

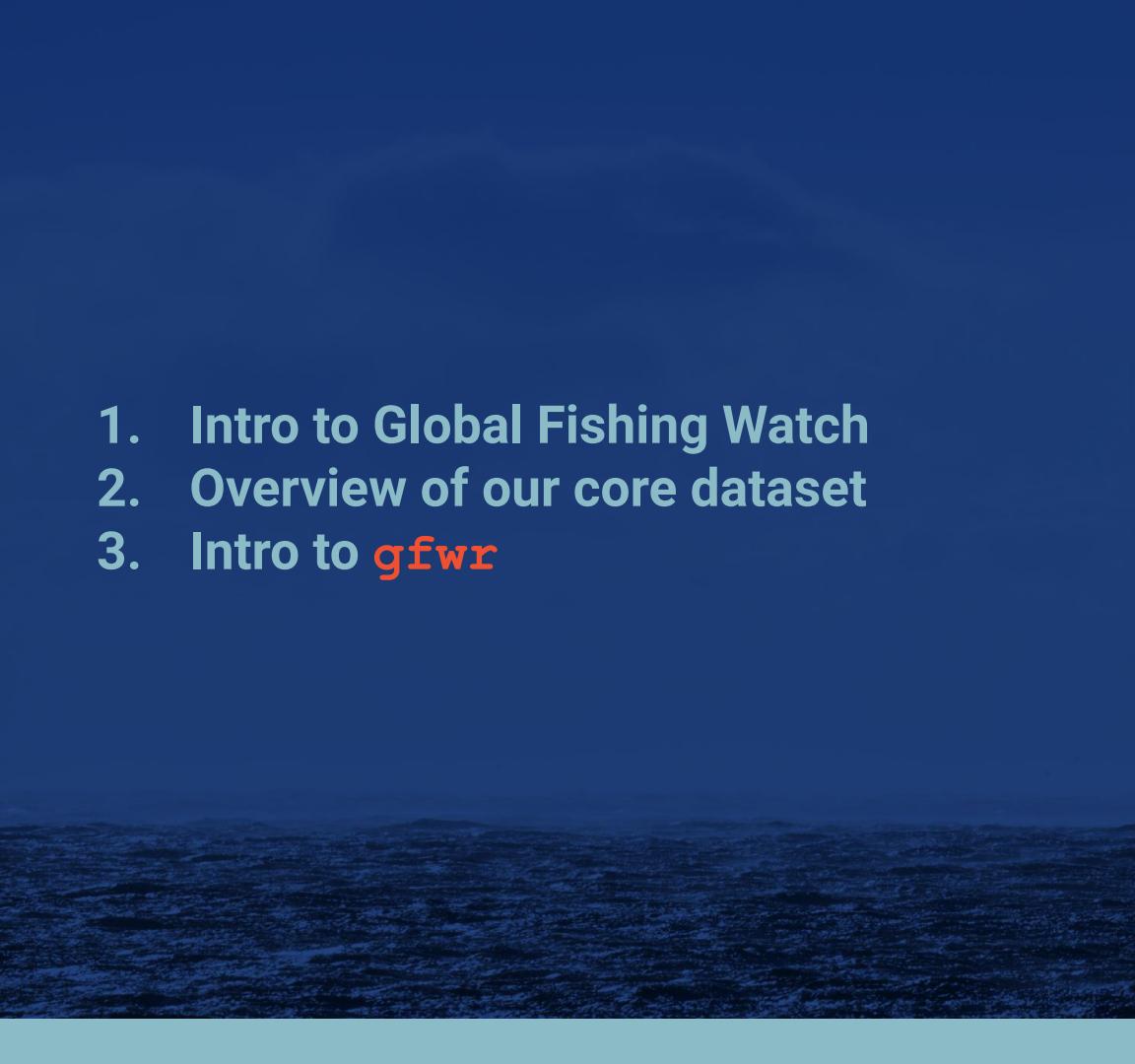
# Global Fishing Watch::gfwr

**Open data and tools for a sustainable  
ocean**

May 16th, 2023  
CorrelAid

Tyler Clavelle, Senior Data Scientist



- 
1. Intro to Global Fishing Watch
  2. Overview of our core dataset
  3. Intro to **gfwr**





Founded in 2015 as a collaboration between Google, Oceana, and SkyTruth

Established as an independent 501c3 international nonprofit in 2017

Largely grant funded by philanthropic foundations active in ocean conservation, with a small amount of government funding.

# Vision

Healthy, productive and resilient oceans where transparent and effective governance of marine resources supports biodiversity and sustainable development.



Global Fishing Watch

# Our team

**75+ GFW Staff**  
**20+ Countries**



# Mission

We advance ocean governance through increased transparency of human activity at sea.

By creating and publicly sharing map visualizations, data and analysis tools, we enable scientific research and drive a transformation in how we manage our ocean.



Global Fishing Watch

# Our Solution :: Open Data

We share our data through different products:

- **API Portal & gfwR**
- **Data Download Portal**
- **Map and Marine Manager Portal**
- **Carrier Vessel Portal**
- **Research and publications**



# GFW Process

Idea or prototype



Research Projects



Products





ACTIVITY

 Apparent fishing effort

SOURCE

AIS

hours / 32,000 km<sup>2</sup>

0 2K 10K 40K ≥80K

 Apparent fishing effort

SOURCE

VMS (9 countries)

hours / 32,000 km<sup>2</sup>

0 2K 10K 40K ≥80K

 Vessel presence

DETECTIONS

 Night light detections (VIIRS) Radar detections (SAR)

VESSELS



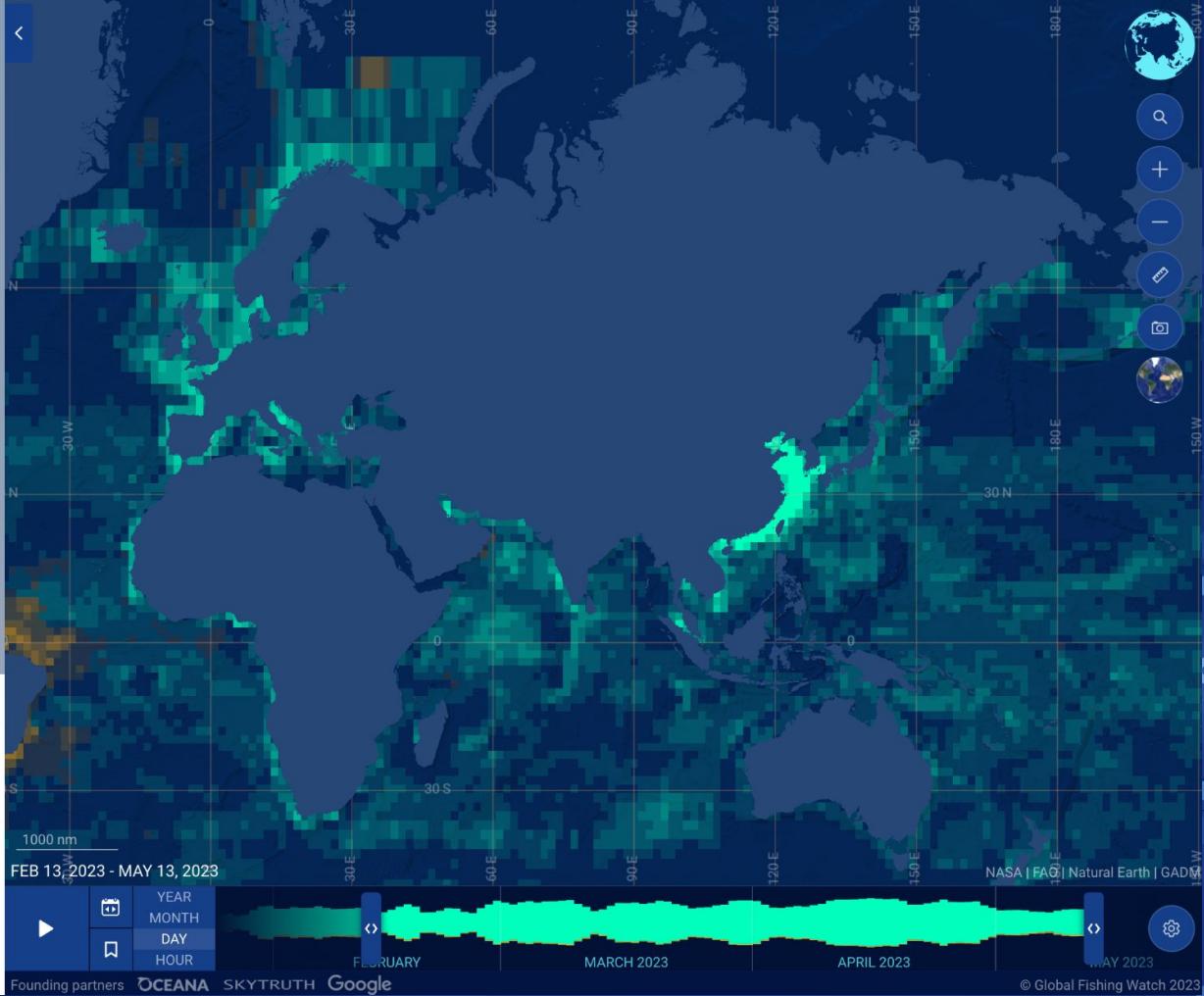
Search for vessels or add them from the map.



EVENTS

 Encounter Events for Carriers-Fishing

ENVIRONMENT



Founding partners

OCEANA

SKYTRUTH

Google

© Global Fishing Watch 2023

# Our tools



## Historic data

Several years of data across all datasets: Fishing effort, encounters between vessels, night-light vessel detections, vessel events and identity.



## Near real-time data

Data published with a 72-hour delay and access to historical vessel tracks and fishing activity back to January 1, 2012.



## Easy to use

Designed so both experts and non-experts can see and assess fishing activity, and track individual vessels over time.



## Accessible and free

Freely available to anyone with an internet connection; easy to access and use, developed to run on mid-level computers and with a low data consumption.



Global Fishing Watch

# API Portal

Our [API Portal](#) provides a new way for partners and stakeholders to access dynamic datasets that are used in all our tools and incorporate them into directly into their own systems, platforms and research— *free for non-commercial use*.

By openly publishing our APIs, we aim to transform global collaboration and catalyze solutions to address the ocean's most complex problems.





Harvesting big data from s...

Data available

Quick Start

Get your GFW Postman col...

Map Visualization - 4Wings ...

Vessels API

Events API

# Introduction

Welcome to the Global Fishing Watch Application Programming Interfaces (API) Documentation site!

Global Fishing Watch has created a technology portal that provides application programming interfaces, or APIs, to revolutionize the way we research and monitor human impacts across the world's ocean.

Our APIs provide software instructions that enable automatic connection of our data and products to other systems so users can easily download and integrate our datasets, code, and models to power their own platforms. By providing streamlined access to information on current fishing vessel activity, identity and history, we are helping create solutions for a resilient, sustainable ocean.

Global Fishing Watch APIs are only available for non-commercial purposes. They are used by researchers, governments and technology companies.

# Open Data to Solve

Our API users represent more than 200 organizations from 67 countries, including 70 universities.



They are exploring new research in biodiversity and ecosystem resilience, fisheries management and technological innovation.

## < Ecosystem & Biodiversity Resilience >

- “Identify patterns in fishing with climate change”
- “Reconstruct shark bycatch”
- “Identify marine debris occurring by fishing”
- “Understand how fishing redistributes following the implementation of MPAs”

## < Fisheries Management >

- “Identify illegal, unreported and unregulated (IUU)”
- “Identify labor exploitation issues”
- “Cross check fishing grounds with official data submissions to tuna regional fisheries management organizations”

## < Innovation >

- “Support natural disaster planning”
- “Incorporate into university curriculum”
- “Teaching web development and data analytics bootcamp”

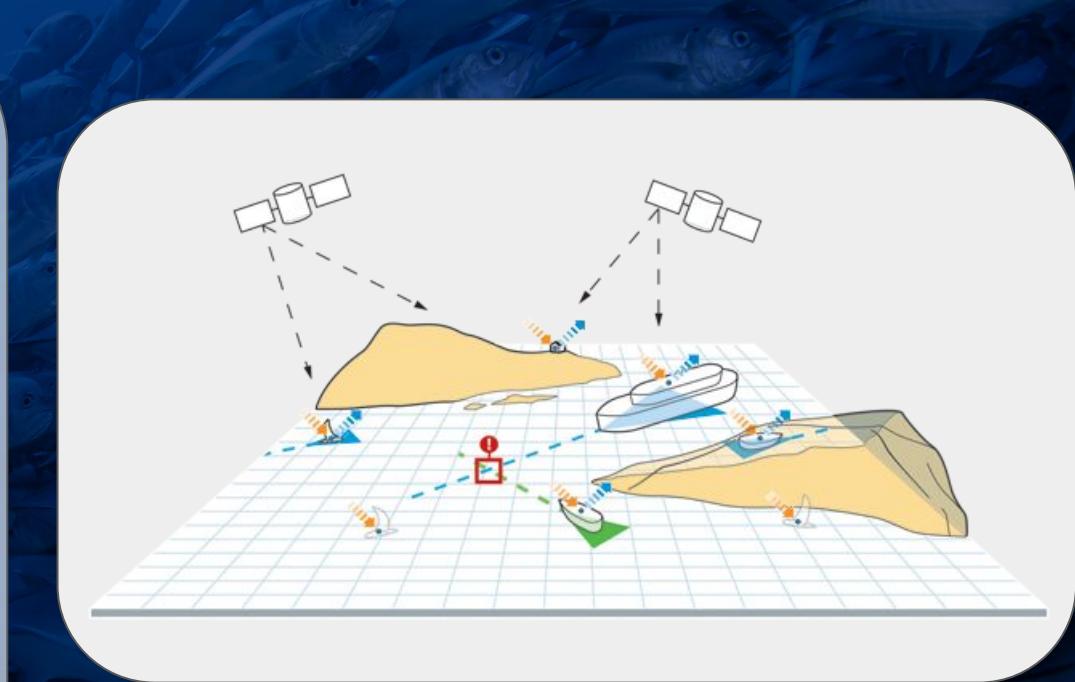


# Automatic Identification System (AIS)

The **automatic identification system (AIS)** is a vessel broadcast technology originally designed for ship-to-ship communication as a collision avoidance system.

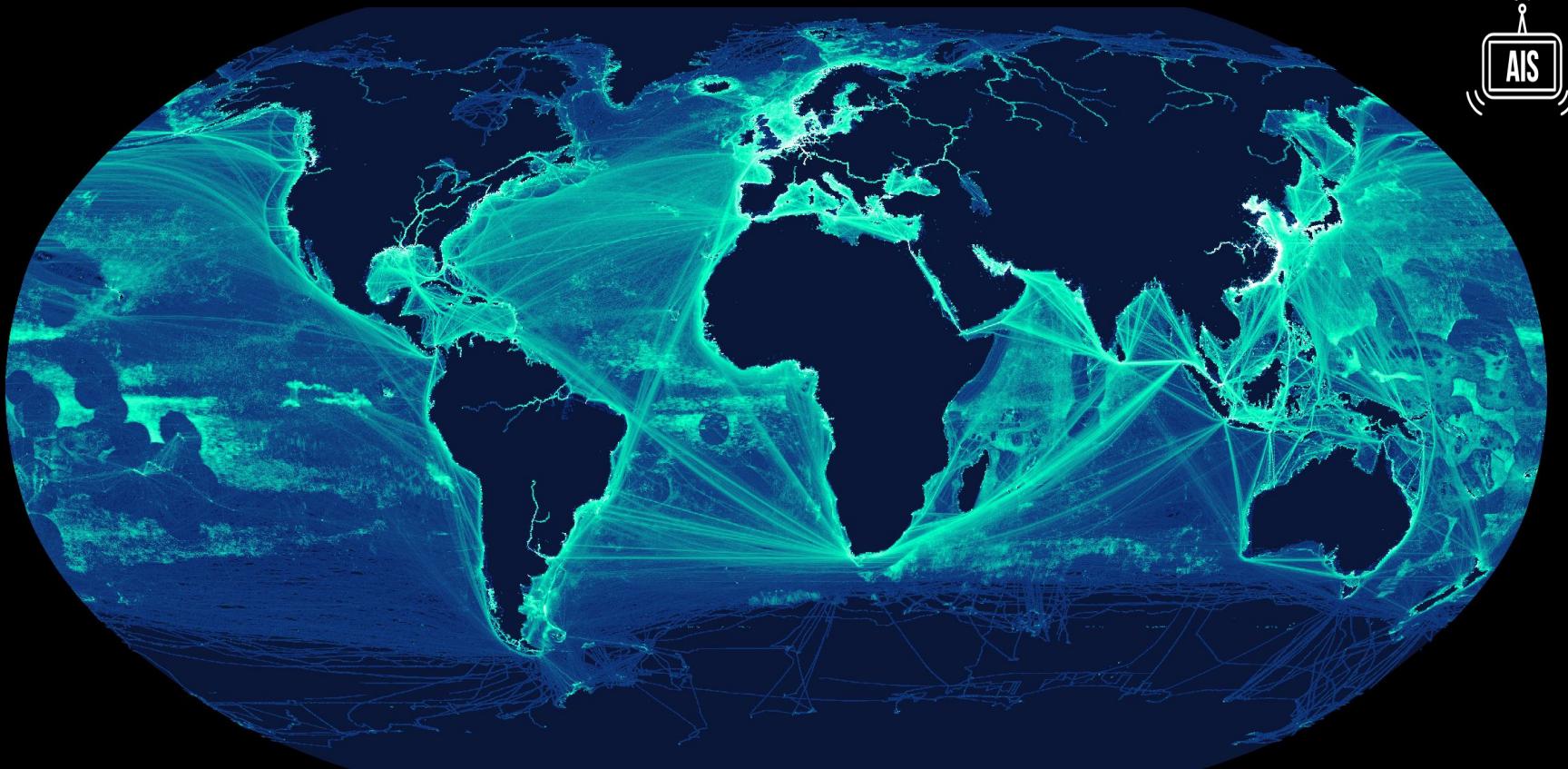
AIS messages transmit a lot of information about a vessel, such as identity, position, and speed.

AIS messages are received by other ships and picked up by terrestrial and satellite receivers.



Global Fishing Watch

# Vessels with AIS, 2018



Hours of vessel presence per 100 km<sup>2</sup>



Global Fishing Watch

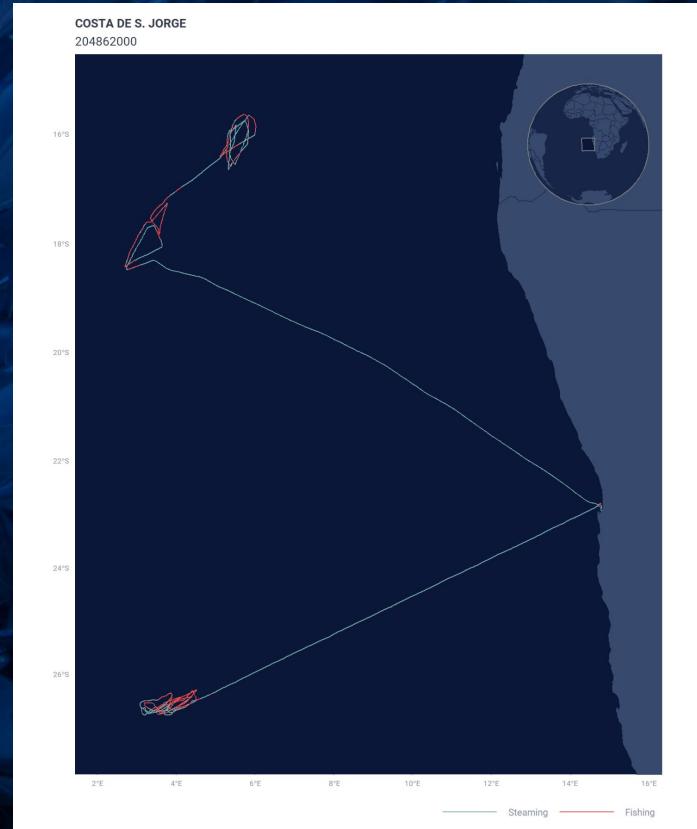


# Fishing effort and vessel presence

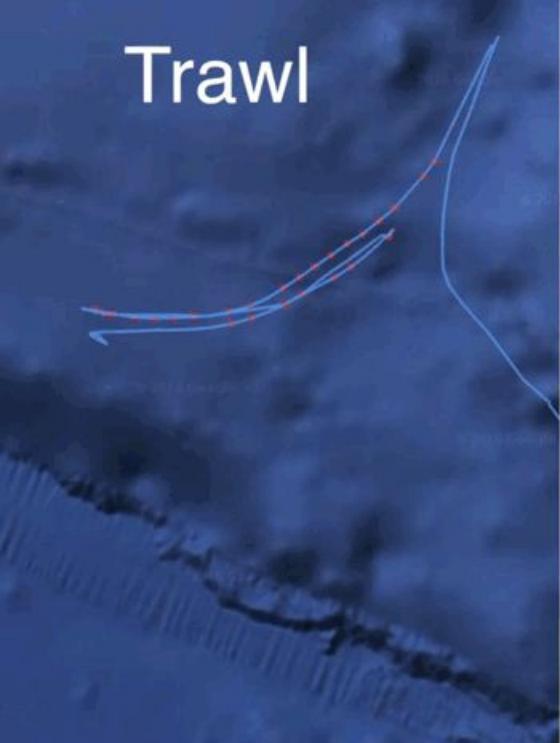
GFW identifies and classifies vessel presence and apparent fishing activity in the AIS data based on vessel movement by combining two convolutional neural network models.

A **vessel classification model** looks at all the AIS positions for a vessel and predicts the most likely vessel class (fishing or non-fishing) for that vessel. Information from vessel registries are also incorporated.

A (general) **fishing detection model** scores every AIS position as fishing, not fishing, or unknown.



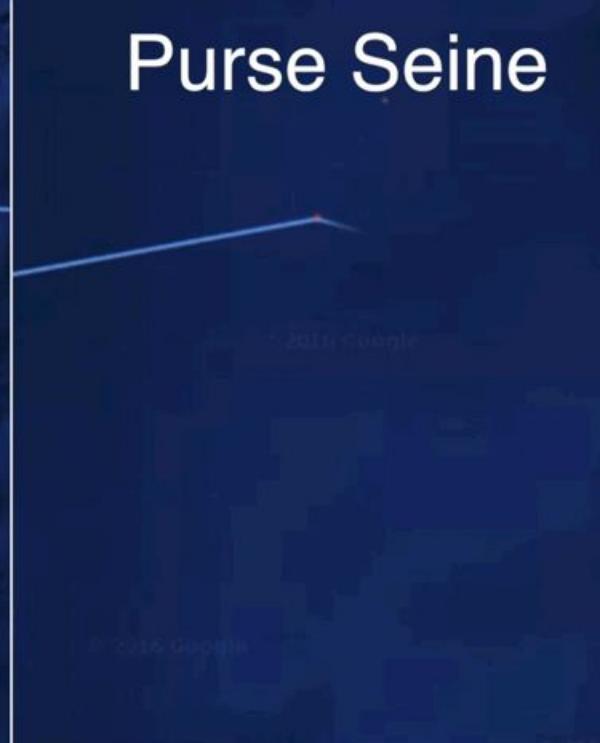
# Trawl



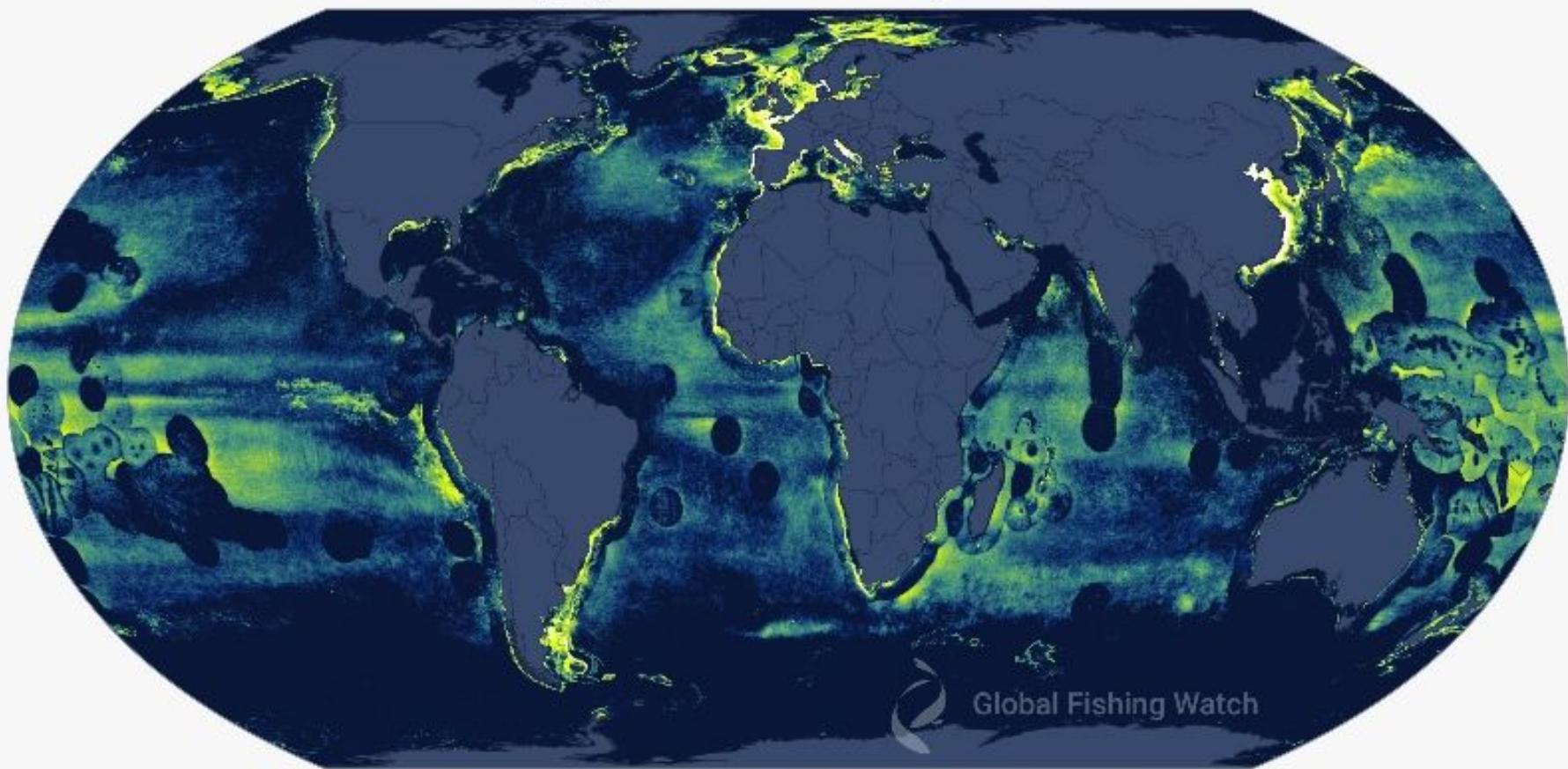
# Longline



# Purse Seine



# Fishing by Vessels with AIS, 2012-2020



hours of fishing per km<sup>2</sup>



# R Package :: `gfwr`

The `gfwr` package provides convenient R functions to freely pull data from the GFW APIs.

Designed to allow researchers and other users with no API experience to work with data made accessible via the GFW APIs.

Will be periodically updated to incorporate new API endpoints and user feedback.

Open source and publicly available at:  
<https://github.com/GlobalFishingWatch/gfwr>



# R Package :: `gfwr`

The `gfwr` package currently works with the following GFW APIs:



## Vessels

Vessel identity details based on AIS self-reported data and GFW models. Basic and advanced search modes.



## Events

Vessel-level events for specific activities, such as fishing, port visits, and transshipment. Filter by date range and vessel.



## Map Visualization (4Wings)

Gridded apparent fishing effort (e.g. rasters) based on AIS data. Multiple filtering and grouping options.



# Installation :: gfwr



You can install the development version of `gfwr` like so:

```
devtools::install_github("GlobalFishingWatch/gfwr")
```

Once everything is installed, you can load and use `gfwr` in your scripts with `library(gfwr)`

```
library(gfwr)
```

# Authorization :: `gfwr`



The use of `gfwr` requires a GFW API token, which users can request from the [GFW API Portal](#). Save this token to your `.Renviron` file (using `usethis::edit_r_environ()`) by adding a variable named `GFW_TOKEN` to the file (`GFW_TOKEN = "PASTE_YOUR_TOKEN_HERE"`). Save the `.Renviron` file and restart the R session to make the edit effective.

Then use the `gfw_auth` helper function to save the information to an object in your R workspace every time you need to extract the token and pass it to subsequent `gfwr` functions.

So you can do:

```
key <- gfw_auth()
```

# Vessels API :: gfwr

```
get_vessel_info(query = 224224000,
                 search_type = "basic",
                 dataset = "all",
                 key = key)
#> # A tibble: 1 × 17
#>   name callsign first...¹ flag  geart...² id     imo    lastT...³ mmsi  msgCo...⁴ posCo...⁵
#>   <int> <chr>    <chr> <chr> <lgl> <chr> <chr> <chr> <chr> <int> <int>
#> 1     1 EBSJ    2015-1... ESP    NA      3c99... 8733... 2019-1... 2242... 1887249 73677
#> # ... with 6 more variables: shipname <chr>, source <chr>, vesselType <chr>,
#> #   years <list>, dataset <chr>, score <dbl>, and abbreviated variable names
#> #   ¹firstTransmissionDate, ²geartype, ³lastTransmissionDate, ⁴msgCount,
#> #   ⁵posCount
```

To combine different fields and do fuzzy matching to search the `carrier_vessel` dataset:

```
get_vessel_info(query = "shipname LIKE '%GABU REEFE%' OR imo = '8300949'",
                 search_type = "advanced", dataset = "carrier_vessel", key = key)
```



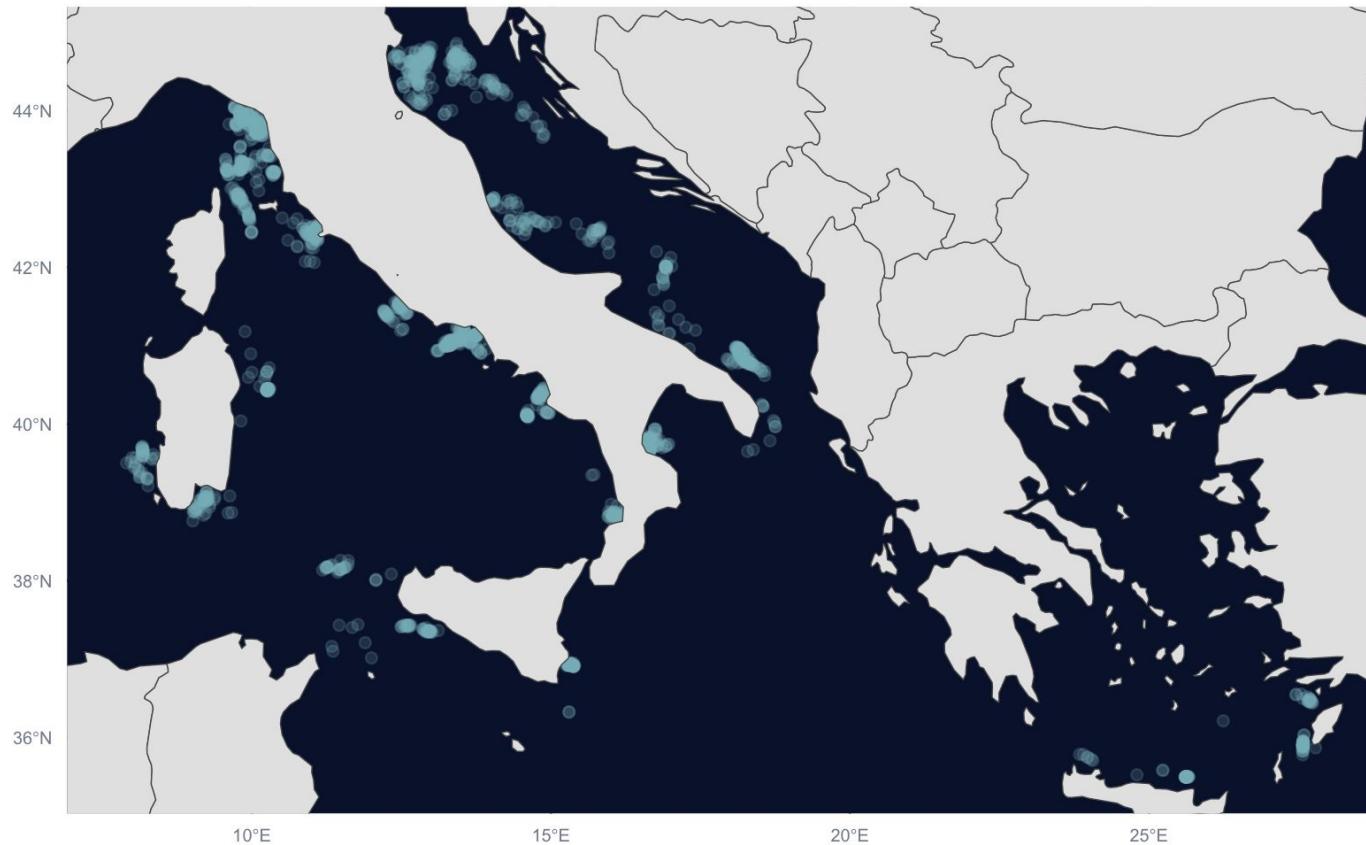
# Events API :: gfwr

```
get_event(event_type='fishing',
          vessel = usa_trawler_ids,
          start_date = "2020-01-01",
          end_date = "2020-02-01",
          key = key
        )
#> [1] "Downloading 2 events from GFW"
#> # A tibble: 2 × 11
#>   id      type    start              end                  lat    lon regions
#>   <chr>   <chr>   <dttm>            <dttm>            <dbl> <dbl> <list>
#> 1 777fb1... fish... 2020-01-09 23:15:22 2020-01-09 23:52:24  28.1 -94.0 <named list>
#> 2 f19d61... fish... 2020-01-10 12:59:23 2020-01-10 16:55:15  28.1 -93.9 <named list>
#> # ... with 4 more variables: boundingBox <list>, distances <list>, vessel <list>,
#> #   event_info <list>
```



## Fishing events by Italian trawlers

2020-01-01 to 2020-06-01

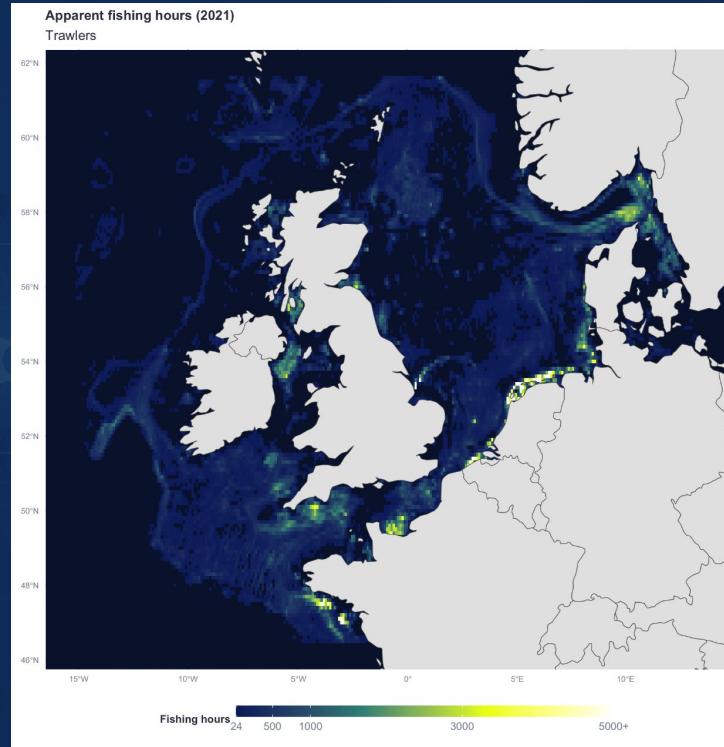


# Map Visualization (4Wings) :: gfwr

The `get_raster()` function gets a dataframe of gridded apparent fishing effort and can be used to make heatmaps like the GFW Map.

Can select data for specific regions using three preset region types (EEZ, MPA, RFMO).

User can also provide their own geojson to download data for a custom region.



# Map Visualization (4Wings) :: gfwr

Multiple arguments are provided for customizing the output of

`get_raster()`:

- `spatial_resolution`: “`low`” (0.1 degree) or “`high`” (0.01 degree)
- `temporal_resolution`: “`daily`”, “`monthly`”, or “`monthly`”
- `group_by`: “`vessel_id`”, “`flag`”, “`gearType`”, or “`flagAndGearType`”
- `date_range`: comma separated string of two dates. Must be one year or less (e.g. “`2021-01-01, 2021-12-31`”)
- `region`: code geographically filter the data. This can be a one of three preset region types or a custom geojson
- `region_source` indicating the type of region (“`eez`”, “`mpa`”, “`rfmo`”, or “`user_json`”)



# Example 1:: gfwr

## Fishing activity within a region

The first example will use one of the preset region options to download and plot fishing activity

To get activity for a specific region, first use the `get_region_id()` function to find the id code of our region of interest.

```
# Use get_region_id function to get EEZ code for Italy
code_eez <- get_region_id(region_name = 'ITA', region_source = 'eez', key = gfw_auth())

#> # A tibble: 1 × 3
#>   id iso3  label
#>   <dbl> <chr> <chr>
#> 1  5682 ITA  Italy
```



# Example 1 :: gfwr

Now we can download fishing activity using `get_raster()`, specifying choices for the remaining options for filtering and grouping the data:

```
# Download data for the Italian EEZ
eez_fish_df <- get_raster(spatial_resolution = 'low',
                           temporal_resolution = 'yearly',
                           group_by = 'flag',
                           date_range = '2021-01-01,2021-10-01',
                           region = code_eez$id,
                           region_source = 'eez')

#> Rows: 5216 Columns: 6
#> — Column specification —
#> Delimiter: ","
#> chr (1): flag
#> dbl (5): Lat, Lon, Time Range, Vessel IDs, Apparent Fishing hours
#>
#> i Use `spec()` to retrieve the full column specification for this data.
#> i Specify the column types or set `show_col_types = FALSE` to quiet this message.
```



# Example 1 :: gfwr

In this example, the `get_raster()` function returns a dataframe with 5,216 rows and six fields. The fields in the response will vary depending on the `group_by` choice.

```
#> # A tibble: 5,216 × 6
#>   Lat   Lon `Time Range` flag `Vessel IDs` `Apparent Fishing hours`
#>   <dbl> <dbl> <dbl> <chr> <dbl> <dbl>
#> 1 37.4  13.1  2021  ITA    87    5071.
#> 2 37.4  13.2  2021  ITA    74    3266.
#> 3 37.2  13.5  2021  ITA    37    905.
#> 4 40.9  17.5  2021  ITA    19    314.
#> 5 35.5  12.6  2021  ITA    41    828.
#> 6 35.4  12.8  2021  ITA    23   1331.
#> 7 37.1  13     2021  ITA    37    629.
#> 8 38.1  11.9  2021  ITA    19    377.
#> 9 40     15.7  2021  ITA    4     37.6
#> 10 39.6  16.7 2021  ITA   11    181.
#> # ... with 5,206 more rows
```



# Example 1 :: **gfwr**

The data includes, for each 10th degree grid cell, the total fishing hours in the Italian EEZ by vessels of different flag states during our date range.

```
#> # A tibble: 5,216 × 6
#>   Lat   Lon `Time Range` flag  `Vessel IDs` `Apparent Fishing hours`
#>   <dbl> <dbl> <dbl> <chr>    <dbl>                <dbl>
#> 1 37.4  13.1  2021 ITA      87                 5071.
#> 2 37.4  13.2  2021 ITA      74                 3266.
#> 3 37.2  13.5  2021 ITA      37                 905.
#> 4 40.9  17.5  2021 ITA      19                 314.
#> 5 35.5  12.6  2021 ITA      41                 828.
#> 6 35.4  12.8  2021 ITA      23                1331.
#> 7 37.1  13     2021 ITA      37                 629.
#> 8 38.1  11.9  2021 ITA      19                 377.
#> 9 40     15.7  2021 ITA      4                  37.6
#> 10 39.6  16.7 2021 ITA      11                 181.
#> # ... with 5,206 more rows
```



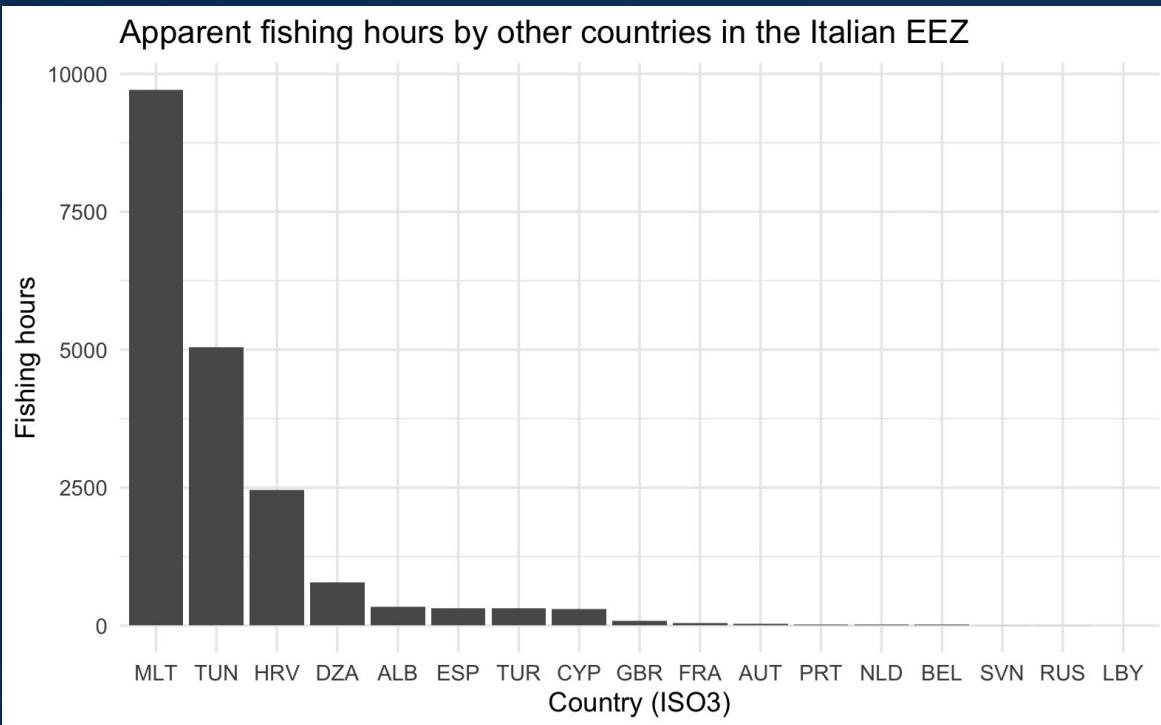
# Example 1 :: **gfwr**

We can summarize the data and see what other flag states do the most fishing activity in the Italian EEZ:

```
eez_fish_df %>%  
  filter(flag != 'ITA') %>%  
  group_by(flag) %>%  
  summarize(fishing_hours = sum(`Apparent Fishing hours`, na.rm = T)) %>%  
  ggplot() +  
  geom_col(aes(x = forcats::fct_reorder(flag, desc(fishing_hours)),  
               y = fishing_hours)) +  
  labs(title = 'Apparent fishing hours by other countries in the Italian EEZ',  
       y = 'Fishing hours',  
       x = 'Country (IS03)') +  
  theme_minimal()
```



# Example 1 :: gfwr



# Example 1 :: gfwr

Because the data includes fishing by all flag states, to make a map of all activity, we first need to summarize activity by grid cell:

```
eez_fish_all_df <- eez_fish_df %>%
  group_by(Lat, Lon) %>%
  summarize(fishing_hours = sum(`Apparent Fishing hours`, na.rm = T))
#> `summarise()` has grouped output by 'Lat'. You can override using the `groups` argument.
```



# Example 1 :: gfwr

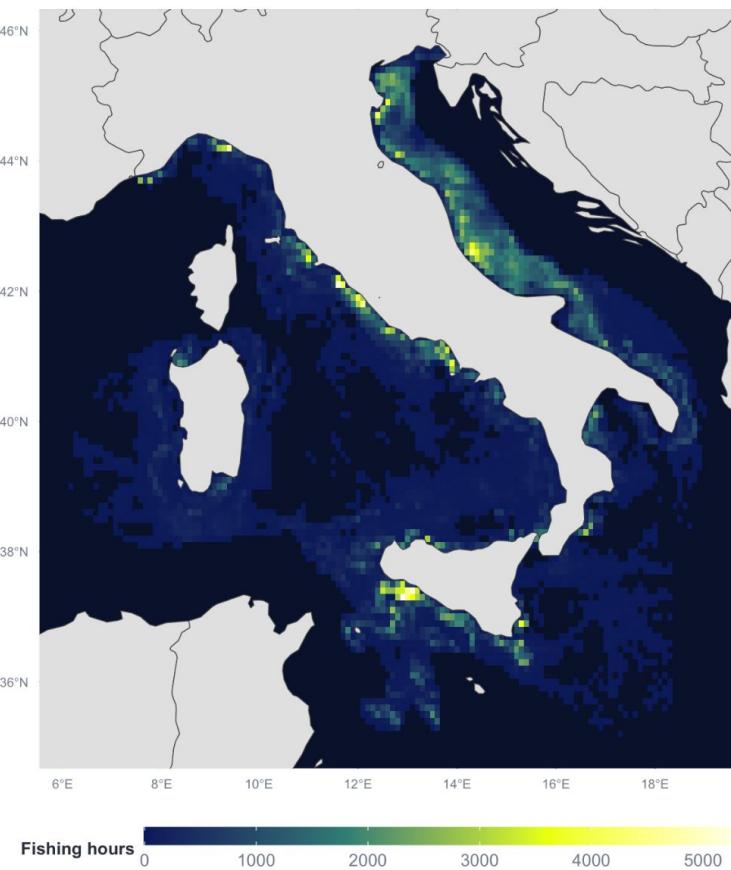
Now we can plot a map of the data with `ggplot2`.

```
eez_fish_all_df %>%
  ggplot() +
  geom_raster(aes(x = Lon,
                  y = Lat,
                  fill = fishing_hours)) +
  geom_sf(data = ne_countries(returnclass = 'sf', scale = 'medium')) +
  coord_sf(xlim = c(min(eez_fish_all_df$Lon),max(eez_fish_all_df$Lon)),
            ylim = c(min(eez_fish_all_df$Lat),max(eez_fish_all_df$Lat))) +
  scale_fill_gradientn(colors = map_effort_dark, na.value = NA) +
  labs(title = 'Apparent fishing hours in the Italian EEZ',
       subtitle = '2021-01-01 to 2021-10-01',
       fill = 'Fishing hours') +
  map_theme
```



### Apparent fishing hours in the Italian EEZ

2021-01-01 to 2021-10-01



gfwr

Global Fishing Watch

# Example 2 :: gfwr

## Fishing activity within a custom region

The second example will download and plot fishing activity using geojson, which allows for downloading activity in a custom region defined by the user

**Note:** The `get_raster()` function does not have a built in method to download global scale data but you can use a geojson to accomplish this

**Tip:** The website <https://boundingbox.klokantech.com/> is a handy resource for creating custom geojson

The geojson should be stored as a string with the following format:

```
'{"geojson": {"type": "Polygon", "coordinates": [insert coordinates] }}'
```



## Example 2 :: gfwr

Define the geojson object and pass it to the `region` argument. Indicate that the `region source = 'user json'`

```
region_json = '{"geojson": {"type": "Polygon", "coordinates": [[[[-15.1296846569, 46.500565613], [13.25831514, 46.500565613], [13.25831514, 46.499565613], [-15.1296846569, 46.499565613], [-15.1296846569, 46.500565613]]]}}
```

```
geojson_df <- get_raster(spatial_resolution = 'low',
                           temporal_resolution = 'yearly',
                           group_by = 'gearType',
                           date_range = '2021-01-01,2021-12-31',
                           region = region_json,
                           region_source = 'user_json')
```

```
#> Rows: 49246 Columns: 6
#> — Column specification —————
#> Delimiter: ","
#> chr (1): geartype
#> dbl (5): Lat, Lon, Time Range, Vessel IDs, Apparent Fishing hours
#>
#> i Use `spec()` to retrieve the full column specification for this data.
#> i Specify the column types or set `show_col_types = FALSE` to quiet this message.
```



# Example 2 :: gfwr

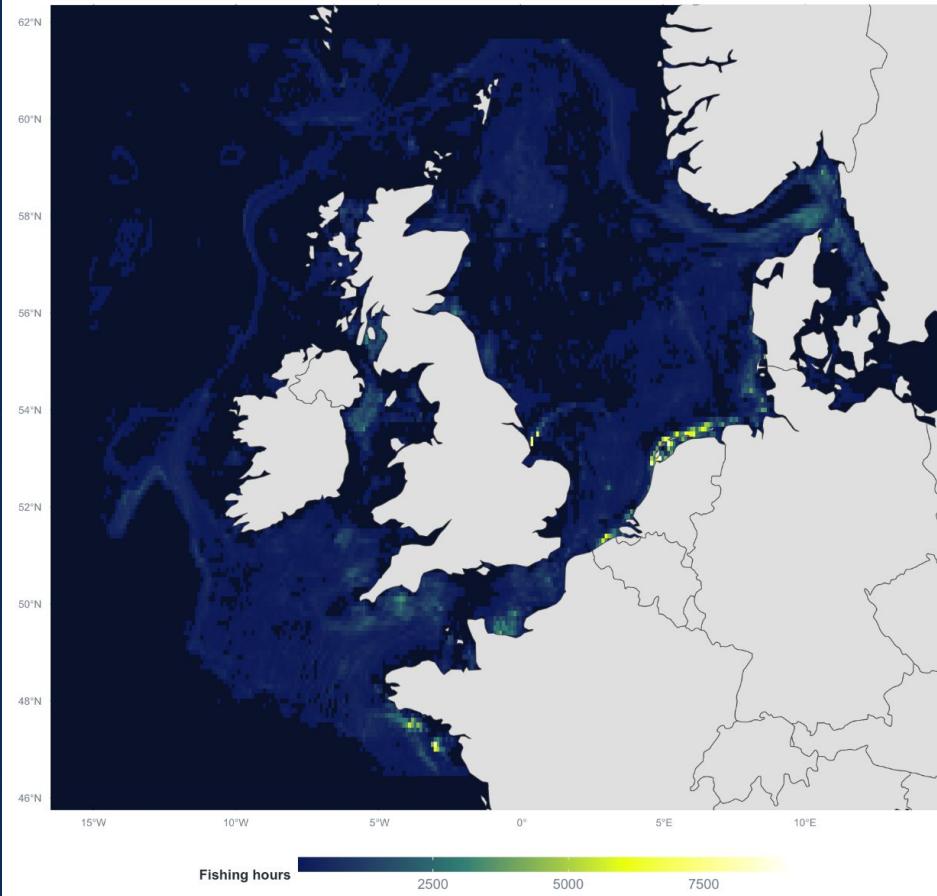
Now let's plot all 2021 fishing activity by trawlers in our custom region, including only cells with at least 24 hours of apparent fishing activity.

```
geojson_df %>%
  filter(geartype == 'trawlers') %>%
  filter(`Apparent Fishing hours` > 24) %>%
  ggplot() +
  geom_raster(aes(x = Lon,
                  y = Lat,
                  fill = `Apparent Fishing hours`)) +
  geom_sf(data = ne_countries(returnclass = 'sf', scale = 'medium')) +
  coord_sf(xlim = c(min(geojson_df$Lon),max(geojson_df$Lon)),
            ylim = c(min(geojson_df$Lat),max(geojson_df$Lat))) +
  scale_fill_gradientn(colors = map_effort_dark, na.value = NA) +
  labs(title = 'Apparent fishing hours (2021)',
       subtitle = 'Trawlers',
       fill = 'Fishing hours') +
  map_theme
```



### Apparent fishing hours (2021)

Trawlers



# Final Thoughts :: **gfwr**

Global Fishing Watch is dedicated to creating and publicly sharing open data and tools to advance ocean governance

The **gfwr** package provides easy access to GFW data made available via the GFW API Portal.

**gfwr** currently includes functions to access GFW's Vessels, Events, and Map Visualization (4Wings) APIs and will be updated to access new GFW APIs as they become available

**gfwr** is open source and we welcome contributions! Clone the repository at <https://github.com/GlobalFishingWatch/gfwr>



# Thank you



Global Fishing Watch is an international nonprofit organization dedicated to advancing ocean governance through increased transparency of human activity at sea. By creating and publicly sharing map visualizations, data and analysis tools, we aim to enable scientific research and transform the way our ocean is managed. We believe human activity at sea should be public knowledge in order to safeguard the global ocean for the common good of all.

**Discover more at [globalfishingwatch.org](http://globalfishingwatch.org)**

# Our datasets



## Fishing effort and vessel presence

Vessel-specific fishing activity identified from vessel tracking data by GFW algorithms. Also includes non-fishing vessel activity.



## Vessel identity

Comprehensive vessel information (MMSI, flag, gear type, length, authorizations, etc.) for all vessels listed on public vessel registries



## Port visits and voyages

Global database of anchorages visited by vessels broadcasting AIS and the voyages they make between ports



## Transshipment

Detection of potential transshipment events



## Non-transmitting vessels

Detection of vessels not broadcasting AIS or VMS using satellite imagery



Global Fishing Watch

```
# Map theme with dark background
map_theme <- ggplot2::theme_minimal() +
  ggplot2::theme(
    panel.border = element_blank(),
    panel.background = element_rect(fill = "#0a1738", color = NA),
    legend.position = "bottom", legend.box = "vertical",
    legend.key.height = unit(3, "mm"),
    legend.key.width = unit(20, "mm"),
    legend.title.align = 0.5,
    legend.text = element_text(color = "#848b9b", size = 8),
    legend.title = element_text(face = "bold", color = "#363c4c", size = 8),
    plot.title = element_text(face = "bold", color = "#363c4c", size = 10),
    plot.subtitle = element_text(color = "#363c4c", size = 10),
    axis.title = element_blank(),
    axis.text = element_text(color = "#848b9b", size = 6),
    panel.grid.major = element_line(color = "#0a1738"),
    panel.grid.minor = element_line(color = "#0a1738"))

# Palette for fishing activity
map_effort_dark <- c("#0c276c", "#3b9088", "#eef000", "#ffffff")
```



# Which APIs are available?

Only AIS-derived data (for now) and and based on our peer reviewed research



**Fishing effort** Discover fishing patterns for nearly 70,000 vessels broadcasting on AIS, displayed across space and time at global scale, in a map visualization.



**Fishing events** Find vessel position data showing possible fishing events in detail, anywhere on the ocean.



**Vessel search and identity** Search fishing, carrier and support vessels through multiple identifiers and cross-check identity information derived from AIS self-reported data.



**Encounters** Find data on vessel encounters and possible transshipment events on a global scale for improved knowledge of at-sea catch transfers.



**Loitering** Locate information on vessel loitering to increase awareness of potential at-sea encounters and transshipment events.



**Port visits** Find data on port visits and patterns of vessel behavior across space and time.



**gfwR** Access data from its application programming interfaces, or APIs, directly through R—a specialized programming language for data processing, statistical analysis and data visualizations.



# New APIs coming soon...

- **Statistics API:** get fishing activity and/or event statistics for the world or a region
- **Intentional AIS disabling events API:** get events where fishing vessels intentionally disabling their vessel tracking system ([read paper](#))
- **More vessel types:** get non-fishing vessel and vessel details in our Vessel API
- **Vessel identity:** a new version of Vessel API including identity and authorization data from regional and national registries ([read paper](#))
- **Vessel Insights API:** get vessel indicators like AIS coverage, fishing events in no take MPA and IUU list status, likely disabling events, name or identity changes etc.
- **Ports and Voyages API :** get vessel trip and activity details between port visits.



Global Fishing Watch