Interactive visualization of climate model data via Python or GUI with psyplot



DACH 2022

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March 23rd, 2022

<u>Help</u>





Technical Note

This presentation is a jupyter notebook presented with <u>rise</u> for interactive execution of the cells. You can run it interactively on mybinder in your browser:



The link to the repo on Github:

https://github.com/Chilipp/psyplot-DACH2022-presentation).

Back to first slide





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launch binder

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Back to first slide

So let's import some libraries for the execution

```
In [1]: %matplotlib widget
       import psyplot.project as psy
        import numpy as np
        import xarray as xr
        import matplotlib.pyplot as plt
        import cartopy.crs as ccrs
        from IPython.display import display, Video
        from ipympl.backend_nbagg import Canvas
        Canvas.header_visible.default_value = False
        import pyvista
        pyvista.rcParams['use_ipyvtk'] = True
        import warnings
        warnings.filterwarnings("ignore", r"\s*The on_mappable_chang
       warnings.filterwarnings("ignore", r"\s*The input coordinates
       warnings.filterwarnings("ignore", r"\s*shading=")
        warnings.filterwarnings("ignore", r"\s*\[Warning by")
```





Outline

Main features of psyplot

How to use and extend the framework

Some more features of psyplot





Outline

Main features of psyplot

How to use and extend the framework

Some more features of psyplot

Note:

I am not a visualization expert

The aim of this talk is not to show wonderful plots, but rather how to generate them.

You can always make them publication-ready using the rich features of matplotlib.





Main features of psyplot





Using psyplot from Python

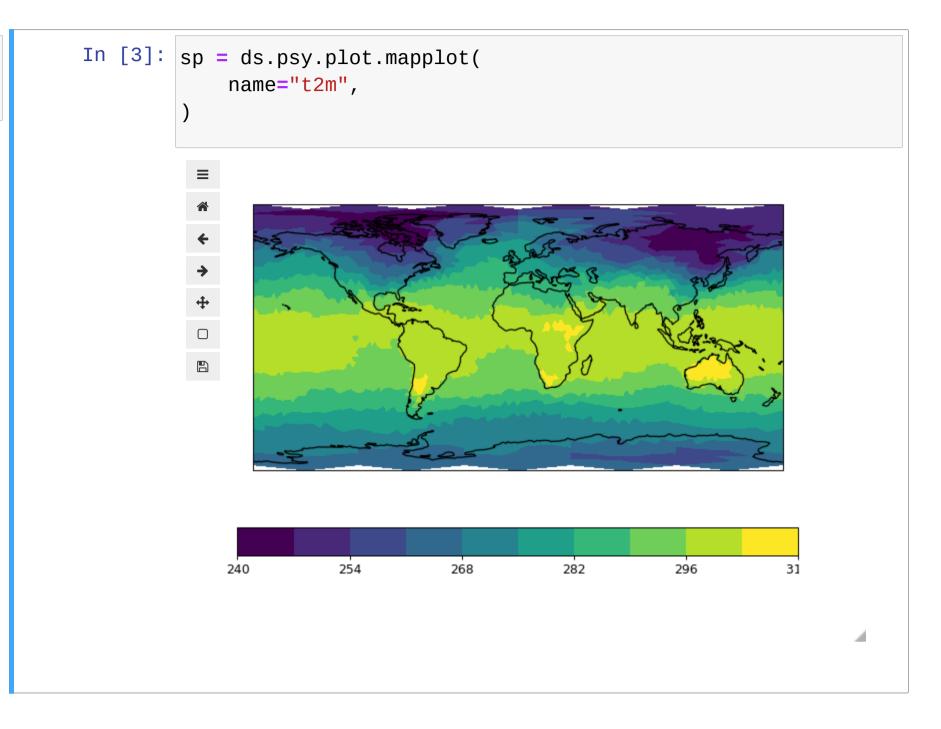
```
In [2]: ds = psy.open_dataset("data/icon_grid_demo.nc")
        ds
Out[2]: <xarray.Dataset>
                       (time: 5, ncells: 5120, vertices: 3, edge:
        Dimensions:
        480, no: 4, lev: 4)
        Coordinates:
          * time
                       (time) datetime64[ns] 1979-01-31T18:00:00
        ... 1979-05-31T18:00:00
                        (ncells) float64 ...
            clon
            clon_bnds (ncells, vertices) float64 ...
                       (ncells) float64 ...
            clat
                       (ncells, vertices) float64 ...
            clat_bnds
                        (edge) float32 ...
            elon
            elon bnds
                       (edge, no) float32 ...
                       (edge) float32 ...
            elat
            elat_bnds (edge, no) float32 ...
                       (lev) float64 1e+05 8.5e+04 5e+04 2e+04
          * lev
        Dimensions without coordinates: ncells, vertices, edge, no
        Data variables:
                       (time, lev, ncells) float32 ...
            t2m
                       (time, lev, ncells) float32 ...
            u
                       (time, lev, ncells) float32 ...
                       (time, lev, edge) float32 ...
            t2m_edge
        Attributes:
                                  Climate Data Interface version
            CDI:
        1.9.1 (http://mpimet...
            Conventions:
                                  CF-1.4
            history:
                                  Thu Aug 30 21:54:23 2018: cdo de
        lname, t2m_2d, u_2d, v...
            number_of_grid_used:
            uuidOfHGrid:
                                  bf575ad8-daa6-11e7-a4a9-93d511f8
        21b4
                                  Temperature and Wind demo-File f
            title:
        or python nc2map mo...
                                  Climate Data Operators version
            CDO:
        1.9.1 (http://mpimet...
```





Using psyplot from Python

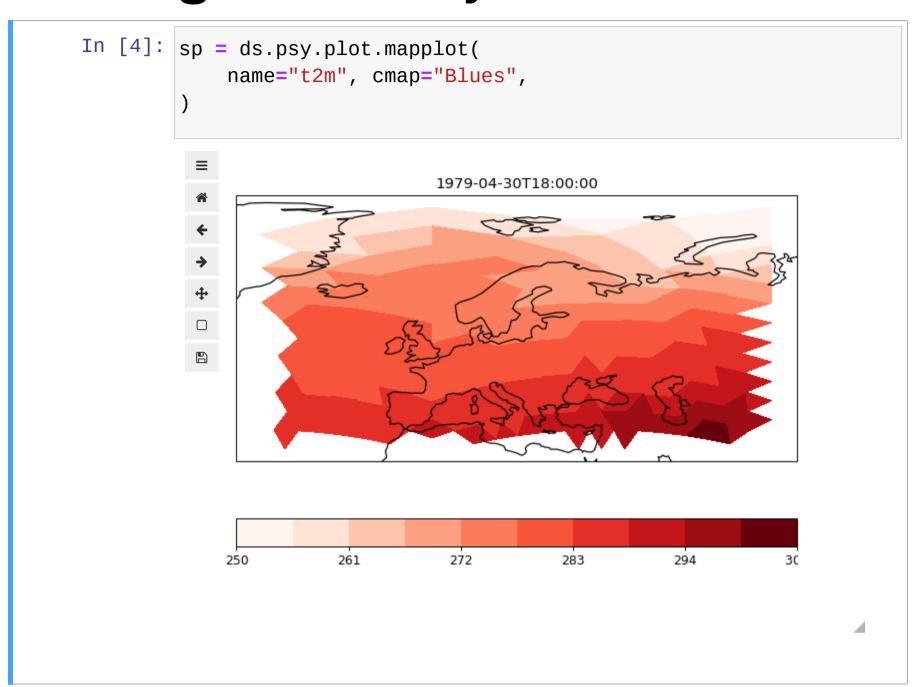
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```







Working interactively from the command line







Working interactively from the command line

```
In [5]: sp.update(cmap="Reds")
In [6]: sp.update(title="%(time)s")
In [7]: sp.update(time=3)
In [8]: sp.update(lonlatbox="Europe")
In [9]: psy.close("all")
```





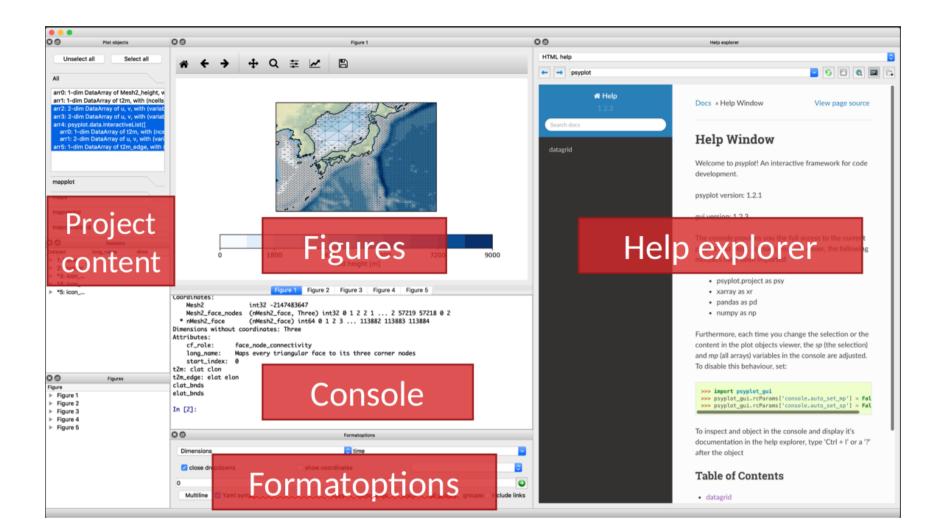
Using the GUI

psyplot comes with a flexible graphical user interface (GUI).

- On mybinder: click <u>here</u>.
- On mistral:
 - either via X11

ssh -X mistral
module load python3
psyplot

- or <u>via remote desktop</u>
- On your on own working station: Install it via conda install -c conda-forge psyview





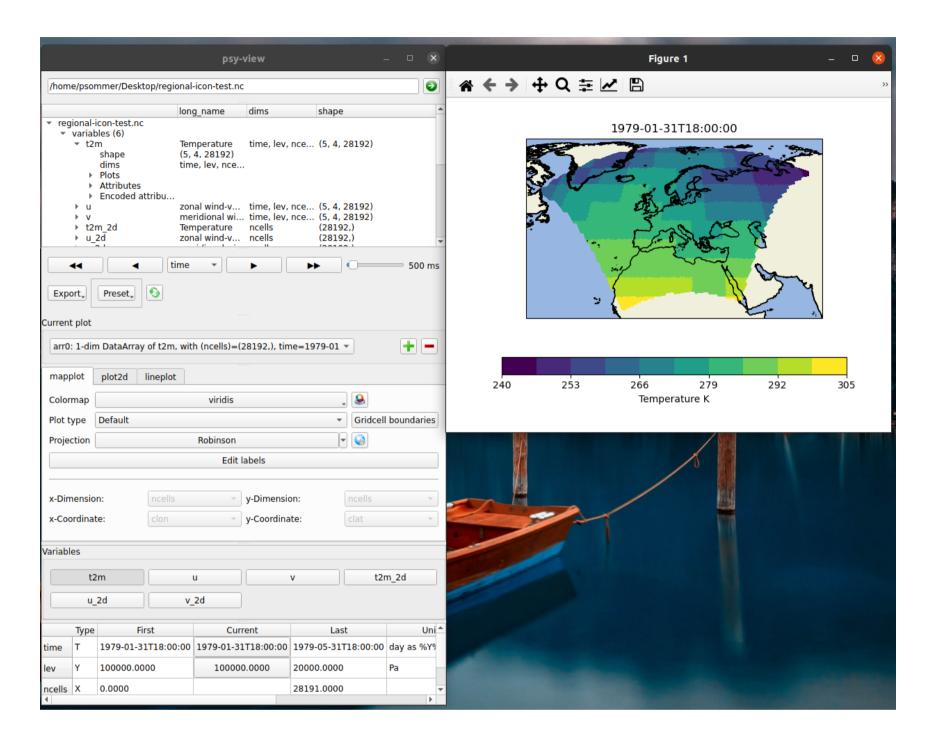


psy-view

An ncview-like interface, but with psyplot

- quick access to netcdf-variables via buttons
- switch between projections
- modify basemap
- change labels, colormaps, etc.
- display time-series when clicking on the map
- load presets for your plots
- animate through time, z, etc.

https://psyplot.github.io/psy-view





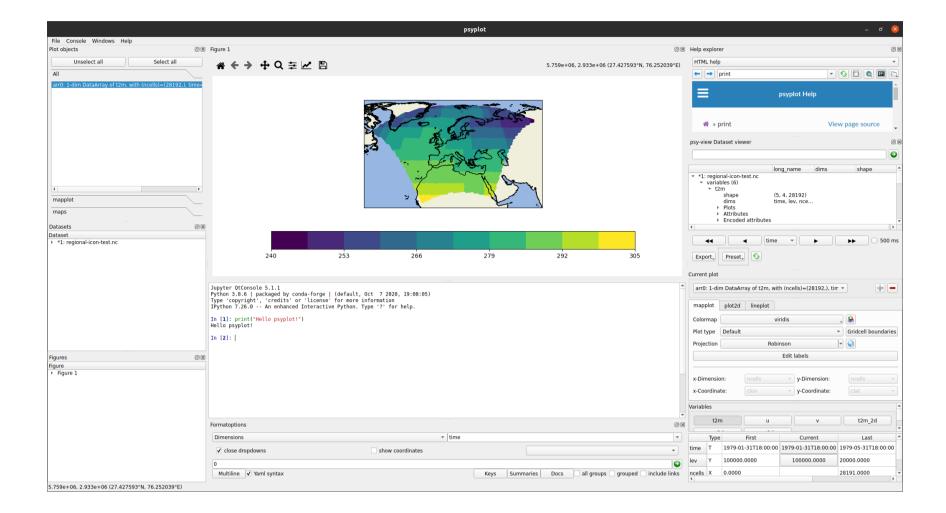


The psyplot GUI

Flexible GUI for coding and clicking

- integrated IPython console for interactive use of the command line
- connected help window that renders help and python object documentation
- integrated psy-view window
- shortcut widgets for individual formatoptions

https://psyplot.github.io/psyplot-gui



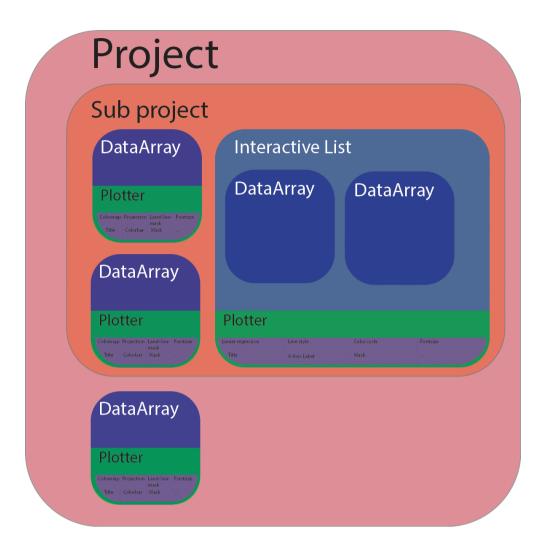




An introduction into the psyplot framework

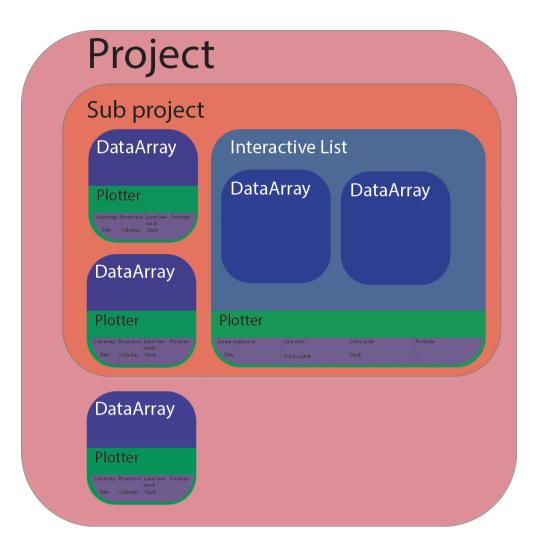








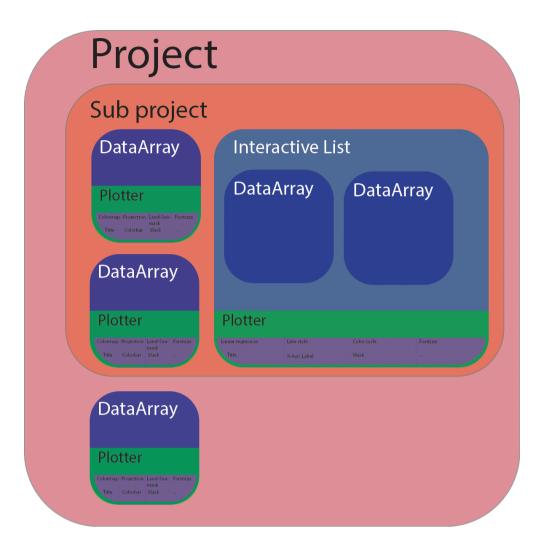




- Formatoption: The smallest possible unit. Each formatoption controls one aspect of the plot (cmap, lonlatbox, etc.)
- Plotter: A set of formatoptions that visualizes data



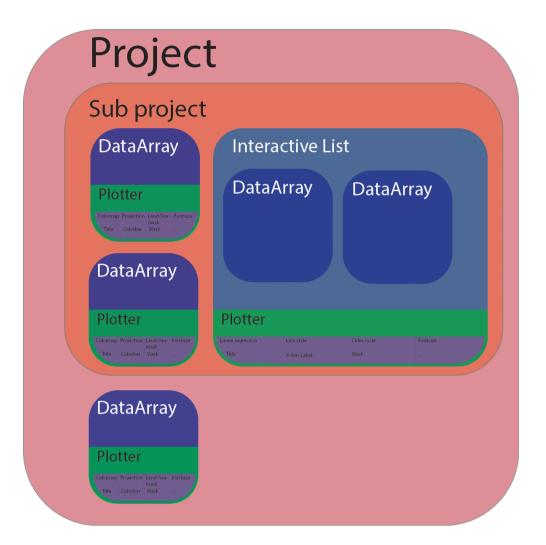




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- DataArray: Standard xarray
- InteractiveList: A collection of DataArray s that are visualized by one plotter (e.g. a collection of lines)







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- DataArray: Standard xarray
- InteractiveList: A collection of DataArray's that are visualized by one plotter (e.g. a collection of lines)
- Project: A set of data objects, each visualized by one plotter
- Sub project: A subset of a larger Project









import the necessary objects from the framework

In [10]: from psyplot.plotter import Formatoption, Plotter





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```

define a formatoption

```
In [11]: class MyFormatoption(Formatoption):
    #: the default value for the formatoption
    default = 'my text'

def initialize_plot(self, value):
        # method initialize the plot in the very beginning
        self.text = self.ax.text(0.5, 0.5, value, fontsize="xx-large")

def update(self, value):
    # method to update the plot
    self.text.set_text(value)
```





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def update(self, value):
    # method to update the plot
    self.text.set_text(value)
```

assign the formatoption to a plotter

```
In [12]: class MyPlotter(Plotter):
    my_fmt = MyFormatoption('my_fmt')
```





```
In [13]: # make the plot
         ds = psy.open_dataset('data/demo.nc')
         data = ds.psy.t2m
         plotter = MyPlotter(data)
                                     via the project
```





```
In [14]: # turn it into a project
    from psyplot.project import Project
    project = Project([data])
    project

Out[14]: 1 Main psyplot.project.Project([ arr0: 4-dim DataArray of t2m, with (time, lev, lat, lon)=(5, 4, 96, 192), ])
```



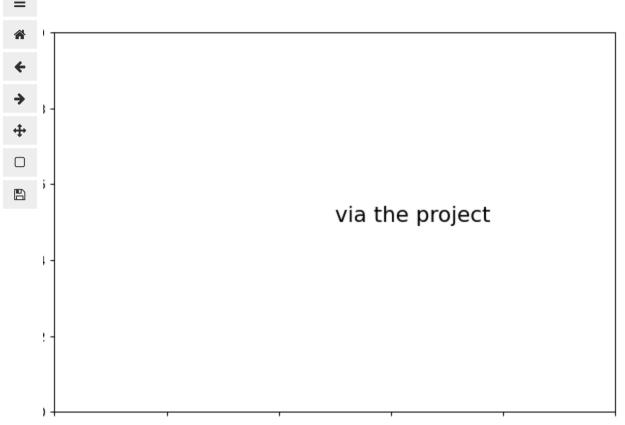


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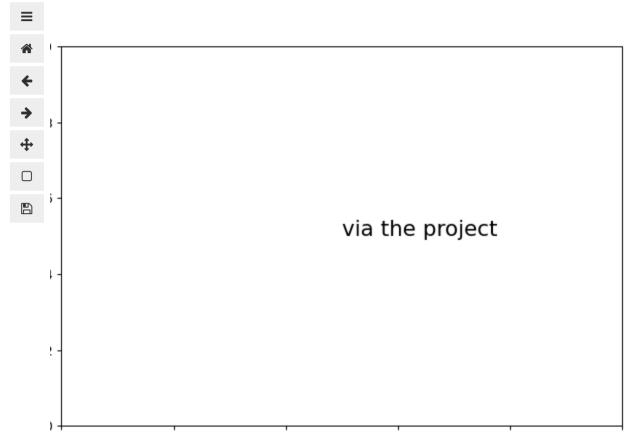


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```

```
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```

Tutorial notebook:

https://psyplot.github.io/examples/general/example exte









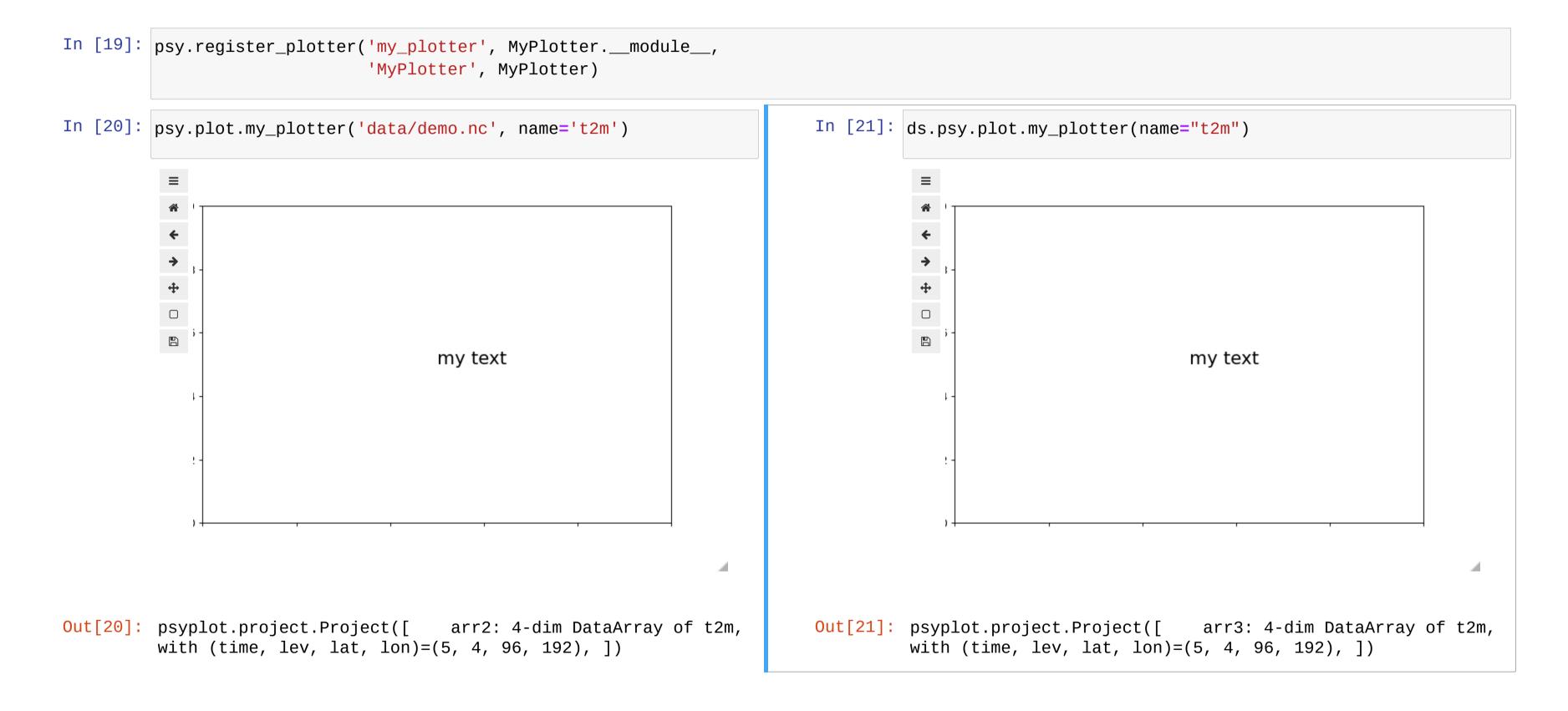




```
In [19]: psy.register_plotter('my_plotter', MyPlotter.__module__,
                              'MyPlotter', MyPlotter)
In [20]: psy.plot.my_plotter('data/demo.nc', name='t2m')
          \equiv
                                     my text
Out[20]: psyplot.project.Project([
                                      arr2: 4-dim DataArray of t2m,
         with (time, lev, lat, lon)=(5, 4, 96, 192), ])
```











Plugins for visualization

psyplot is the core that defines the framework (Plotter, Formatoption, Project, CFDecoder), the plot methods are implemented by plugins:

- psy-simple: for standard 1D and 2D plot
 - e.g. lineplot, plot2d, vector, barplot
- psy-maps: for georeferenced plots (i.e. maps)
 - e.g. mapplot, mapvector, etc.
- psy-reg: for regression analysis
 - linreg, densityreg





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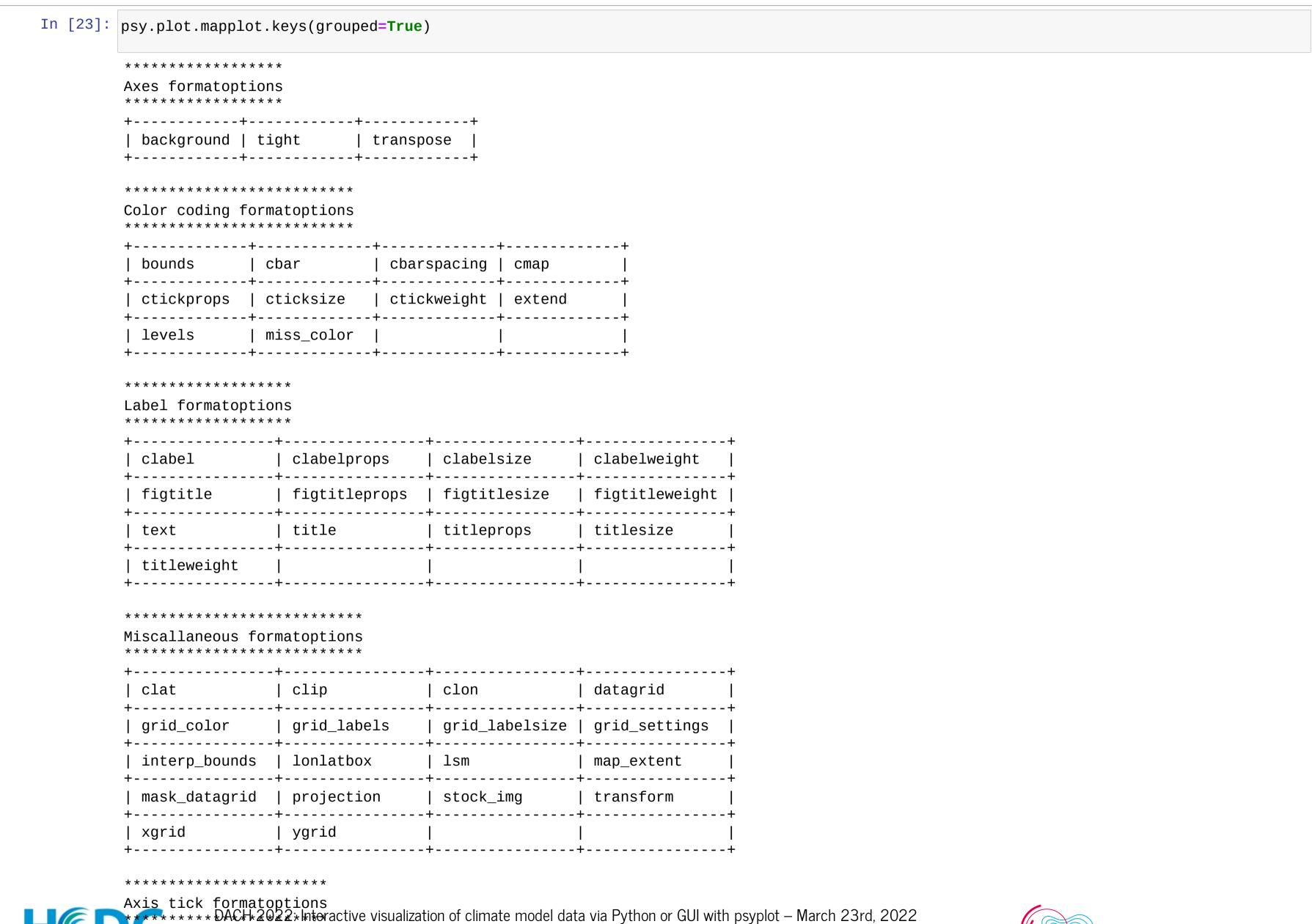
```
In [22]: psy.plot.show_plot_methods()
         barplot
             Make a bar plot of one-dimensional data
         combined
             Plot a 2D scalar field with an overlying vector field
         density
             Make a density plot of point data
         fldmean
             Calculate and plot the mean over x- and y-dimensions
         horizontal_mapcombinedtransect
             Open and plot data via :class:`psy_transect.maps.Horiz
         ontalTransectCombinedPlotter` plotters
         horizontal_maptransect
             Open and plot data via :class:`psy_transect.maps.Horiz
         ontalTransectFieldPlotter` plotters
         horizontal_mapvectortransect
             Open and plot data via :class:`psy_transect.maps.Horiz
         ontalTransectVectorPlotter` plotters
         lineplot
             Make a line plot of one-dimensional data
         mapcombined
             Plot a 2D scalar field with an overlying vector field
         on a map
         mapplot
             Plot a 2D scalar field on a map
         mapvector
             Plot a 2D vector field on a map
         my_plotter
             Open and plot data via :class:`__main__.MyPlotter` plo
         tters
         plot2d
             Make a simple plot of a 2D scalar field
         vector
             Make a simple plot of a 2D vector field
         vertical_maptransect
             Open and plot data via :class:`psy_transect.plotters.V
         erticalMapTransectPlotter` plotters
         vertical_transect
             Open and plot data via :class:`psy_transect.plotters.V
         erticalTransectPlotter` plotters
         violinplot
             Make a violin plot of your data
```





They already have a lot of formatoptions available

- Philipp S. Sommer





Make your own data plotter

```
In [24]: import numpy as np
         from psy_simple.plotters import CMap, Bounds
         from psy_maps.plotters import Transform, MapPlot2D
         from psyplot.plotter import Plotter
         class MySimpleMapplot(Plotter):
             # Specify the defaults
             rc = {
                 "cmap": "Reds",
                 "norm": None,
                 "transform": "cf",
                 "plot": "poly",
             def convert_coordinate(self, coord, *variables):
                 if coord.attrs.get("units", "").startswith("radian")
                     var.attrs.get('units', '').startswith('radian')
                     for var in variables
                 ):
                     coord = coord.copy(data=coord * 180. / np.pi)
                     coord.attrs["units"] = "degrees"
                 return coord
             # Specify the formatoptions
             cmap = CMap("cmap", bounds="norm")
             norm = Bounds("norm")
             transform = Transform("transform")
             plot = MapPlot2D("plot", bounds="norm")
         def plot(data, ax, **formatoptions):
             return MySimpleMapplot(
                 data, ax=ax, **formatoptions
```





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                 if coord.attrs.get("units", "").startswith("radian")
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                     coord = coord.copy(data=coord * 180. / np.pi)
                     coord.attrs["units"] = "degrees"
                 return coord
             # Specify the formatoptions
             cmap = CMap("cmap", bounds="norm")
             norm = Bounds("norm")
             transform = Transform("transform")
             plot = MapPlot2D("plot", bounds="norm")
         def plot(data, ax, **formatoptions):
             return MySimpleMapplot(
                 data, ax=ax, **formatoptions
```

```
In [25]: fig, ax = plt.subplots(subplot_kw=dict())
             projection=ccrs.PlateCarree())
         ax.set_global()
         ds = psy.open_dataset("data/icon.nc")
         plot(ds.psy.t2m, ax=ax);
```



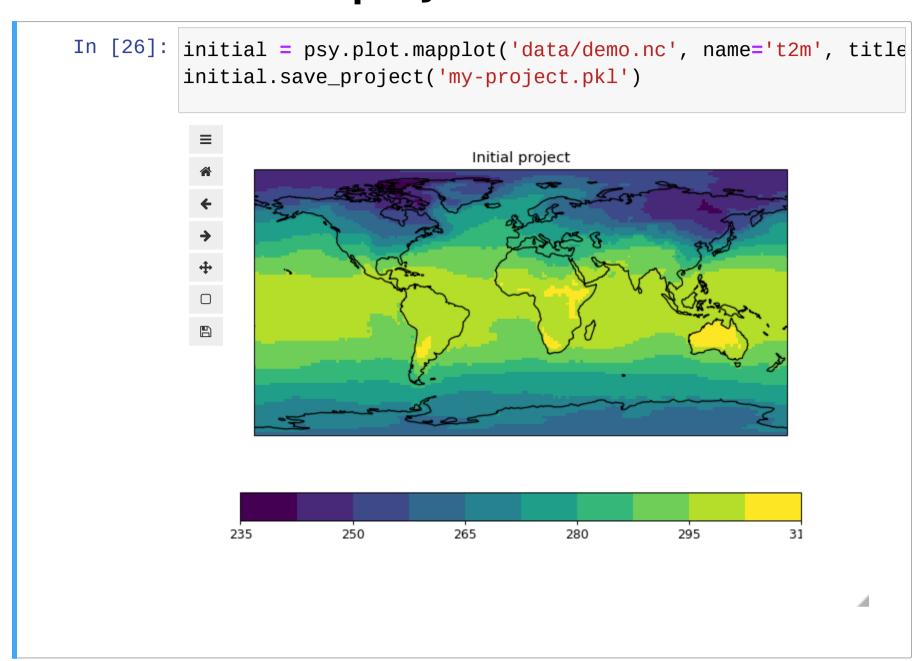


Other features of psyplot





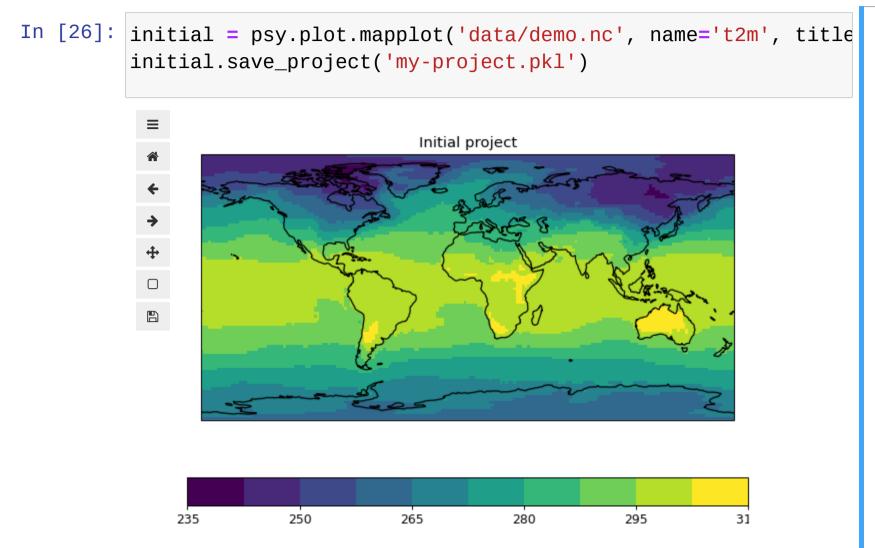
Save and load projects

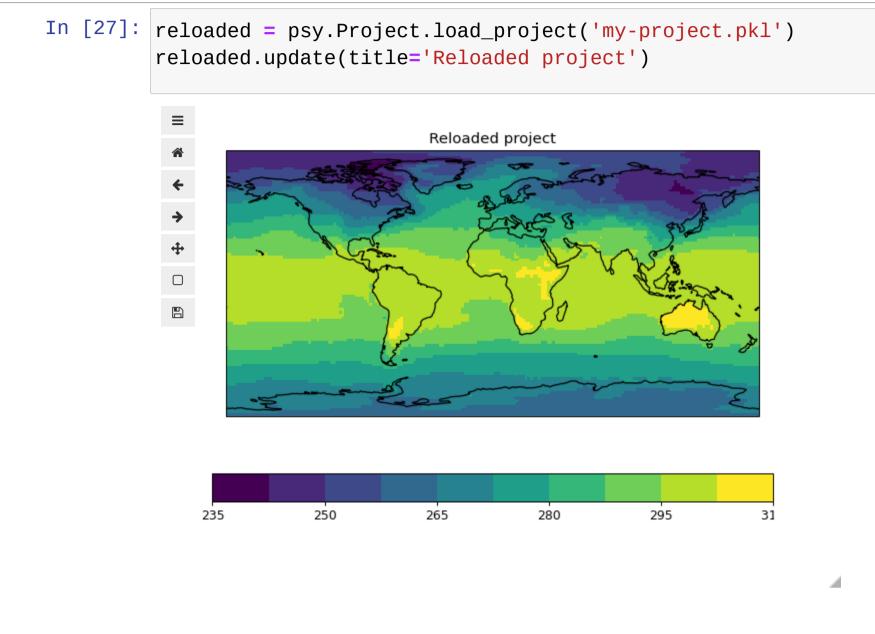






Save and load projects









Export plots





Export plots





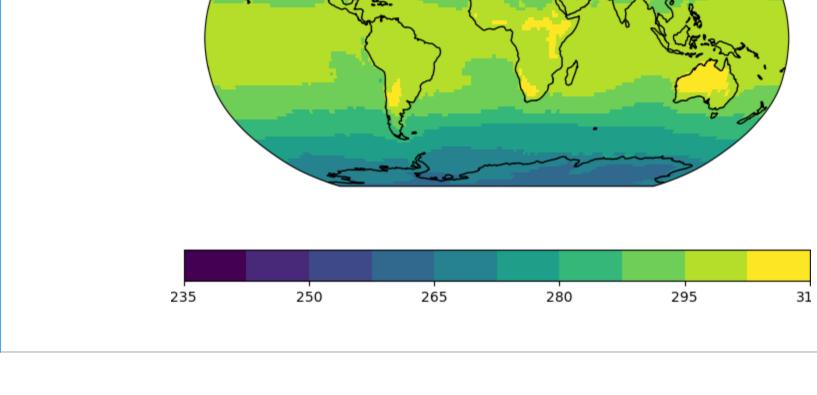
Generate plots from the command line

```
In [30]: !echo 'projection: robin' > fmt.yml
!psyplot data/demo.nc -n t2m -pm mapplot -fmt fmt.yml -o data/output.png
```





Generate plots from the command line





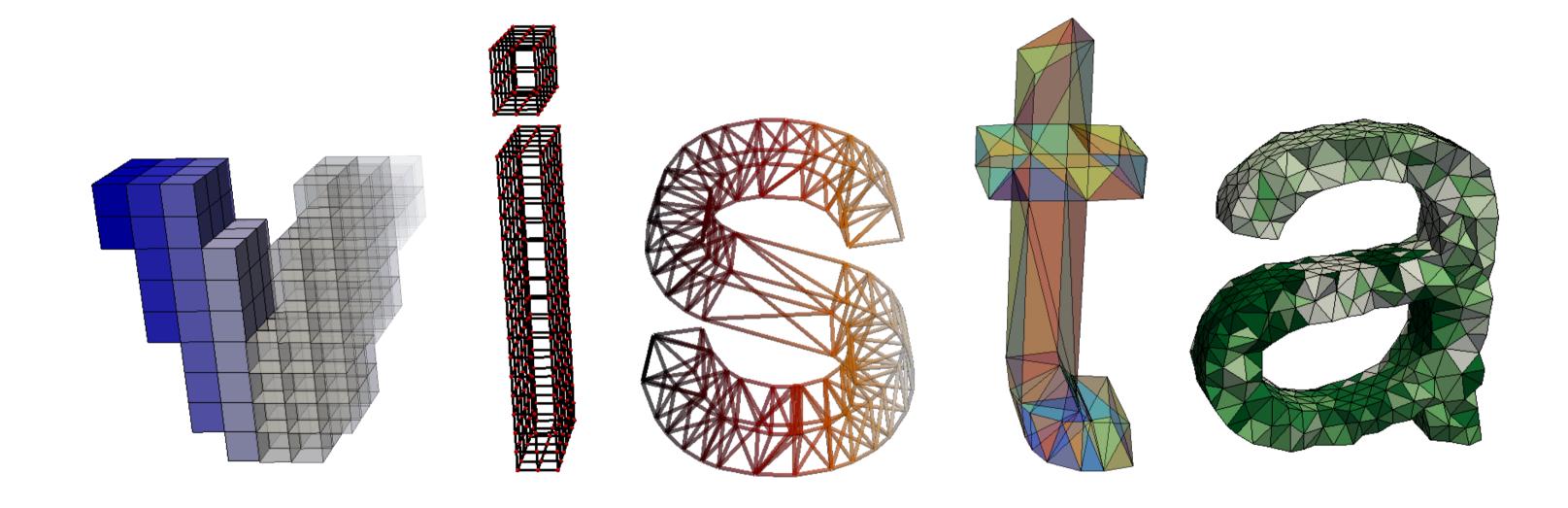


Outlook





3D visualization (not matplotlib, VTK)







pyvista: VTK and matplotlib

```
In [32]: import psy_vtk.plotters as pvtk

ds = psy.open_dataset('data/rectilinear.nc')

globe_plot = pvtk.GlobePlotter(ds.psy.t2m)
disp = globe_plot.ax.show()
```

pyvista combines the power and efficiency of the (pretty difficult) VTK python bindings with a well-documented interface and matplotlib-like functionalities.

And it can even work with psyplot pretty much out of the box!





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And it can even work with psyplot pretty much out of the box!

```
In [33]: globe_plot.update(cmap='Reds')
In [34]: globe_plot.update(datagrid=True)
```





Immediate support of all grids

```
In [35]: ds = psy.open_dataset('data/rectilinear.nc')
globe_plot = pvtk.GlobePlotter(ds.psy.t2m)
globe_plot.ax.show();
```

```
In [36]: ds = psy.open_dataset('data/curvilinear.nc')

globe_plot = pvtk.GlobePlotter(ds.psy.t2m)
globe_plot.ax.show();
```





Visualizing big data

For 4.4 million cells:

psy-vtk needs a couple of seconds to visualize it and it works fluently.

```
In [37]: Video("data/screencast.mp4", embed=True, html_attributes="au
Out[37]:
```

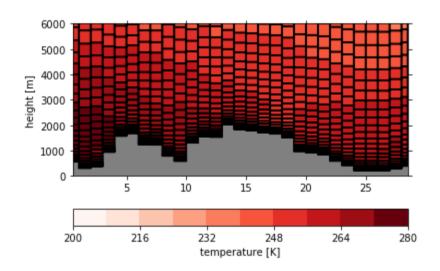


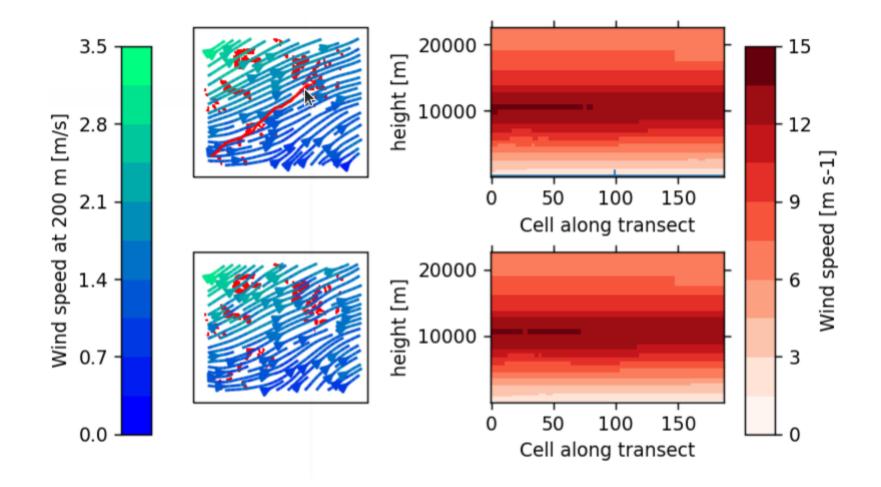


Transects

psy-transect

- interpolate rastered (or unstructured) data on to a path.
- display vertical profiles (with respect to orography, if available)
- supports vector (wind) or scalar fields (temperature)
- made for interactive usage









Summary

The framework

- the psyplot core for the data model, and plugins for various visualizations
- designed to be flexible and sustainable
- equipped via flexible graphical user interface





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- support for multiple grids: rectilinear, circumpolar and unstructured





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- designed to be flexible and sustainable
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- based on a netCDF-like infrastructure and interpretes CF- and UGRID conventions
- support for multiple grids: rectilinear, circumpolar and unstructured

Scriptability

- close to the data with a minimum of visualization overhead (compared to Paraview or something else)
- can easily be enhanced by other powerful libraries, such as scipy, scikit-learn, etc.



