# WhaleWatch 2.0: Downscaled Blue Whale Habitat Models along the West Coast

Briana Abrahms, Heather Welch, Stephanie Brodie, Michael Jacox, Elizabeth Becker, Steven J. Bograd, Ladd Irvine, Daniel Palacios, Bruce Mate, Elliott L. Hazen

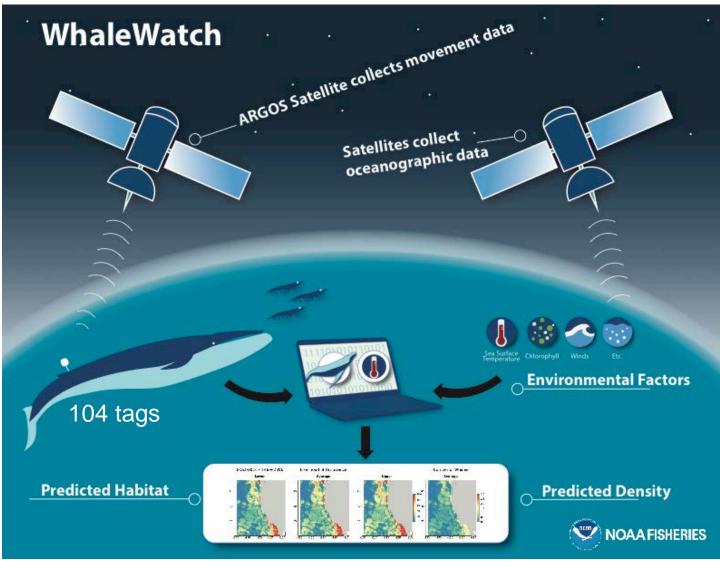




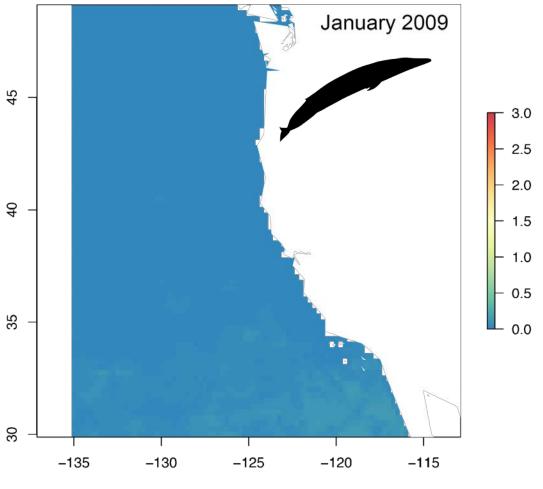




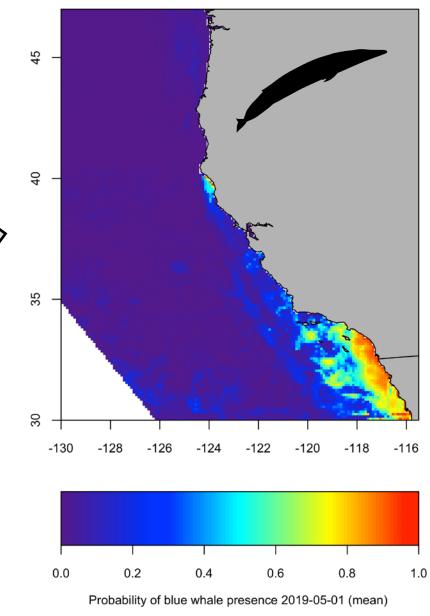




## WhaleWatch 1.0 to 2.0

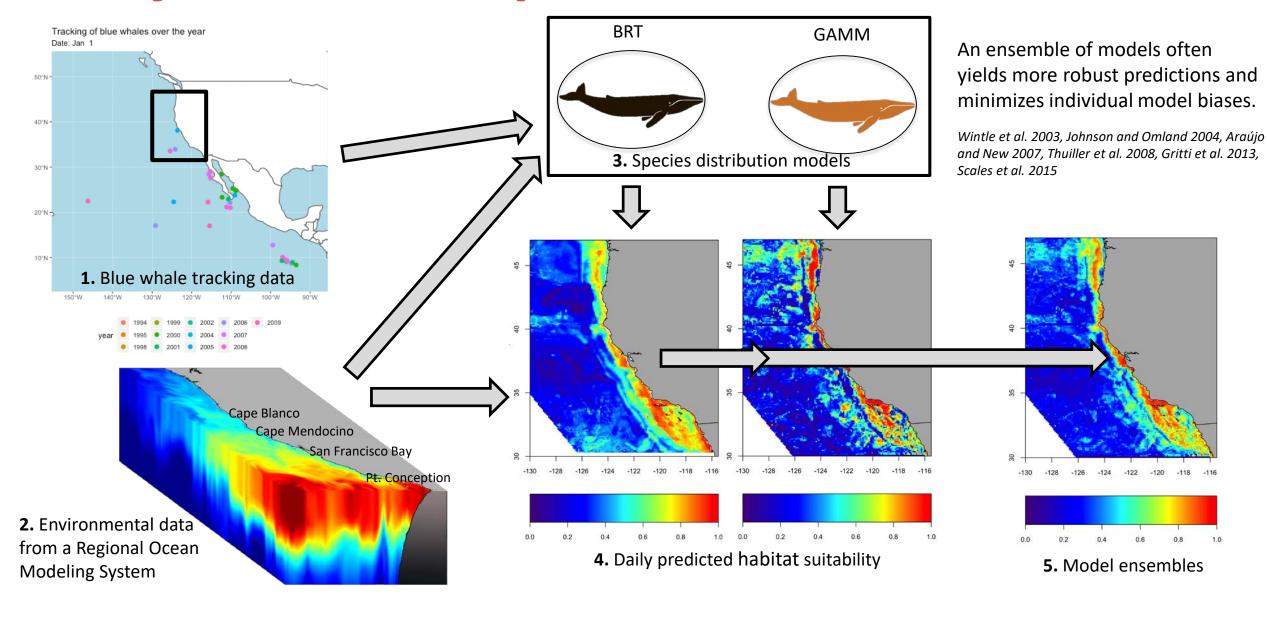


Hazen et al. 2017 J. Appl. Ecol.



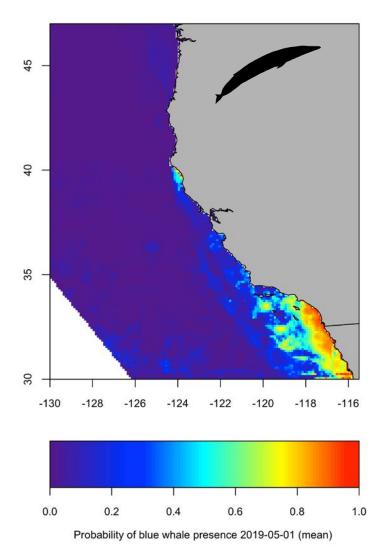
Abrahms et al. 2019 Div. Dist.

## Daily blue whale predictions



## Model output

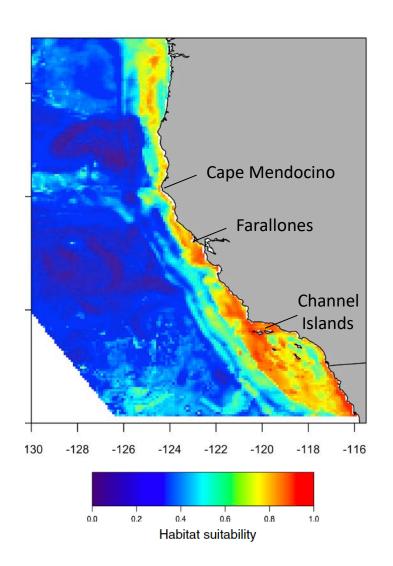
Daily, year-round "Habitat suitability" or "Probability of occurrence" on a 0-1 scale Red = more likely, blue = less likely

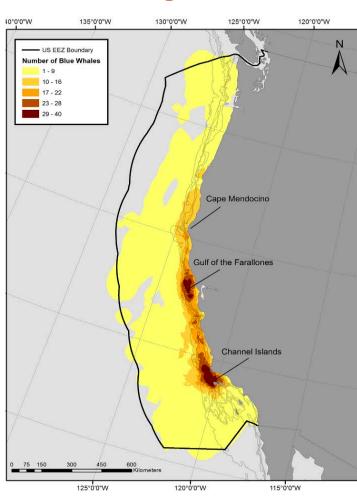


## **Model Evaluation**

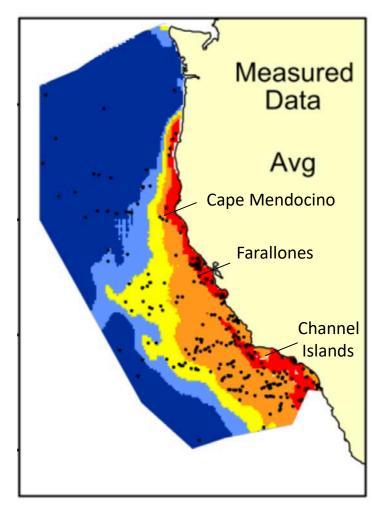
1. Temporal and spatial cross-validation 2. Testing on independent observer dataset train train train train test train train 45 Data source train train test train CalCOFI train train AUC/TSS scores  $\geq 0.5$  = better than random. CINC train train ≥ 0.75 considered good. **NMFS** Cruise PointBlue AUC = 0.951 compared to independent observer data SAMSAP Survey SpotterProData **SWFSC** WhaleAlertData 30 N=3,413 sightings -130-125-120 lon

## **Model Evaluation – Spatial Predictions**





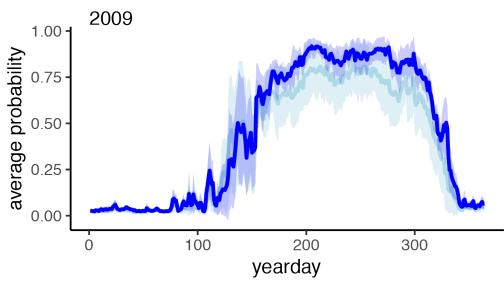
Irvine et al. 2017 90% home range from tagging data

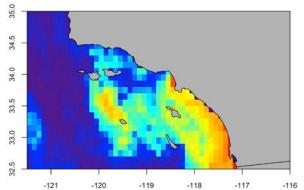


Becker et al. 2016 Long-term survey data

## **Model Evaluation – Timing**

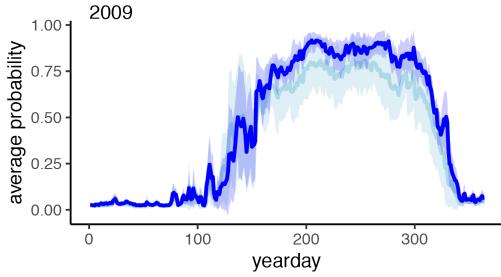
2009 "normal" conditions



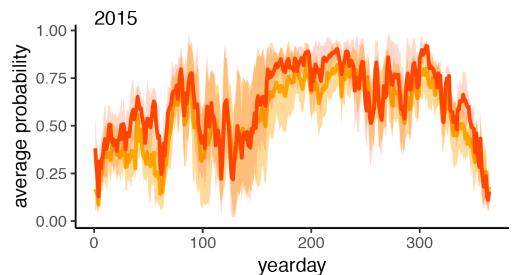


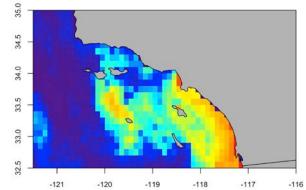
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2009 "normal" conditions



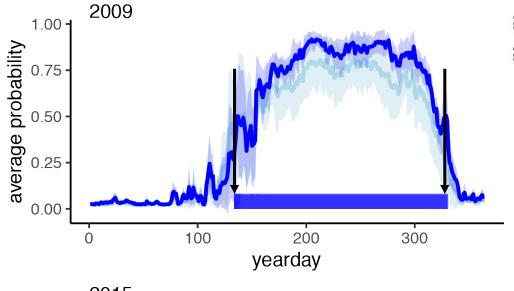
2015 warm water anomaly

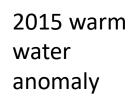


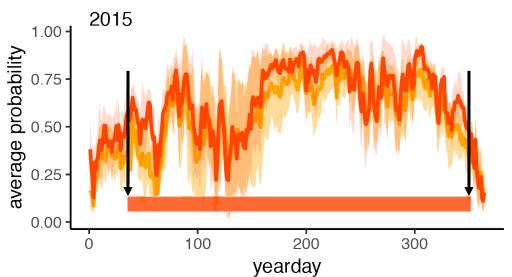


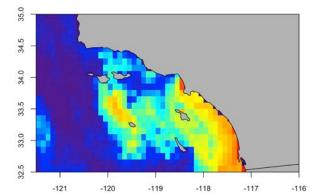
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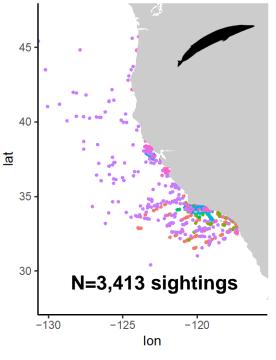
2009 "normal" conditions





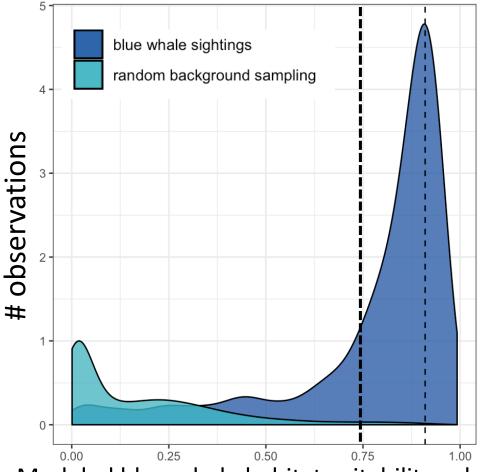






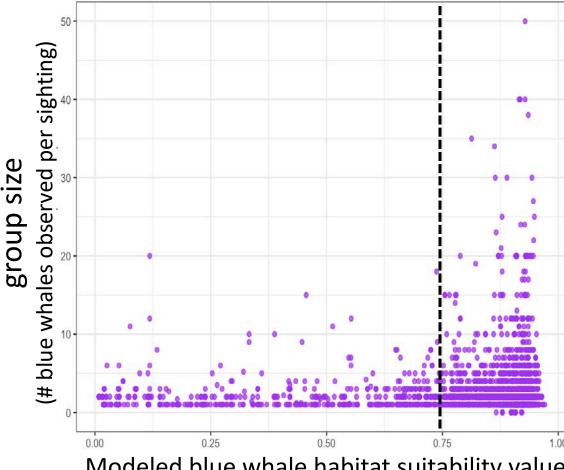
## **Model Evaluation – Whale Sightings**

### Higher habitat suitability → more sightings events



Modeled blue whale habitat suitability value

### Higher habitat suitability → larger group sizes

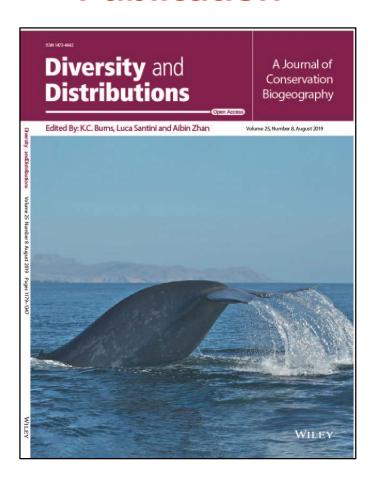


Modeled blue whale habitat suitability value

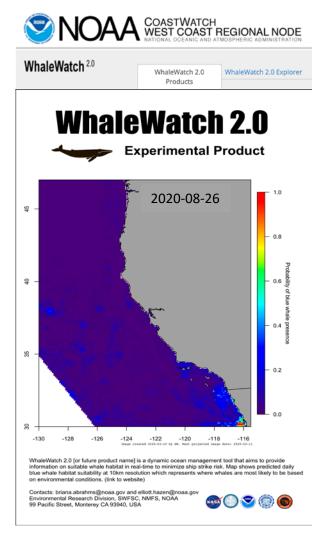
## **Publication**

## **Products**

### Website

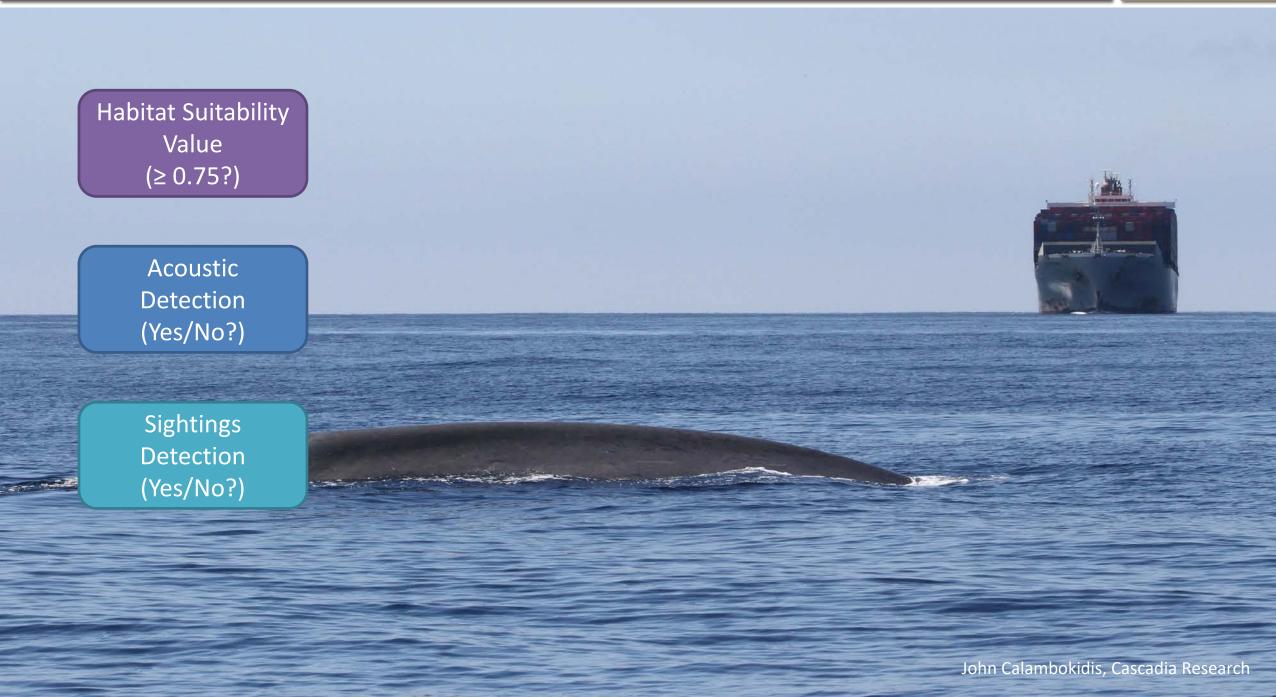


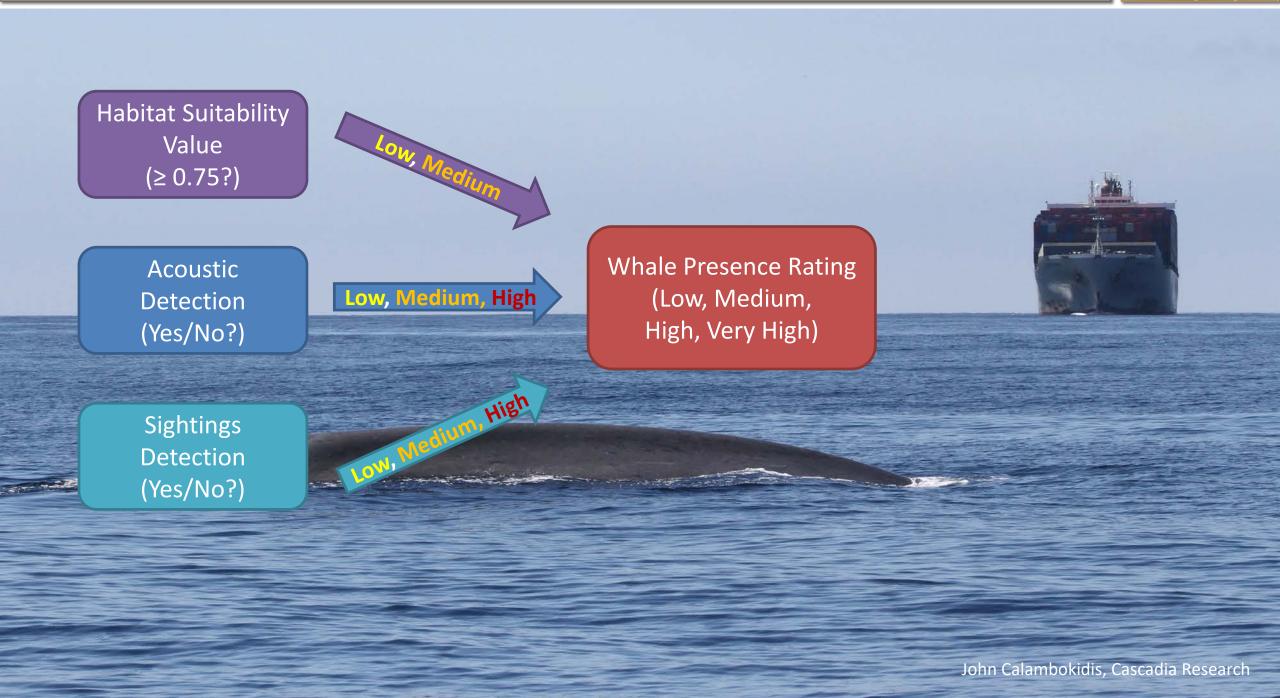
**Abrahms et al.** 2019. Dynamic ensemble models to predict distributions and anthropogenic risk exposure for highly mobile species. Divers. Distr., 25(8) 1182-1193.



https://coastwatch.pfeg.noaa.gov/projects/whalewatch2/whalewatch2 map.html







**Voluntary Vessel Speed Reduction Zone In Effect** | NOAA recommends that vessels > 300 gross registered tons transiting the zone do so at speeds of 10 knots or less









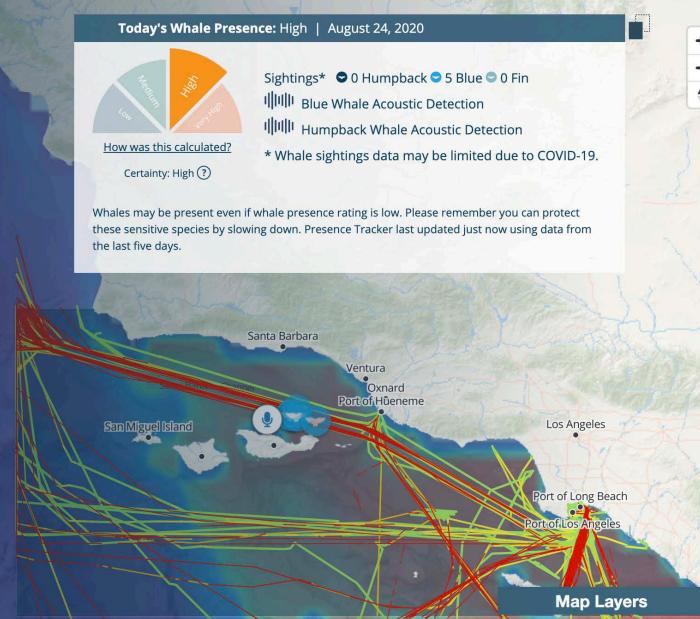




2018 and 2019 Were the Worst Years on Record for Whale-Ship Collisions off the West Coast of the United States.

Despite this trend, there are solutions to combat the problem. Research demonstrates ships that slow to 10 knots in areas with high whale presence significantly reduce the danger to whales.

Whale Safe is a technology-based mapping and analysis tool displaying whale and ship data for the Santa Barbara Channel, with the goal of helping to prevent fatal ship collisions with whales.





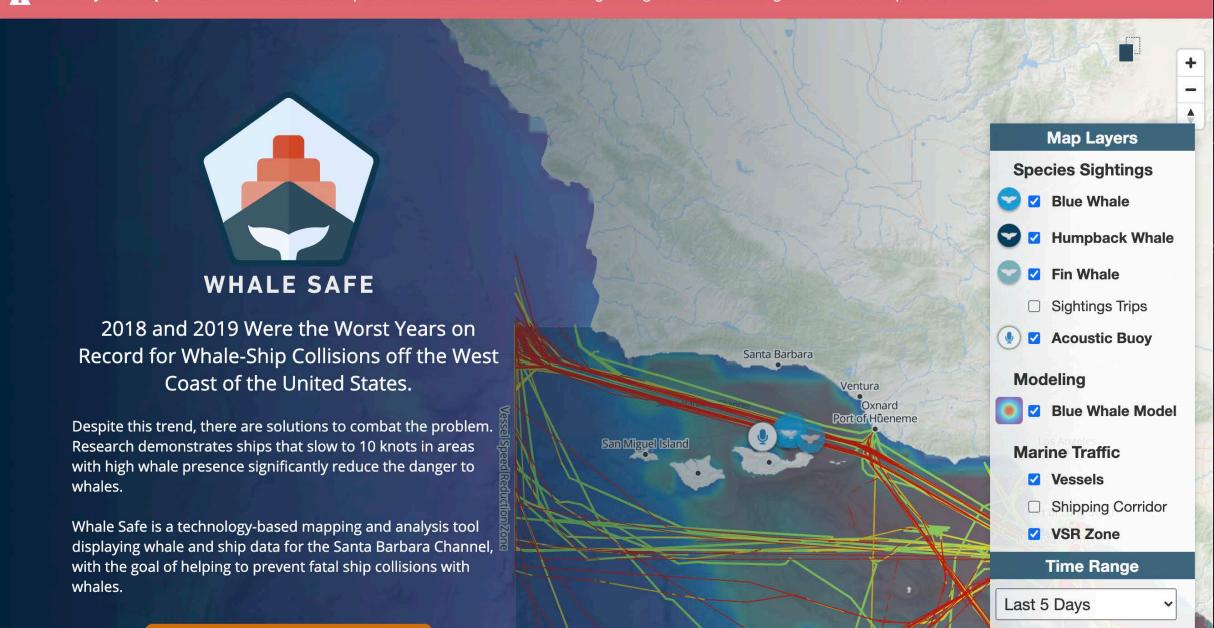
UCSB

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UCSB



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Voluntary Vessel Speed Reduction Zone In Effect | NOAA recommends that vessels > 300 gross registered tons transiting the zone do so at speeds of 10 knots or less

#### **Whale Presence Rating: Blue Whale Habitat Model**

The blue whale habitat model produces predictions of habitat suitability at a 10km resolution. For integration into the Whale Presence Rating, we calculate the average habitat suitability across the vessel speed reduction zone. We then compare this against a threshold value that was determined through additional analyses conducted by authors of Abrahms et al. 2019. In this analysis the distribution of observed blue whale sightings was compared to the average predicted habitat suitability values, and it was determined that peak densities of blue whale sightings occurred at average habitat suitability values above 0.75. Thus, a threshold of 0.75 is used in the Whale Presence Rating.

Species	Average Habitat Suitability Across Vessel Speed Reduction Zone	Whale Presence Rating
Blue	<0.75	Low
Blue	≥0.75	Medium

High suitability predictions are very similar to a "tornado watch" where all the factors point to a high likelihood of blue whale occurrence. However because the model is not able to definitively confirm if blue whales are present, the model cannot trigger a high Whale Presence Rating on its own.



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WhaleSafe Webinar Sept. 17<sup>th</sup>

https://bit.ly/34FW7Jx

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# When are model predictions useful in this context?

- When data are not available year-round
- When survey data gets interrupted (like during a pandemic!)
- When used as one of several sources of information in decision-making
- When forecasting is needed

## Thank you!

**Special thanks to:** Co-authors, CINMS staff, Benioff Ocean Initiative

#### **Resources & Related Products**

www.coastwatch.pfeg.noaa.gov/projects/whalewatch2/ www.coastwatch.pfeg.noaa.gov/ecocast/ Hazen et al. 2018, Science Advances

Abrahms et al. 2019, Divers. & Distr.











**Contact:** Briana Abrahms, abrahms@uw.edu

