

# **Evaluating Species-Specific Environmental Suitability for Marine Aquaculture Development Along the U.S. West Coast**





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2025-11-30



Figure 1: Aquaculture Image Sourced from NOAA Fisheries

```
#|label: import-libraries
# Import libraries
library(terra)
library(sf)
library(here)
library(testthat)
library(tmap)
library(kableExtra)
library(tidyverse)
library(dplyr)
```

 README  MIT license  

## Identifying Suitable Marine Aquaculture Areas

This repository contains tools to identify and map suitable areas for marine aquaculture development along the U.S. West Coast. Suitability is determined based on species-specific ranges of sea surface temperature (SST) and ocean depth. The workflow includes a custom function that ingests user-defined environmental thresholds and produces a map of suitable area across Exclusive Economic Zone (EEZ) regions.

### Table of Contents

- [Overview](#)
- [Repository Structure](#)
- [Installation](#)
- [Usage](#)
- [Contributors](#)
- [Acknowledgements](#)
- [License](#)

### Overview

This project evaluates which U.S. West Coast EEZ regions are most suitable for marine aquaculture, focusing on several oyster species and one species of choice. Suitability is calculated by filtering SST and depth rasters based on user-defined ranges. A generalizable function is provided that:

- Accepts minimum/maximum SST, minimum/maximum depth, and a species name
- Calculates the suitable area within each EEZ
- Outputs a map with EEZ regions colored by the proportion of suitable habitat
- Automatically incorporates the species name into the title

This workflow supports reproducible spatial analysis and species-specific suitability assessments for aquaculture planning.

## Repository Structure

```

aquaculture-suitability-model
├── .gitignore
├── .Rhistory
├── aquaculture-suitability-model.Rproj
├── aquaculture-suitability-workflow.pdf
├── aquaculture-suitability-workflow.qmd
├── LICENSE
├── README.md
├──
└── data
    ├── average_annual_sst_2008.tif
    ├── average_annual_sst_2009.tif
    ├── average_annual_sst_2010.tif
    ├── average_annual_sst_2011.tif
    ├── average_annual_sst_2012.tif
    ├── depth.tif
    └── wc_regions_clean.dbf
  
```



```
wc_regions_clean.prj
wc_regions_clean.shp
wc_regions_clean.shx

figures
oyster_map.pdf
scallop_map.pdf

R
suitability_function.R
```

## Installation

Clone the repository and install any required R packages:

```
git clone https://github.com/mmorenorolon/aquaculture-suitability-model.git
cd aquaculture-suitability-model
```

In R:

```
install.packages(c("tidyverse", "sf", "terra", "tmap", "kableExtra", "here", "dplyr", "testthat"))
```

## Usage

To run the project, source the main script and call the suitability function:

```
# Example:
source("R/suitability_function.R")

result <- map_suitability(
  tmin = 11,
  tmax = 30,
  dmin = -70,
  dmax = 0,
  species_name = "Oyster"
)

# Outputs
result$map      # tmap object of suitable areas
result$table    # formatted suitability table
```

This returns a mapped object showing suitable EEZ areas for the specified species with its corresponding summary table.

## Data Access

Environmental datasets (SST and depth) and EEZ shapefiles must be downloaded separately or placed in the `data/` directory.

### NOAA Sea Surface Temperature (SST)

National Oceanic and Atmospheric Administration (NOAA). 2024. 5km Daily Global Satellite Sea Surface Temperature Anomaly v3.1. Coral Reef Watch Program. Average annual SST rasters for 2008–2012 were used in this analysis. Data files: `average_annual_sst_2008.tif`, `average_annual_sst_2009.tif`, `average_annual_sst_2010.tif`, `average_annual_sst_2011.tif`, `average_annual_sst_2012.tif`. Available at:

<https://coralreefwatch.noaa.gov/product/5km/>

### GEBCO Bathymetry

General Bathymetric Chart of the Oceans (GEBCO). 2023. GEBCO Compilation Group: GEBCO 2023 Grid. British Oceanographic Data Centre. Data file: `depth.tif`. Available at: <https://www.gebco.net/>

### Exclusive Economic Zones (EEZ)

Flanders Marine Institute (VLIZ). 2023. Maritime Boundaries Geodatabase: Exclusive Economic Zones (EEZ), version 12. MarineRegions.org. Data file: `wc_regions_clean.shp`. Available at: <https://www.marineregions.org/>

Ensure file paths in the scripts match your local structure.

## Contributors

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Melannie Moreno Rolón

## Acknowledgements

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This project was completed as part of the Environmental Data Science curriculum at UC Santa Barbara. SST, depth, and EEZ datasets were provided through course materials. Thanks to instructors and TAs for guidance on spatial analysis in R.

## License

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This repository is distributed under the MIT License.

## Introduction

As the global population continues to rise, so does the pressure on wild fisheries to meet growing seafood demand. Marine aquaculture offers a promising solution, providing a sustainable alternative that can relieve pressure on wild stocks while supporting economic development. According to Gentry et al. (2017), the availability of suitable ocean space is unlikely to limit the expansion of marine aquaculture, indicating that many regions have the physical capacity to support future growth. This presents an important opportunity for countries such as the United States to develop aquaculture systems that meet both economic and environmental objectives.

Identifying where aquaculture can be responsibly developed requires evaluating the environmental conditions that support healthy growth and minimize ecological impacts. This project assesses the suitability of West Coast Exclusive Economic Zones (EEZ) for marine aquaculture using two key environmental constraints: sea surface temperature (SST) and bathymetry. Using satellite-derived SST data from 2008–2012 and a regional bathymetry dataset, the total area

within each EEZ that meets species-specific environmental thresholds can be quantified. The analysis focuses on two groups: oysters, which are already widely cultivated in California, and the Purple Hinged Rock Scallop (*Crassadoma gigantea*), a giant scallop species with emerging aquaculture potential (Culver et al., 2022). By integrating spatial environmental data with habitat requirements, this project identifies where conditions are most favorable for expanding sustainable marine aquaculture along the U.S. West Coast.

## Methods

To assess aquaculture suitability along the U.S. West Coast, a generalized function was implemented that automates the processing of sea surface temperature (SST), bathymetry, and EEZ boundary data. Depth requirements for the purple-hinged rock scallop (*Crassadoma gigantea*) were obtained from SeaLifeBase, which reports an ecological depth range of 0–80 m below sea level (b.s.l.) (University of British Columbia, 2025; Harbo, 1997). Thermal tolerance data for this species are not provided in SeaLifeBase, so temperature thresholds were derived from Reef Life Survey observations, which indicate a temperature range of approximately 13.3–22.1 degrees Celsius (Schmid, 2025). In addition, suitability thresholds for oysters were incorporated based on published ecological ranges, with optimal SST values between 11–30 degrees Celsius and depth values between 0 and 70 meters b.s.l. These values were used to define species-specific suitability thresholds for reclassification of SST and bathymetry data. The workflow consisted of four phases.

### 1. Sea Surface Temperature Processing

Daily 5-km SST averages from 2008–2012 were compiled and converted into a single long-term mean SST raster. The datasets were first stacked and then averaged by pixel. SST values, originally in Kelvin, were converted to degrees Celsius.

### 2. Bathymetry Processing

A regional depth raster was reprojected to match the SST coordinate reference system (CRS). The bathymetry was cropped to the spatial extent of the SST data and resampled to its resolution to maintain consistency and cell alignment between rasters.

### 3. Environmental Suitability Classification

Species-specific temperature and depth constraints were translated into binary suitability surfaces. For the purple-hinged rock scallop (*Crassadoma gigantea*), SST values between 13.3–22.1 Celsius and depths between 0–80 meters b.s.l. were classified as suitable (value = 1), with all other values set to unsuitable (value = 0). In contrast, for oysters, suitability was defined by a broader SST range of 11–30 Celsius and shallower depths between 0 and 70 meters b.s.l. Separate binary rasters were generated for each species, and suitability layers were multiplied to produce combined indices identifying locations that simultaneously satisfied both environmental conditions.



#### **4. Suitability Estimation at the EEZ Level**

Exclusive Economic Zone (EEZ) boundaries were transformed to match the SST projection. The combined suitability raster was masked to the extent of each EEZ, and the area of each raster cell was computed in square kilometers. Suitable cell areas were aggregated within each EEZ to obtain total suitable area per region. These results were subsequently merged with the EEZ polygon dataset and visualized using a colorblind-friendly continuous color scale.

## Data Analysis

The workflow was applied for the oysters and using their ecological parameters to demonstrate the process before generalizing it.

```
#|label: oyster-analysis
# Load and process SST
SST_2008 <- rast(here('data', 'average_annual_sst_2008.tif'))
SST_2009 <- rast(here('data', 'average_annual_sst_2009.tif'))
SST_2010 <- rast(here('data', 'average_annual_sst_2010.tif'))
SST_2011 <- rast(here('data', 'average_annual_sst_2011.tif'))
SST_2012 <- rast(here('data', 'average_annual_sst_2012.tif'))

# Check that all SST rasters share the same CRS
if (crs(SST_2008) == crs(SST_2009) &
    crs(SST_2009) == crs(SST_2010) &
    crs(SST_2010) == crs(SST_2011) &
    crs(SST_2011) == crs(SST_2012)) {
  print("All coordinate reference systems match!")
} else {
  warning("Coordinate reference systems do not match!")
}

# Stack SST rasters (2008-2012)

sst_stack <- c(SST_2008, SST_2009, SST_2010, SST_2011, SST_2012)

# Check that rasters were stacked successfully
if (!nlyr(sst_stack) > 0) {
  message("SST stack failed: no raster layers detected.")
  stop("Halting execution.")
}

# Compute mean SST over time (per pixel)

mean_sst <- terra::mean(sst_stack)

# Convert temperature units from Kelvin to Celsius

mean_sst_c <- mean_sst - 273.15

# Prepare bathymetry (depth) raster
```

```

# Load the bathymetry raster
bathy <- rast(here("data", "depth.tif"))

# Make CRS match SST:

bathy_proj <- project(bathy, crs(mean_sst_c))

# Check that the re-projection of the depth raster was successful
test_that("Bathymetry CRS matches SST CRS after projection", {
  expect_identical(crs(bathy_proj), crs(mean_sst_c))
})

# Crop bathymetry to SST's extent

bathy_crop <- crop(bathy_proj, mean_sst_c)

# Check resolution of depth vs sst data
if (xres(bathy_crop) == xres(mean_sst_c) &
    (yres(bathy_crop) == yres(mean_sst_c))) {
  print("Raster resolutions match!")
} else {
  warning("Raster resolutions do not match.")
}

```

Warning: Raster resolutions do not match.

```

# Resample bathymetry to SST resolution (so each cell lines up):

depth_res <- resample(bathy_crop, mean_sst_c, method = "near")

# Check that the depth and SST match in resolution
test_that("Depth raster was resampled to match SST resolution", {
  expect_equal(res(depth_res), res(mean_sst_c))
})

#.....
#
# Find Suitable Locations
#
#.....

```

```

# Reclassify SST into suitable / unsuitable
# The oyster thresholds for SST are between 11-30 Celsius

sst_rcl <- matrix(c(-Inf, 11, 0,
                    11, 30, 1,
                    30, Inf, 0), ncol = 3, byrow = TRUE)

sst_suit <- classify(mean_sst_c, rcl = sst_rcl)

# Reclassify depth into suitable or unsuitable (1, 0)
# The depth thresholds for oysters range is 0-70 meters b.s.l.

depth_rcl <- matrix(c(-Inf, -70, 0,
                      -70, 0, 1,
                      0, Inf, 0), ncol = 3, byrow = TRUE)

depth_suit <- classify(depth_res, depth_rcl)

# Combine SST and depth suitability

# Unit test for sst and depth CRS
test_that("Reclassified rasters share identical CRS", {
  expect_identical(crs(sst_suit), crs(depth_suit))
})

# Multiply to get 1 only where both are suitable
suitability <- sst_suit * depth_suit # 1 = suitable, 0 = unsuitable

# Prepare EEZ vector and mask
eez_sf <- st_read(here("data", "wc_regions_clean.shp"), quiet = TRUE)

# convert to SpatVector format
eez <- vect(eez_sf)

# Re-project with mean sst's CRS
eez_proj <- project(eez, mean_sst_c)

# Check that the re-projection of the EEZ shapefile was successful
test_that("Bathymetry CRS matches SST CRS after projection", {
  expect_identical(crs(eez_proj), crs(mean_sst_c))
})

```

```

})

# Mask suitability by EEZ
suitability_eez <- mask(suitability, ee_z_proj)

# Count suitable cells per EEZ

# a. Compute area in squared kilometers of each raster cell
cell_area_km <- cellSize(suitability_eez, unit = "km")

# b. Multiply suitability (0/1) by area to get "suitable area per cell"
suitable_area_raster <- suitability_eez * cell_area_km
# Cells that were 1 now contain area in km2
# Cells that were 0 remain 0

# c. Extract total suitable area (km2) for each EEZ polygon
eez_suitable_area <- terra::extract(suitable_area_raster,
                                   ee_z_proj,
                                   fun = sum,
                                   na.rm = TRUE)

# d. Add the EEZ region names to the output
# Replace "region" with the correct column name from your EEZ shapefile
eez_suitable_area$region <- ee_z_proj$rgn

# Rename the "mean" column
names(eez_suitable_area)[2] <- "suitable_km2"

# Format the table for EEZ suitable area totals
eez_suitable_area_table <- ee_z_suitable_area %>%
  select(region, suitable_km2) %>%
  kable(col.names = c("EEZ Region", "Suitable Area (km2)"),
        caption = "Total Suitable Area by EEZ Region",
        align = "lr", digits = 1) %>%
  kable_styling(
    full_width = FALSE,
    bootstrap_options = c("striped", "hover"))

# Merge table back into EEZ SpatVector
eez_map <- ee_z_proj
eez_map$suitable_km2 <- ee_z_suitable_area$suitable_km2

```

```

# Create the final map
map_final <- tm_basemap("Esri.OceanBasemap") +

  tm_shape(eez_map) +

  tm_polygons(fill = "suitable_km2",
              fill.scale = tm_scale_intervals(values = "brewer.blues",
                                              style = "quantile"),
              fill.legend = tm_legend(bg.color = "white",
                                      bg.alpha = 0.2,
                                      title = "Suitable Area (km2)",
                                      frame = FALSE,
                                      position = tm_pos_in("right", "top")),
              col = "black",
              lwd = 0.2) +

  tm_text("rgn", col = "black", fontface = "bold", size = 0.7) +

  tm_title(size = 1,
           text = "Suitable Area for Oyster Aquaculture in West Coast EEZ") +

  tm_layout(frame = TRUE, frame.lwd = 0.4, frame.r = 0) +

  tm_scalebar(breaks = c(0, 250, 500),
              position = tm_pos_in("left", "bottom")) +

  tm_compass(type = "arrow", position = tm_pos_in("left", "top")) +

  tmap_options(component.autoscale = FALSE)

```

To avoid repeating the oyster workflow for each species, we implemented a generalized function that accepts species-specific parameters.

```

#|label: oyster-function
source("R/suitability_function.R")

oyster_results <- map_suitability(tmin = 11, tmax = 30,
                                dmin = -70, dmax = 0,
                                species_name = "Oysters")

```

We then tested the function with scallop parameters to confirm that the function can be applied to any species of interest and their ecological parameters.

```
#|label: scallop-function
scallop_results <- map_suitability(tmin = 13.3, tmax = 22.1,
                                   dmin = -80, dmax = 0,
                                   species_name = "Purple-Hinged Rock Scallops")
```

## Results

The resulting suitability maps and EEZ-level summaries for oysters and scallops are shown below.



Suitable Area for Oysters  
Aquaculture in West Coast EEZ

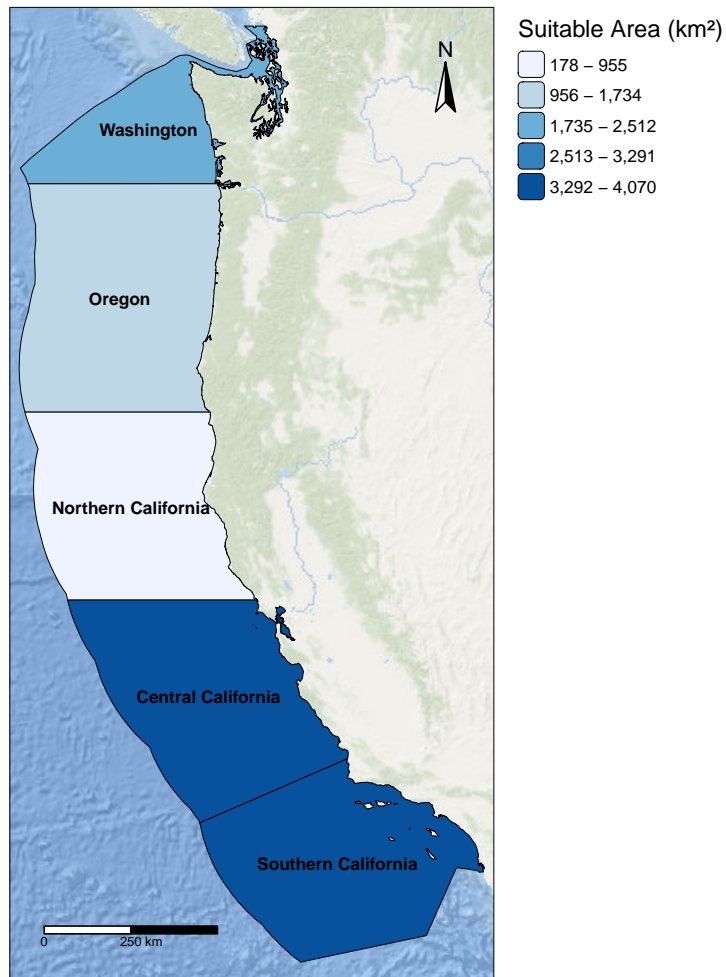


Figure 2: Oyster Suitability Map

Suitable Area for Purple-Hinged Rock Scallops  
Aquaculture in West Coast EEZ

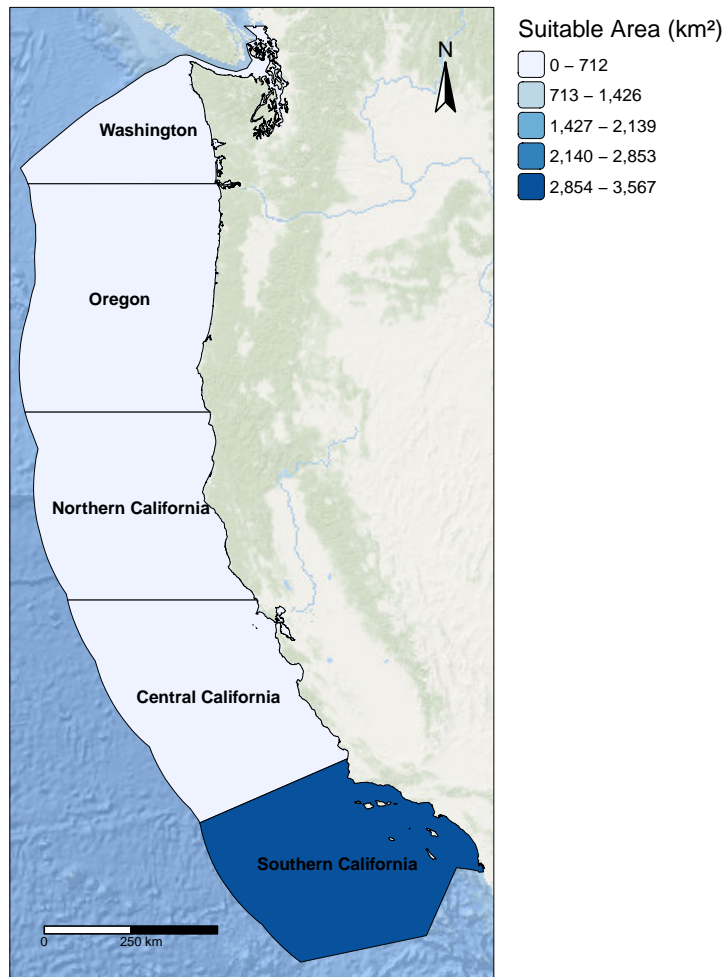


Figure 3: Scallop Suitability Map

Table 1: Total Suitable Area for Oysters by EEZ Region

EEZ Region	Suitable Area (km <sup>2</sup> )
Oregon	1074.3
Northern California	178.0
Central California	4069.9
Southern California	3757.3
Washington	2378.3

Table 2: Total Suitable Area for Purple-Hinged Rock Scallops by EEZ Region

EEZ Region	Suitable Area (km <sup>2</sup> )
Oregon	0.0
Northern California	0.0
Central California	118.8
Southern California	3567.3
Washington	0.0

The analysis identified stark differences in the amount of environmentally suitable area for aquaculture across West Coast EEZ regions. For oysters, Central California and Southern California contained the largest suitable areas, with approximately 4,070 squared km and 3,757 squared km respectively, followed by Washington (2,378 squared km) and Oregon (1,074 squared km). Northern California showed a more limited suitable habitat (178 squared km). In contrast, suitable areas for purple-hinged rock scallops were highly concentrated in the southern portion of the study region. Southern California accounted for nearly all suitable habitat (3,567 squared km), with a small area in Central California (119 km<sup>2</sup>), while Oregon, Washington, and Northern California contained no suitable area based on the species' temperature and depth thresholds.

## Discussion

The results highlight the clear spatial differences in aquaculture suitability driven by environmental constraints associated with sea surface temperature and bathymetry. Oyster suitability was broadly distributed across the West Coast, with the greatest concentrations being in Central and Southern California. These regions offer both the depth and thermal ranges that align with oyster tolerance. These thresholds resulted in several thousand square kilometers of potentially viable habitat. Washington and Oregon also contained meaningful amounts of suitable area, although to a lesser extent. The distribution pattern suggests that oyster aquaculture has relatively flexible environmental requirements within this coastline. This finding indicates that aquaculture suitability for oysters spans across multiple EEZs.

In contrast, the distribution of suitable habitat for purple-hinged rock scallops was comparatively restricted. Southern California dominated the available area, as it contributed to nearly all suitable habitat identified in the study, with only a small area in Central California meeting threshold conditions. The absence of suitable areas in Oregon, Washington, and Northern California indicates that the species' temperature range limits its potential along the cooler northern waters. These results align with the species' known geographic distribution, as purple-hinged rock scallops are more frequently associated with subtidal, subtropical environments (Culver et al., 2022).

The stark contrast between the two species underscores the importance of evaluating on a species-specific level and considering their environmental thresholds when evaluating aquaculture potential. While oysters demonstrate broad tolerance across the West Coast, the purple-hinged rock scallop is limited to a much smaller geographic range despite being a native species. From a planning perspective, this means that opportunities to expand scallop aquaculture are highly geographically concentrated, while oyster aquaculture can be distributed more widely. Further research is needed to translate these metrics into practical site selection, like evaluating regulatory conditions, ecological interactions, and infrastructure considerations.

## References

- Culver, C., Jackson, M., Davis, J., Vadopalas, B., Bills, M., Olin, P., & CENTER, W. R. A. (2022). Advances in purple-hinge rock scallop culture on the US West Coast. *Western Regional Aquaculture Center. United States Department of Agriculture, National Institute of Food and Agriculture*.
- Gentry, R. R., Froehlich, H. E., Grimm D., Kareiva, P., Parke, M., Rust, M., Gaines, S. D., & Halpern, B. S.(2017). Mapping the global potential for marine aquaculture. *Nature ecology & evolution*, 1(9), 1317-1324.
- Harbo, R. M. (1997). *Shells & shellfish of the Pacific northwest: a field guide*. Madiera Park, BC: Harbour Publishing.
- Schmid, J. (2025). *Crassadoma gigantea*. Retrieved November 30, 2025, from Reef Species of the World website: <https://reeflifesurvey.com/species/crassadoma-gigantea/>
- University of British Columbia. (2025). *Crassadoma gigantea*, Giant rock-scallop : fisheries. Retrieved November 30, 2025, from Sealifebase.ca website: <https://www.sealifebase.ca/summary/SpeciesSummary.php?id=47314&lang=english>

## Data Citations

### NOAA Sea Surface Temperature (SST)

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