

2023 FECM / NETL Carbon Management Research Project Review Meeting

August 28 - September 1, 2023

An Experimental and Computational Approach to Investigating CO₂ Uptake of Cellulose-Producing Algae from Cellulosic Ethanol Product (FE0032207)

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Outline

- Short introduction
- Why use *Nannochloropsis* algae for CO₂ uptake
- Large-scale simulations for cellulose formation
- Preliminary work with density functional tight binding calculations
- What's next?

Introduction



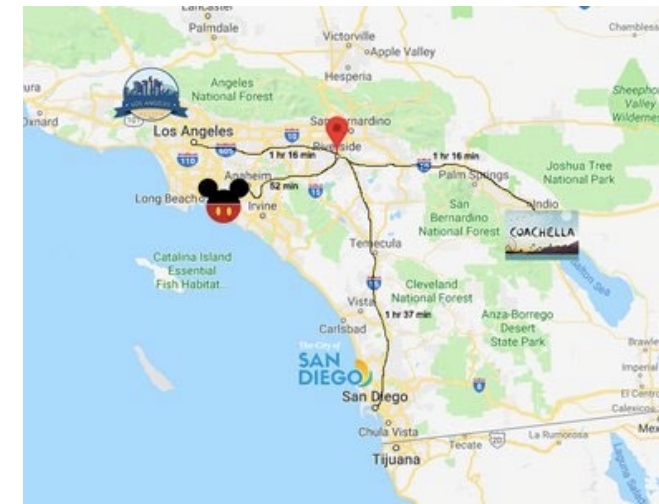
**Cai Group
(Experimental)**

Center for
Environmental
Research and
Technology (CE-CERT)



**Wong Group
(Computational)**

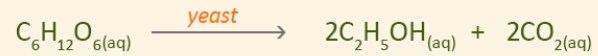
Materials Science
& Engineering (MSE)
Building



Cellulosic ethanol

Ethanol fermentation  traditional liquid fuel production

glucose $\xrightarrow{\text{yeast}}$ ethanol + carbon dioxide



Saving 50 %

CO₂ is still released

several ethanol plants have invested

Challenge

Economic

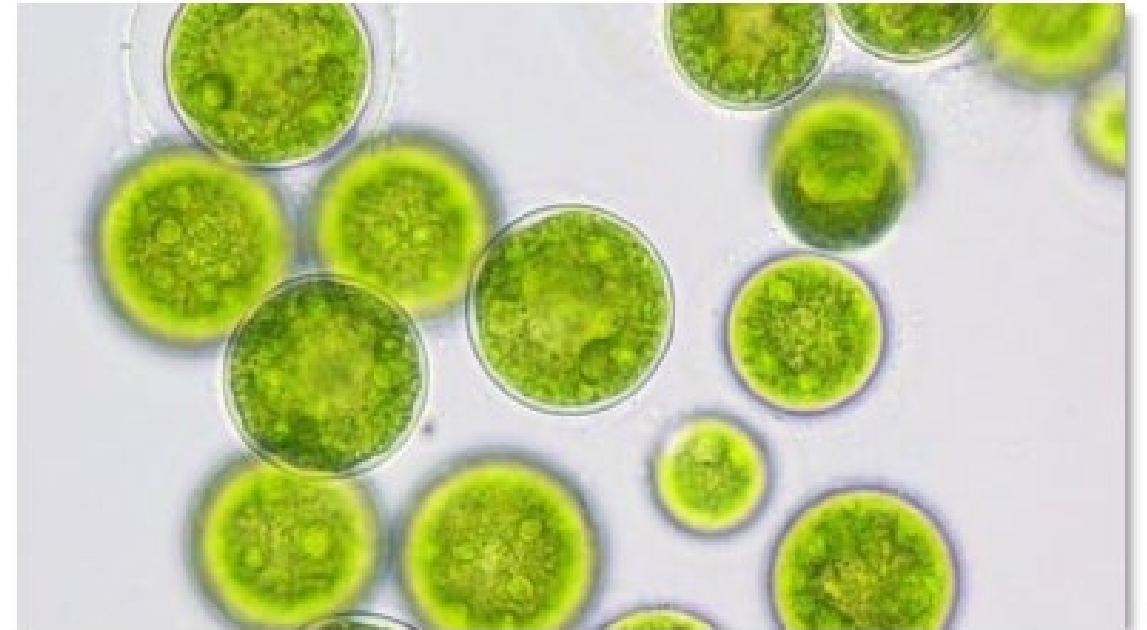
Cellulosic ethanol

Better than corn ethanol

> 20-30 gCO₂e/M

Nannochloropsis for CO₂ Uptake

- *Nannochloropsis*: cellulose-producing algae
- Can capture waste CO₂ from ethanol fermentation to produce
 - Algal lipids used for biodiesel production
 - microcrystalline cellulose as high-value co-product



Nannochloropsis for CO₂ Uptake

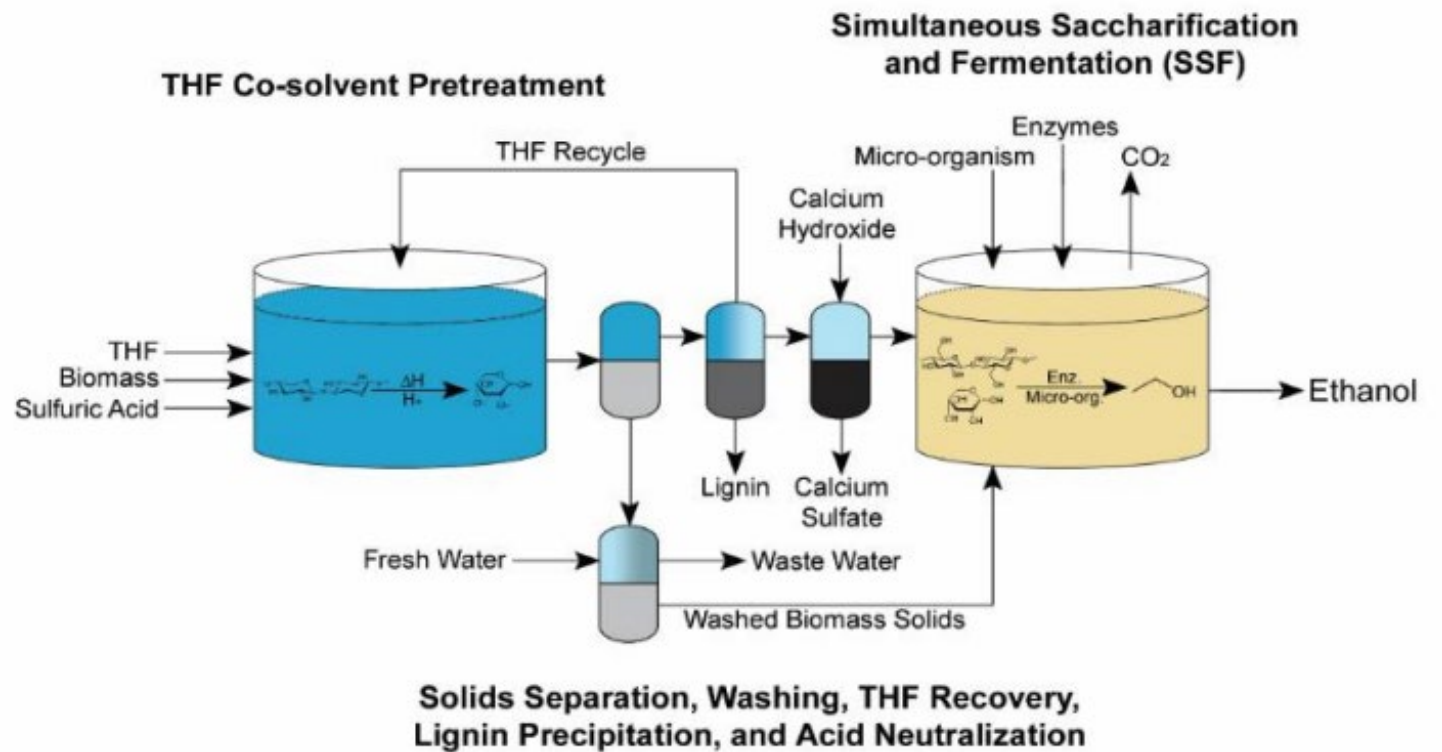
- **Economic & environmental benefits**
 - Capturing CO₂ from ethanol fermentations **supports algal production and enables potential greenhouse gas savings**
 - Lignin generated as byproduct can provide heating to support cellulosic ethanol production & algal cellulose production
 - **Lignin is biogenic:** its combustion is carbon neutral

Pretreatment Approaches

Co-Solvent Enhanced Lignin-cellulosic Fractionation (CELf) developed by experimental collaborator (Dr. Cai) to pretreat lignin-cellulosic biomass

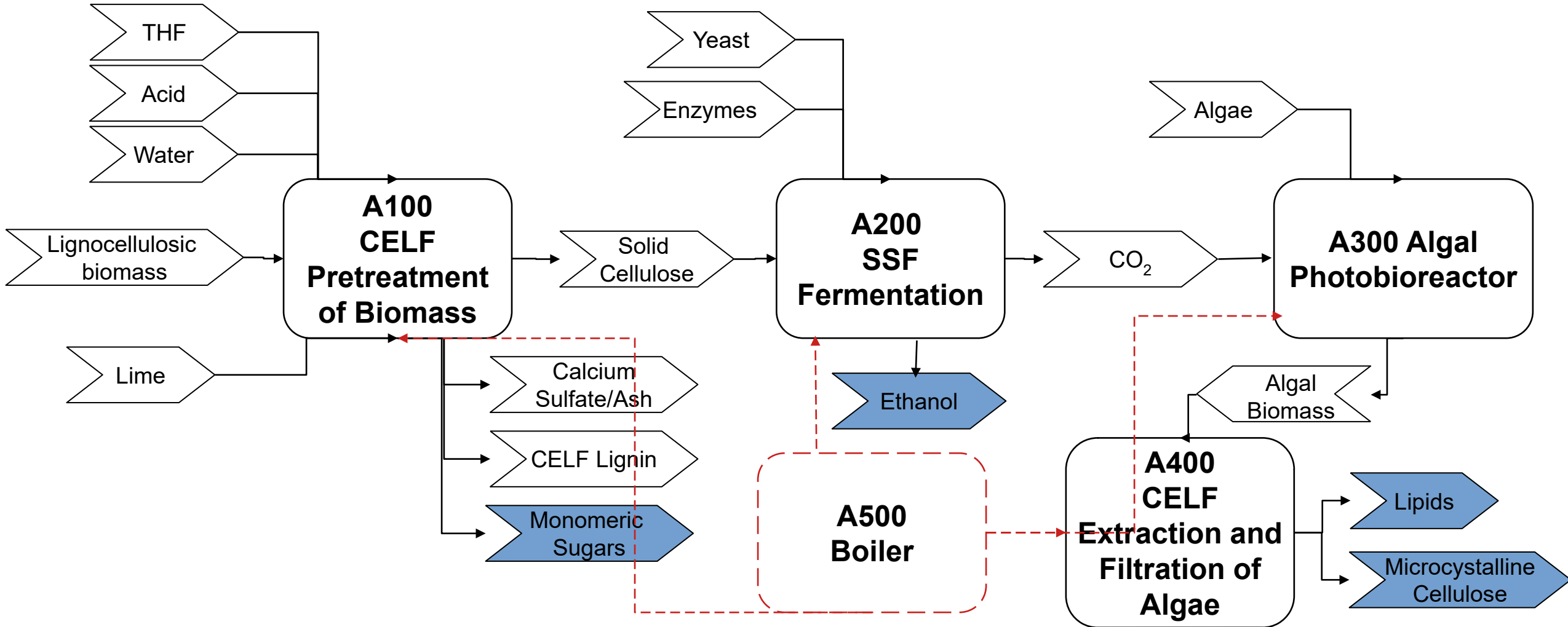
CELf nondestructively fractionates lignin, oleic, & protein in any plant-based

Could be extended to algae fractionating & extract *nannochloropsis*



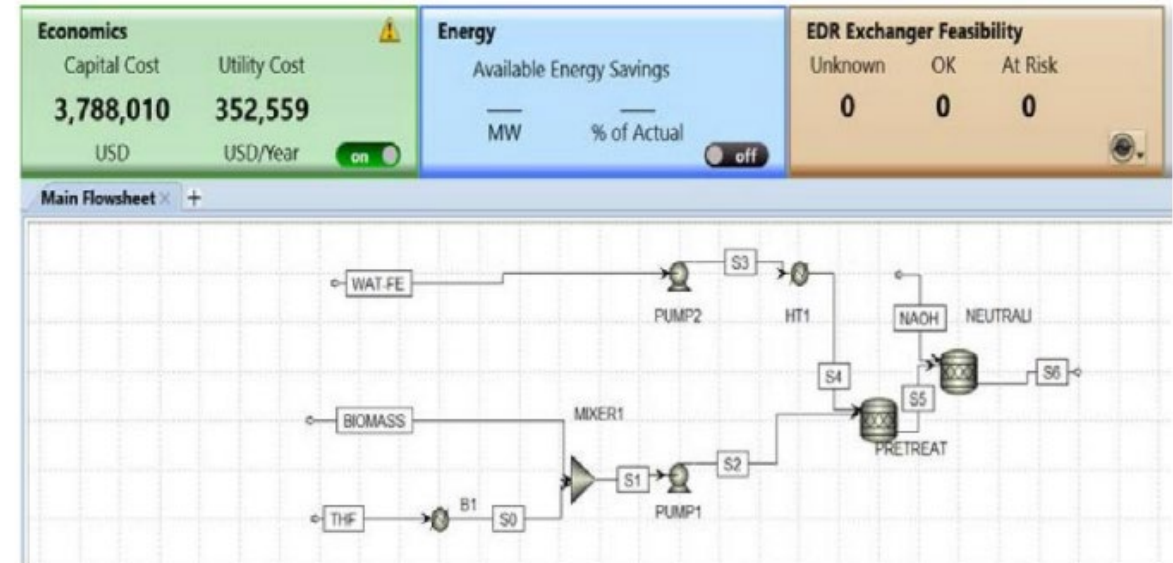
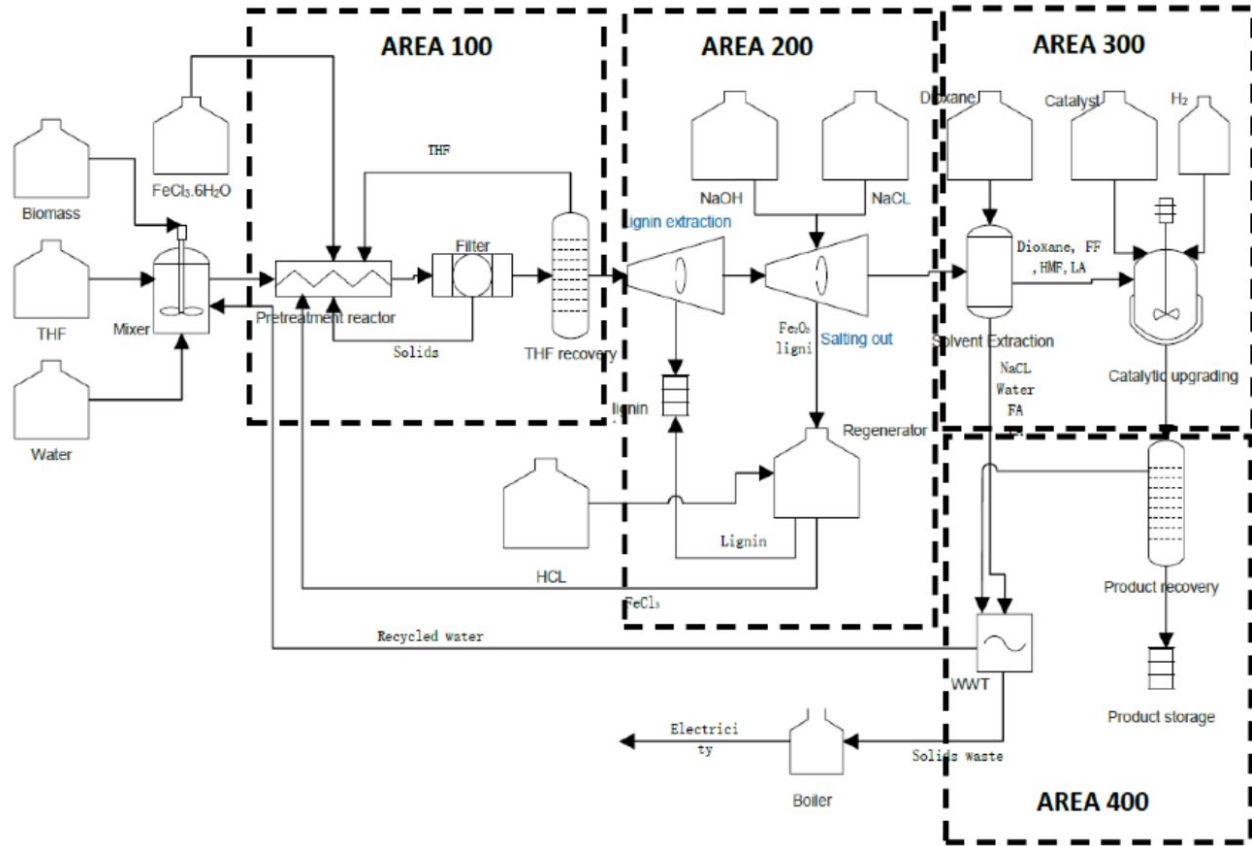
Process diagram flow

co-locating cellulosic ethanol fermentation with algal lipid and cellulose production



Life cycle analysis

Techno-economic & life cycle analysis will support quantitative outcomes



AspenOne software using modified GREET model for cellulosic ethanol will be used

Preliminary work with CELF

- Performed CELF pretreatment of **industrial hemp** and **corn stover** to prepare glucan-rich material for digestion by SSF (simultaneous saccharification and fermentation).
- CELF pretreated corn stover **achieved >80%** glucan, however, CELF pretreated industrial hemp **only reached 75%** (target 80%).
- We have begun to **optimize CELF conditions** to **further improve** glucan composition for industrial hemp. Once we have obtained similar glucan concentrations in both feedstock types, we can begin **to measure CO₂ emission** from fermentation.
- Our modeling team has **successfully integrated** CELF pretreatment, solids filtration, solvent recovery, and neutralization processes in AspenOne. We are currently **optimizing heat recovery** to calculate initial energy balance. Our goal is to target **total heat utilization of 4.5kwh/tonne biomass input**.

Preliminary work with CELF

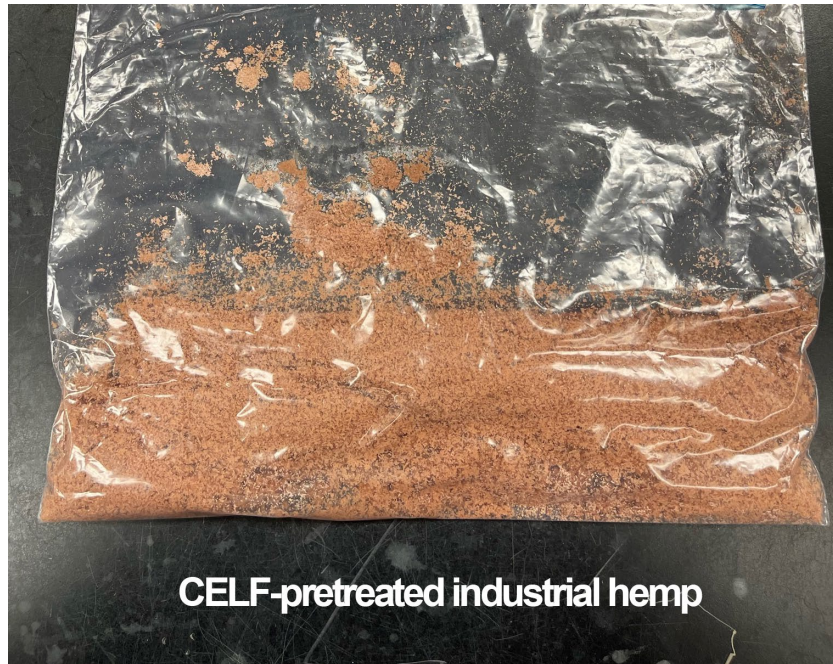


Figure 1. Knife-milled industrial hemp stalk subjected to mild CELF pretreatment

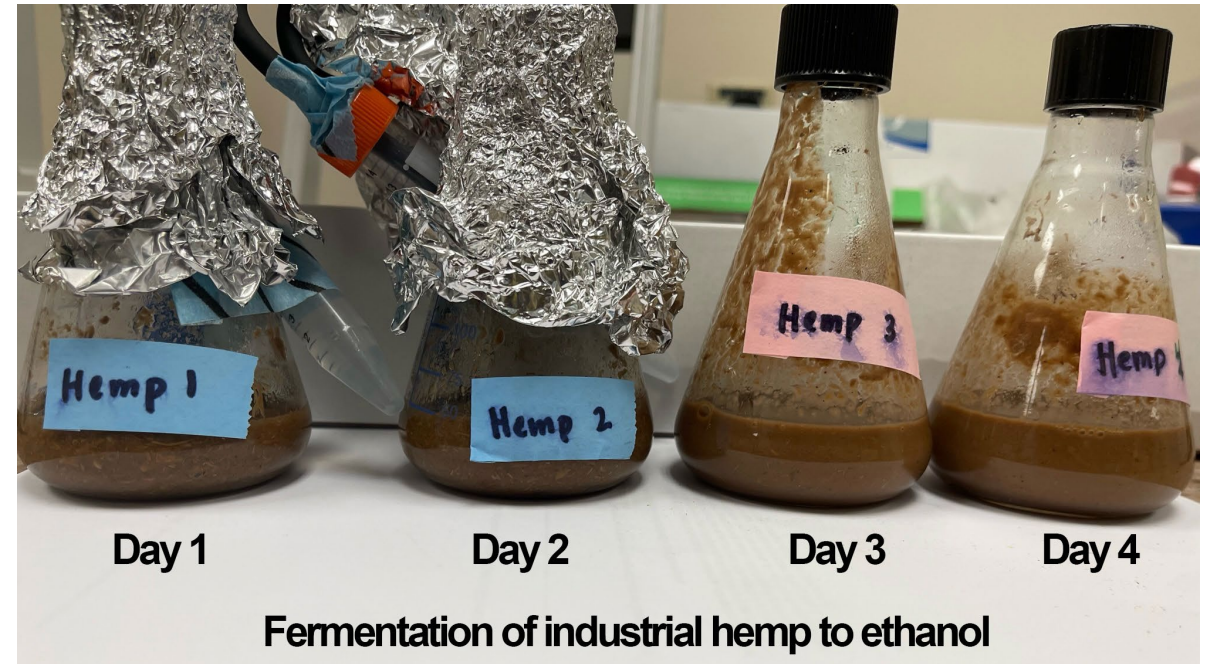
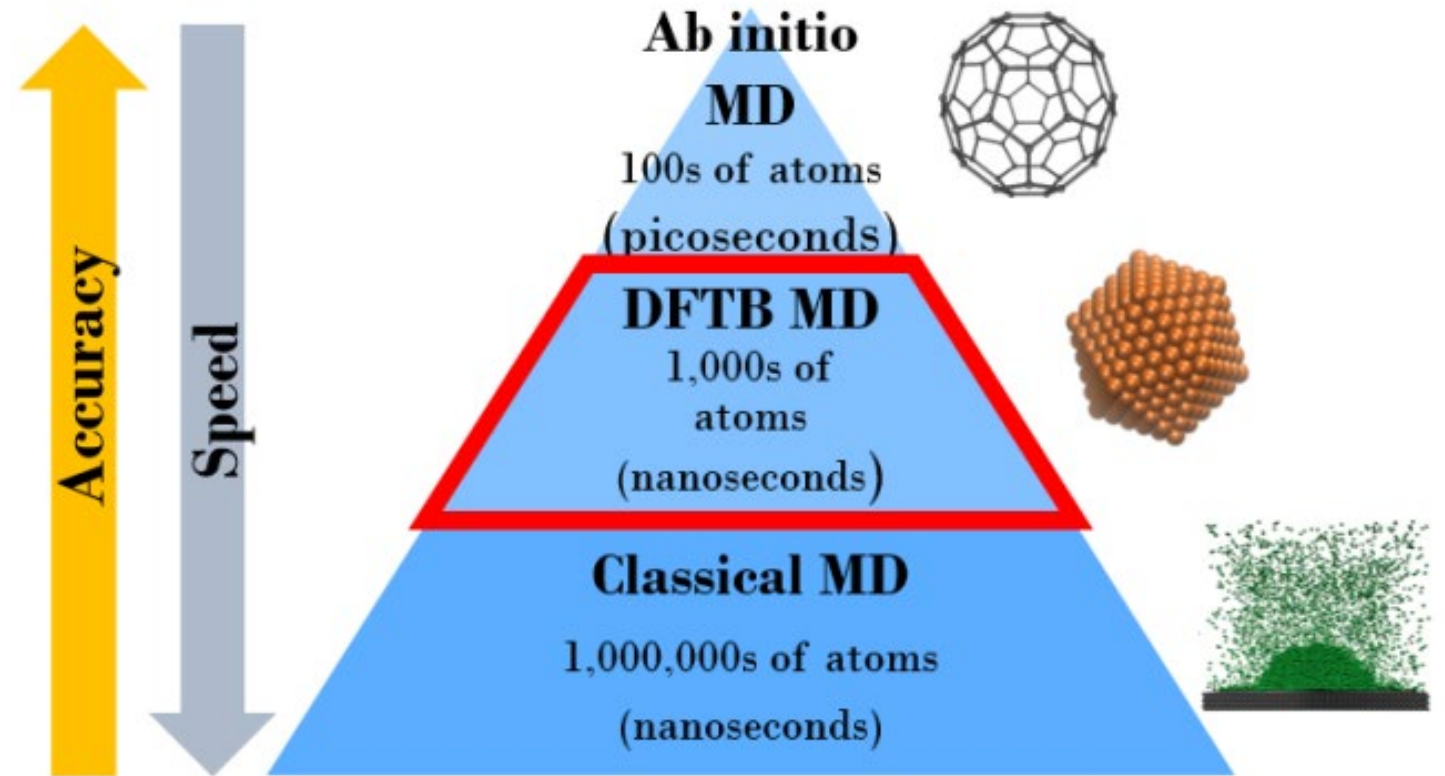


Figure 2. SSF of CELF-pretreated industrial hemp at 100 g/L initial loading. Observed rapid solubilization of solids over first four days. Ethanol analysis under way.

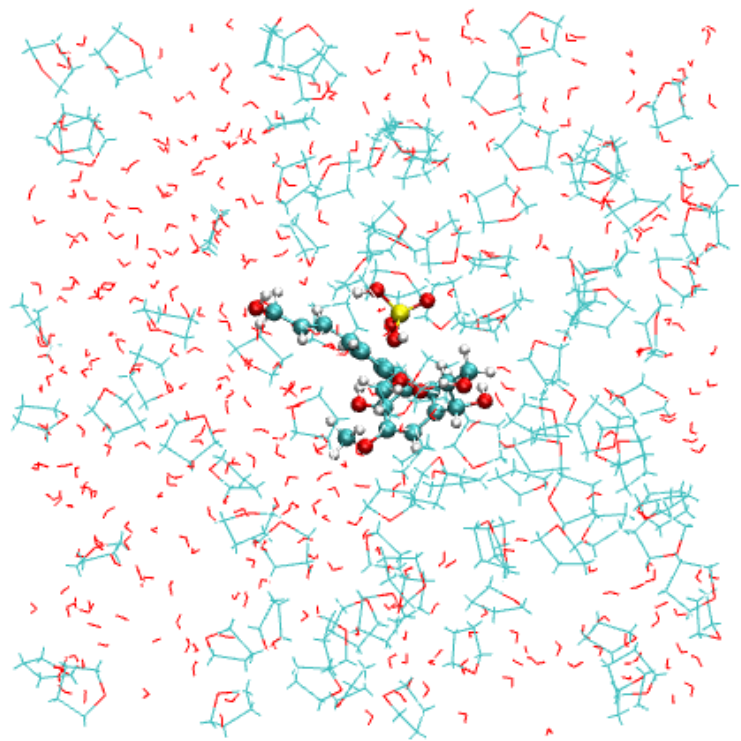
Molecular modelling

- DFT good for small systems
- Classical molecular dynamics can handle large systems but are missing the quantum part
- DFTB merges reliability of DFT with computational efficiency of tight binding



Molecular modelling

Large-scale **Density Functional Tight Binding (DFTB)** calculations will probe cellulose formation



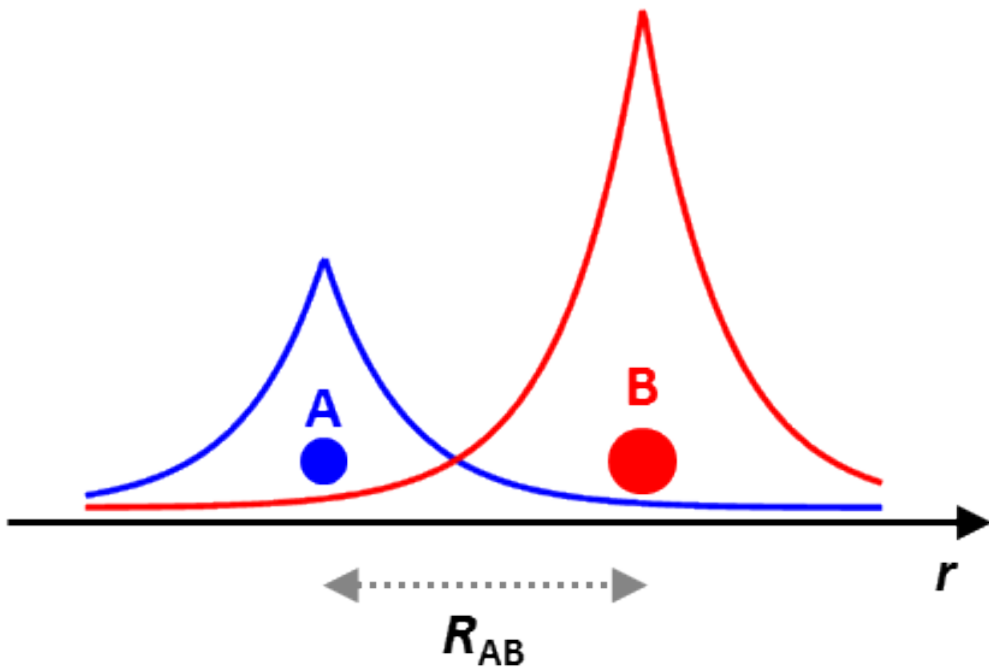
Cover of May 2019 issue (NETL Project DE-FE0030582)

S. I. Allec, Y. Sun, C.-en A. Chang, B.M. Wong
J. Chem. Theory Comput. **15**, 2807 (2019)

DFTB Primer

DFTB: coarse-grained, parameterized DFT with atomic-centered basis functions

Computational savings: pre-parameterized “basis” functions



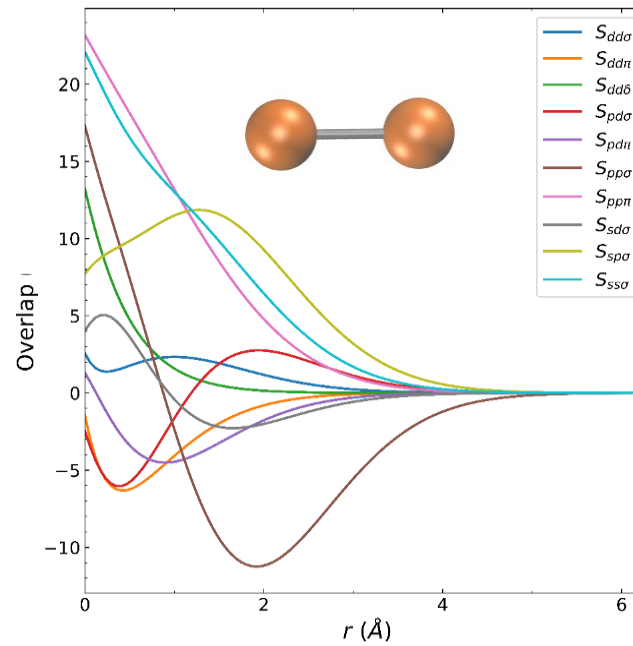
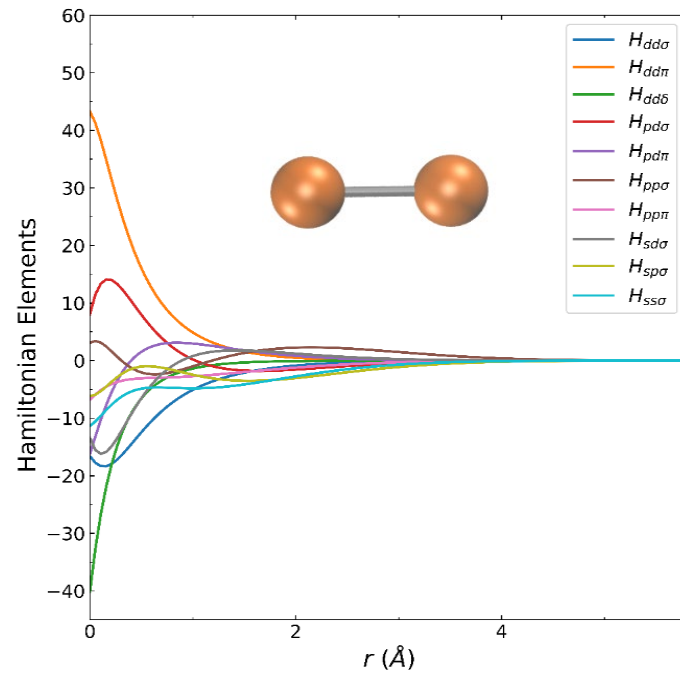
pre-tabulated as function of R_{AB}

simplifies integrals in SCF procedure

DFTB Primer

$$E_{DFTB} = \underbrace{E_{BS}}_{\text{parametrized}} + E_{Coul} + E_{rep}$$

$$E_{BS} = \sum_i^{occ} \sum_{\mu\nu} c_{\mu}^{a*} c_{\nu}^a H_{\mu\nu}^0$$



parametrized beforehand from DFT calculations

$$H_{\mu\nu}^0 = \langle \phi_{\mu} | H^0 | \phi_{\nu} \rangle$$

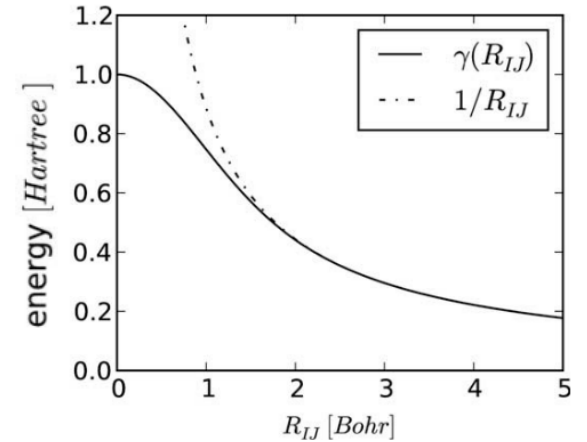
$$S_{\mu\nu} = \int \phi_{\mu}(r) \phi_{\nu}(r) d^3r$$

DFTB Primer

$$E_{DFTB} = E_{BS} + E_{Coul} + E_{rep}$$

$$E_{coul} = \frac{1}{2} \sum_{IJ} \gamma_{IJ}(R_{IJ}) \Delta q_I \Delta q_J$$

$$\gamma_{IJ}(R_{IJ}) = \begin{cases} U_I, & I = J \\ \frac{\text{erf}(C_{IJ}R_{IJ})}{R_{IJ}}, & I \neq J \end{cases}$$



Computational Materials Science 47 (2009) 237–253

3ob-3-1 skf parameter

param	e_d	e_p	e_s	U_d	U_p	U_s	f_d	f_p	f_s
C	0.0	-0.194	-0.505	0.365	0.365	0.365	0.0	2.0	2.0
H	0.0	0.0	-0.239	0.419	0.419	0.419	0.0	0.0	1.0
O	0.0	-0.332	-0.879	0.236	0.236	0.236	0.0	4.0	2.0
S	0.321	-0.258	-0.630	0.328	0.328	0.328	0.0	4.0	2.0

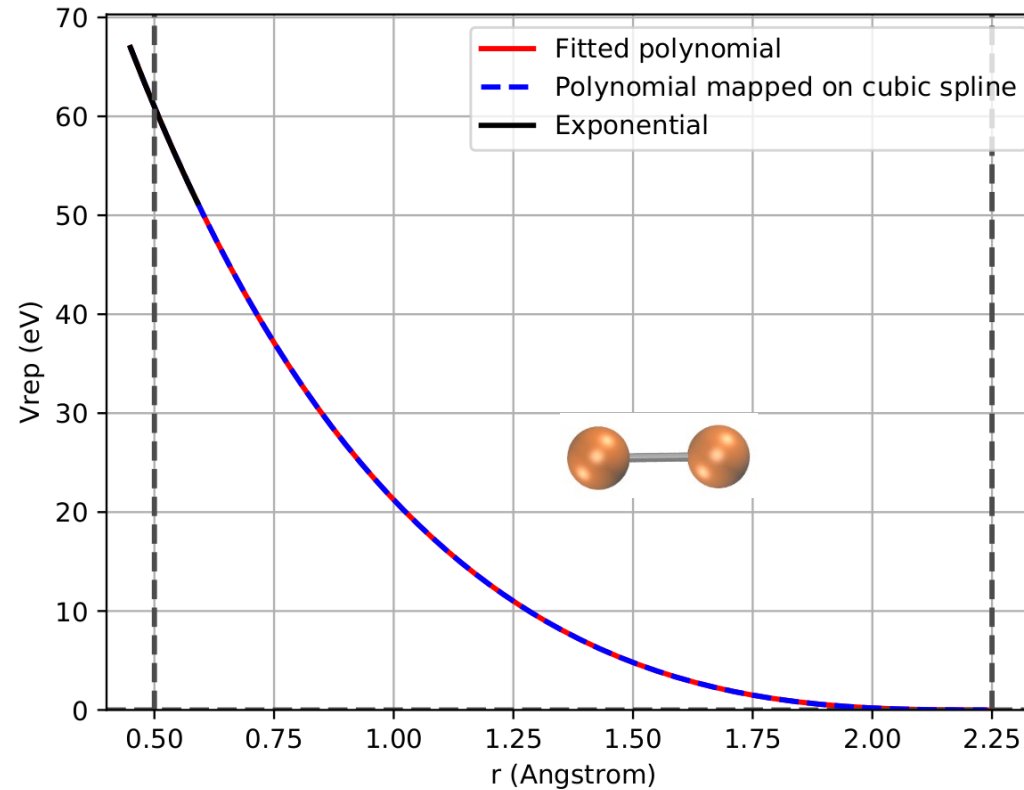
e = onsite energy, U = Hubbard U , f = occupation number

parametrized beforehand from DFT calculations

DFTB Primer

$$E_{DFTB} = E_{BS} + E_{coul} + E_{rep}$$

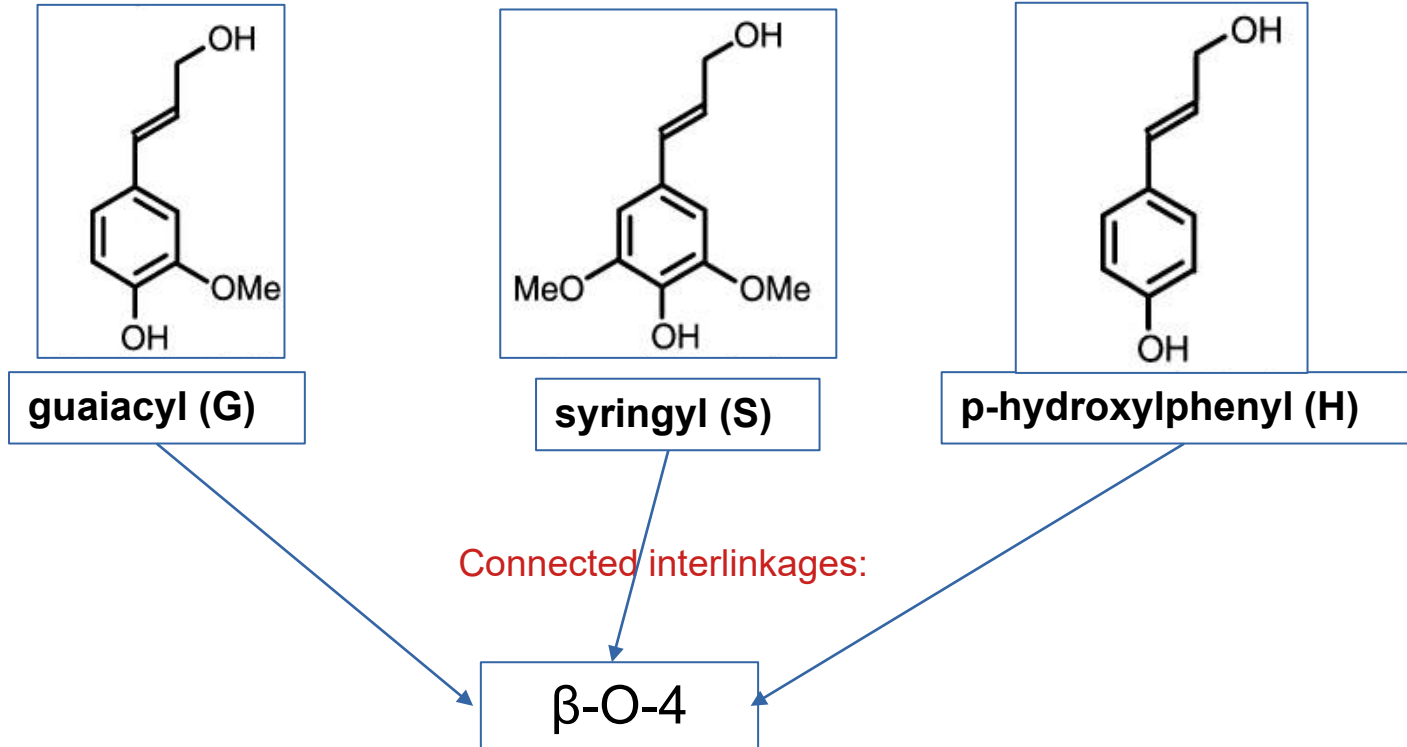
$$E_{rep} = \sum_{I < J} V_{rep}^{IJ}(R_{IJ})$$



Pre-parameterization allows fast calculations of large systems

Simulated CELF Pretreatment

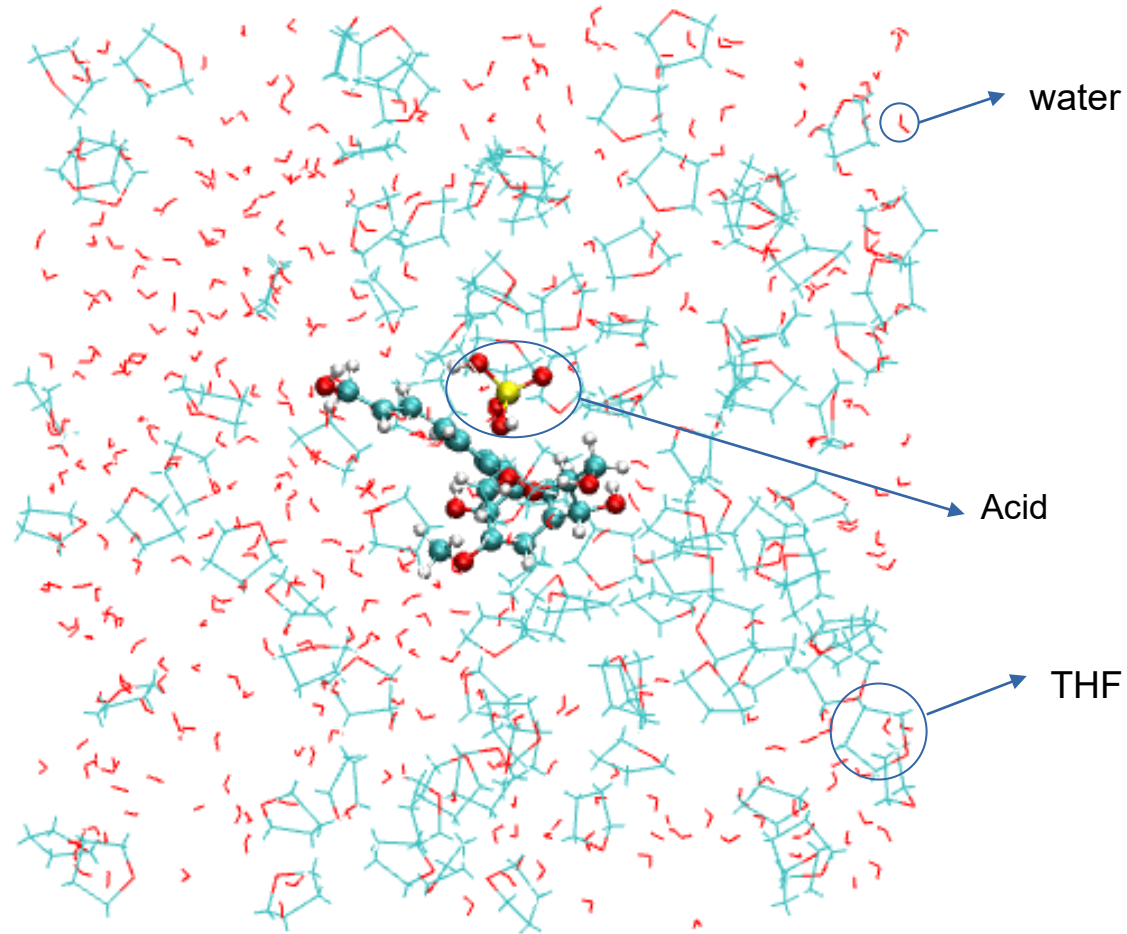
Lignin subunits:



Model of lignin dimer β -O-4:

- G-G
- G-S
- S-G

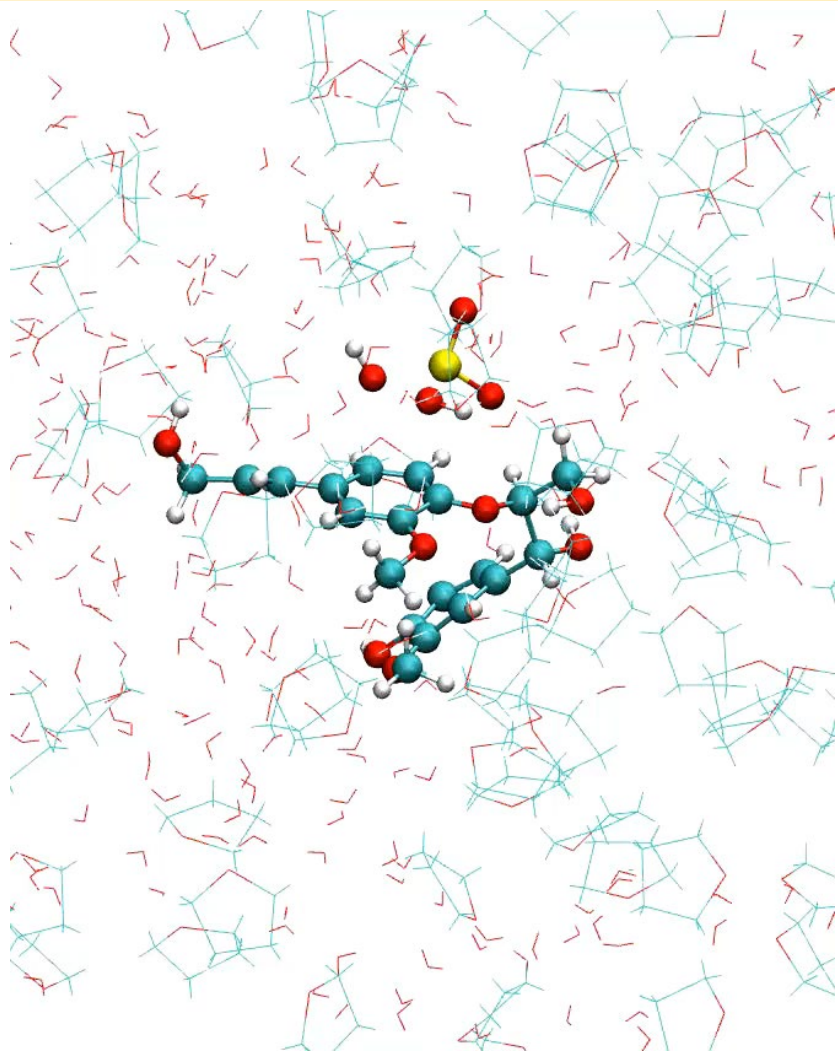
DFTB



- DFTB3 (3ob-3-1) + DFT-D3 disp effect
- PBC (mimic periodicity)
- DFTB relaxation (Force < 0.07 eV/Å)
- Co-solvent:
 - 1:1 THF:Water v/v ratio
 - Acid (H_2SO_4)

GG dimer β -O-4 (2560 atoms)

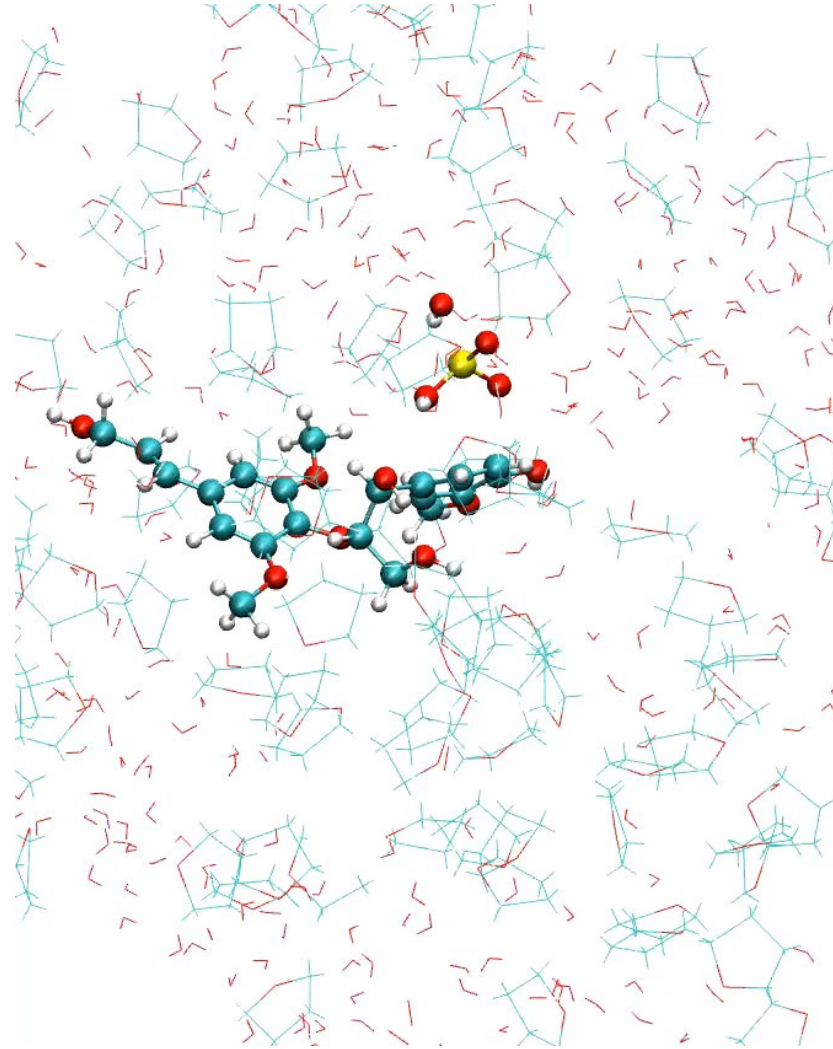
Preliminary work with DFTB-MD



- GG dimers
- NVT (423 K): Nose-Hoover Thermostat
- @NERSC (National Energy Research Scientific Computing)

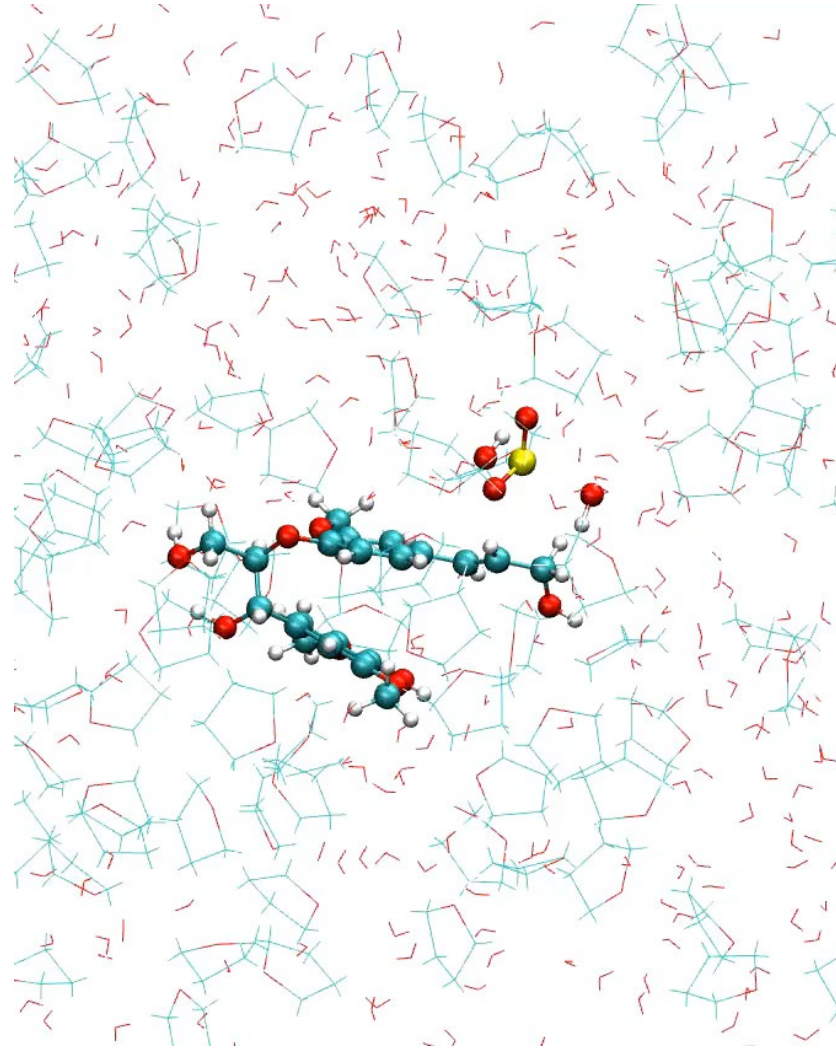
Preliminary work with DFTB-MD

- GS dimer



Preliminary work with DFTB-MD

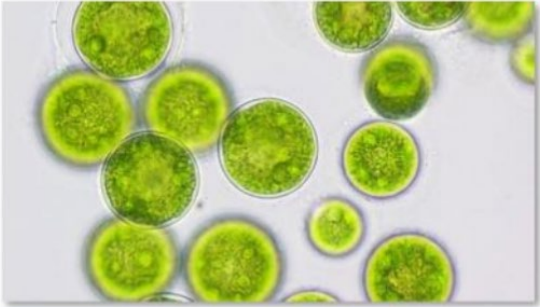
- SG dimer



Summary

Nannochloropsis sp. Algae

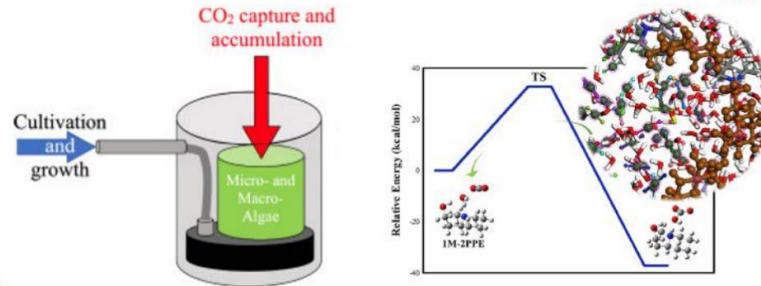
①



CELLF

Characterize Products, CO₂ Uptake, & Computation

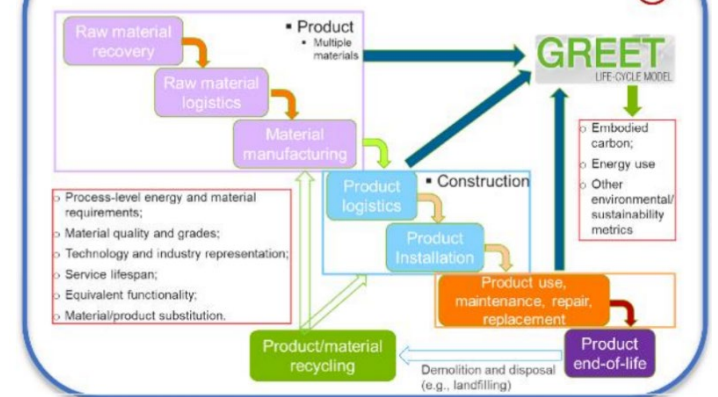
②



DFTB enables fast predictions of cellulose formation

Life Cycle & Techno-economic Analysis

③



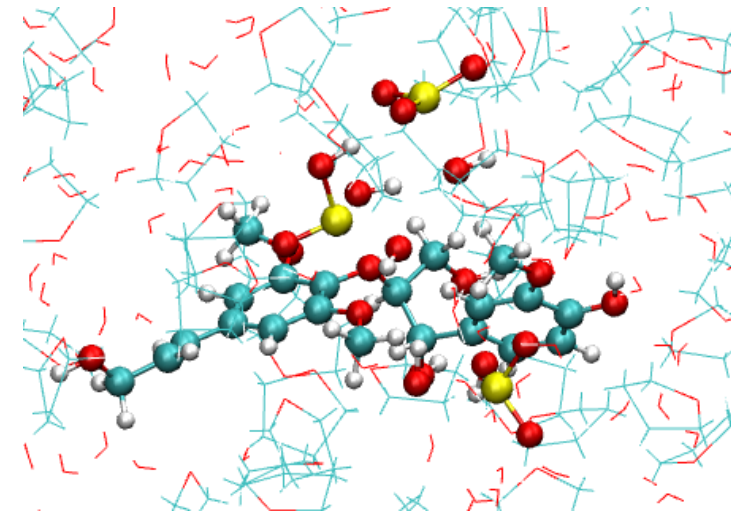
Outlook

CELF Pretreatment

- Improve glucan composition for industrial hemp
- Measure CO₂ emission from fermentation
- AspenOne: optimizing heat recovery

DFTB-MD calculations for cellulose formations:

- Longer time scale
- Other dimer structures →
 - G-H • H-S
 - H-G • S-H
 - H-H • S-S
- Vary temperature
- Add more acid (SO₄H₂)



Acknowledgements

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Thank You