The background of the slide is a faded, light-colored image of the Golden Gate Bridge in San Francisco, viewed from a distance across the water. The bridge's towers and suspension cables are visible, creating a grid-like pattern in the background.

Biogeochemical simulation of San Francisco Bay using an unstructured-grid model

Prof. Fei CHAI

**School of Marine Sciences
University of Maine**

***Two papers published in Ocean Dynamics (2020) and Continental Shelf Research (2018)
and a manuscript submitted to Frontiers in Marine Science***

**Zhengui Wang, Fei Chai, Richard Dugdale, Qianqian Li, Huijie Xue,
Frances Wilkerson, Yi Chao, Yinglong Zhang, Honchun Zhang**

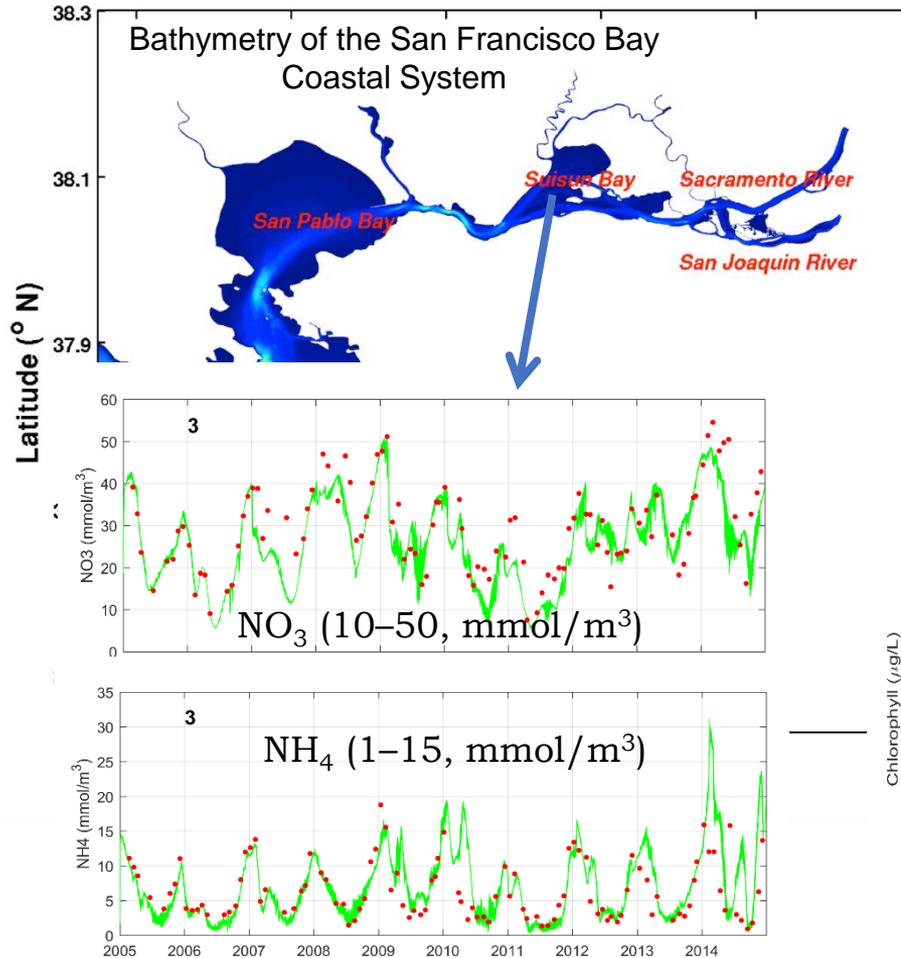
Outline

- ❖ San Francisco Bay (SFB) and SCHISM-CoSiNE model
- ❖ Model-data comparison and nitrogen export from SFB
- ❖ Nutrients and plankton response to
 - NO_3 vs. NH_4 concentration and NH_4 inhibition
 - Bottom grazing (invasive Asian clams)
 - 3D sediment transport modeling in regulating light availability and primary production
- ❖ Summary

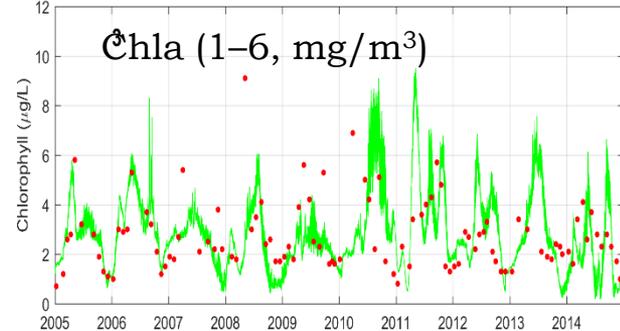
Summary

- ❖ High Nitrogen & Low Growth (HNLG) in San Francisco Bay (SFB), and **SCHISM-CoSiNE** captures overall nutrients and chlorophyll variability for SFB
- ❖ **90% of DIN** from rivers and WWTPs **exported to the coastal ocean**, and 10% assimilated by plankton and deposited into the sediment
- ❖ **NO₃ vs. NH₄, NH₄ inhibition** and **bottom grazing** by invasive Asian clams alter nitrogen cycling (more NH₄) and regulates NO₃ uptake by phytoplankton
- ❖ **Sediment transport modeling for better SPM simulation** is crucial for improving primary production and phytoplankton dynamics.

Background & Motivation



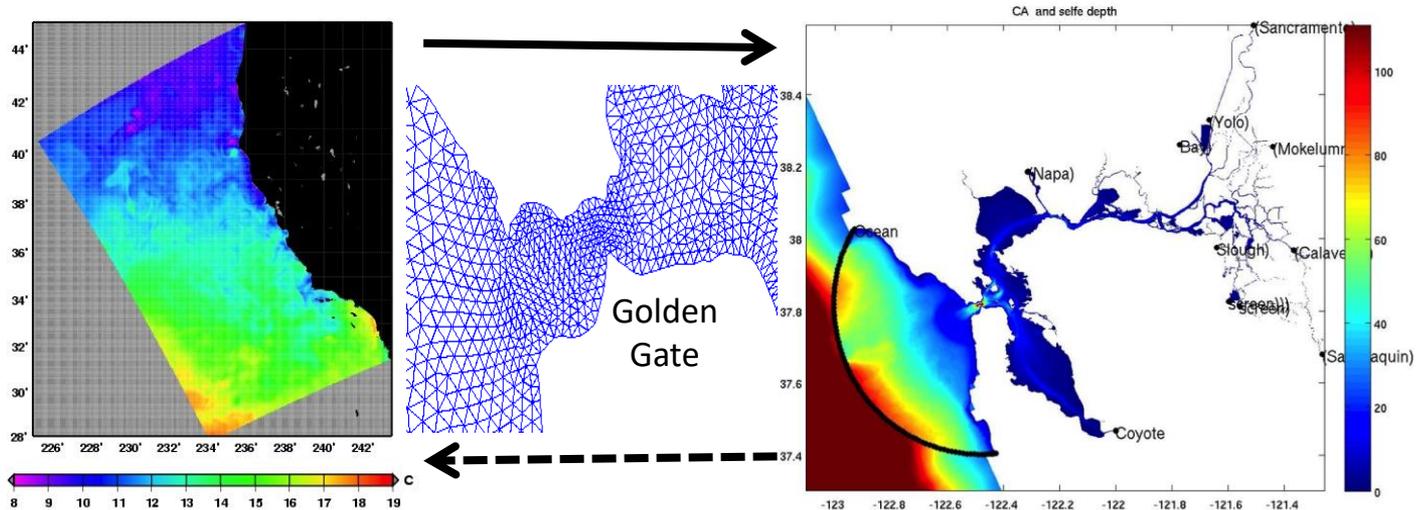
- Population growth (8 millions people)
- High NO₃ and NH₄ input from 18 WWTPs
- **High Nitrogen and Low Growth (HNLG)**
- Sediment loading
- Invasive species – Asian clams



Modeling San Francisco Bay/Estuary

SCHISM: 3D Semi-implicit Eulerian–Lagrangian Finite-Element,
horizontal resolution from 10m to 1000m, wet/dry, 23 vertical levels
NCEP/NAM atmospheric forcing (9-km), 3-km ROMS coastal ocean boundary conditions

Linking California coastal ocean model with San Francisco Bay/Estuary & lower Sacramento River



Structured grid **ROMS**

3-km

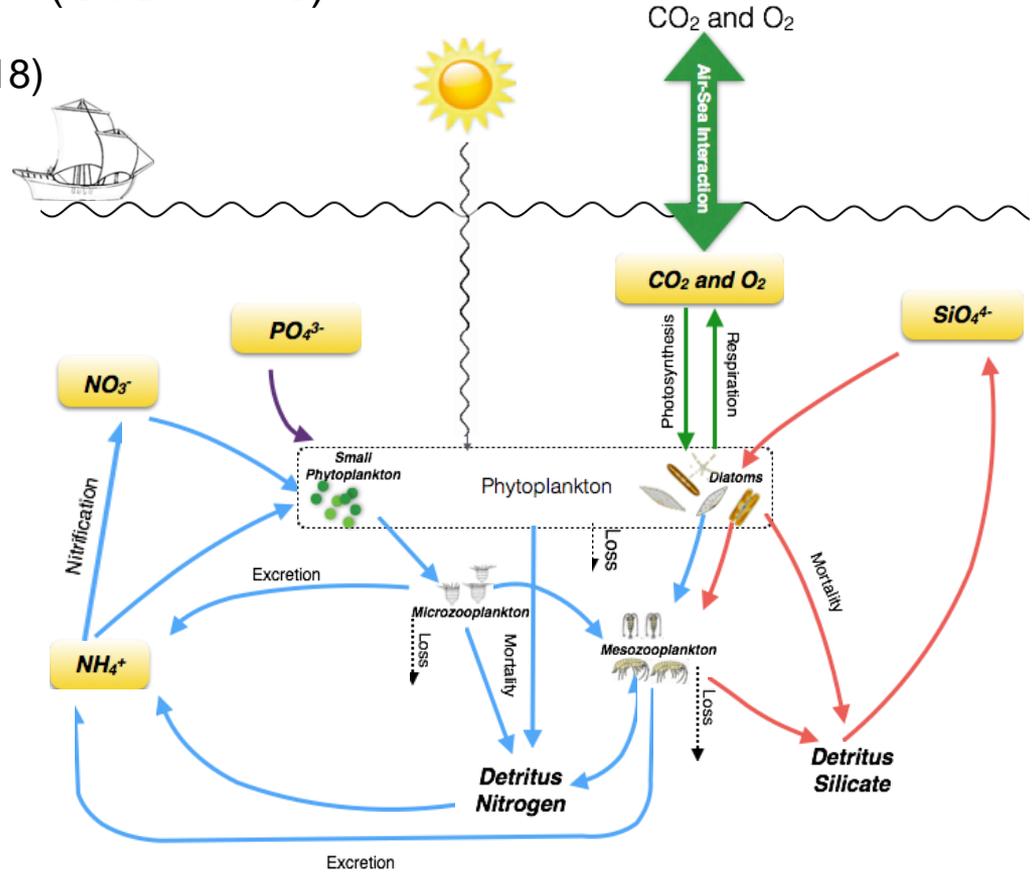
Offline

Unstructured grid **SCHISM**

1-km.....10-m

Carbon, Silicate, Nitrogen Ecosystem (CoSiNE-13)

(Chai et al., 2002; Dugdale et al., 2002;
Xiu and Chai, 2014; Liu and Chai et al., 2018)



Nutrient:

Nitrate (NO₃)
Ammonium (NH₄)
Silicate (SiO₄)
Phosphate (PO₄)

Phytoplankton:

Small Phytoplankton (S1)
Diatom (S2)

Zooplankton:

Microzooplankton (Z1)
Mesozooplankton (Z2)

Detritus:

Detritus Nitrogen (DN)
Detritus Silicon (DSi)

**Oxygen
and Carbon**

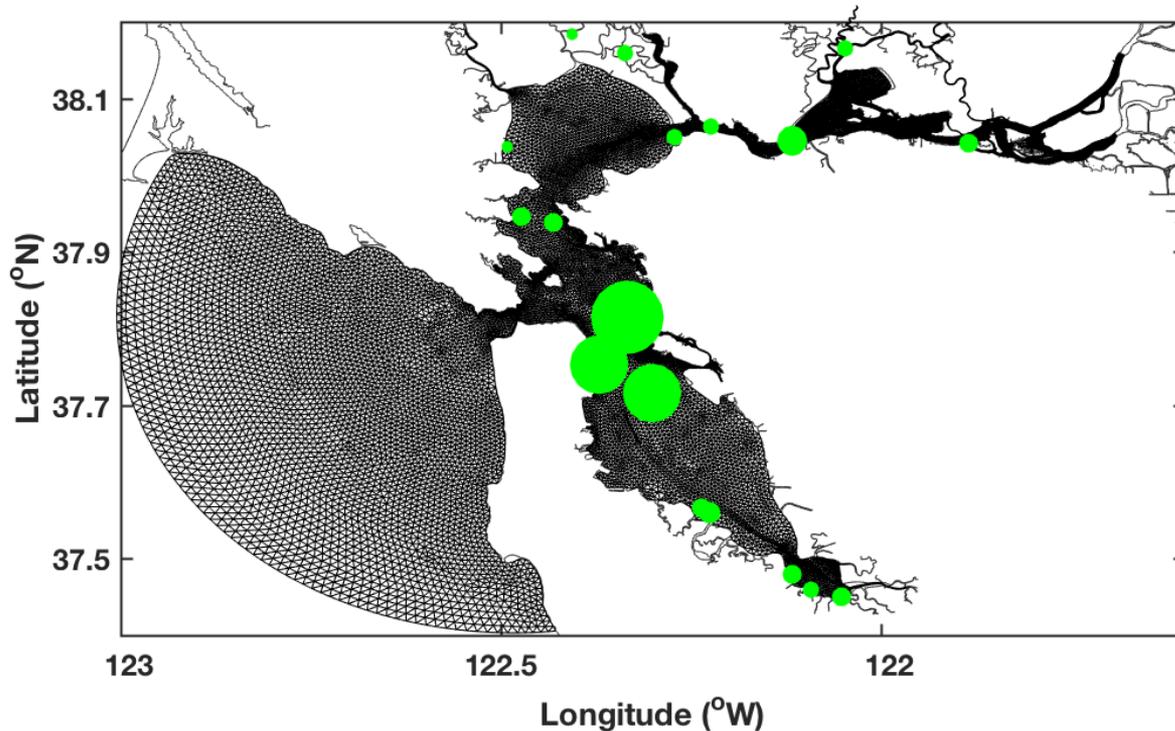
Dissolved Oxygen (DOX)
Carbon Dioxide (CO₂)
Alkalinity (ALK)

Liu and Chai et al., 2018
Continental Shelf Research

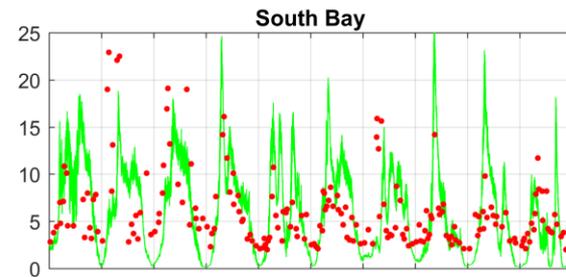
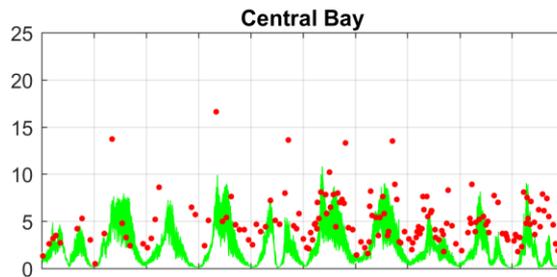
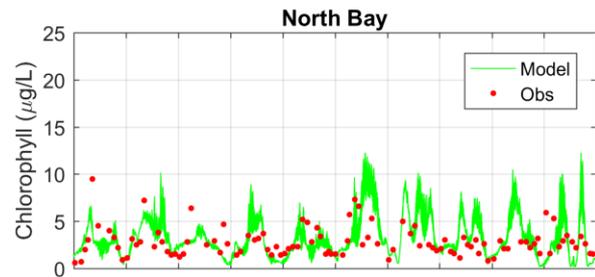
Wang and Chai et al., 2020
Ocean Dynamics

Coupled SCHISM-CoSiNE Model

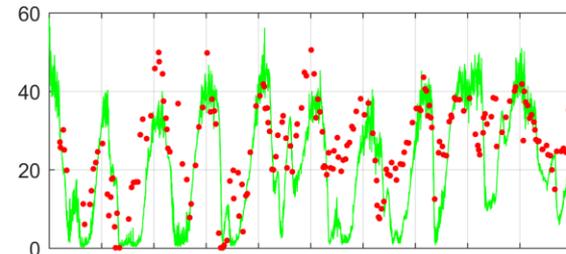
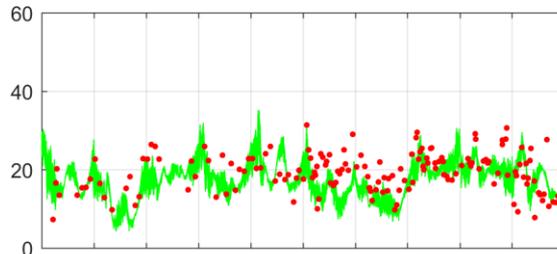
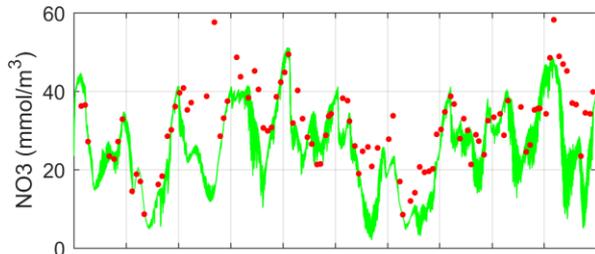
- **Boundary Conditions:** 3-km California ROMS-CoSiNE;
4 Rivers with discharge (USGS), dissolved inorganic nutrients;
- **Sources:** NO_3 and NH_4 from [18 WWTPS](#)



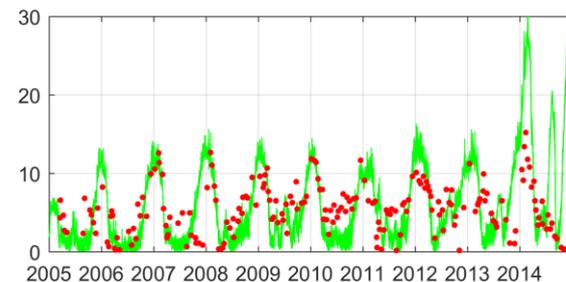
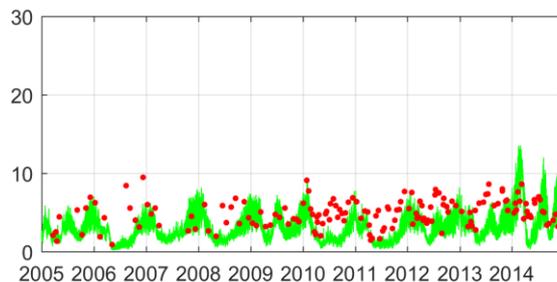
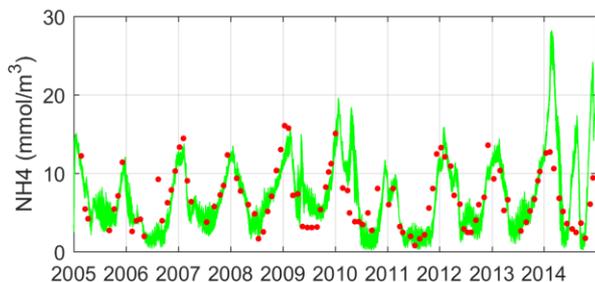
CHL-a



NO₃

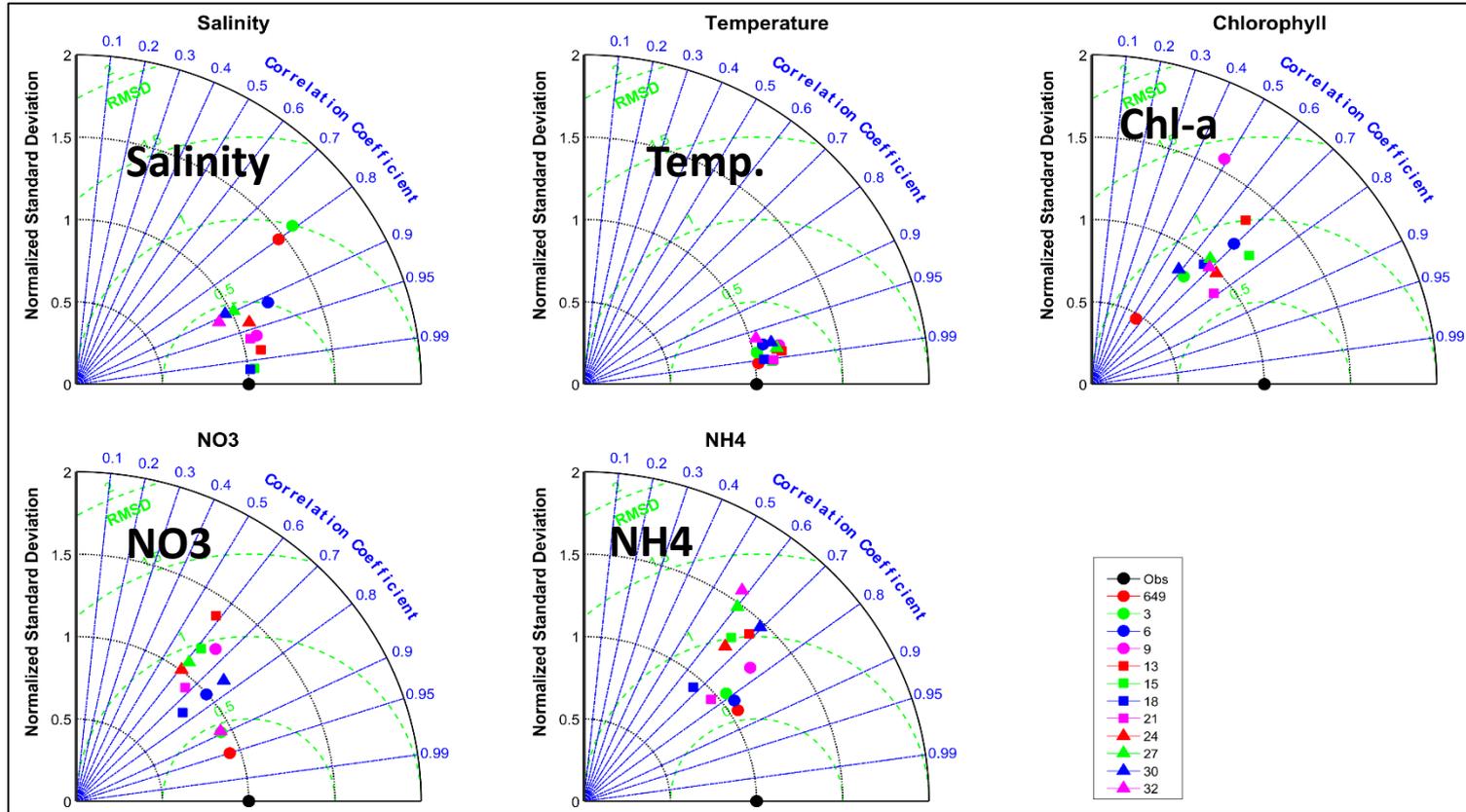


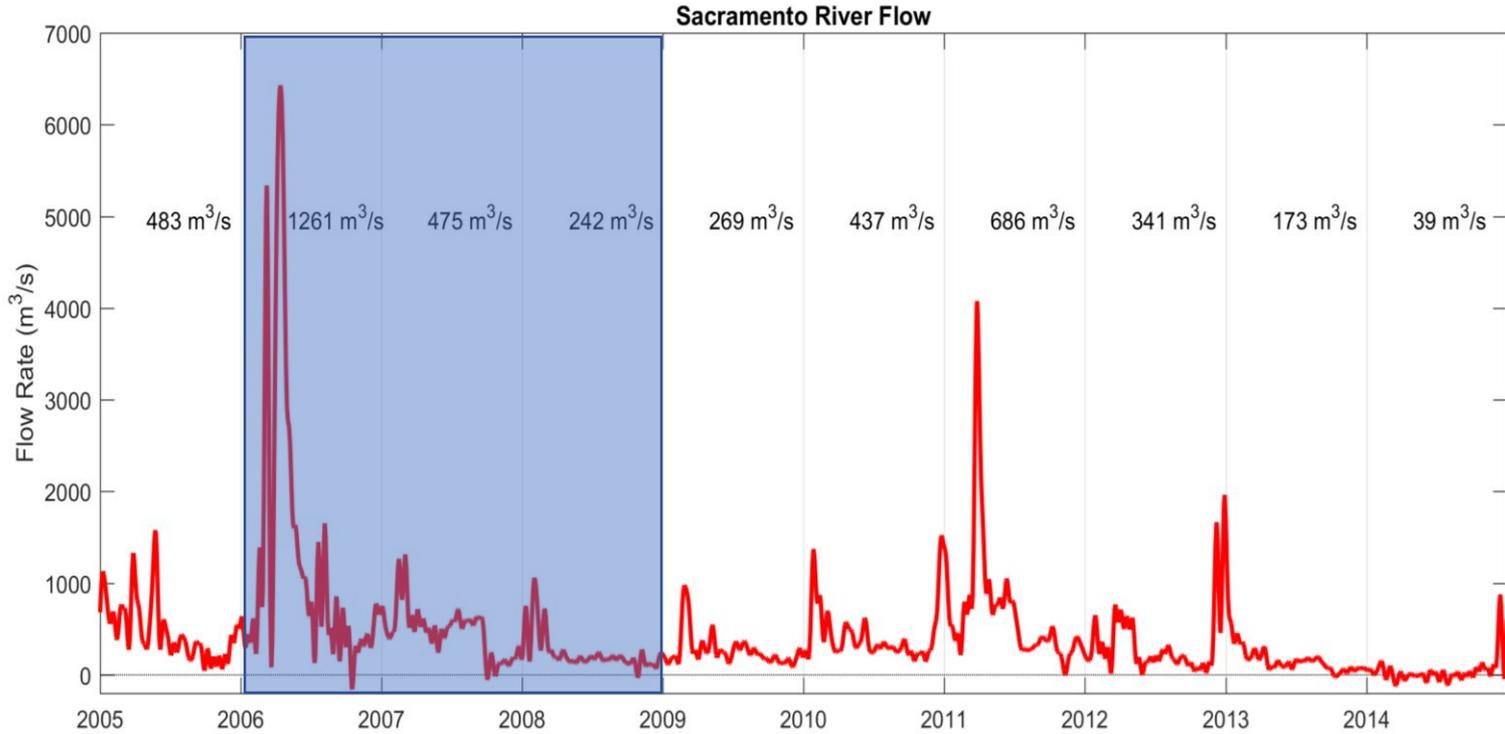
NH₄



- Time series of simulated chlorophyll generally match measurements from USGS
- The interannual variation of nutrients (NO₃ and NH₄) were well captured by CoSiNE model

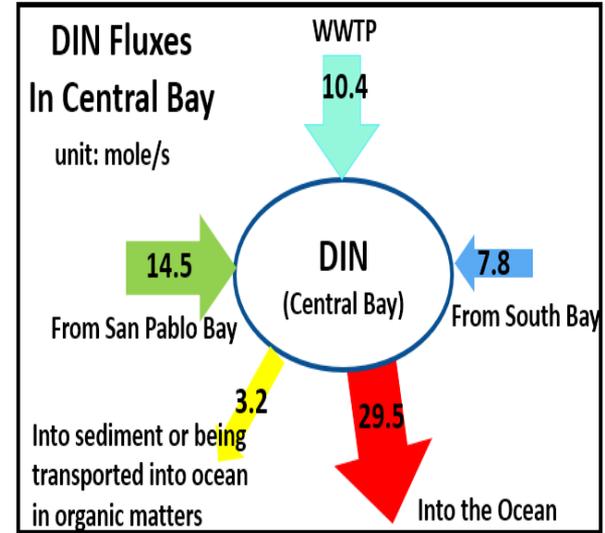
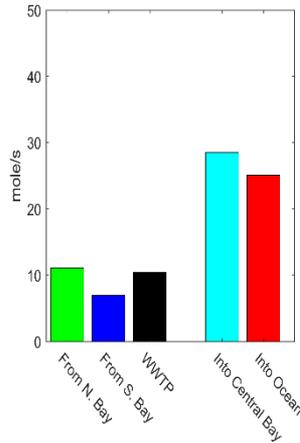
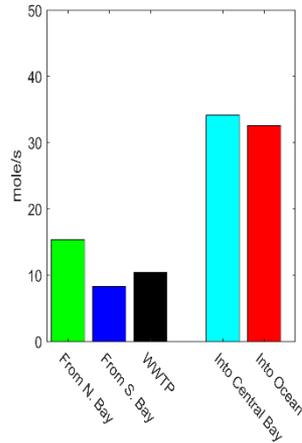
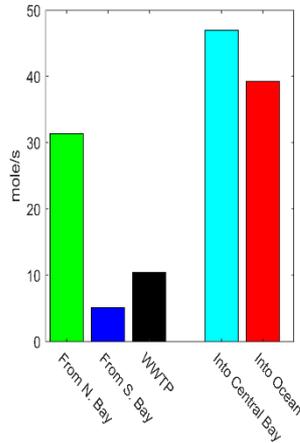
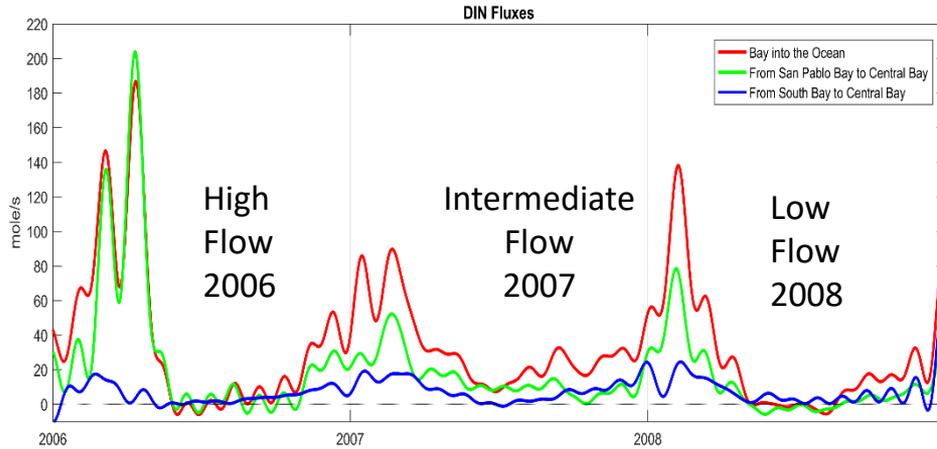
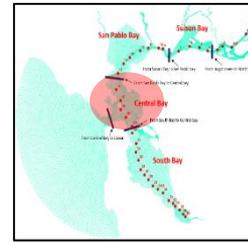
Model Skill - Taylor Diagram





Three years from 2006 to 2008 are selected for analyzing model results under different river flow conditions.

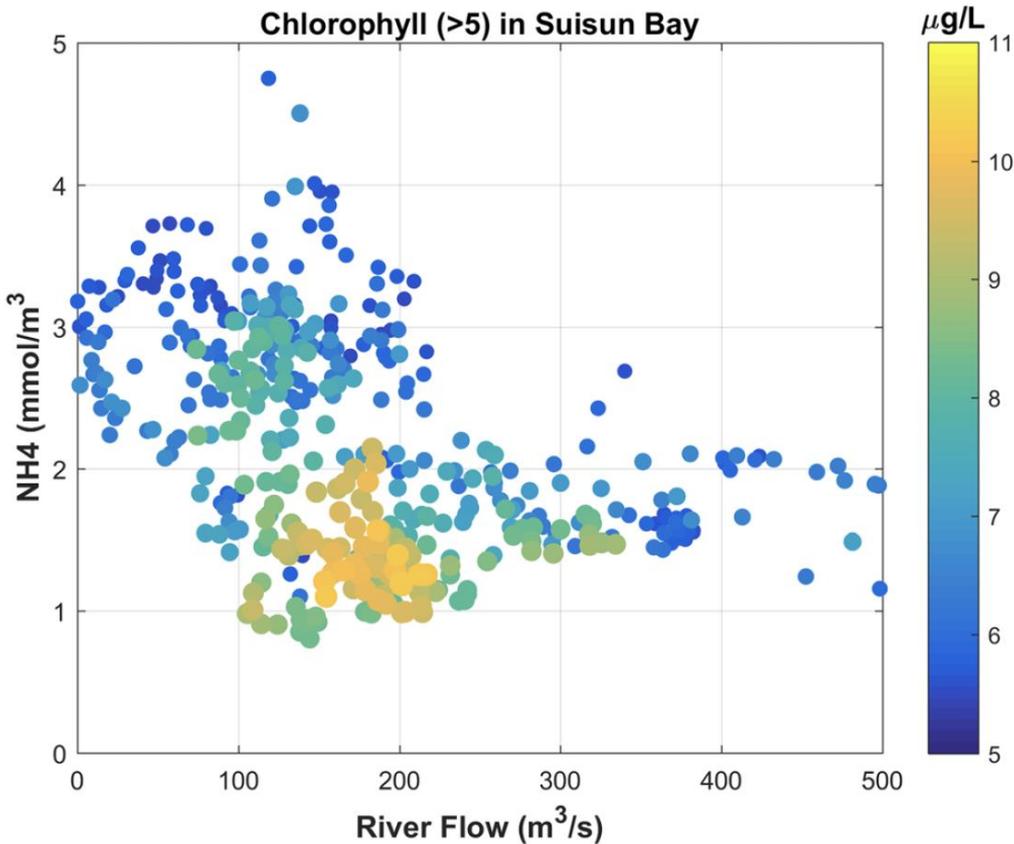
DIN ($\text{NO}_3 + \text{NH}_4$) Fluxes in Central Bay



Most of nutrient loads (**90%**) into the Bay are transported out, while only 10% are assimilated by plankton or into the sediment.

Outline

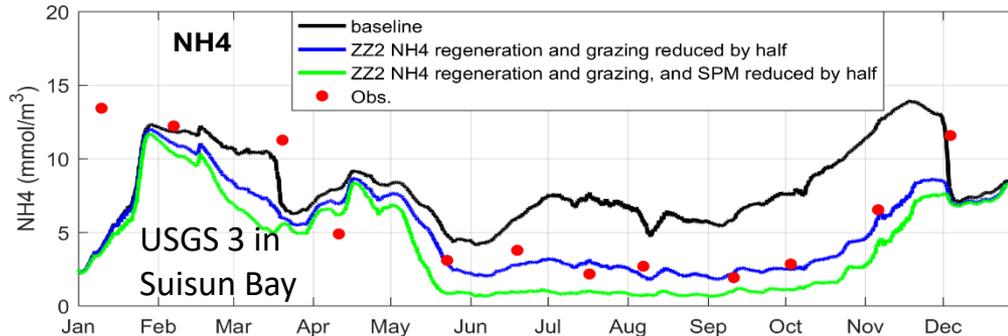
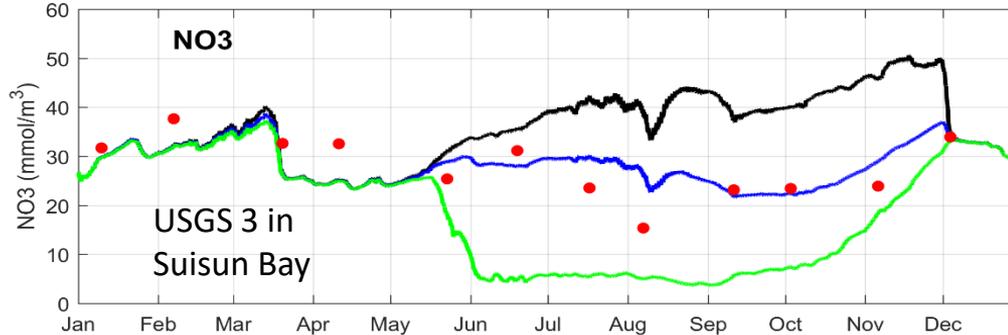
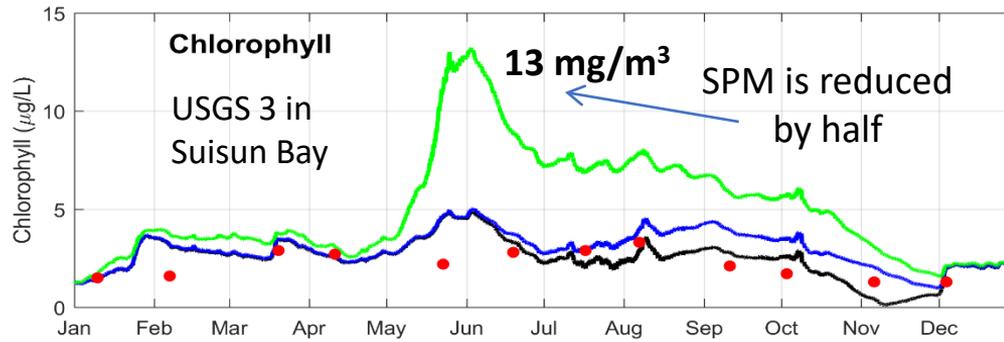
- ❖ San Francisco Bay (SFB) and SCHISM-CoSiNE model
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Flow rate, NH₄ concentration, and Chlorophyll

Fig. 12 Scatter plot for chlorophyll (> 5 µg/L) in Suisun Bay. Ten-year model results are used for this analysis. The x -axis represents the flow rate from major rivers, while the y -axis represents NH₄ concentration. For each chlorophyll point, the corresponding flow rate is obtained by averaging the river flow over the past 2 weeks

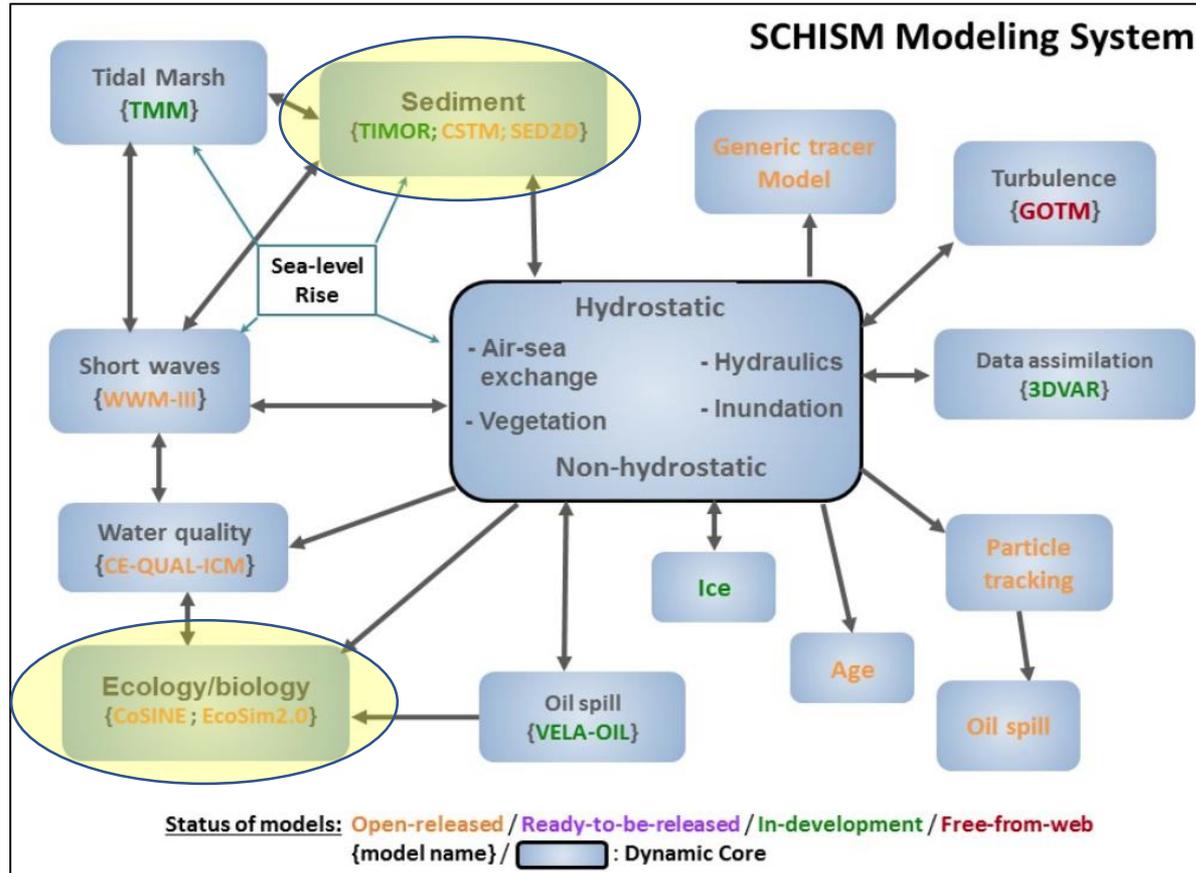
Wang and Chai et al.,
Ocean Dynamics, July 2020



Role of SPM and Light in Regulating Phytoplankton Bloom

It shows that SPM concentration can largely influence the phytoplankton growth.

SCHISM and Sediment Transport Model (SED3D)



Open-released Ready-to-be-released In-development Free-from-web

Sediment Transport Model Configuration in SF Bay

➤ 3 Type of Sediment Grains

➤ Initial Condition

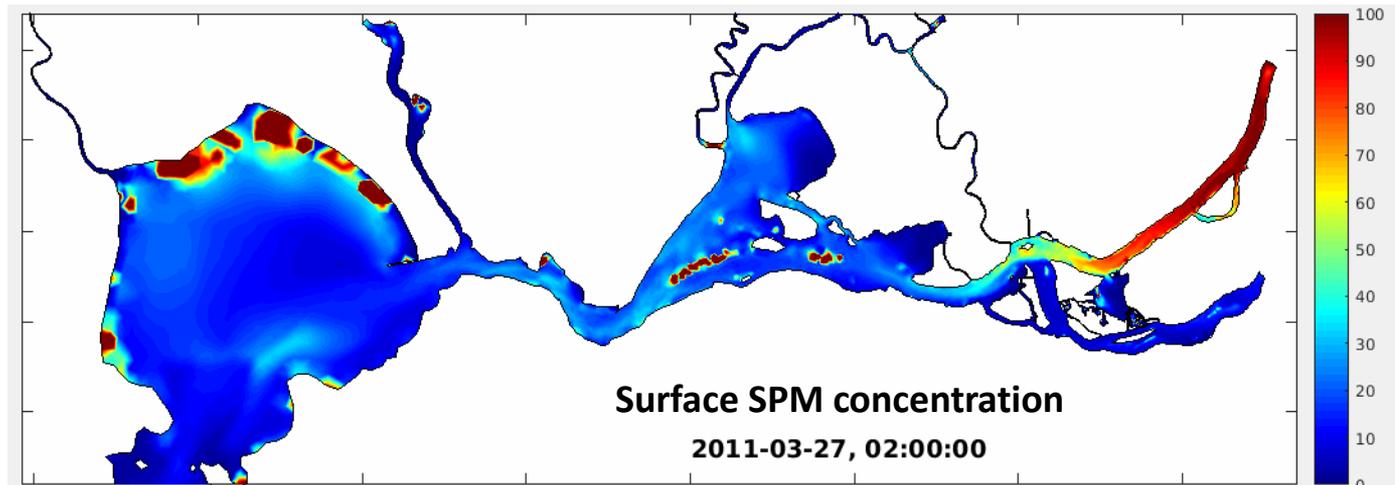
- Sediment bed fraction
- Sediment bed thickness
- SPM concentrations in water

➤ Boundary Condition

- Open Ocean boundary: SPM=10 mg/L
- River Boundaries: Turbidity data

➤ Sensitive Parameters

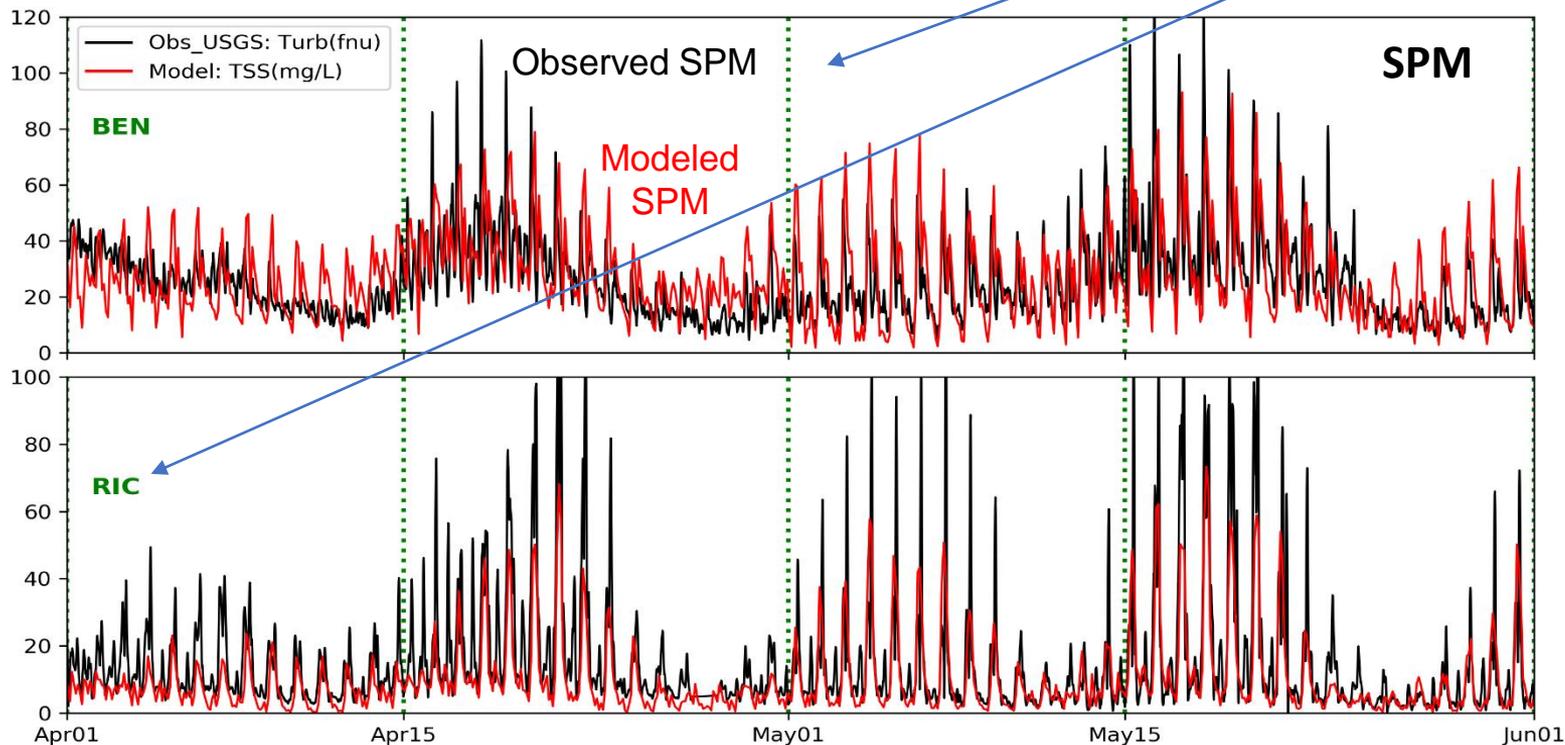
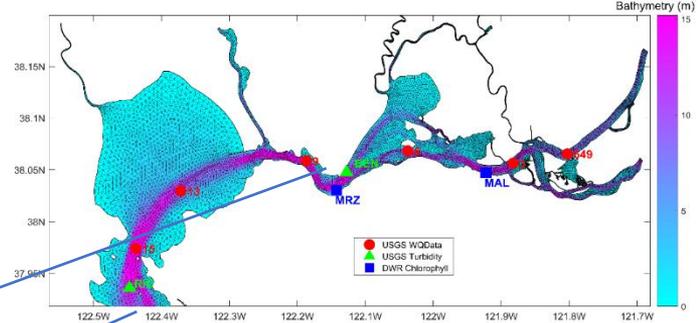
- Grain size
- Erosion rate



Wang and Chai
et al.,
submitted.

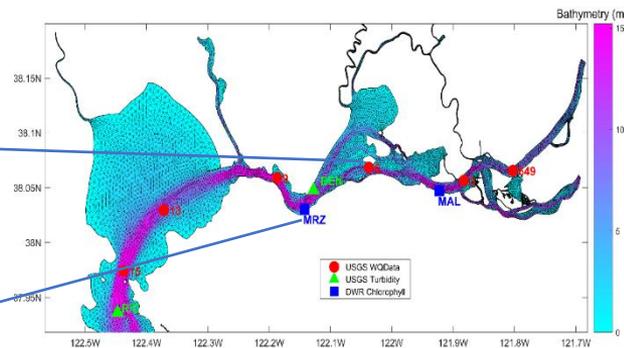
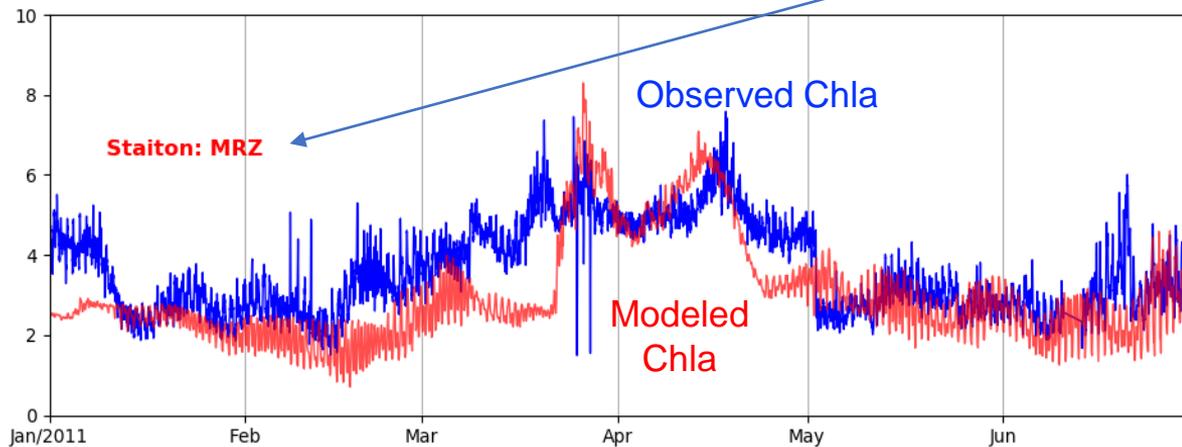
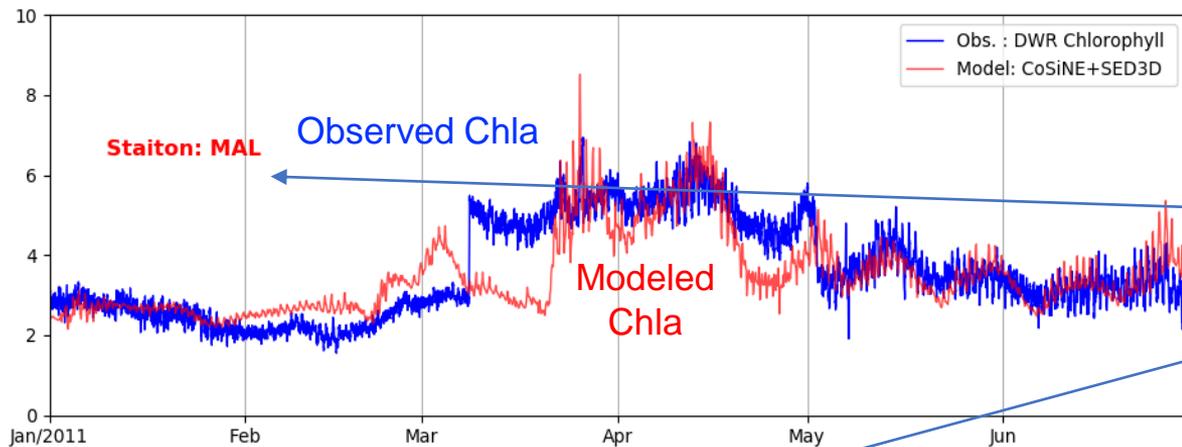
Model Calibration: SED3D

- SPM (or TSS) is compared with turbidity data from USGS
- Model well captures the diel cycle (1 day) and spring-neap tide cycle (14 day)



Wang and Chai
et al.,
submitted.

Modeled *chlorophyll* also compares well with continuously monitoring data



Wang and Chai
et al.,
submitted.

Chlorophyll Simulation with SED3D

- With SED3D, simulated chlorophyll matches the observation better visually

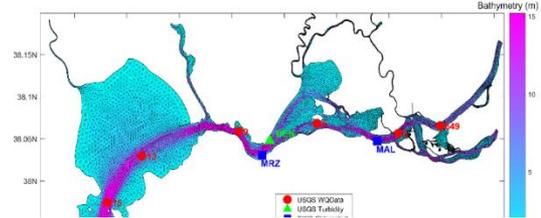
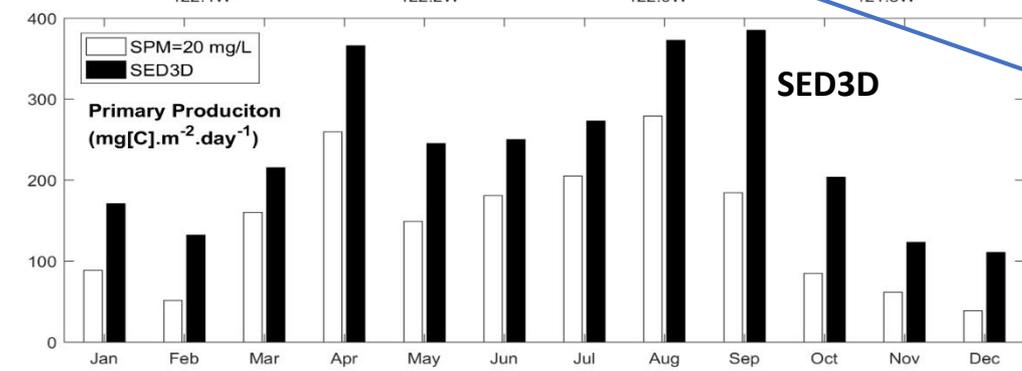
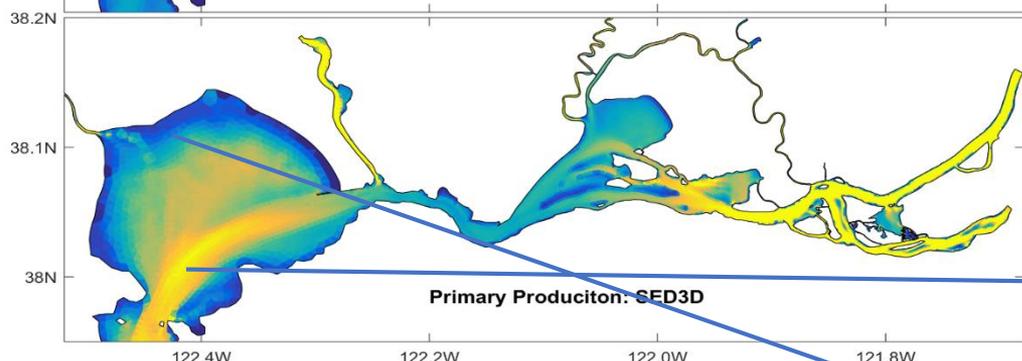
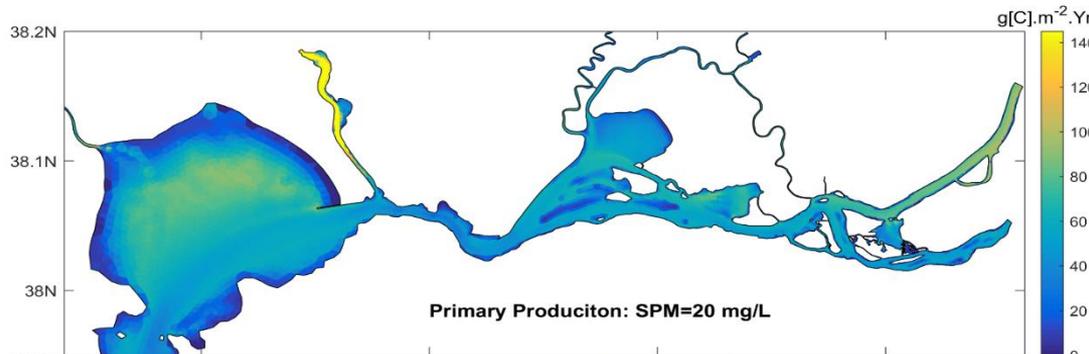


Table 1. Statistics for chlorophyll results including R, MAE and ME for the six stations in northern SFB. They are based on the best matches in +/- 3 days around the observation times. The numbers in parentheses are the improvement (percentage) of the chlorophyll in SPM_SED3D relative to that in SPM_20. The last column is the averaged improvement.

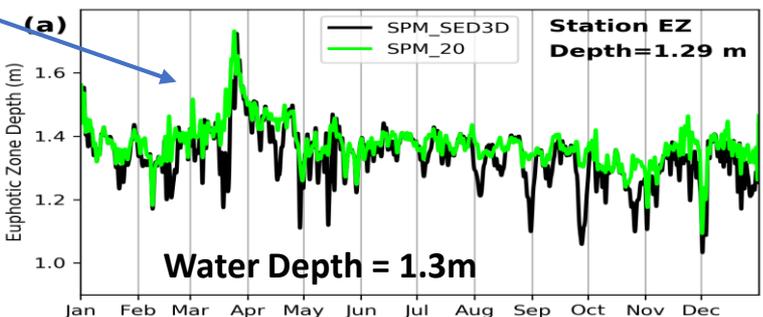
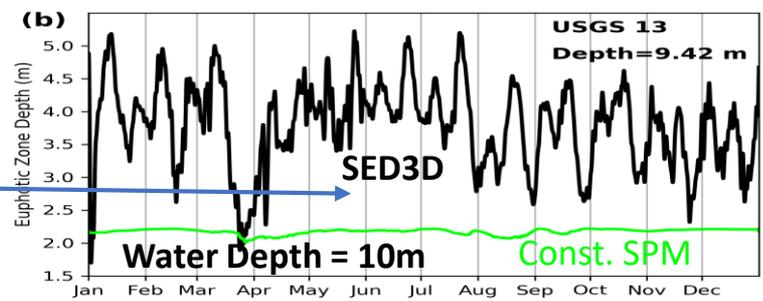
Chlorophyll ($\mu\text{g}\cdot\text{L}^{-1}$)		649	3	6	9	13	15	Improvement
R	SPM_20	0.43	0.19	0.68	0.32	0.39	0.52	
	SPM_SED3D	0.95	0.77	0.85	0.63	0.79	0.85	0.38
MAE	SPM_20	2.46	1.40	0.84	1.34	2.42	3.47	
	SPM_SED3D	1.18 (52%)	0.57 (59%)	0.37 (56%)	0.74 (44%)	1.59 (34%)	2.11 (39%)	0.90 (48%)
ME	SPM_20	-1.71	-0.58	-0.52	-0.60	-1.73	-2.89	
	SPM_SED3D	-0.31 (81%)	0.41 (30%)	0.04 (91%)	0.05 (91%)	-0.88 (49%)	-1.49 (48%)	0.80 (65%)



Primary Production

- Primary production is significantly increased (15%) in CoSiNE model with SED3D compared to the case with constant SPM.
- The difference is larger along the bay channel where the water depth is deeper.

Euphotic Zone Depth at different location



Summary

- ❖ High Nitrogen & Low Growth (HNLG) in San Francisco Bay (SFB), and **SCHISM-CoSiNE** captures overall nutrients and chlorophyll for SFB
- ❖ **90% of DIN** from rivers and WWTPs **exported to the coastal ocean**, and 10% assimilated by plankton and deposited into the sediment
- ❖ **NH₄ inhibition** and **bottom grazing** by invasive Asian clams alter nitrogen cycling (more NH₄) and regulates NO₃ uptake by phytoplankton
- ❖ **Sediment transport modeling for better SPM simulation** is crucial for improving primary production and phytoplankton dynamics.

weak

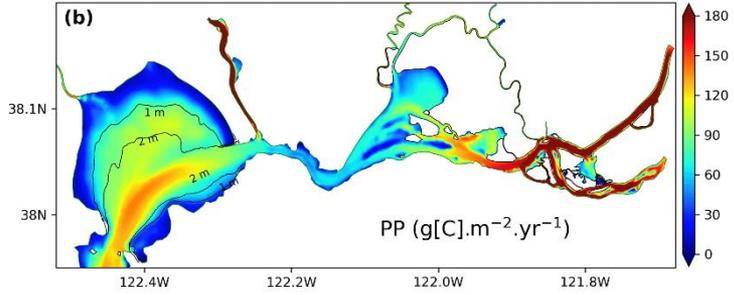
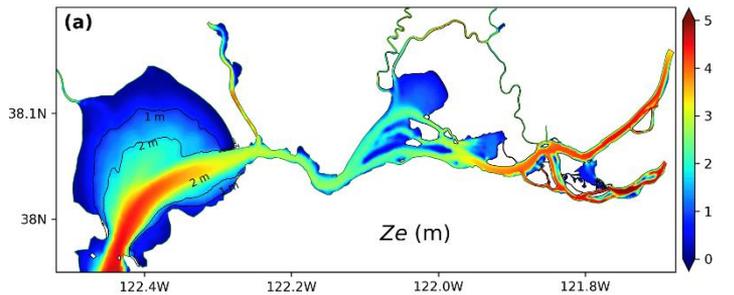
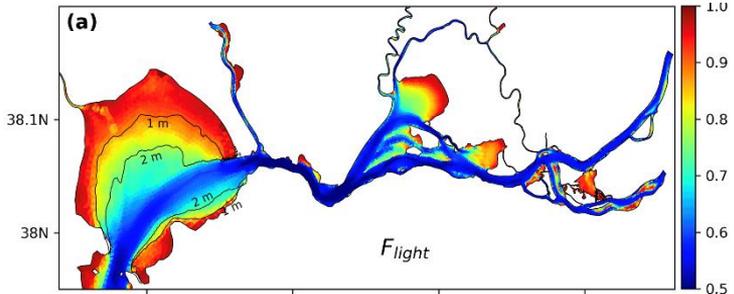
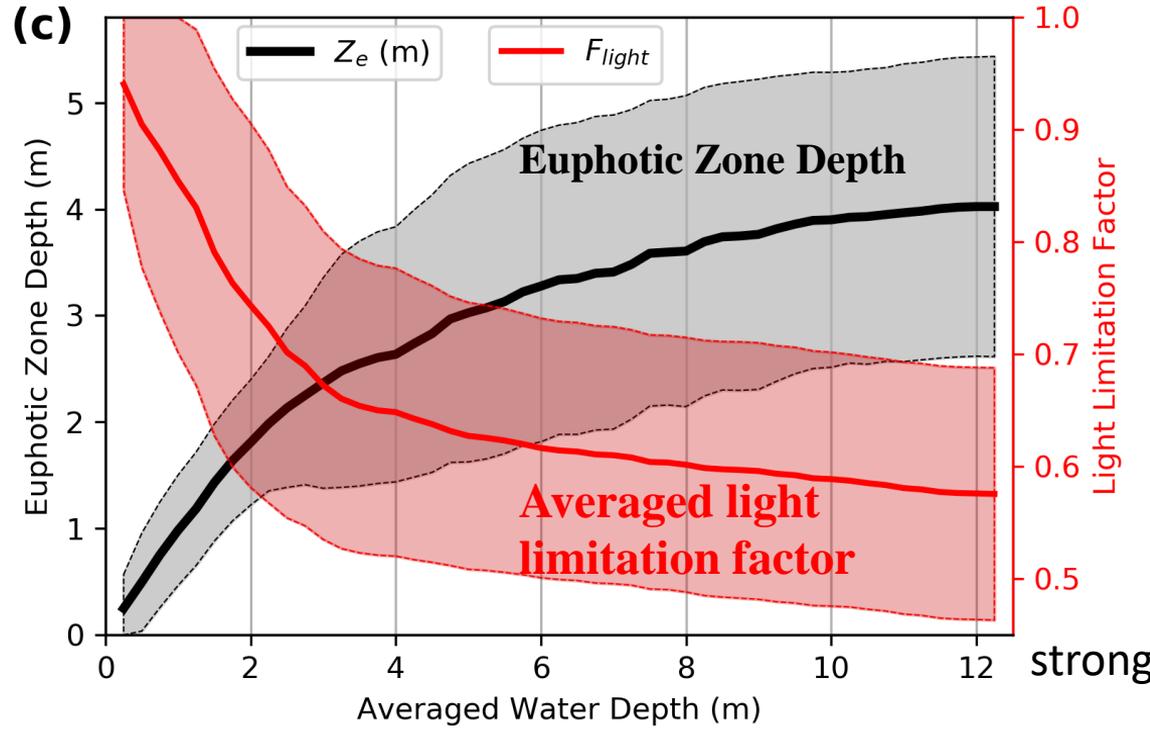


Figure 10. Comparison of Euphotic Depth (a) and vertically integrated primary production (b) in northern SFB for 2011. All the data are from SPM_SED3D.



Z_e :Euphotic Zone Depth Wang and Chai et al., submitted.

F_{light} : Averaged light limitation for phytoplankton

$$F_{light} = \frac{1}{Z_e} \int_{-Z_e}^0 \phi(z) \cdot dz \quad \phi(z) = \left(1 - e^{\frac{-\alpha}{\mu_{max}} \cdot I} \right) \cdot e^{\frac{-\beta}{\mu_{max}} \cdot I}$$

is light calculation