2023 R/Finance Call for Papers

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Lightning Talk Proposal

Hockeystick: Visualizing Global Warming with R

Previously relegated to a niche corner of the investment landscape, the impact of global warming on financial markets has become an active topic of research and policy at central banks and financial regulators. For instance, the European Central Bank¹, the US Federal Reserve², and the Financial Stability Board³ all have active regulatory studies and pilot programs to measure and manage climate risks. In addition, the US Securities and Exchange Comission (SEC) has proposed requiring listed corporations to include enhanced climate disclosures in their statements⁴.

Accordingly, as the risk and returns from global warming enter the mainstream of finance, there is an urgent need for all practioners to gain a basic understanding of the data and the mechanics of global warming. There are a multitude of publicly-available data sources regarding global warming from a large variety of academic and scientific organizations around the world, for example NASA, the European ECMWF, UK Met Office, the Japan Meteorological Service, to name but a few. For financial practitioners without climate training navigating these complex sources can be daunting and potentially error-prone.

The goal of the hockeystick⁵ R package is to make essential global warming datasets easily available in R to non-climate experts. hockeystick users can download the latest raw data from authoritative sources as well as view it via pre-defined ggplot2 charts. Datasets include atmospheric CO₂ and CH₄, carbon emissions, instrumental, reconstructed, and paleo ice-core temperature records, sea levels, hurricanes, and Arctic/Antarctic sea-ice. All data is compiled from authoritative, reliable, peer-reviewed sources and traceable to their original sources and documented. hockeystick does not store any data itself, but serves as an api wrapper to always obtain the most up-to-date data. Uses may use the dataframes returned by the package functions or use the pre-defined charts for their own purposes.

The package is designed to facilitate extensibility and permit users to analyze and reuse the data as they see fit. During the lightning talk I propose to demonstrate the use of the package and its visualization capabilities. Some visual examples follow below.

Overall, as more entity-level climate data become available, I hope that the talk and package will allow conference attendees to place such data in the greater planetary-level climate context, and easily available in R to complement their standard workflows.

¹Climate change and monetary policy in the euro area," 2021. ECB Strategy Review.

²https://www.federalreserve.gov/newsevents/pressreleases/other20220929a.htm

³Financial Stability Board, "Supervisory and Regulatory Approaches to Climate-related Risks," April 2022. Interim report ⁴https://www.sec.gov/news/press-release/2022-46

 $^{^5}$ hockeystick: Download and Visualize Essential Climate Change Data. https://cran.r-project.org/package=hockeystick; https://cortinah.github.io/hockeystick/

Package demo

Retrieve NOAA/ESRL Mauna Loa CO_2 Observatory concentration data and plot:

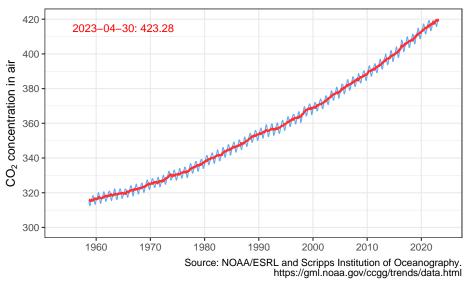
```
library(hockeystick)
ml_co2 <- get_carbon()
plot_carbon(ml_co2)</pre>
```

Warning: Removed 3 rows containing missing values ('geom_line()').

Warning: Removed 1 row containing missing values ('geom_line()').

Atmospheric CO₂ (Keeling Curve)

Mauna Loa CO₂ monthly mean ppm

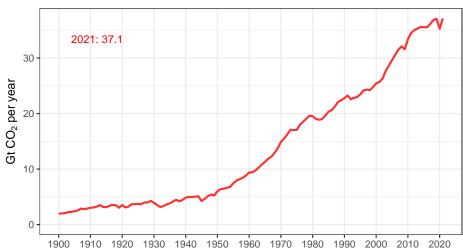


Retrieve GCP global CO₂ emissions and plot:

```
emissions <- get_emissions()
plot_emissions(emissions)</pre>
```

Fossil Combustion CO₂ Emissions

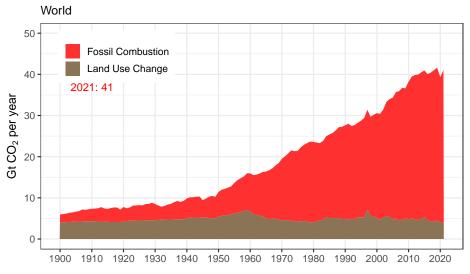
World



Source: Global Carbon Project and Our World In Data. https://github.com/owid/co2-data

plot_emissions_with_land(emissions)

Fossil + Land Use Change CO₂ Emissions

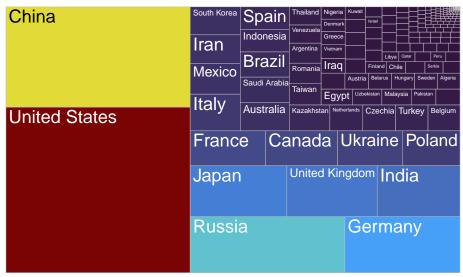


Source: Global Carbon Project and Our World In Data. https://github.com/owid/co2-data

Visualize cumulative emissions by country:

emissions_map()

1900-2021 Cumulative CO₂ Emissions by Country

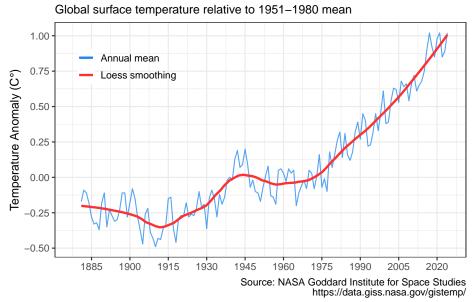


Source: Global Carbon Project and Our World In Data

Retrieve NASA/GISS global surface temperature anomaly data and plot:

anomaly <- get_temp()
plot_temp(anomaly)</pre>

Global Land-Ocean Temperature Index (LOTI)

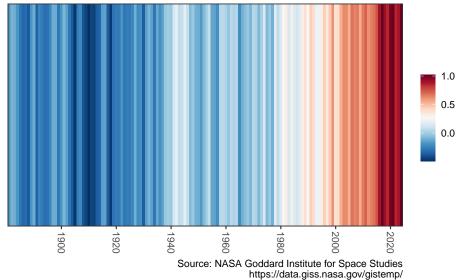


Visualize warming using Ed Hawkins styled "warming stripes":

warming_stripes()

Global surface temperature anomaly

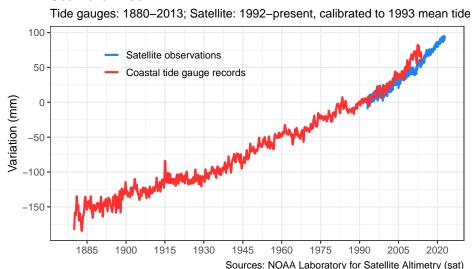
Relative to 1951-1980 average



Retrieve tide gauge and satellite sea level data and plot:

```
gmsl <- get_sealevel()
plot_sealevel(gmsl)</pre>
```

Sea Level Rise



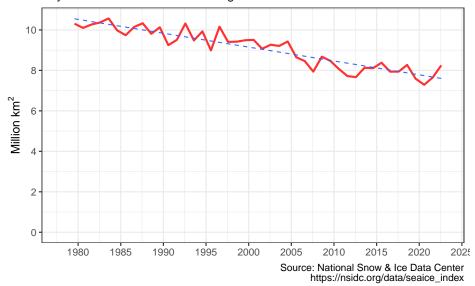
https://www.star.nesdis.noaa.gov/socd/lsa/SeaLevelRise
Commonwealth Scientific and Industrial Research Organisation (tide gauge)
https://research.csiro.au/slrwavescoast/sea-level/measurements-and-data/sea-level-data/

Retrieve July annual Arctic Sea Ice Index and plot:

seaice <- get_seaice()
plot_seaice(seaice)</pre>

Arctic Sea Ice

July mean sea ice extent. Linear regression in blue.

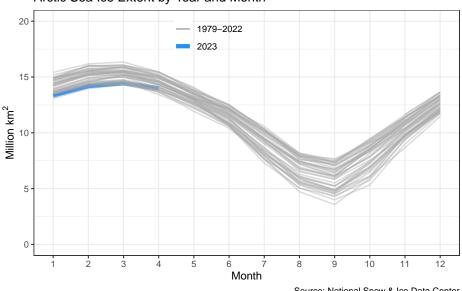


get_seaice() arguments can be modified to download Antarctic sea ice, and allow any month.

You can also visualize sea ice by month and year:

```
arcticice <- get_icecurves()
plot_icecurves(arcticice)</pre>
```

Arctic Sea Ice Extent by Year and Month

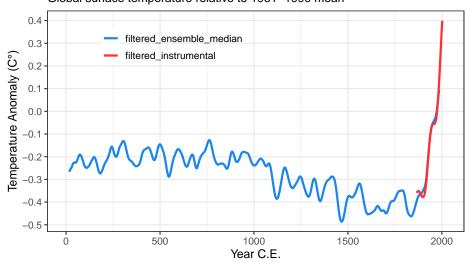


Source: National Snow & Ice Data Center https://nsidc.org/data/seaice_index

Retrieve Common Era temperature reconstruction and plot it with instrumental record:

```
anomaly2k <- get_temp2k()
plot_temp2k(anomaly2k)</pre>
```

Global Common Era Temperature Reconstruction Global surface temperature relative to 1961–1990 mean



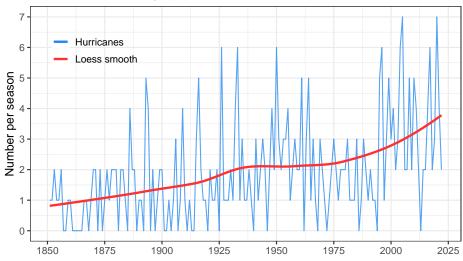
Source: PAGES2k Consortium, NOAA https://www.ncei.noaa.gov/access/paleo-search/study/26872

Retrieve NOAA HURDAT2 hurricane data and plot:

hurricanes <- get_hurricanes()
plot_hurricanes(hurricanes)</pre>

North Atlantic Hurricane Basin

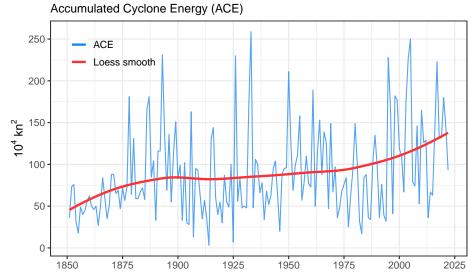
Major Hurricanes (category 3-5)



Source: NOAA Hurricane Research Division, HURDAT2 re-analysis https://www.aoml.noaa.gov/hrd/hurdat/Data_Storm.html

plot_hurricane_nrg(hurricanes)

North Atlantic Hurricane Basin



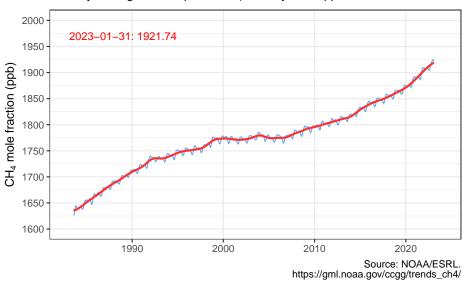
Source: NOAA Hurricane Research Division, HURDAT2 re-analysis https://www.aoml.noaa.gov/hrd/hurdat/Data_Storm.html

Retrieve NOAA/ESRL CH₄ Globally averaged mean data and plot:

ch4 <- get_methane()
plot_methane(ch4)</pre>

Atmospheric Methane

Globally Averaged Atmospheric CH₄ monthly mean ppb

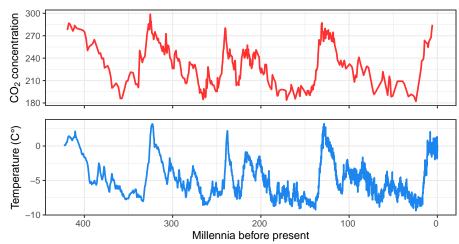


Retrieve Vostok paleo ice core data and plot:

vostok <- get_paleo()
plot_paleo(vostok)</pre>

Paleoclimate: The Link Between CO₂ and Temperature

420,000 years from the Vostok ice core, Antarctica.



Source: U.S. Department of Energy ESS–DIVE http://cdiac.ess–dive.lbl.gov/ftp/trends/co2/vostok.icecore.co2 http://cdiac.ess–dive.lbl.gov/ftp/trends/temp/vostok/vostok.1999.temp.dat

Acknowledgments

- Carbon Dioxide concentrations: Dr. Pieter Tans, NOAA/GML (https://gml.noaa.gov/ccgg/trends/) and Dr. Ralph Keeling, Scripps Institution of Oceanography.
- Global temperature anomaly: GISS Surface Temperature Analysis (GISTEMP), version 4. GISTEMP Team, 2020: NASA Goddard Institute for Space Studies. https://data.giss.nasa.gov/gistemp/
- Warming Stripes design from Ed Hawkins' Climate Lab. https://www.climate-lab-book.ac.uk/2018/warming-stripes/. In addition grateful to Dr. Dominic Royé for posting his approach to plotting them using ggplot2, which warming_stripes() is based on. https://dominicroye.github.io/en/2018/how-to-create-warming-stripes-in-r/
- Sea level data: NOAA Laboratory for Satellite Altimetry (sat) and Commonwealth Scientific and Industrial Research Organisation (tide gauges)
- Sea Ice Index: National Snow & Ice Data Center. Data Archive: https://nsidc.org/data/explore-data
- Vostok carbon dioxide and temperature data: https://cdiac.ess-dive.lbl.gov/trends/co2/vostok.html
- Common Era reconstructed temperature data: PAGES2k Consortium and NOAA).
- Hurricanes: National Oceanic and Atmospheric Administration HURDAT Atlantic Hurricane Database Re-analysis Project, particularly Dr. Chris Landsea.
- Carbon Dioxide emissions: Global Carbon Project and Our World In Data
- Methane: Lan, X., K.W. Thoning, and E.J. Dlugokencky, NOAA Global Monitoring Laboratory (https://gml.noaa.gov/ccgg/trends_ch4/).
- Thank you to Dirk Eddelbuettel for providing the .isConnected function from his tint package to test for internet connectivity.