

Growth Measurement and Modeling of *Dunaliella salina*

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Algal Biomass, Biofuels & Bioproducts
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Why Algae?

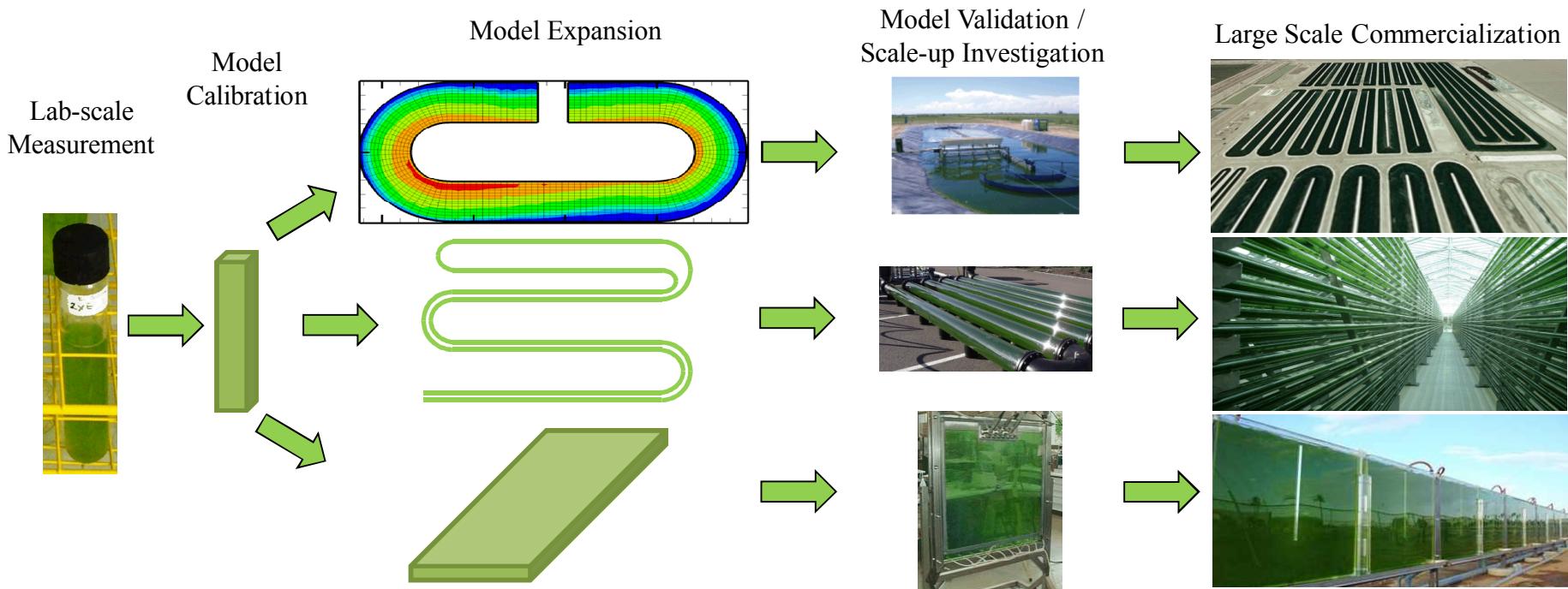


- **Algae-based biofuels are a promising component to a long-term renewable energy solution**
- **Algae can be engineered or stressed to produce large quantities of oil with favorable characteristics for biodiesel**
- **Algae can be grown in waste/brackish/sea water, reducing the impact on fresh water supplies**
- **Algae mitigate atmospheric CO₂**
- **Algae can be grown on non-arable land, decreasing the impact on the food supply**



Need Realistic Model

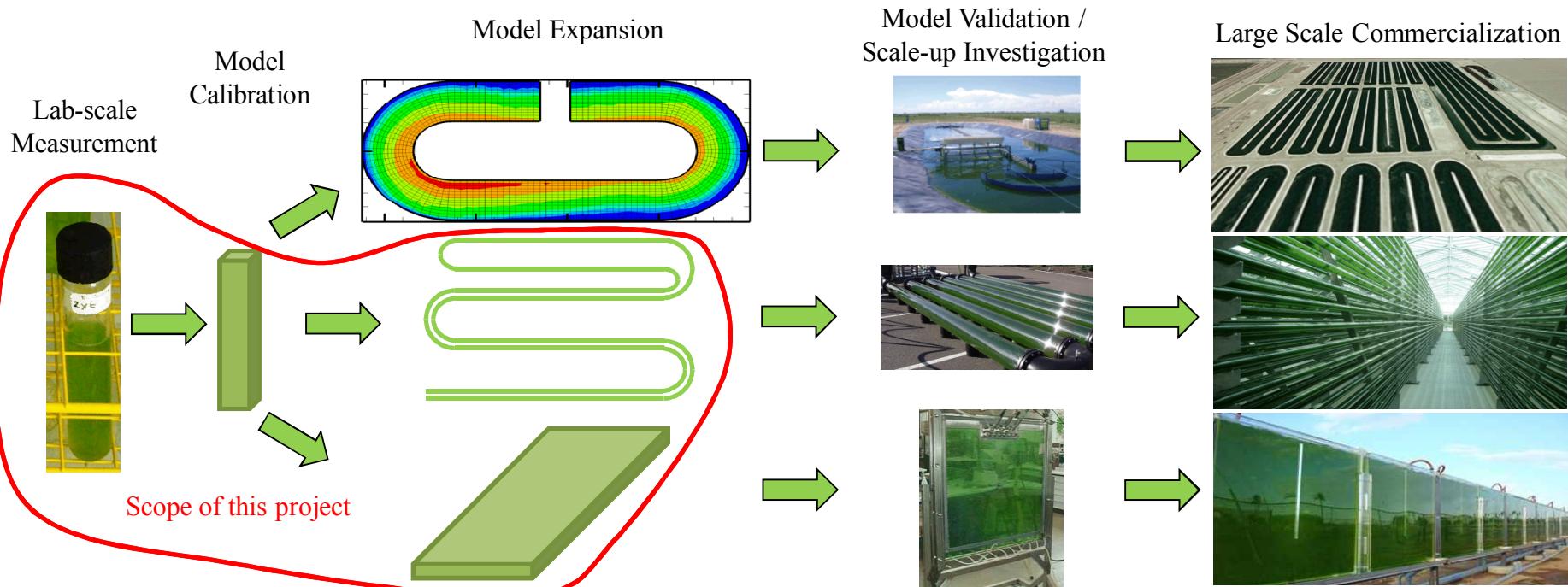
- We need to be able to optimize algae growth and lipid production in large commercial scale systems
- It is too time consuming and expensive to test various solutions on a commercial scale
- A computational model facilitates faster and cheaper optimization
- The necessary data are lacking to create the needed constitutive relations for algae growth and lipid production.





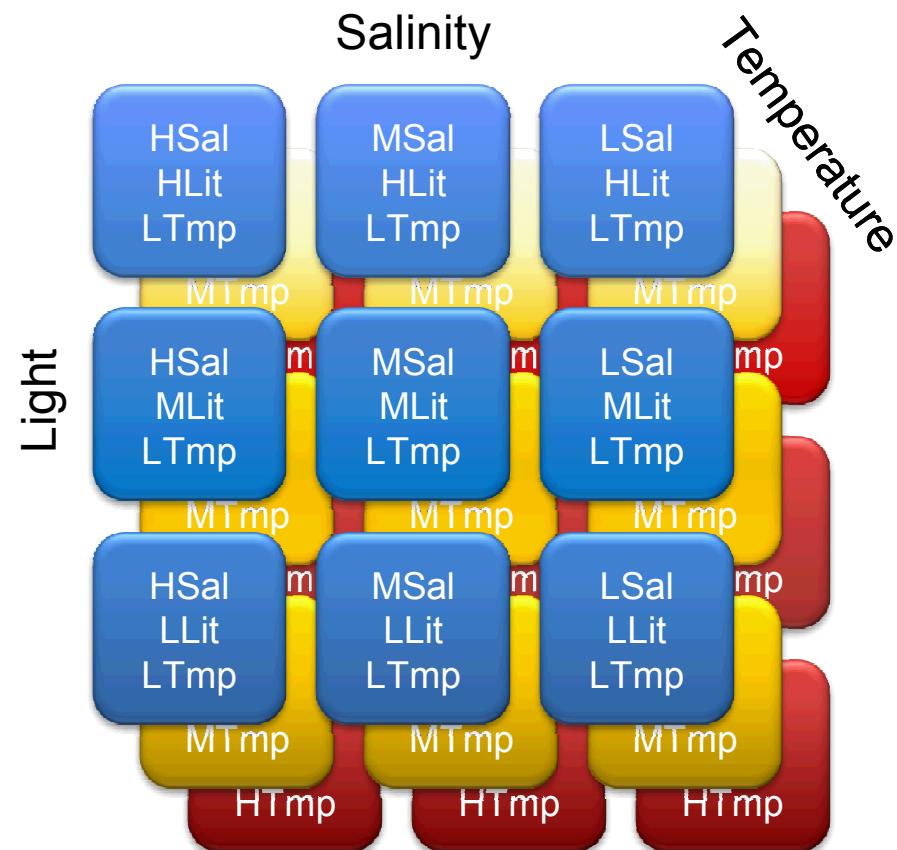
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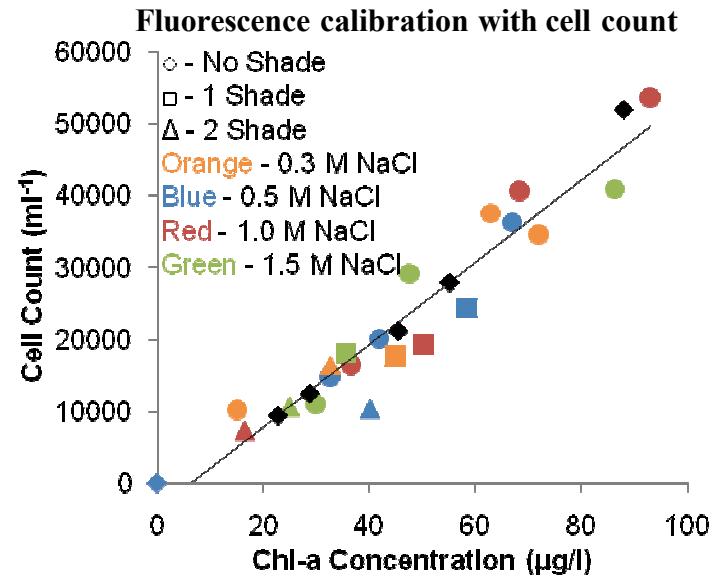
Project Goals

- **Multi-factorial Measurements**
 - Measure effect of light intensity, salinity and temperature on growth multiple key marine algal species
 - Use in-situ measurement methods and parallel growth to reduce time needed
- **Constitutive Relations**
 - Determine relationships between environmental variables and growth
 - Apply to algae growth model
- **Photobioreactor Models**
 - Develop model for closed photobioreactor systems
 - Expand model to use of marine algal species
 - Add lipid production to model



Measurement Technique

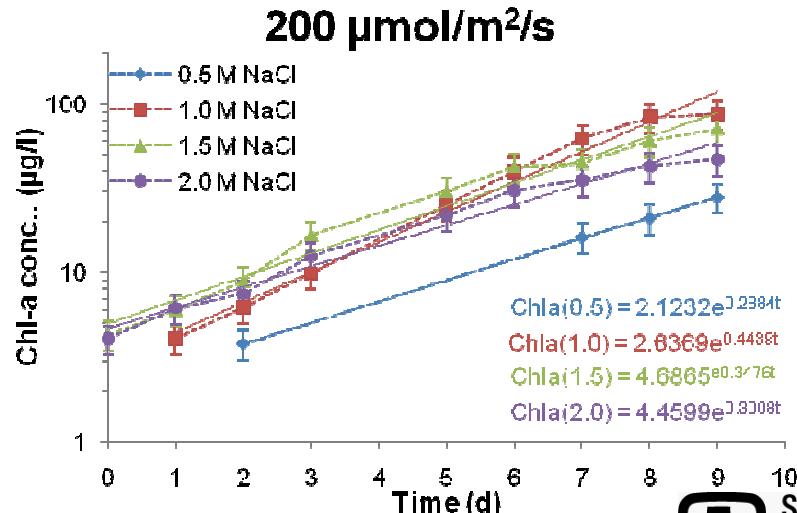
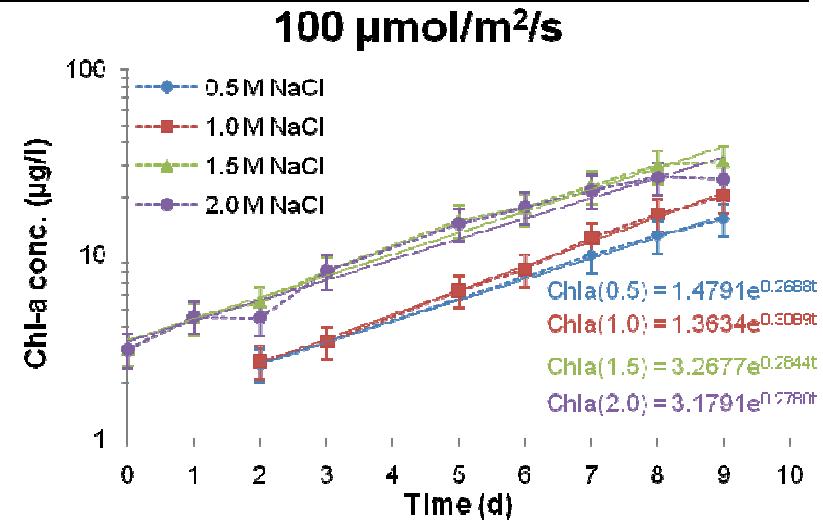
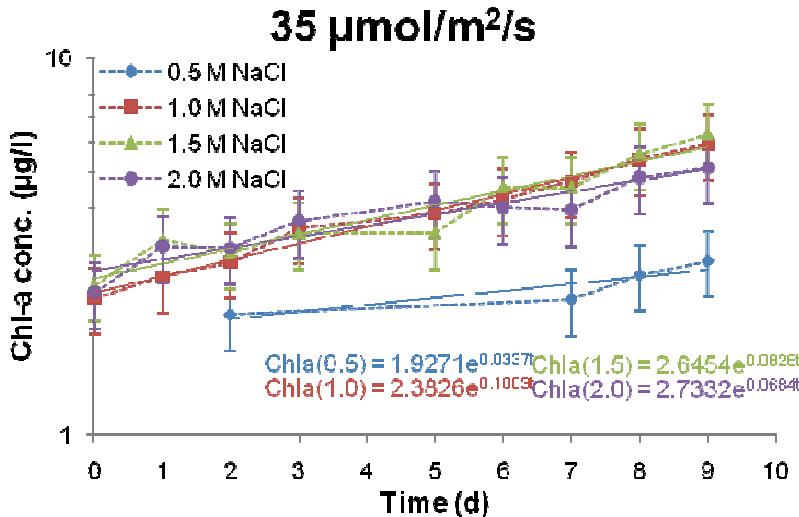
- **Algae:**
 - Marine, triacylglycerol (TAG) producing, readily available
 - *Dunaliella salina*, *Chlorella sorokiniana*, *Nannochloropsis oculata*, *Nitzschia frustulum*
- **Factors:**
 - Sample 4 salinities, 3 light intensities, 4 temperatures
- **Growth:**
 - Use chlorophyll a fluorescence
 - Excite at ~ 440 nm, emit at ~ 670 nm
 - Calibrate chlorophyll fluorescence with known standards of chlorophyll concentration
 - Calibrate chlorophyll concentration with cell counter for each algae species



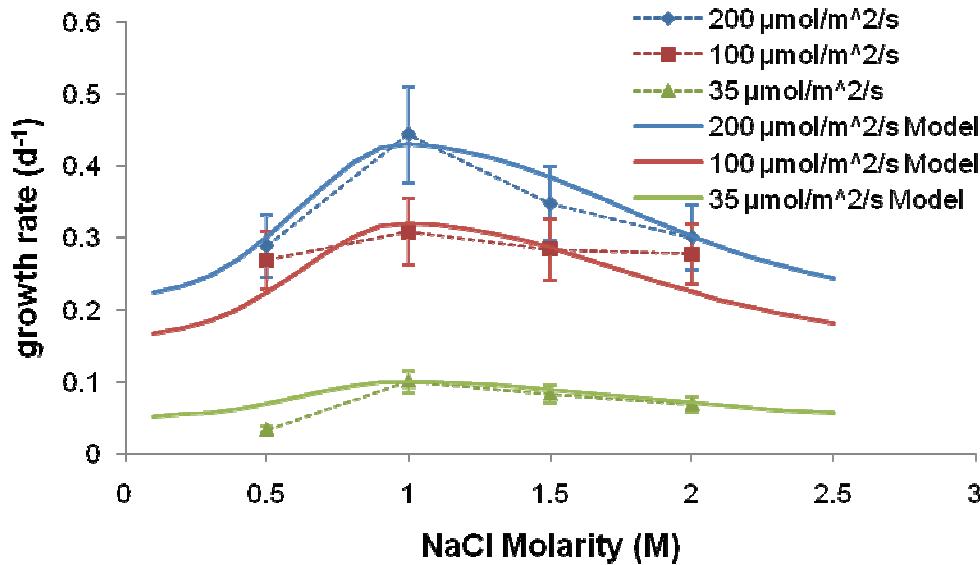
Growth Measurement Data

- Measured growth at 29 °C for 3 light intensities and 4 salinities in parallel
- Light/dark cycle = 16:8
- Measured in triplicate and averaged
- Calculate specific growth rate, μ , by fitting data to exponential growth curve:

$$C_{Chla} = C_0 e^{\mu t}$$



Constitutive Relation Determination

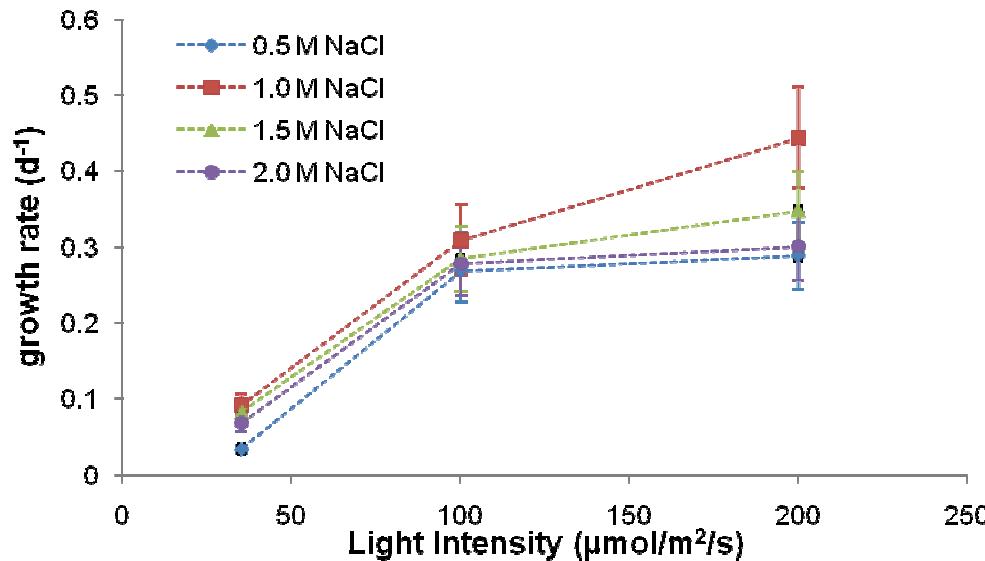


• Salinity

- Use a Gaussian type curve for salinity constitutive relation:
 - $ksal_1 = 0.0012 \text{ (ppt NaCl)}^{-2}$
 - $ksal_2 = 0.00025 \text{ (ppt NaCl)}^{-2}$
 - $S_{opt} = 57 \text{ ppt NaCl (0.975 M)}$
 - $f_{sal} = \frac{1}{2}$

$$f(S) = \frac{\mu(S)}{\mu_{opt}} = \begin{cases} \left(f_{sal} \exp\left(-ksal_1(S - S_{opt})^2\right) + (1 - f_{sal}) \right) & \text{when } S \leq S_{opt} \\ \left(f_{sal} \exp\left(-ksal_2(S - S_{opt})^2\right) + (1 - f_{sal}) \right) & \text{when } S > S_{opt} \end{cases}$$

Constitutive Relation Determination



- **Light Intensity**
 - Use Steele's equation for light intensity constitutive relation:
 - $I_{opt} = 210 \mu\text{mol}/\text{m}^2/\text{s}$
 - $FD = \frac{2}{3}$ (from 16:8 light/dark cycle)

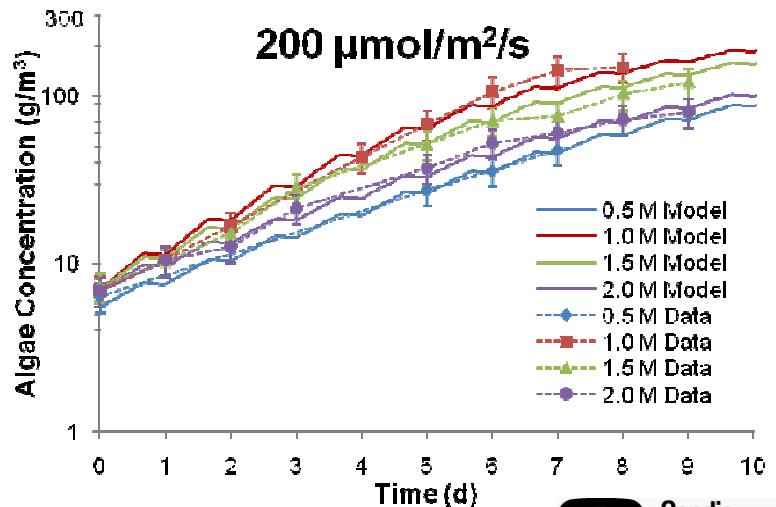
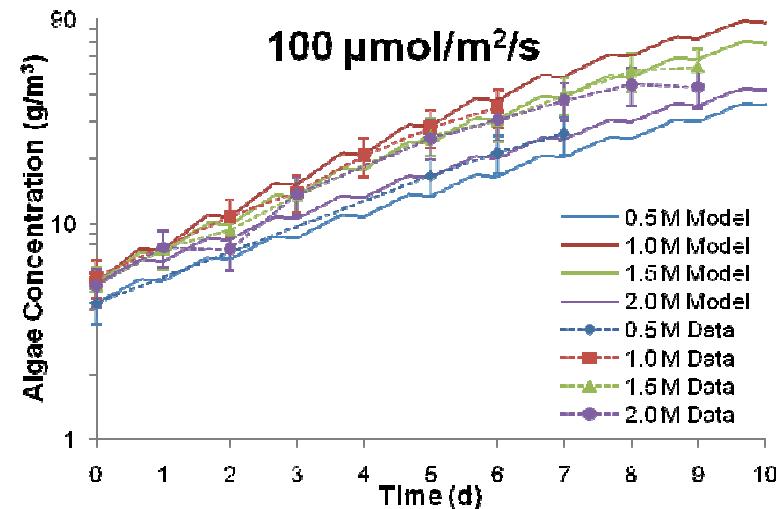
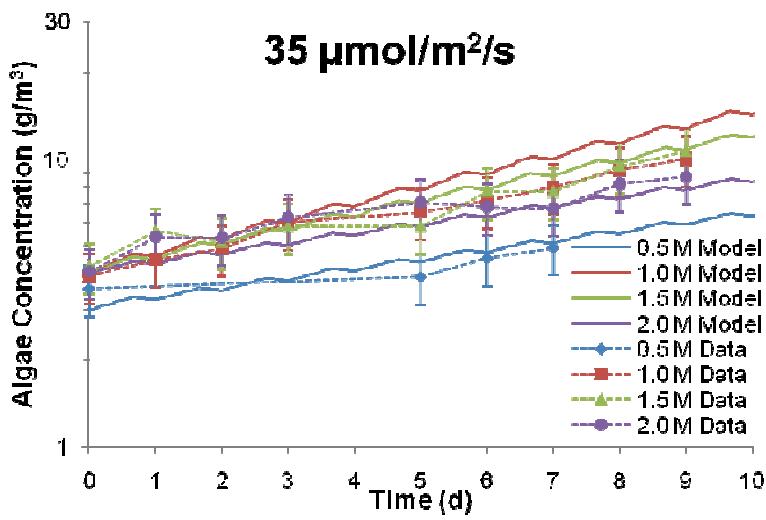
$$f(I_0) = \frac{\mu(I_0)}{\mu_{opt}} = \frac{2.718 \cdot FD}{Kess \cdot \Delta z} \left(e^{-\alpha_B} - e^{-\alpha_T} \right)$$

$$\alpha_B = \frac{I_0}{FD \cdot I_{opt}} e^{-Kess(H_T + \Delta z)}$$

$$\alpha_T = \frac{I_0}{FD \cdot I_{opt}} e^{-Kess \cdot H_T}$$

Lab-scale Model

- **SNL-EFDC Model:**
 - Models algae growth based on constitutive relations
 - B - biomass
 - P - production $\frac{\partial}{\partial t} B(\mathbf{x}, t) = (P - B_M - P_R) B(\mathbf{x}, t)$
 - B_M - metabolism
 - P_R - predation $P = \mu_{opt} \cdot [f_1(N)f_2(I)f_3(T)f_5(S)]$
 - Tracks nutrients, salinity, temperature, light, CO_2 and O_2 concentrations
 - Allows for sources and sinks of parameters
- **Predicted *D. salina* growth in test tube based on constitutive relations (from literature (T, I), measurement (S, I), and typical values (N))**





Conclusions

- **Experimental**
 - Developed and tested experiments for measuring growth of algae
 - Completed multi-factorial measurements of *D. salina* growth
- **Computational**
 - Added salinity growth dependence
 - Created airlift bubble type photobioreactor model (e.g.. test tube, column, plate)
 - Developed salinity, temperature, and light intensity constitutive relations for *D. salina*
 - Modeled *D. salina* in test tube airlift photobioreactor and compared to measurement data



Future Work

- Develop tubular flow fluid dynamics model to interface with algae growth model.
- Conduct growth measurements for more algae species/strains.
- Conduct lipid measurements and add lipid predictions to model.



Questions?
