmus sp. DOE1357	Green- Sphaeropleales	UTEX	(high biomass productivity- CUNY/NAABB)
16	Chlorococcum sp. DOE1426	Green- Chlorophyceae	UTEX	(high biomass productivity- CUNY/NAABB)
17	Unknown Green Alga DOE1116	Green-	UTEX	(high biomass productivity- CUNY/NAABB)
18	Chaetoceros muelleri CCMP194	Bacillariophtya- centric diatom	NCMA	Saline crater lake, Galapagos Islands
19	Surirella sp. CCMP3162	Bacillariophtya- pennate diatom	NCMA	isolated from Salt Lake (Lake George), North Dakota-(Revival unsuccessful)
20	Rhodomonas salina CCMP1319	Cryptophyte	NCMA	Marine
21	Thalassiosira weissflogii CCMP1051	Bacillariophtya- centric diatom	NCMA	Brackish, warm water, King Kalakaua's Fishpond, Kahaluu, Hawaii
22	Tisochrysis lutea CCMP463	Haptophyta - golden alga	NCMA	Marine, aquaculture



Energy Efficiency & Renewable Energy

23 | Bioenergy Technologies Office

BETO Peer Review Meeting – March 2017



### **TIER I** Strain Screening on Microplates

#### Outcomes

- Identify fast growing strains, compare to benchmark strains
- Determine temperature and salinity tolerance range
- Quantify tolerance to oxygen and low pH
- Assess heterotrophic growth potential (cellulosic hydrolysates)







#### **Milestones**

- Complete screening of 1<sup>st</sup> batch of TIER I strains (3/2017)
- Complete screening of 2<sup>nd</sup> batch of TIER II strains (3/2018)





### **TIER I** Strain Screening on Microplates



#### **Development of Industrially Relevant DISCOVR Media**

- Ammonium sulfate is primary N source, reflecting dominant form of recycled N following biomass conversion processes (HTL, CAP)
- N:P ratio = 16:1 (Redfield)
- DISCOVR media support growth up to 800 mg/L AFDW
- DISCOVR freshwater medium supports growth as well as BG-11
- Media have been reviewed by Technical Advisory Board



February 17, 2017



Less Expensive than BG11

Energy Efficiency &

**Renewable Energy** 

- Proxy for Recycled Media
- Harmonized with NREL Design Case





#### Outcomes

- Quantify seasonal areal biomass productivities of top Tier I strains under conditions simulating outdoor testbeds in Arizona (ATP<sup>3</sup>, UA)
- Generate biomass for NREL compositional analyses
- Test harvestability (settling time)
- Strains with productivities >20% greater than benchmarks pass to Tier III



#### **Milestones**

- Quantify biomass productivities of at least 5 TIER I strains (9/2017)
- Quantify biomass productivities of at least 5 TIER I strains (9/2018)

BETO Peer Review Meeting – March 2017







## **TIER II + III** Biomass Compositional Analysis

#### Outcomes

- Tier II Strains: Determine biomass composition of nutrient replete and deplete samples taken from LEAPs bioreactor using established methods:
  - Determine biochemical shift profile under nutrient depletion
  - Integrate composition with productivity data supporting TEA/LCA
- Tier III Strains: Identify set of critical economic co.<sup>8</sup> products present in respective species taken from cultures for co-products such as sterols, carotenoids, omega-3-fatty acid, phycocyanin, …

### Milestones



**Renewable Energy** 

- Determine biochemical composition of 5 TIER II strains (9/2017)
- Determine detailed composition of 3 TIER III strains and conduct pretreatment severity testing for CAP process (3/2018)
  U.S. DEPARTMENT OF Energy Efficiency &

### Outcomes



Energy Efficiency & Renewable Energy

- Increase (>20%) biomass and/or lipid productivity and/or environmental robustness of top performing Tier III strains via:
  - Fluorescence activated cell sorting
  - Adaptive evolution, combined with chemical mutagenesis



#### **Milestones**

► Generate at least two improved strains (≥20% improvement in coproduct content or biomass productivity relative to parent) for hand-off to PNNL for LEAPS evaluation (6/2019)



### **TIER II** Culture Stability/Resilience Testing

### Outcomes



#### Develop predator/pathogen panel

- Identify 25 commercially available predator species for initial testing
- Test predator species for culture stability and activity against a panel of 3 "standard" algae
- Develop standardized laboratory-scale crash protocol
- Identify set of relevant environmental culture conditions
- Develop a panel of at least 8 deleterious species
- Characterize selected algal strains under selected environmental conditions against predator panel
  - Identify strains with the broadest predator and pathogen resistance at lab scale

#### Milestones

- Complete testing four predator initial panel (3/2017)
- Complete lab-scale testing (9/2017)



Energy Efficiency & Renewable Energy

### **TIER III** Culture Stability/Resilience Testing

#### Outcomes



**Renewable Energy** 

- Complete tests in the SNL Algal Testbed (Crash Lab):
  - Induce pond culture crashes via addition of deleterious species identified in TIER II testing
  - Determine conditions under which resistance persists



Days P.I.

### Milestones

- Demonstrate standard crash assays at 1000L pond scale (6/2017)
- Complete pond scale evaluation of predation resistance of 2-4 algal strains (12/2018)
  U.S. DEPARTMENT OF Energy Efficiency &





## TIER II+III Spectroradiometric Monitoring

### Outcomes

Identify and characterize the spectral signatures resulting from the interaction of algae with multiple, diverse pests relevant to production scale algal culture in a stand-off fashion





Sandia

National

aboratories

### FY17 Tasks

- Analysis of field trial data from crashing ponds collected in the ATP<sup>3</sup> AFS trials to identify optical signatures of functional pest presence
- Multifactorial (temp and salinity) experiments on one algal/pathogen pair to validate and assess the sensitivity and specificity of the optical biomarkers under relevant (and highly variable) field conditions.



### Outcomes

Leverage the data generated by DISCOVR combined with those from RAFT and ATP<sup>3</sup> to identify pond operation practices and parameters that enhance stability and productivity

We will apply and ensemble machine learning methods, such as regression, random decision forests, Baysian network, clustering, support vector machines, artificial neural networks to achieve this goal.



### FY17 Tasks

- Develop a predictive model for pond productivity and reliability based on genetic data acquired from ATP<sup>3</sup> and RAFT consortiums.
- Use the multipathogen/multialgal data generated by DISCOVR to create contamination models that will inform pond operation strategies such as harvesting and re-inoculation.



Sandia

National

ooratories

## **TIER IV+V** Pond Testing / Productivity Mapping



### **Milestone for Outdoor Pond Trials**

Complete outdoor pond testing for at least four TIER IV Strains (9/2019)



#### **Milestone for Productivity Mapping**

Generate biomass productivity maps by species-specific Biomass Assessment Tool (BAT) for TIER V strains (9/2019)



Annual biomass productivity map for *Chlorella sorokiniana* DOE 1412



Energy Efficiency & Renewable Energy

#### Relevance

- Reduce total microalgae biofuels production costs to \$3/GGE by 2030 by developing an integrated screening platform for identification of high productivity strains with cellular composition suitable for biofuels and bioproducts for resilient, year-round outdoor cultivation via crop rotation.
- Overcome limitations of previous strain prospecting efforts such as low success rate, slow speed, and unrealistic laboratory test conditions.
- Addresses critical research needs stated in BETO's 2016 MYPP and National Algae Biofuels Technology Review (NABTR):
  - Stable high yield strains that resist predators in large-scale ponds (MYPP)
  - Strain screening and climate-simulated culturing (NABTR)
- Addresses the need for cost reduction via valorization of biomass, as presented by NREL at the Jan 2017 BETO quarterly SOT meeting.
- Standardized identification, deep characterization, and delivery of robust, high productivity microalgae strains to industry and other BETO funded projects (e.g., Agile Biofoundry).
- Workflow will facilitate bioprospecting by algae biofuels stakeholders.



Energy Efficiency & Renewable Energy

#### Summary: The Gold Standard for Strain Characterization

- The DISCOVR project will develop a standardized, industrially-relevant process for characterizing and comparing potential biofuels/bioproduct strains.
- This project is a streamlined, coordinated effort to capitalize on consortium labs' complementary core capabilities in environmental simulation and productivity prediction, robustness evaluation, biomass valorization, and strain improvements.
- We aim to deliver new strains that perform better than the current State of Technology, in order to directly contribute to meeting BETO's goal of producing advanced biofuels at <\$3/GGE.</p>

#### "The Whole is Greater than the Sum of its Parts" (Aristotle)





### **TIER II+III** Machine Learning



We will apply and ensemble machine learning methods, such as regression, random decision forests, Baysian network, clustering, support vector machines, artificial neural networks to achieve this goal.







### **DISCOVR** Publicity

https://www.sciencedaily.com/releases/2017/01/170113133049.htm

https://www.eurekalert.org/pub\_releases/2017-01/dnnl-bmf011317.php

http://military-technologies.net/2017/01/13/biofuel-matchmaker-finding-the-perfect-algae-for-renewable-energy/

http://www.renewableenergyworld.com/articles/2017/01/biofuel-matchmaker-finding-the-perfect-algae-for-renewable-energy.html

http://www.algaeindustrymagazine.com/pnnl-seeking-perfect-algae-renewable-energy/

http://www.chemeurope.com/en/news/161401/biofuel-matchmaker-finding-the-perfect-algae-for-renewable-energy.html

http://latesttechnology.space/biofuel-matchmaker-finding-the-perfect-algae-for-renewable-energy/

http://www.alternative-energy-news.info/headlines/biofuels/

https://article.wn.com/view/2017/01/13/Biofuel matchmaker Finding the perfect algae for renewable e/

http://www.sequimgazette.com/news/sequim-lab-looks-to-find-the-best-biofuel-in-algae/

