



Modeling the Adsorption of Sargassum-Derived Hydrochar

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Background Information



Algal Blooms

- Overgrowth of algae or cyanobacteria
- Climate change (& human influence)
- Harmful algal blooms are just one type
- Methylene blue dye (MB) as a proxy for toxins



Credits of Image to FAU (1)

Sargassum Seaweed

- Brown algae: FL, Gulf of Mexico, Caribbean
- Natural role of habitat, reducing erosion



Credits of Image to Franziska Elmer (2)



Credits of Image to New York Post (3)

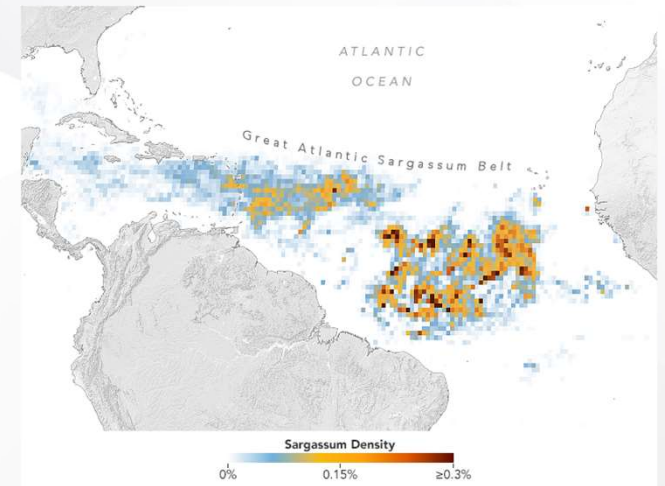
(NOAA, 2023; "What is Sargassum?" n.d.)

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Why Sargassum?



- Readily available
- Essentially untouched as a resource
- Potential as an adsorbent in water treatment



Credits of Image to NASA (4)

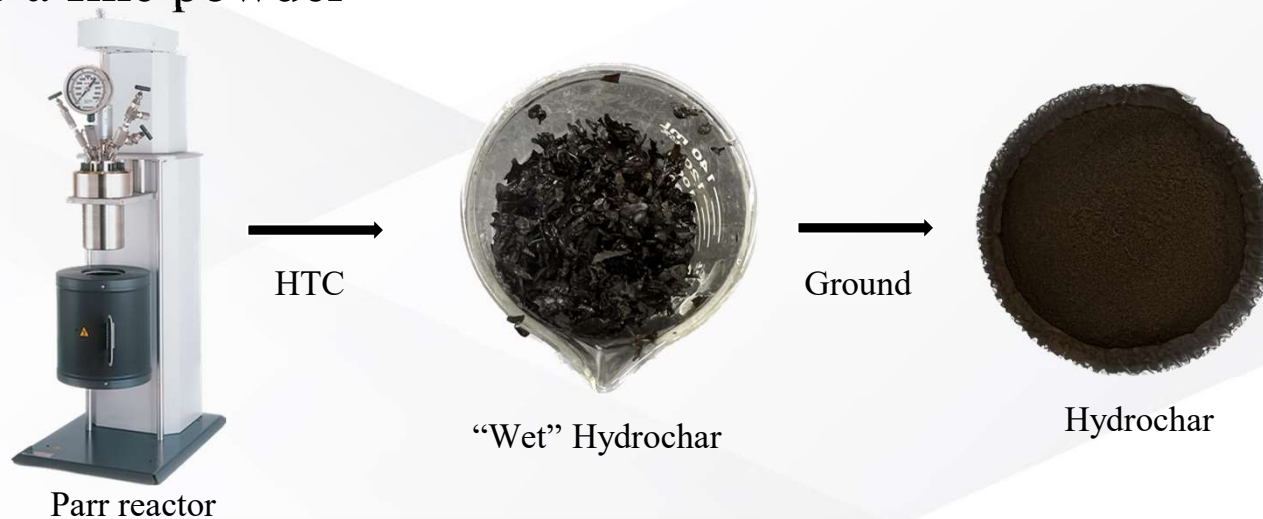
(NASA, 2023)

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Sargassum-Derived Hydrochar

Hydrochar (HC)

- A cooked biomass that has undergone hydrothermal carbonization (HTC)
- Ground into a fine powder



Hydrochar Adsorption

Hydrochar (HC)

- **Adsorption** = particles stick to surface
- **Absorption** = substance absorbs
(enters) another

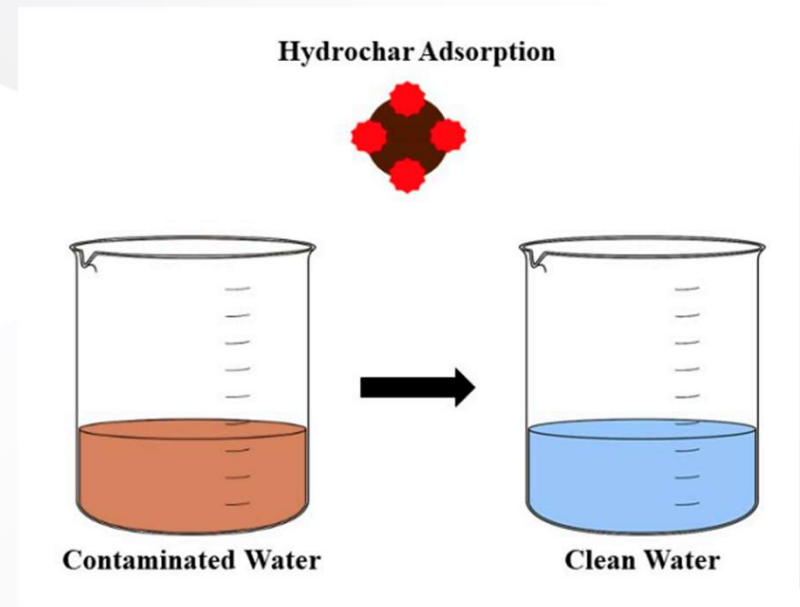


Image Credit to Tahmid Islam (5)



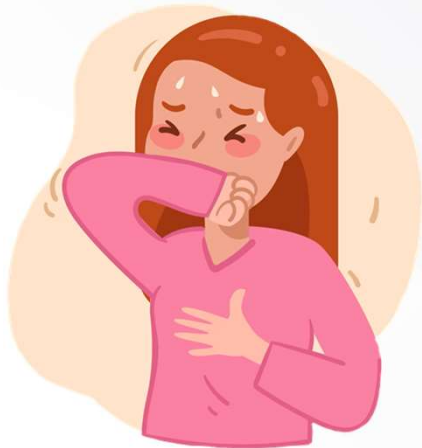
Need For Research



Algal Blooms

Harmful Algal Blooms (HABs) pose a threat to three main categories:

Human Health



Environmental Health



Image Credit to Ben Depp (6)

Economic Health



Image Credit to Fox 13 (7)

(Heil & Muni-Morgan, 2021)



Similar Studies



Similar Studies

- 2016 study on pig manure, pine wood, and cardboard-derived adsorbents with MB dye
- 2023 study on sargassum-derived superactivated hydrochar with MB dye



Pine wood adsorbent

Image Credit to Marta Rossi (8)



Image Credit to Cadianne Chambers (9)

(Lonappan et al., 2016; Chambers, 2023)



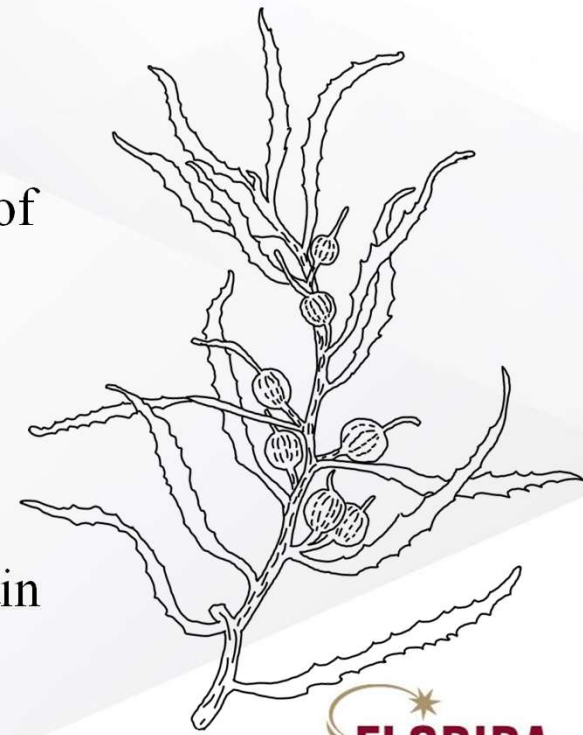
Gap In Academia



Gap In Academia



- Sargassum by itself not fully explored
- Lack of study about the singular potentiality of sargassum itself
 - Increased production efficiency
- Circle of renewability and environmental chain





Focal Of This Study



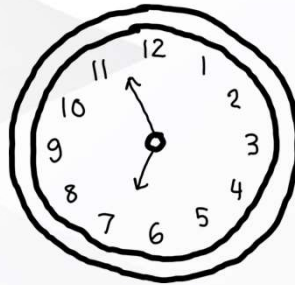
Focus Of The Study

1: Determine the adsorption capability of sargassum-derived hydrochar on methylene blue (MB) dye.

2: Discover the significance of sargassum-derived hydrochar's synthesis parameters.



HTC Temperature



HTC Time



HTC Sargassum:Water Ratio

Research Questions



1. Which tested HTC treatment variation of sargassum-derived hydrochar has the highest adsorbance capability of methylene blue dye?
2. What is the significance of the different parameters in the HTC treatment against methylene blue dye removal?

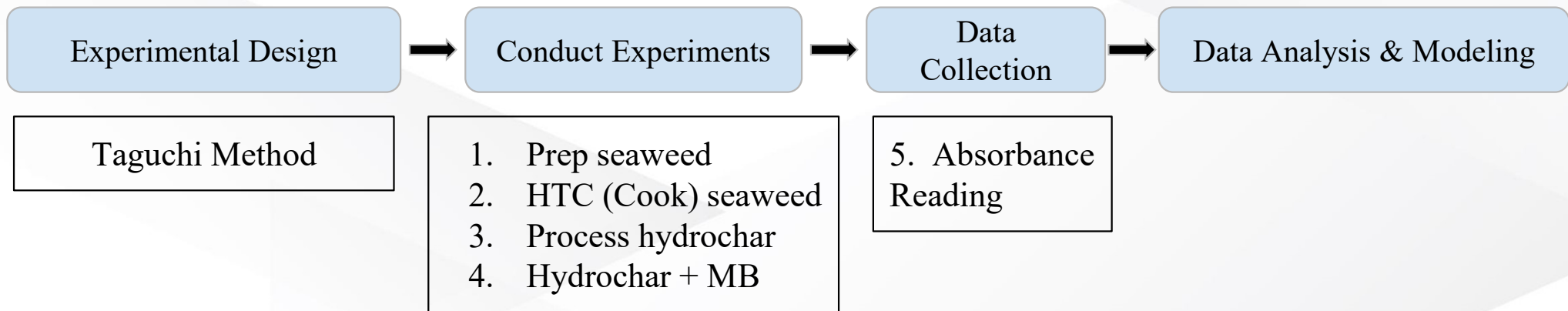




Methodology



Schematics



Timeline

1. Prep seaweed
2. HTC (Cook) seaweed
3. Process hydrochar
4. Hydrochar + MB
5. Absorbance reading

2-4 hrs Prep Seaweed for HTC

1-2 hrs HTC (Cook)

24 hrs Oven Drying

1 hr Grind HC Into Fine Powder

24 hrs Oven Drying

24 hrs Allow for Adsorption

Total Duration: ~75 hours per data point



Experimental Design



Experimental Parameters

In hydrochar creation:

HTC Temperature – 180°C, 220°C, 260°C

HTC Time – 15 min, 30 min, 60 min

HTC Sargassum:Water Ratio – 1:10, 1:15, 1:20



Parr reactor

Taguchi Method

- Taguchi method is used for product experimentation
- It's focus lies in optimization of the product and experimentation
 - Cut down 27 experiments to 9
- Allows for experimentation of a variety of different degrees of parameters

Taguchi Method

Experimental Design

Experiment #	HTC Temp (C)	HTC Time (Minutes)	Water Ratio
1	180°	15	1:10
2	180°	30	1:20
3	180°	60	1:15
4	220°	15	1:20
5	220°	30	1:15
6	220°	60	1:10
7	260°	15	1:15
8	260°	30	1:10
9	260°	60	1:20



Experiments



Materials



Machines:

- Parr Reactor
- Tube Revolver
- Spectrophotometer



Substances:

- Sargassum Seaweed
- Sargassum-derived Hydrochar
- Methylene Blue

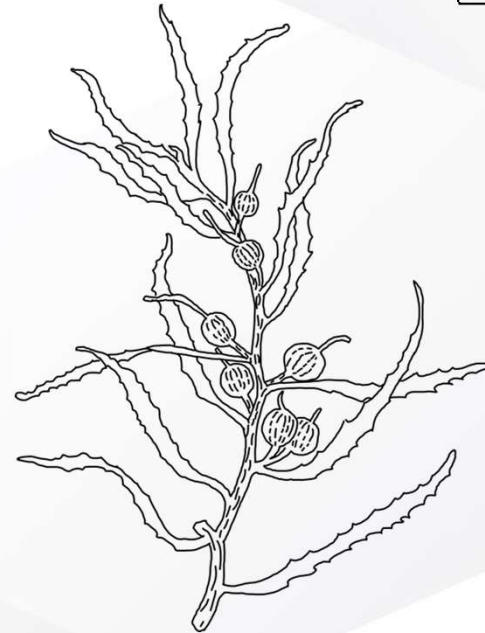


Seaweed Preparation

- Collected from beach
- Washed with water
- Frozen
- Thawed
- Chopped for Parr reactor suitability

Conduct Experiments

1. Prep seaweed
2. HTC (Cook) seaweed
3. Process hydrochar
4. Hydrochar + MB
5. Absorbance reading



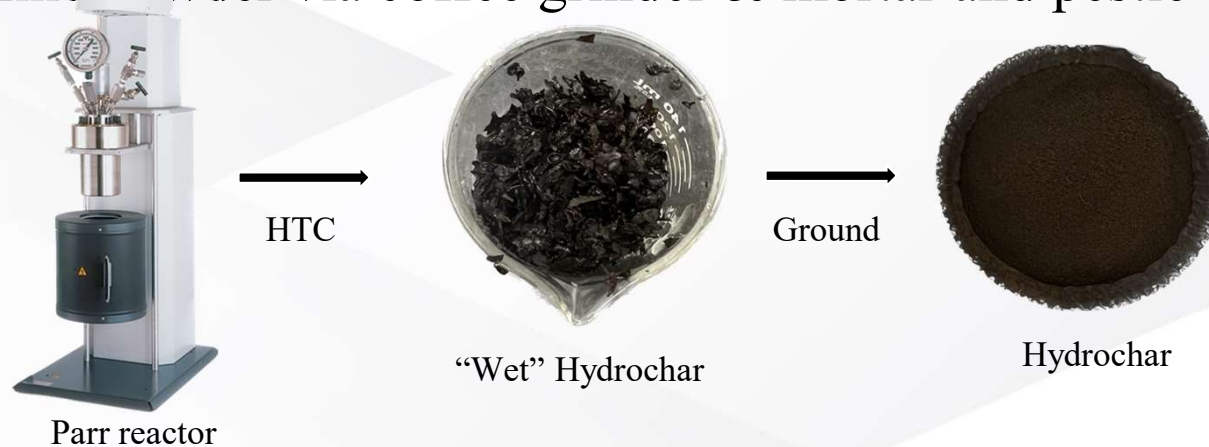
HTC

Hydrochar (HC)

Conduct Experiments

1. Prep seaweed
2. HTC (Cook) seaweed
3. Process hydrochar
4. Hydrochar + MB
5. Absorbance reading

- A cooked biomass that has undergone hydrothermal carbonization (HTC)
- Ground into a fine powder via coffee grinder & mortar and pestle

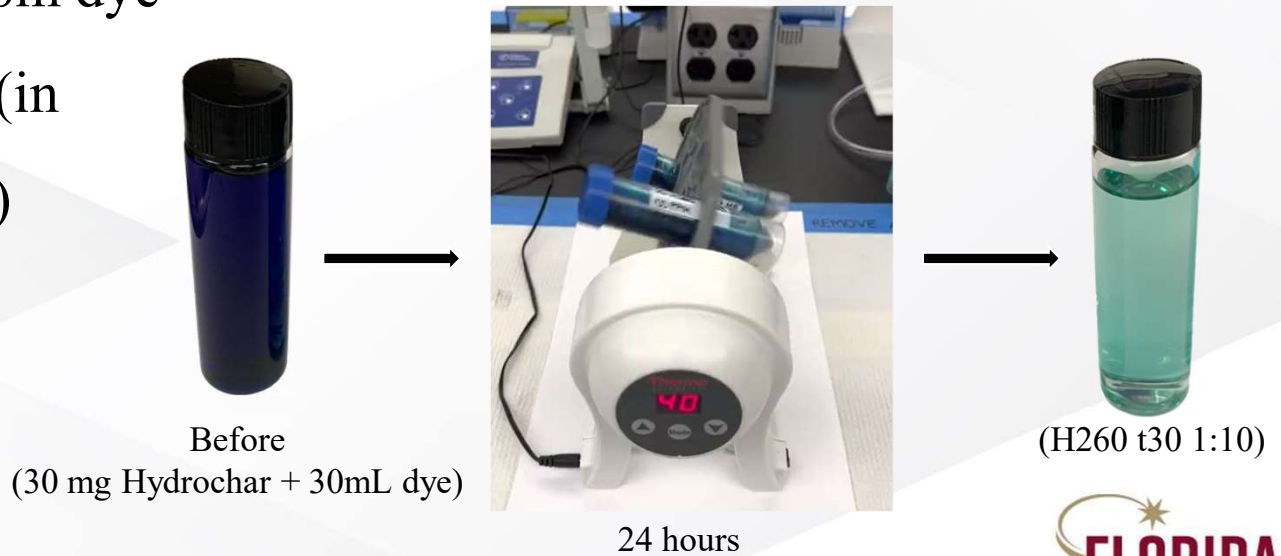


Treatment

- Taking chosen hydrochar variation and mixing it with 100 ppm dye
- Left to adsorb for 24 hrs (in revolver for even mixing)
- Hydrochar filtered out

Conduct Experiments

1. Prep seaweed
2. HTC (Cook) seaweed
3. Process hydrochar
4. **Hydrochar + MB**
5. Absorbance reading



Absorbance Reading

Conduct Experiments

1. Prep seaweed
2. HTC (Cook) seaweed
3. Process hydrochar
4. Hydrochar + MB
5. Absorbance reading

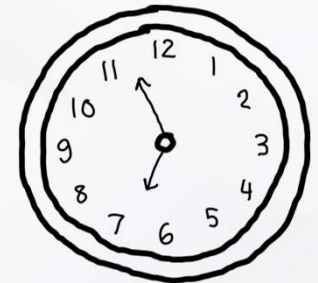
After HC has had 24 hours to adsorb the MB dye, we read final absorbance to obtain percentage removal of the MB.



Varying & Increased Concentration

Varying Concentration:

- Testing the highest performing HC against higher MB concentrations– 150, 200, 250, and 300 ppm.
- A higher concentration is picked for further experimentation



Increased Concentration:

- The 300 ppm MB tested against all HCs
- Same experimental design as 100 ppm





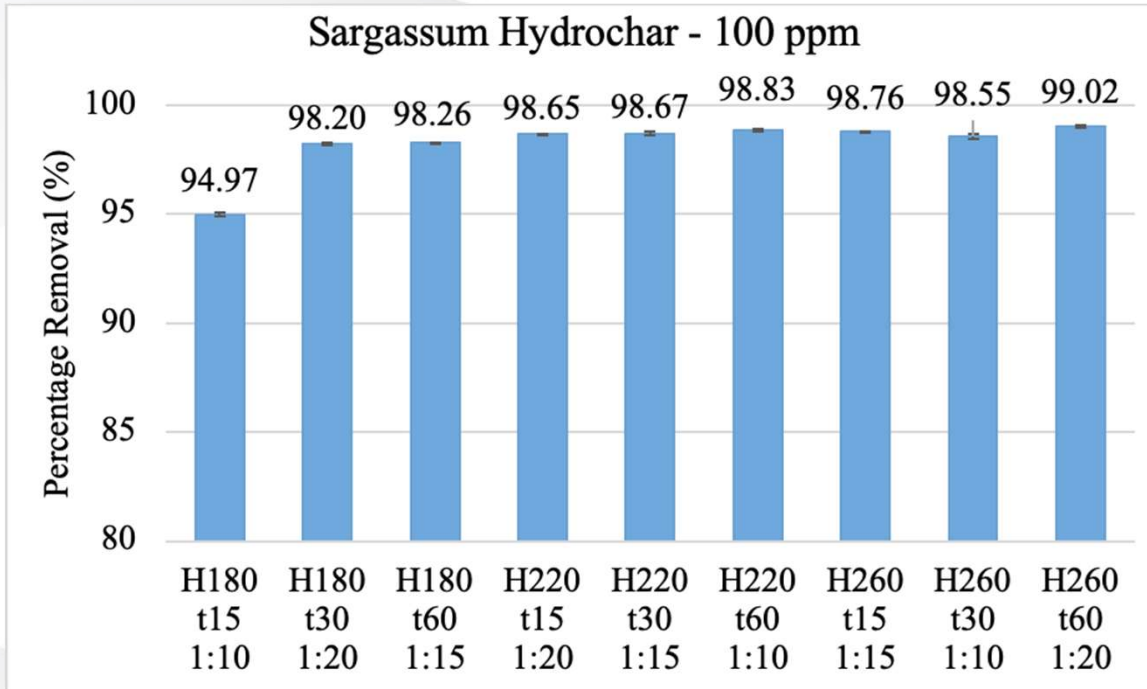
Results



100 PPM

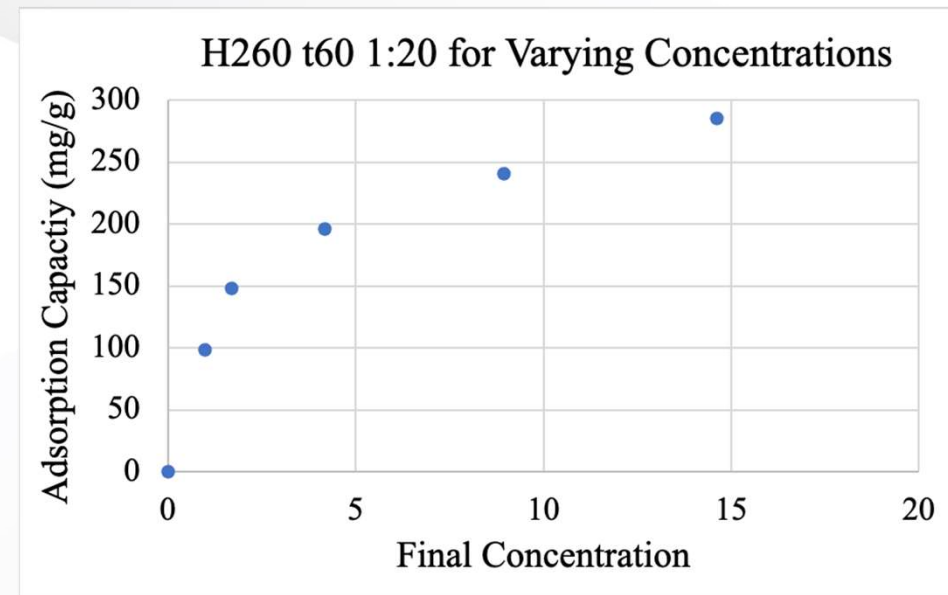
X-Axis Labeling Key:
H : Temperature (°C)
t : duration (minutes)
sargassum:water

- All perform sufficiently
- Best Performing:
 - H260 t60 1:20
- Worst Performing:
 - H180 t15 1:10
- Green hue by leaching



Varying Concentration Test

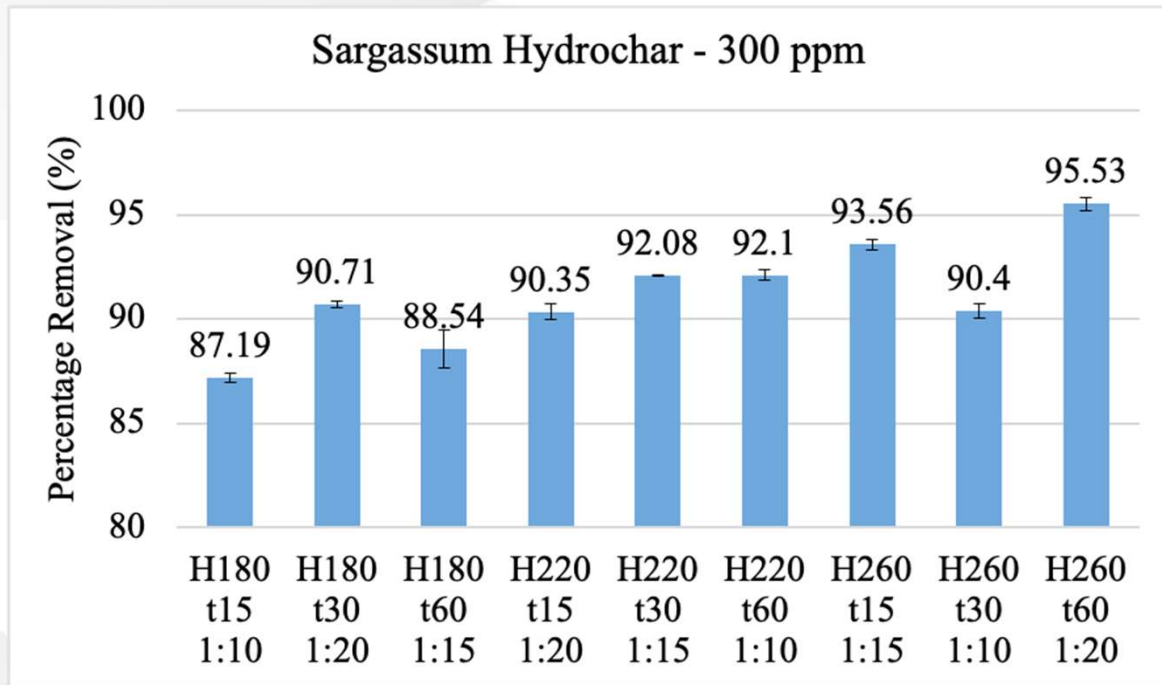
Concentration (ppm)	Percentage Removal (%)
100	99.02 ± 0.05
150	98.86
200	97.92
250	96.43
300	95.13



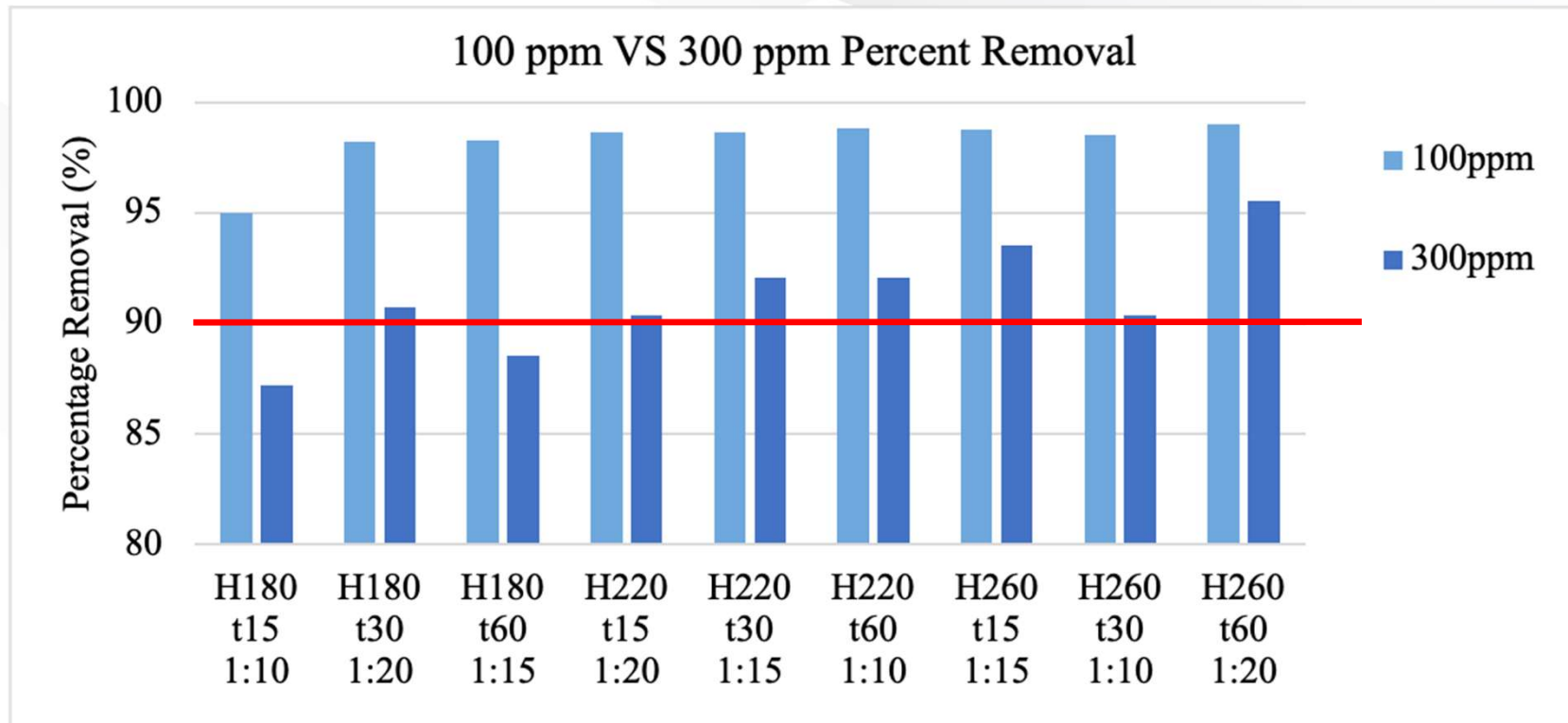
300 PPM

X-Axis Labeling Key:
H : Temperature (°C)
t : Duration (minutes)
Sargassum:Water

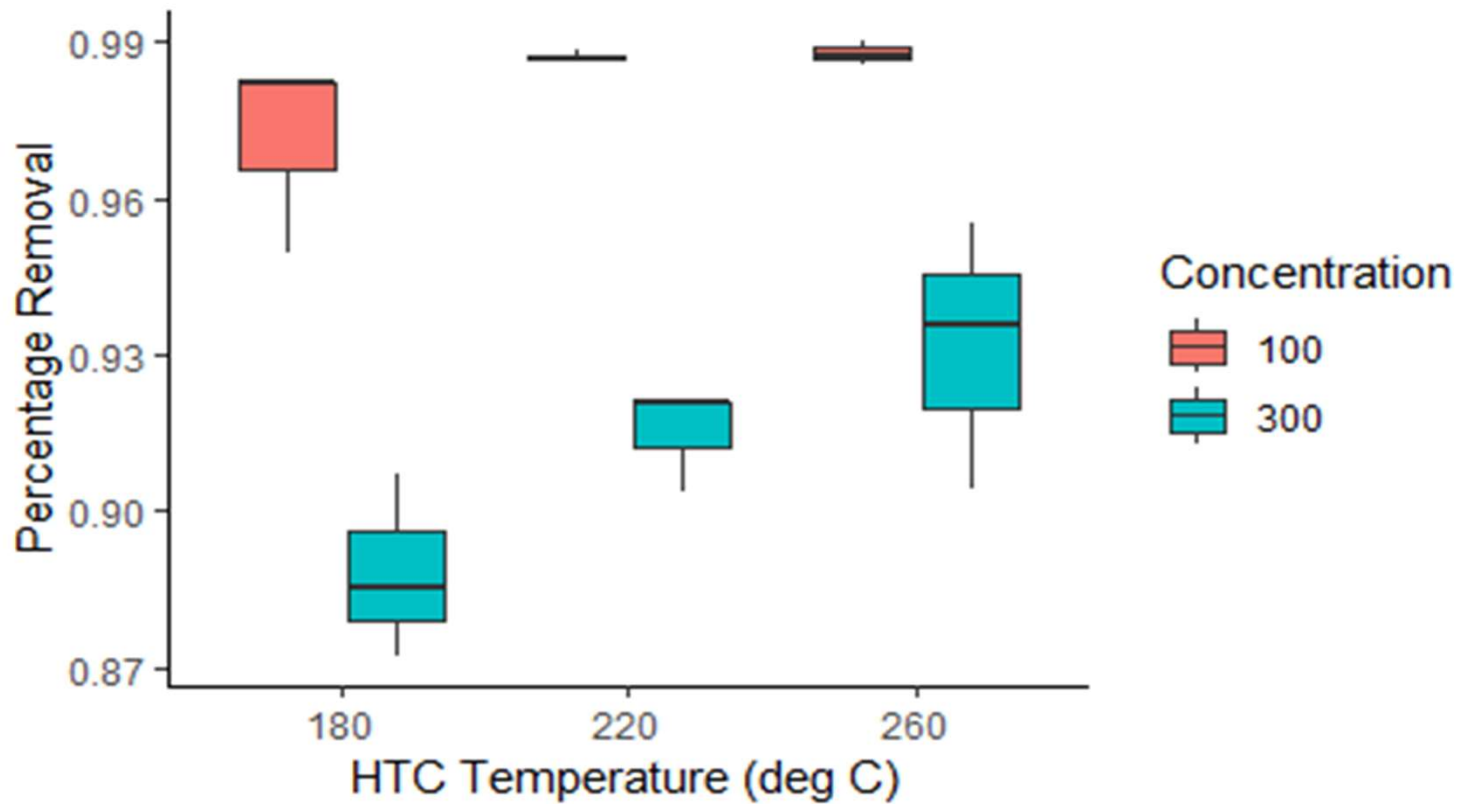
- Best Performing:
 - H260 t60 1:20
- Worst Performing:
 - H180 t15 1:10
- Similar trends as 100 ppm



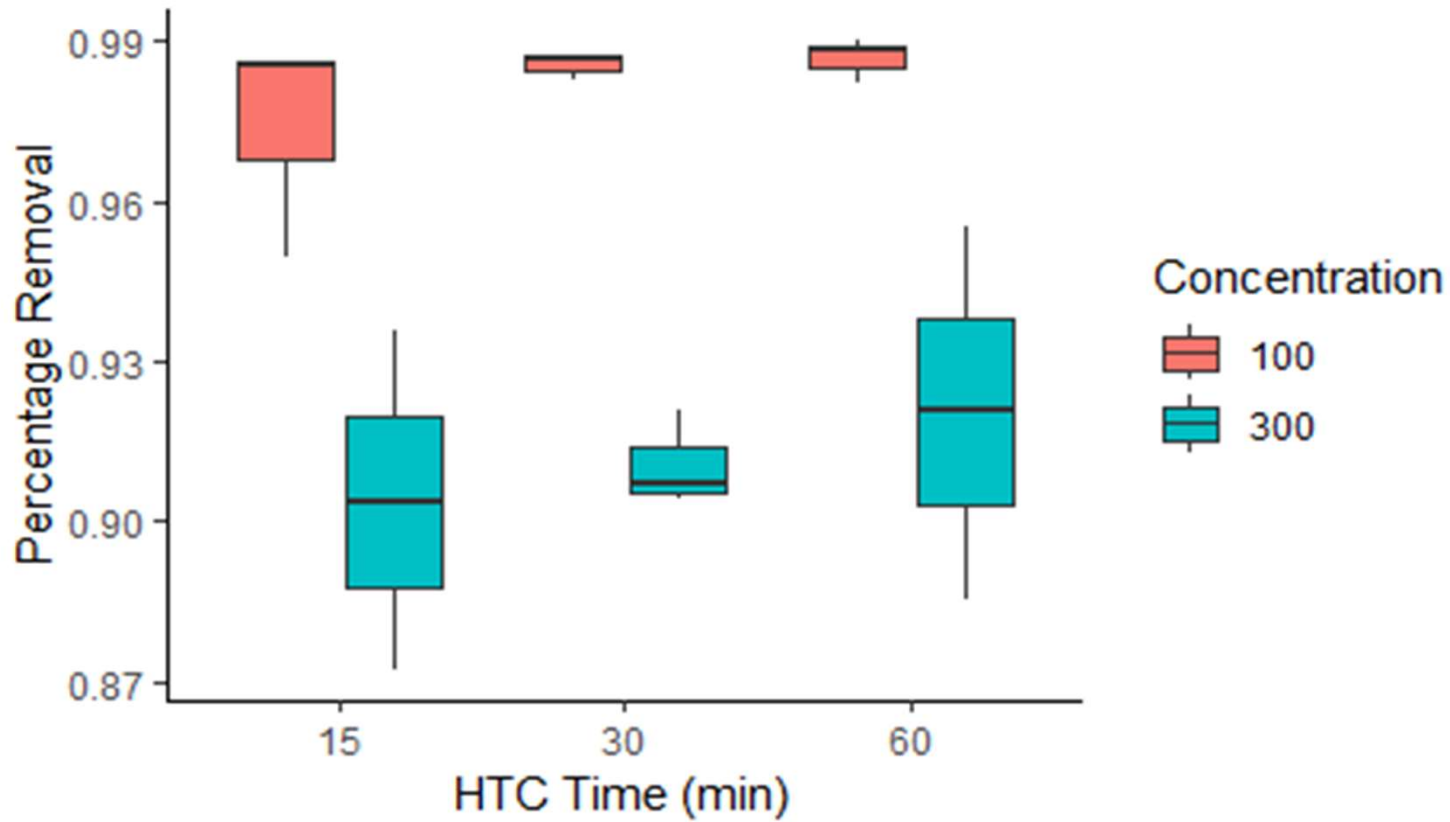
100 ppm Vs. 300 ppm



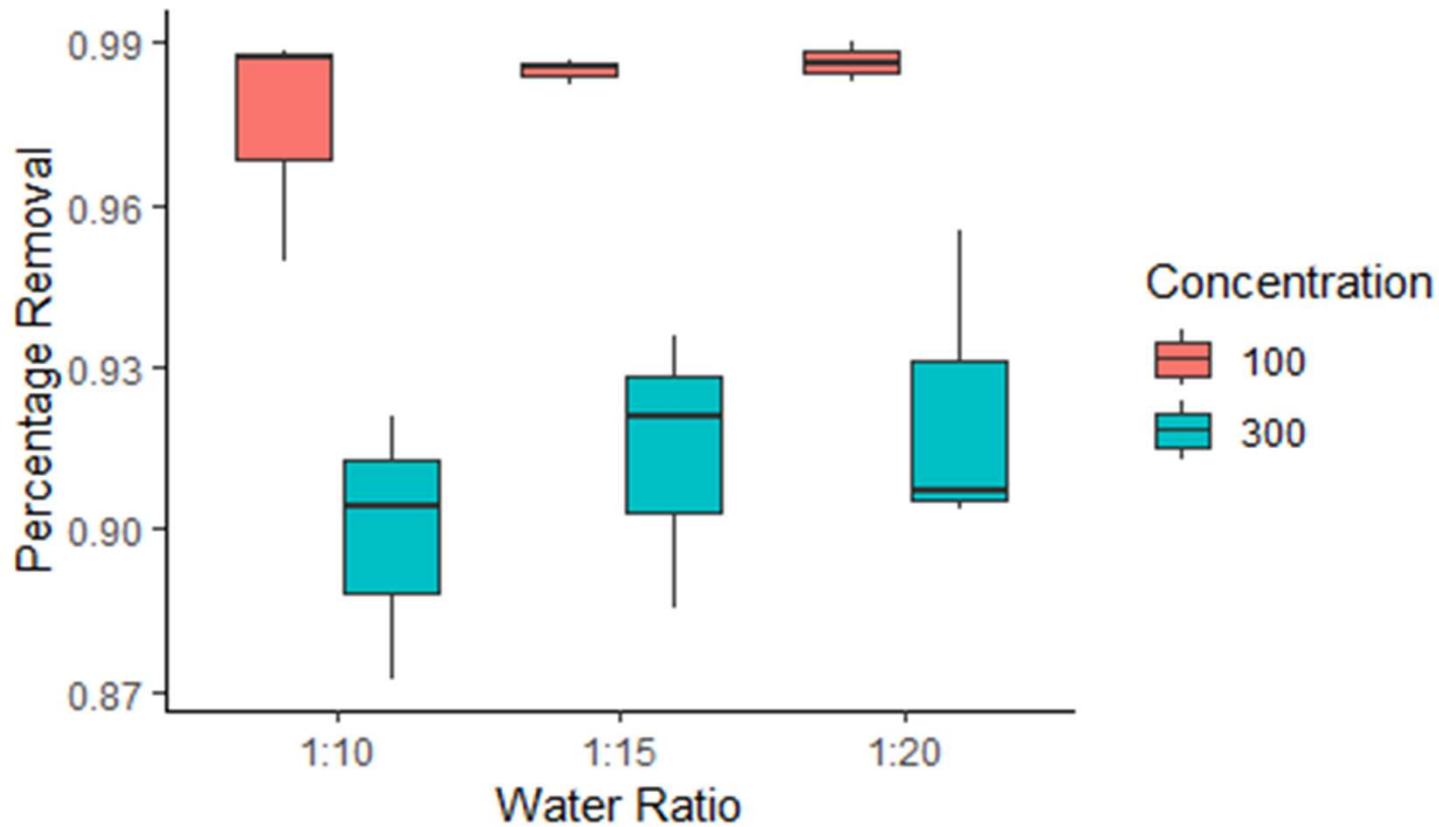
Box Plot: HTC Temperature



Box Plot: HTC Time



Box Plot: Sargassum-to-Water Ratio





Modeling



Modeling

- Beta regression
 - Discover if and how the parameters affect percentage r
 - Utilized for bounded response variables between 0 and 1
 - Link functions: $[0,1] \rightarrow \mathbb{R}$
 - Pseudo R-squared & AIC measure fit of the model to the data
- Modeling three datasets:
 - 100 ppm, 300 ppm, Combined dataset

Cauchit Link Function

$$g(u) = \tan\left(\pi\left(u - \frac{1}{2}\right)\right)$$

Goal:
Higher R-squared & Lower
AIC

(Ferrari & Cribari-Neto, 2004)

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Predictors:

HTC
Temperature

HTC
Time

Sargassum:Water
Ratio



Beta Regression Model:

Model:

$$g(\mu_i) = \beta_0 + \beta_1(\text{temperature}) + \beta_2(\text{time}) + \beta_2(\text{ratio})$$



Response:

$$\mu_i = \text{Percentage Removal}$$

100 ppm *All Variables*

3 Variable *Continuous* Model:

Variable	Coef. Estimate	P-Value
Intercept	-32.59148	8.17e-16
<i>Temperature</i>	0.19762	< 2e-16
<i>Time</i>	0.22226	1.72e-08
<i>Water Ratio 1:15</i>	2.60562	0.117
<i>Water Ratio 1:20</i>	8.24170	8.86e-09
Pseudo R-Squared: 0.8615 AIC: -79.2611		

P Value < 0.05 = Significant

3 Variable *Categorical* Model:

Variable	Coef. Estimate	P-Value
Intercept	6.28999	< 2e-16
<i>Temperature 220</i>	10.89503	< 2e-16
<i>Temperature 260</i>	13.30246	< 2e-16
<i>Time 30</i>	5.67935	< 2e-16
<i>Time 60</i>	9.28842	< 2e-16
<i>Water Ratio 1:15</i>	1.95730	1.38e-05
<i>Water Ratio 1:20</i>	6.07861	< 2e-16
Pseudo R-Squared: 0.9867 & AIC: -99.4049		

300 ppm *All Variables*

3 Variable *Continuous* Model:

Variable	Coef. Estimate	P-Value
Intercept	-2.023726	0.0824
<i>Temperature</i>	0.022521	7.75e-05
<i>Time</i>	0.011621	0.2327
<i>Water Ratio 1:15</i>	0.272150	0.5199
<i>Water Ratio 1:20</i>	0.788053	0.0610
Pseudo R-Squared: 0.7473 & AIC: -41.4058		

P Value < 0.05 = Significant

3 Variable *Categorical* Model:

Variable	Coef. Estimate	P-Value
Intercept	2.21749	1.11e-15
<i>Temperature 220</i>	0.91227	0.02274
<i>Temperature 260</i>	1.79495	0.00024
<i>Time 30</i>	0.02853	0.94873
<i>Time 60</i>	0.49532	0.26701
<i>Water Ratio 1:15</i>	0.32417	0.44974
<i>Water Ratio 1:20</i>	0.87185	0.05646
Pseudo R-Squared: 0.7628 & AIC: -37.5023		



Full Data *Categorical* Model

- Utilizing full data set with categorical factors
 - 18 data points and added 'Concentration' variable

Goal:
Higher R-squared & Lower AIC

P Value < 0.05 = Significant

Variable	Coef. Estimate	P-Value
Intercept	1.80668	< 2e-16
<i>Temperature 220</i>	0.18645	2.97e-05
<i>Temperature 260</i>	0.28887	4.57e-10
<i>Time 30</i>	0.06982	0.123625
<i>Time 60</i>	0.14314	0.002028
<i>Water Ratio 1:15</i>	0.09620	0.033797
<i>Water Ratio 1:20</i>	0.16104	0.000499
<i>Concentration 300</i>	-0.75597	< 2e-16
Pseudo R-Squared: 0.9661 & AIC: -110.6173		

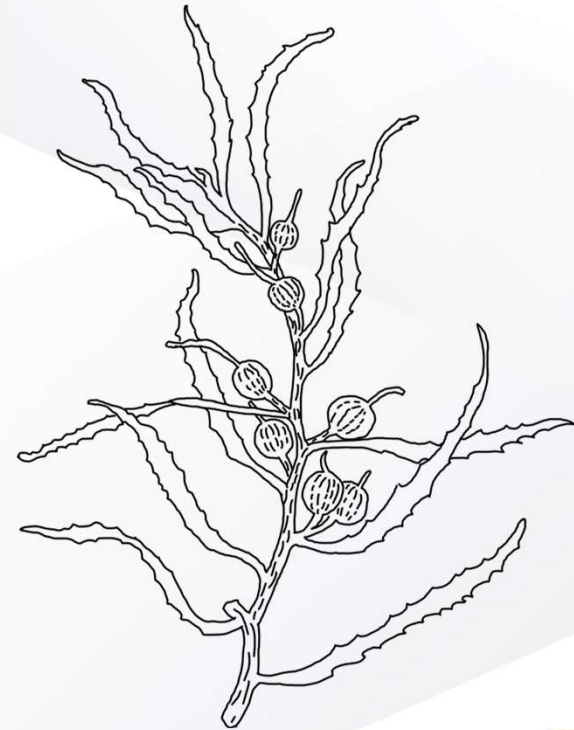


Conclusions



Conclusions

1. Highest level of parameters = Highest performing
 - a. HTC Temperature 260°C, HTC Time 60 minutes, Ratio 1:20
2. HTC Temperature is a significant factor and has a positive impact on a hydrochar's percentage removal of MB



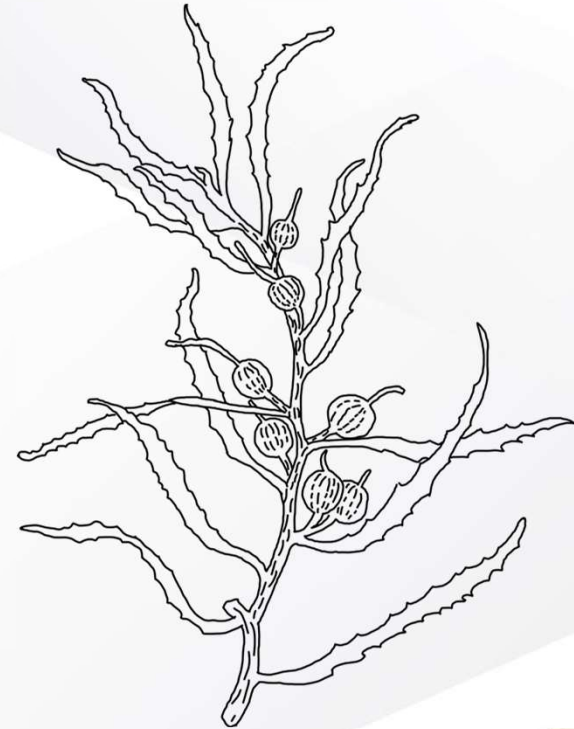


Discussion



Limitations

- Constraints in data collection
- Limited amount of data
- Taguchi method does not take into account interactions between parameters

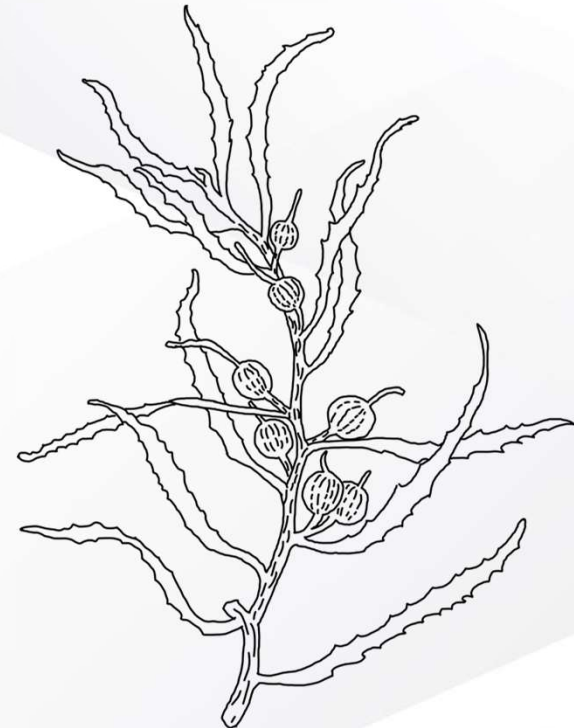


Contributions & Future Work

- Sargassum is supported as a resource for creating a sufficient adsorbent
- Singular sufficiency

Future work:

- Hydrochar with actual toxin
- Implementation of hydrochar
- Algal bloom prediction



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Thank You!

Questions?

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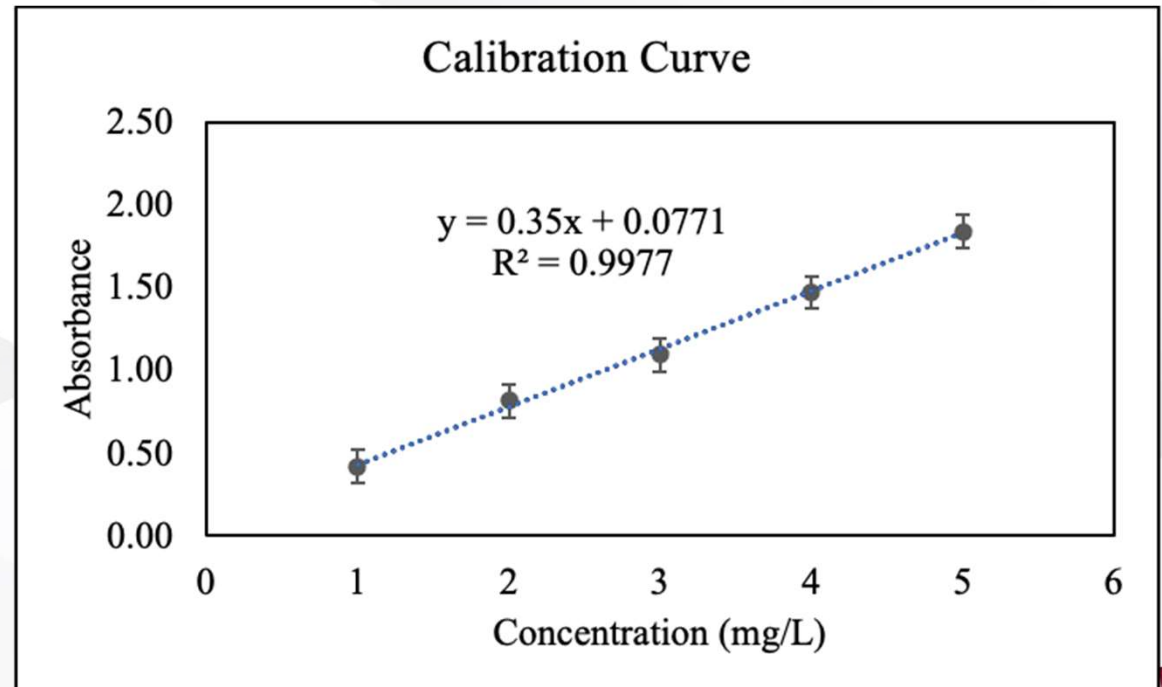


Supplementary



Calibration Curve

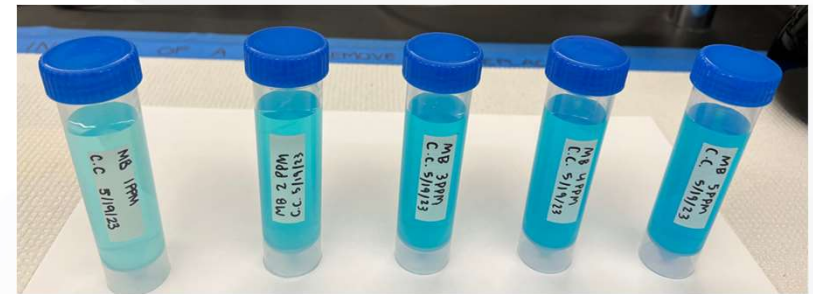
Concentration (ppm)	Average Absorbance
1	0.356
2	0.721
3	1.09
4	1.418
5	1.7065



Calibration Curve

Absorbance: The amount of light absorbed by a substance

Range for Spectrophotometer Readings: 0.356 → 1.702



Full 100 ppm Results

Type of Hydrochar	Percentage Removal (%)
H180 t15 1:10	94.97 ± 0.07
H180 t60 1:15	98.26 ± 0.03
H180 t30 1:20	98.20 ± 0.04
H220 t15 1:20	98.65 ± 0.03
H220 t30 1:15	98.67 ± 0.08
H220 t60 1:10	98.83 ± 0.08
H260 t15 1:15	98.76 ± 0.01
H260 t30 1:10	98.55 ± 0.12
H260 t60 1:20	99.02 ± 0.05

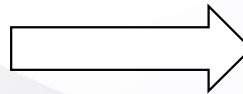
Full 300 ppm Results

Type of Hydrochar	Percentage Removal (%)
H180 t15 1:10	87.19 ± 0.23
H180 t60 1:15	90.71 ± 0.18
H180 t30 1:20	88.54 ± 1.03
H220 t15 1:20	90.35 ± 0.38
H220 t30 1:15	92.08 ± 0.07
H220 t60 1:10	92.10 ± 0.29
H260 t15 1:15	93.56 ± 0.30
H260 t30 1:10	90.40 ± 0.26
H260 t60 1:20	95.53 ± 0.32

Experimental Design

The Taguchi Method:

Experiment #	Parameter: A	Parameter: B	Parameter: C
1	1	1	1
2	1	2	2
3	1	3	3
4	2	1	2
5	2	2	3
6	2	3	1
7	3	1	3
8	3	2	1
9	3	3	2



Experiment #	HTC Temp (C)	HTC Time (Minutes)	Water Ratio
1	180°	15	1:10
2	180°	30	1:20
3	180°	60	1:15
4	220°	15	1:20
5	220°	30	1:15
6	220°	60	1:10
7	260°	15	1:15
8	260°	30	1:10
9	260°	60	1:20

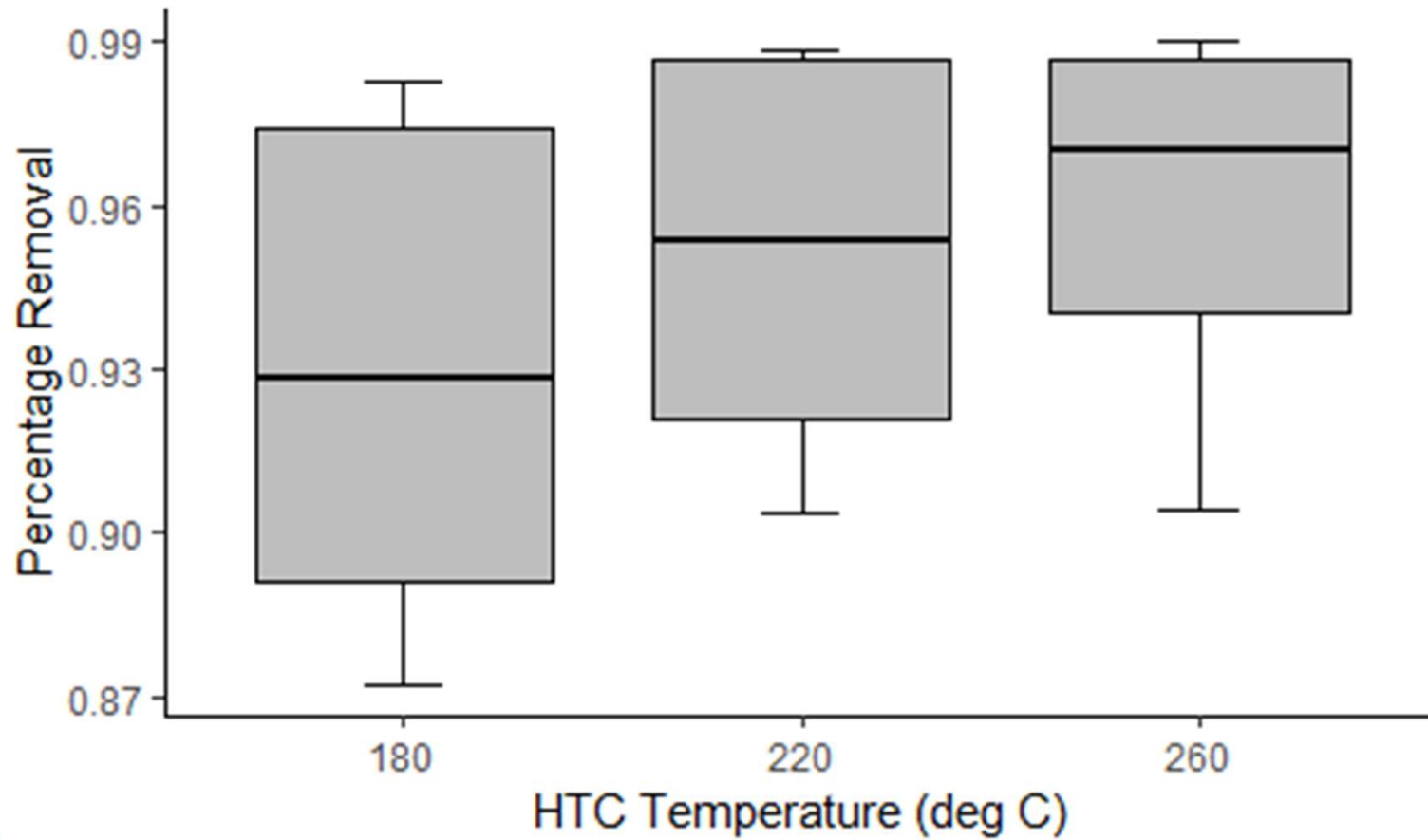
Carbon Offset

“Cooking” biomasses via HTC commonly produces gases as byproducts (CO₂, ...)

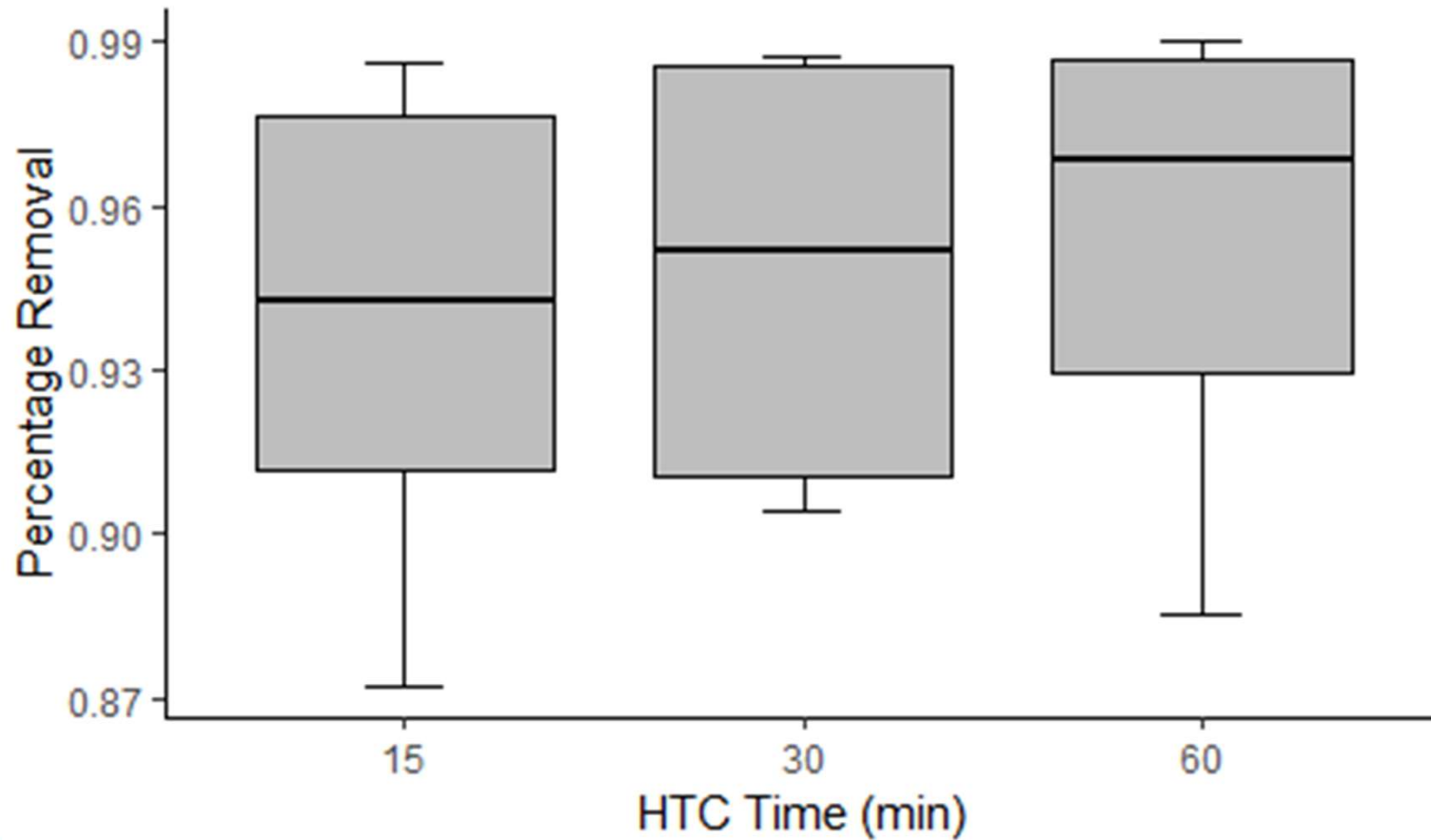
HTC (for hydrochar) not as energy intensive as pyrolysis (for biochar)

Emissions depend on the biomass & cooking conditions; therefore, to know for sargassum specifically, additional data would be needed

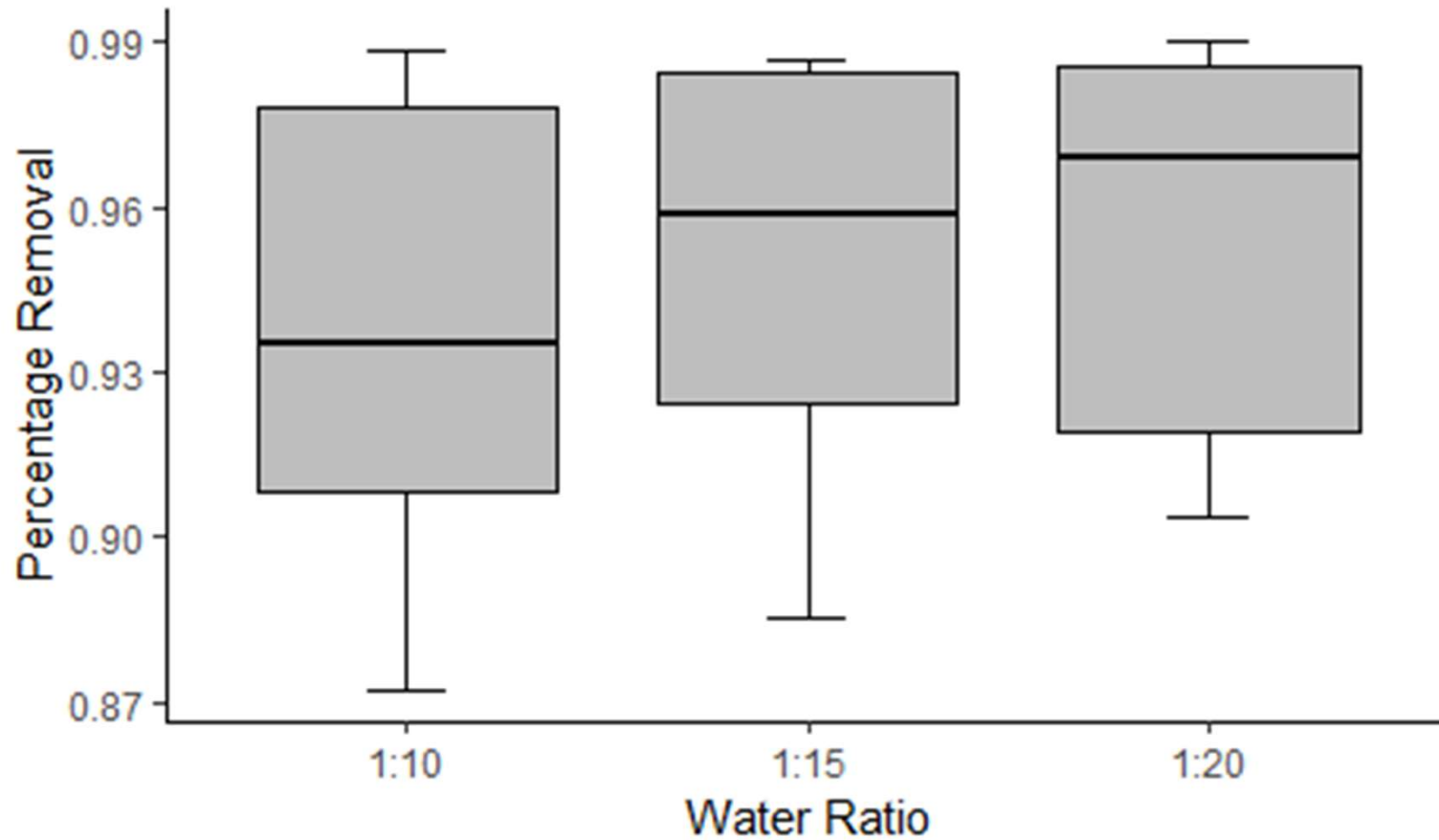
Box Plots



Box Plots



Box Plots



Preliminary Results

100 ppm Sargassum-Derived Adsorbent Results:



Dried Sargassum



Hydrochar
H180°C 30 min. 1:10 ratio



Hydrochar
H220°C 30 min. 1:10 ratio



Hydrochar
H260°C 30 min.
1:10 ratio



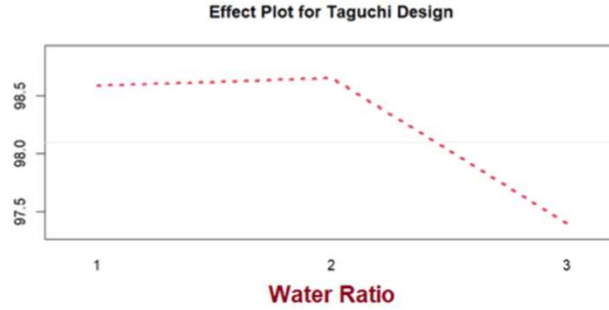
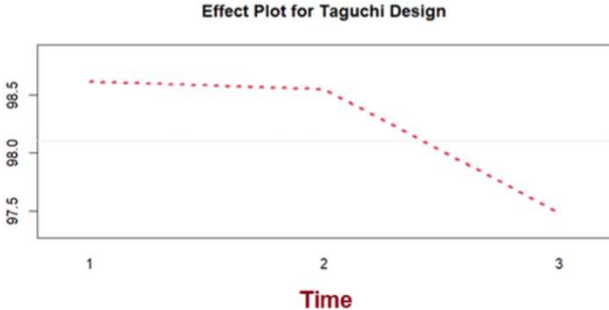
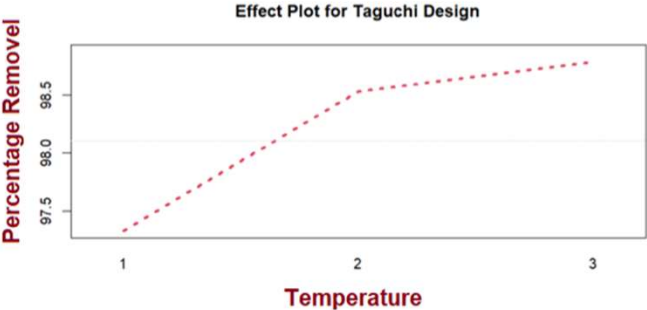
Biochar
H180°C P400 t15



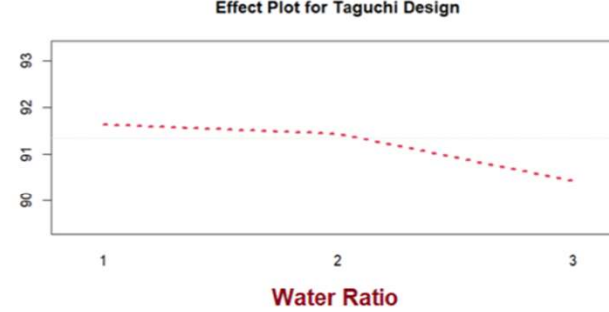
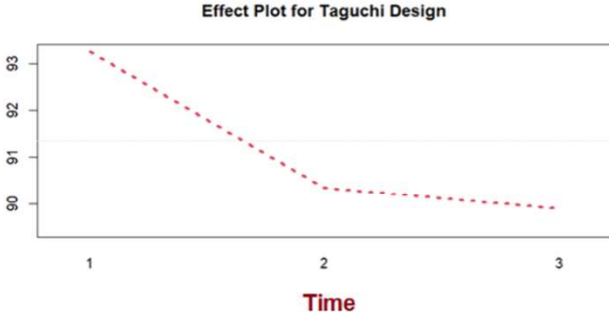
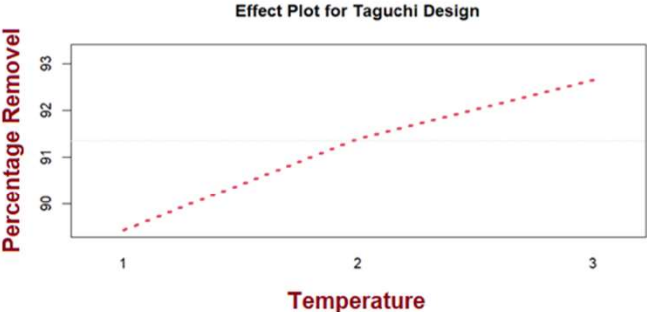
Biochar
H180°C P600 t30

Type of Biomass	% Removal
SG Raw	98.46%
Hydrochar 180°C	98.01%
Hydrochar 220°C	97.90%
Hydrochar 260°C	98.54%
Biochar H180°C P400 t15	93.24%
Biochar H180°C P600 t30	32.39%

Concentration: 100 ppm



Concentration: 300 ppm



Taguchi Method

- Taguchi method is used for product experimentation
- It's focus lies in optimization of the product and experimentation
- Allows for experimentation of a variety of different degrees of parameters

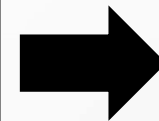
a = number of rows

b = number of levels

c = number of columns

Degrees of freedom

$$L_a(b^c)$$



Run #	A	B	C
1	1	1	1
2	1	2	2
3	2	1	2
4	2	2	1