

NASA Satellite: **MODIS-Aqua** 

# **Drivers of Temporal Variability in Ocean Iron Stress in HNLC Regions using Ocean Color and Climate Modes**

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# Motivation

20-yr Monthly Global

Maps of MODIS-Aqua

Products

- Phytoplankton are microscopic plants that carry out photosynthesis, produce 50-80% of Earth's oxygen, and is food for marine animals.
  - Photosynthesis requires micronutrient iron
  - Over 1/3 of the global ocean is iron limited (HLNC)
  - Ocean warming is predicted to limit iron supply
    - Impact oxygen supply & marine resources



Conserve marine 4 LIFE BELOW WAT resources for future ocean health

- Ship-based time-series measurements of dissolved Fe from high nutrient low chlorophyll (HNLC) regions (Equatorial Pacific, Subarctic N. Pacific, and Southern Ocean) are limited to nonexistent.
- Objective: To determine the temporal variability (interannual & seasonal) of NPQ-corrected  $\phi_{sat}$  (Eq 1),



# **Results and Discussion**

a satellite remote sensing-based estimate of phytoplankton iron (Fe) stress, across HNLC regions with related climate modes and other satellite remotesensed products.



*Figure 1. Global 20-yr average NPQ-corrected*  $\phi_{sat}$ *.* HNLC regions (red boxes) are nutrient replete, Fe limited, sunlit waters with relatively low rates of biological production/export. Subtropical gyres have chl<<0.1 or other nutrient stresses.

### Background

- Phytoplankton pigments absorb light for photosynthesis, but excess light is fluoresced and emitted as red (675 nm).
- Fluorescence is also an indicator of chlorophyll (chl) concentration, photosynthetic rates, and physiological status<sup>1, 2, 7</sup> (Eq 2).

Figure 2. Monthly (**A**) NPQ-corrected  $\phi_{sat}$  and SST by SNP (solid line) and SO (dotted line); (**B**) NPP, PC, and chl by SNP and SO; (**C**) EQ NPQ-corrected  $\phi_{sat}$  and SST anomaly; (**D**) PDO; (**E**) MEIv2 climate modes for 2002-2023. \*Vertical dotted lines are one-year increments.

• No secular trends in Fe stress (Blue lines). SNP and SO are subject to seasonal cycles. SNP sea ice impact during November-March with a freshwater cap/stratification that prevents convective mixing in the winter<sup>10</sup>. East SNP gets more Fe inputs than west SNP<sup>10</sup>. SO sea ice impact during April-October. EQ Fe stress is tied to El Niño-Southern Oscillation (ENSO); greater Fe stress with La Niña events (colder SST anomalies); El Niño 2015 (exception) had a lagging elevated Fe stress response with warmer SST anomalies.



- In the EQ, Fe stress decreases as SST increases (positive phase MElv2 & PDO; negative phase SOI)
- Fe stress driven by La Niña periods (colder SST) (Fig. 2C).
- No correlation among NPP and PC with Fe stress (Fig. 4).
- In the SNP and SO, as SST increase, NPP & PC increases, which increases Fe stress as nutrients are taken up (Fig. 2A). Seasonal wintertime reduced Fe stress.
- As upwelling increases (+NPGO) in SNP, stimulated phytoplankton blooms contribute to higher dissolved Fe uptake and increased Fe stress following Fe depletion.
- Previous research for the EQ found upwelling supplies Fe, thus,

- High fluorescence yields are associated with physiological and nutrient stress in phytoplankton<sup>8</sup>.
- By correcting for (1) pigment concentration, (2) photoprotective response or nonphotochemical quenching (NPQ, heat dissipation), and (3) pigment packaging, **NPQ-corrected**  $\phi_f$  can be derived as a proxy for Fe stress <sup>1, 7</sup>.
- Under non-macronutrient-stressed conditions (N and P abundance), iron stress in Chl increases fluorescence quantum yields  $(\boldsymbol{\phi}_{f})^{1, 5}$ .
- Satellite-derived  $\phi_{sat}$  can indicate phytoplankton Fe stress<sup>1</sup>.



Table 1.	Seasonal	statisti	CS.	Fe stress: EQ>SO>SNP			
	EQ	SNP	SO	<ul> <li>SNP peaks in July (summer)</li> </ul>			
Ave $\varphi_{sat}$ (%)	2.70	1.51	2.00	<ul> <li>SO peaks in Dec (summer)</li> </ul>			
Std Dev	0.16	0.13	0.39	Fe stress variability: SO>SNP>EQ			
Std Err	0.01	0.01	0.03	• SO: highest variability (19.56%)			
CV (%)	5.76	8.51	19.56	• EQ: highest stability (5.76%)			

20-vr Monthly Correlation Matrix (2003-2023) (*: $\alpha < 0.05$ )																
- MEIVZ	-NPGO	Equat Pac NPP	- Equat Pac PC	Equat Pac SST	South Ocean φ	- SAM	South Ocean NPP	South Ocean PC	South Ocean SST	Subarc N Pac φ	- PDO	- SOI	Subarc N Pac NPP	Subarc - N Pac PC	Subarc N Pac SST	
.17 *	0.12	0.1	0.1	-0.3	0.4	0.035	0.32 *	0.096	0.044	0.083	-0.27 *	0.24	-0.31	-0.34	-0.08	_Equat Pac φ
	-0.14 *	-0.35 *	-0.67 *	0.66 *	0.026	-0.056	-0.011	0.018	-0.015	-0.023	0.66 *	-0.76 *	-0.11	-0.11	-0.036	- MEI∨2
-		0.34	0.3	-0.079	-0.043	-0.043	-0.13	-0.072	-0.13 *	0.19 *	-0.15 *	0.12	0.12	0.13	-0.028	- NPGO
			-0.7 *	-0.29 *	-0.13	-0.15 *	-0.3 *	-0.47 *	-0.28 *	0.018	-0.28 *	0.2 *	0.19 *	0.32 *	0.18 *	_ Equat Pac NPP
	- 0.8			-0.49 *	-0.081	-0.024	-0.13 *	-0.12	-0.038	0.01	-0.49 *	0.51 *	0.084	0.1	-0.015	_ Equat Pac PC
	010				-0.28 *	-0.01	-0.36 *	0.019	0.3 *	-0.05	0.55 *	-0.53	0.16 *	0.15 *	-0.35 *	_ Equat Pac SST
	- 0.6					0.11	0.87	0.51	0.47	-0.31 *	-0.047	0.079	-0.9 *	-0.65 *	-0.53 *	_ South Ocean φ
	- 0.4						0.095	0.13	0.21 *	-0.11	-0.034	0.11	-0.068	-0.096	-0.13 *	- SAM
	- 0.2	NPP,	PC, S	ss (+) ST	corr w			0.73	0.42 *	-0.28 *	-0.13 *	0.11	-0.83 *	-0.71 *	-0.41 *	_ South Ocean NPP
		EQ Fe	e stres	SS					0.59 *	-0.19 *	0.0077	0.081	-0.5 *	-0.56 *	-0.65 *	_ South Ocean PC
	- 0.0	(+) co (-) co	orr w/ orr w/	' SOI ( EQ SS	cold) ST					-0.42	0.054	0.13	-0.54 *	-0.43 *	-0.89 *	South Ocean SST
	0.2	NPP,	, PC,	Chl:			SNP S	ST			-0.072	-0.033	0.38 *	0.0091	0.36	_ Subarc N Pac φ
	0.4	stron	g + c	orr ∩≻F(	٦ ٦	( 	(+) CO	rrw/l	e stre	ess,		-0.54 *	0.0067	-0.0088	-0.11	- PDO
			II ~ J		<u>ـ</u>		-C, INF	- <b>r</b>					-0 049	-0.025	-0.059	- 501

reducing Fe stress and increasing chlorophyll concentrations<sup>3</sup>. • Our analysis expands this: following nutrient input (upwelling) and/or seasonal warming, Fe stress may temporarily decrease, but it increases at carrying capacity.

• Higher stability and minimal seasonal variability in the EQ may select phytoplankton with lower Fe requirements, while polar regions have greater seasonal shifts that cause restructuring of the phytoplankton community<sup>3, 5</sup>.

#### Conclusions

1. Fe stress varies interannually based on supply, use, & SST. 2. Seasonal summer cycle (1 SST, 1 NPP) enhances Fe stress in high latitudes at carrying capacity with respect to Fe supply. • Upwelling phase correlated with Fe stress in SNP. 3. Lowest Fe stress in SNP, but highest PC & NPP, indicates more Fe input supply than EQ & SO. 4. Highest Fe stress variability in SO due to sea ice cover 5. Cooler SST/ La Niña cycle drives Fe stress in EQ 6. EQ has the highest Fe stress and high NPP, but lowest PC, indicating faster carbon cycling. 7. Not all variation can be explained by climate modes • i.e. phytoplankton taxonomic composition, accessory pigmentation, physical circulation, and Fe inputs<sup>10</sup>.

#### Future Work

• Focus on localized limitation in narrower latitudinal bands. • Conduct validation tests of NPQ-corrected  $\phi_{sat}$  with cruise data. • Tease out changes in phytoplankton community composition as adaptation and community shifts occur due to ocean warming and environmental responses with NASA's satellite **PACE** (Plankton, Aerosol, Cloud, ocean Ecosystem).

## | Eq 5: $SST_{anomaly} = SST_{month} - SST_{monthly 20-yr average}$

#### Acknowledgements

- Computations were performed on Marvin, a Cray CS500 supercomputer at UNH supported by the NSF MRI program under grant AGS-1919310.
- Training from Cornell Satellite Remote Sensing Training Program. • Zhou Liang (Florida State University) for coding support.

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				-0.049 -0.025	5 -0.059 - SOI
0.6	Upwelling & PC: + corr • NPGO & EQ • NPGO & SNP • SAM & SO	EQ: strong corr • SST & MEIv2 (+) • SST & SOI (-) • SST & PDO (+)	*	0.75	0.55 * Subarc N Pac NPP 0.44 * Subarc N Pac PC
				1	

Figure 4. Matrix of Pearson's correlation (r) at  $\alpha$  < 0.05 significance level (\*).

**HNLC regions** 

• **SNP**: Subarctic North Pacific:

• **EQ**: Equatorial Pacific Ocean:

• Seasonal statistics (Table 1)

significance level (Fig. 4)

• Linear correlation coefficients with

Pearson's correlation (r) at a  $\alpha$  < 0.05

• **SO**: Southern Ocean:

• 40°S-90°S

(Fig. 3)

• 10°N-10°S: 180°E-85°W

• 60°N-40°N: 140°E-120°W

# Methodology and Analysis

#### **Climate Modes MODIS-Aqua Products PDO**: Pacific Decadal Oscillation: ~SNP Two decades (2003-2022) of Moderate-resolution • SST EOF Imaging Spectroradiometer (MODIS)-Aqua mapped monthly Level-3 products at 9 km spatial • +: El Niño & – : La Niña **NPGO**: North Pacific Gyre Oscillation: ~SNP resolution from NASA ocean color • SSH EOF (http://oceancolor.qsfc.nasa.qov) • +: Upwelling & -: Downwelling • **Chl**<sub>sat</sub>: mg chl m<sup>-3</sup> (Detection limit <<0.1)<sup>4</sup> **SOI**: Southern Oscillation Index: ~EQ • **iPAR**<sub>sat</sub> : µmol photons m<sup>-2</sup> s<sup>-1</sup> • SLP difference btw Tahiti and Darwin Monthly, Seasonal, Interannual Analysis • **nFLH**<sub>sat</sub> : mW cm<sup>-2</sup> $\mu$ m<sup>-1</sup> sr<sup>-1</sup> • Monthly averages by HNLC region (Fig. 2) • +: La Niña & – : El Niño • (Detection limit < 0.003)<sup>6</sup> • Monthly 20-yr averages for HNLC regions **MEIv2**: Multivariate ENSO Index: ~EQ • normalized fluorescence line height • SST, SLP, wind (U & V), outgoing thermal radiation EOF • **PIC**<sub>sat</sub> : particulate inorganic carbon (μM) • +: El Niño & – : La Niña • **POC**<sub>sat</sub> : particulate organic carbon (μM) **SAM**: Southern Annular Mode: ~SO • **SST**<sub>sat</sub> : sea surface temperature (°C) • Zonal sea level pressure (SLP) means at 40°S and 65°S • **NPP**<sub>sat</sub> : net primary productivity (mg C m<sup>-2</sup> day<sup>-1</sup>) • +: Upwelling & –: Downwelling • CAFÉ algorithm<sup>9</sup>.