

Scientific visualization (with Python)

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Introduction

- Many plotting systems to choose from
 - matplotlib
 - gnuplot
 - paraview
 - scilab
 - basemap
 - matlab
 - techplot
- They can serve many purposes
 - quick glance at data
 - presentation to others
 - scientific publication
 - general public

Basics

1D data

Semilog plot

Log plot

PDF

2D data

Types of plot
(scalars)

Types of plot
(flow)

Colormaps

3D data (anima- tions)

Refs.

- The nature of the plot depends on the nature of data
 - gridded data
 - sparse data
 - dimensionality ($f(x)$, $f(x, y)$, $f(x, y, t)$...)
- Interactive plots are becoming very easy to make, but we won't focus on it
- Checkout basemap (python) for map-projection plotting

We have to get subjective

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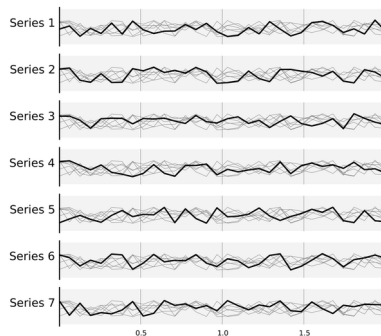
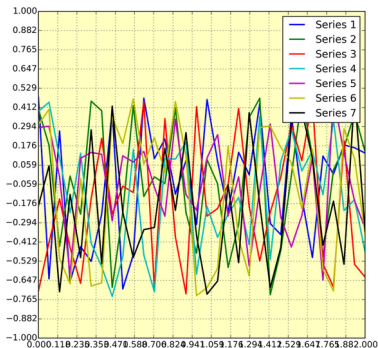
3D data (anima- tions)

Refs.

Some general subjective rules to aim for

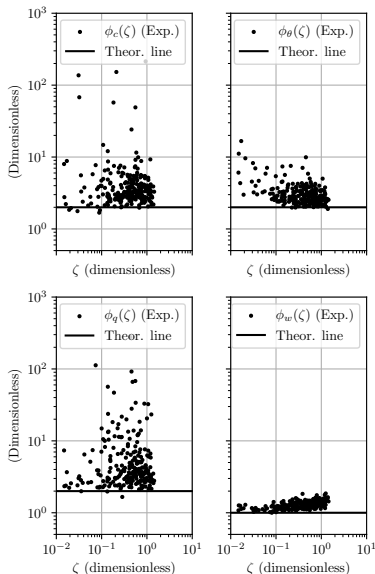
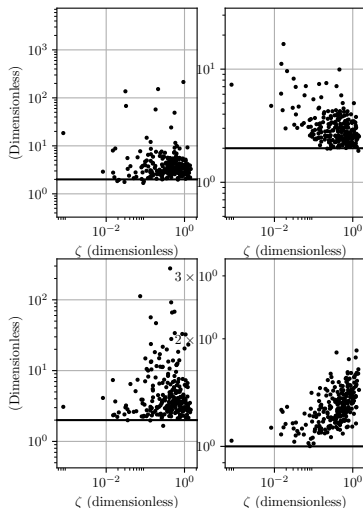
- clarity
- precision
- efficiency

It might be subjective, but we can tell the
difference



Reproduced from Rougier, Droettboom, and Bourne, (2014).
(Although notice that there should be labels in the plot!)

If you're showing more than one plot on that are meant to be compared, keep the same scales



Make your message easy with your plot

Basics

1D data

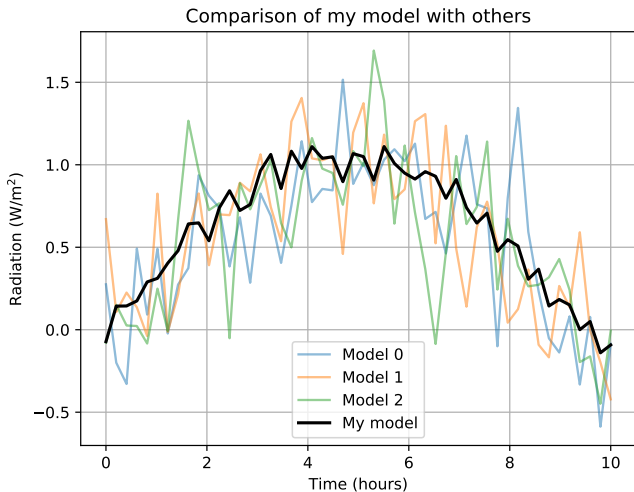
Semilog plot
Log plot
PDF

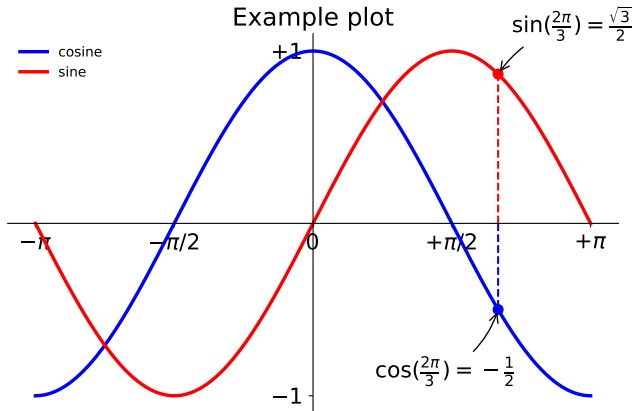
2D data

Types of plot
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(flow)
Colormaps

3D data (animations)

Refs.





Taken from Rougier, (2015).

- Curves
- Labels
- Ticks (and labels)
- Title
- Legend
- Other helpful marks

Some things are almost mandatory

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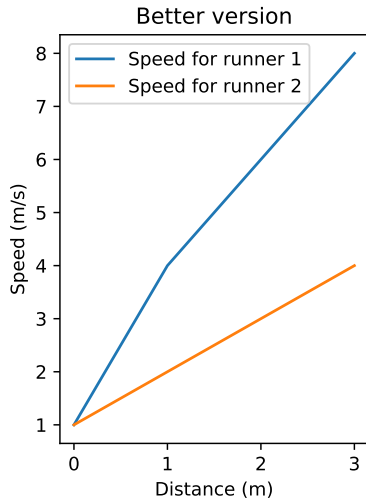
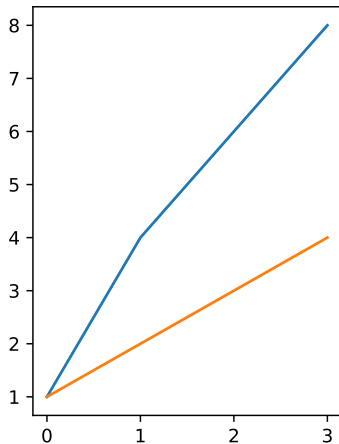
Types of plot
(scalars)
Types of plot
(flow)
Colormaps

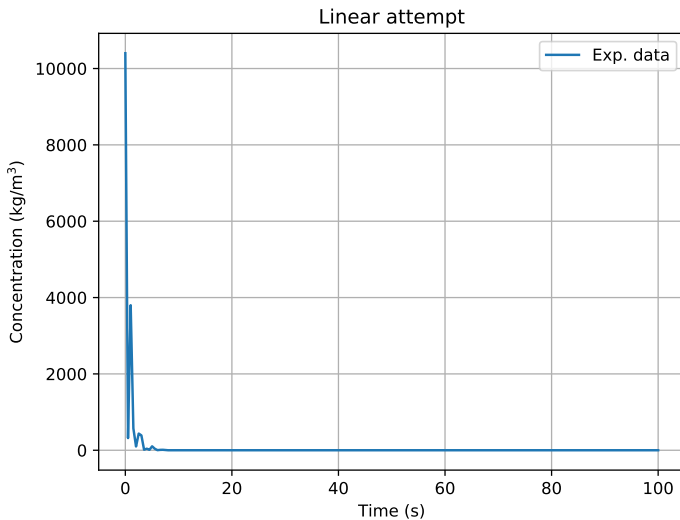
3D data (anima- tions)

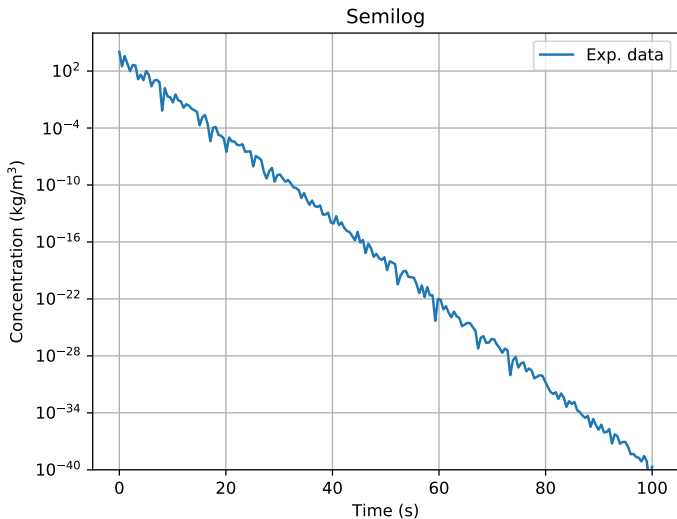
Refs.

Every plot should be self-sufficient in its content. So they should include

- labels
- units (scientific world uses metric)
- legends

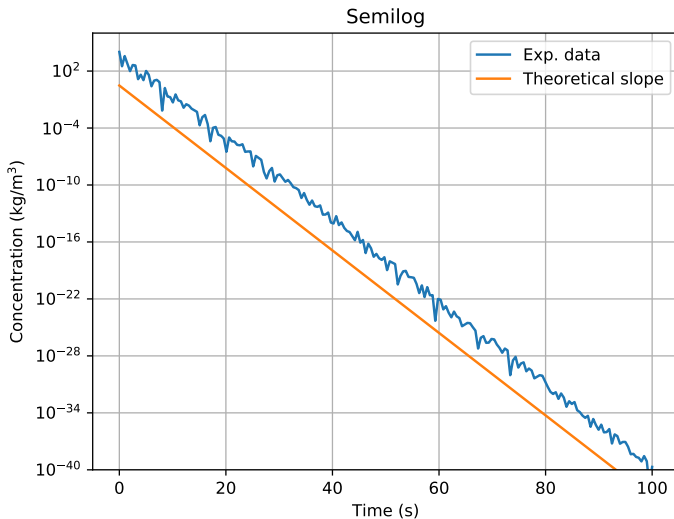




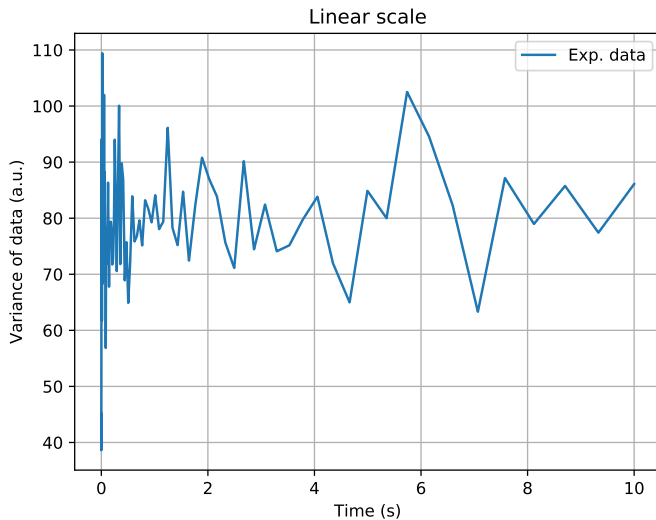


`plt.semilogy(X, Y)`

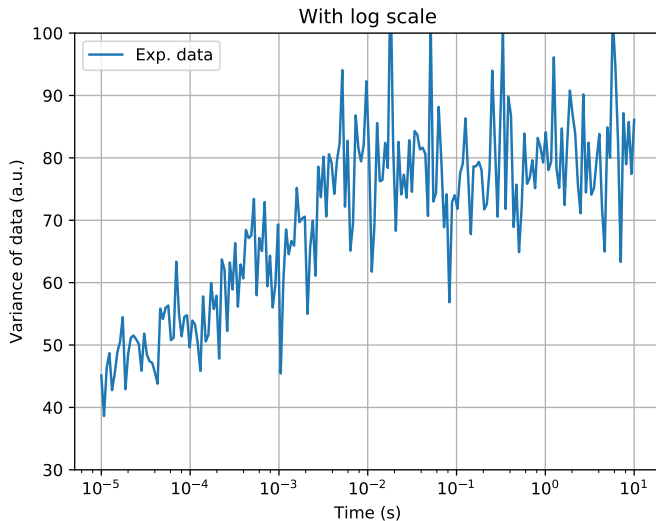
Log-Lin plots



```
plt.semilogy(X, Y)
```

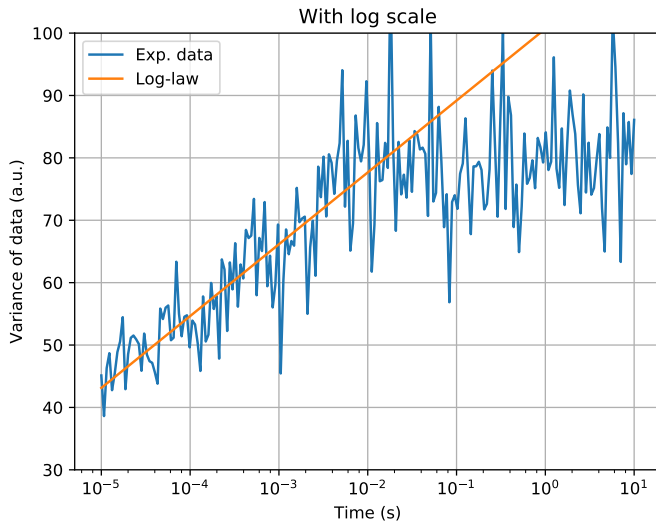


Log-Lin plots

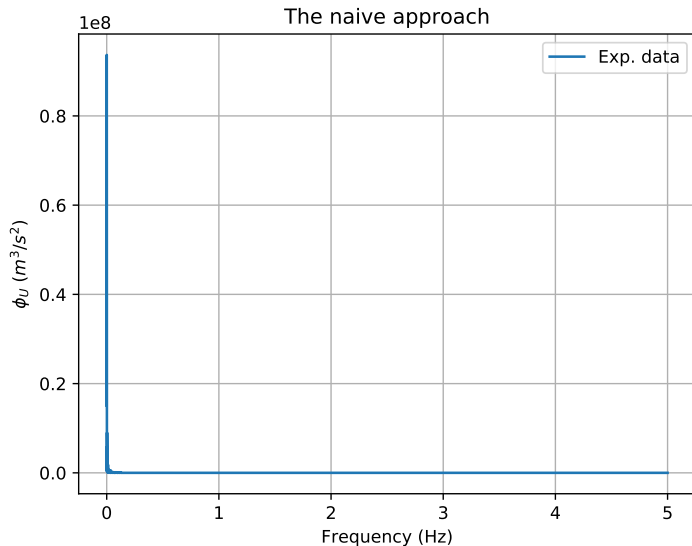


```
plt.semilogx(X, Y)
```

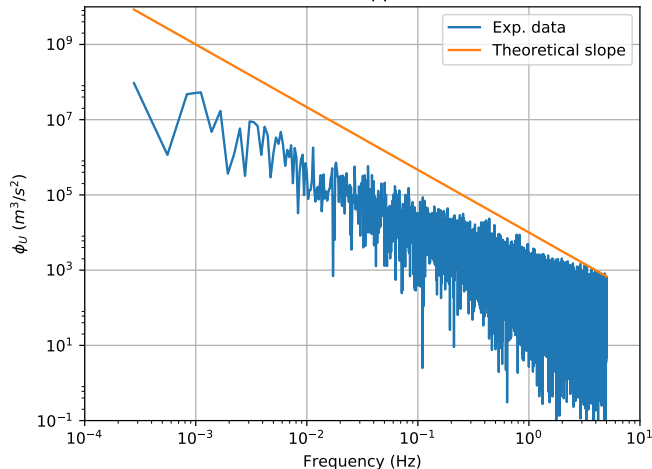
Log-Lin plots



```
plt.semilogx(X, Y)
```

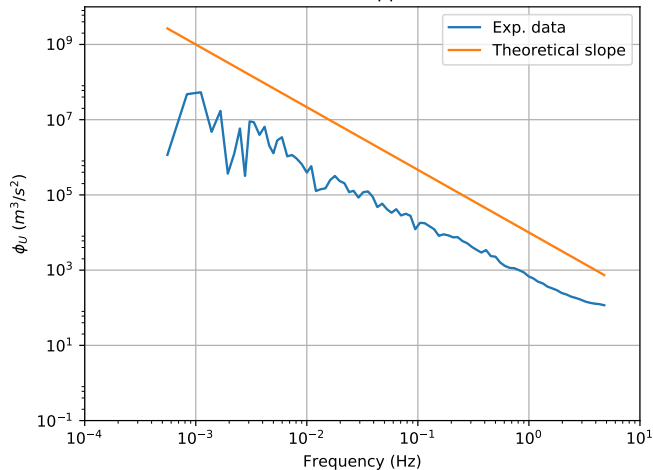



A better approach



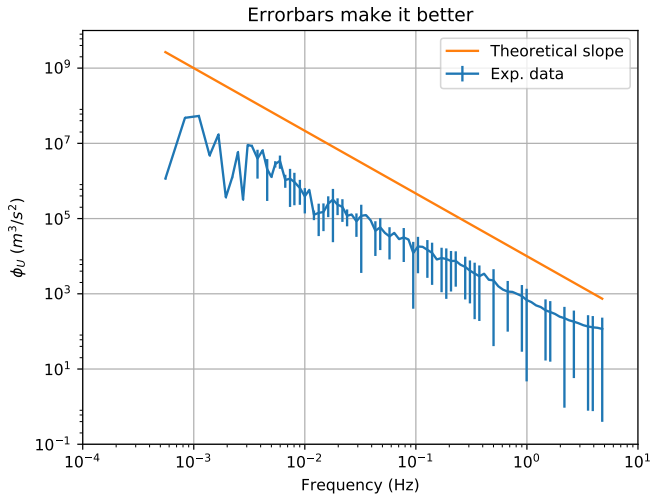
`plt.loglog(X, Y)`

A cleaner approach



`plt.loglog(X, Y)`

Binning and errorbars



```
plt.errorbar(X, Y, yerr=yerrors, xerr=xerrors)
plt.yscale('log')
plt.xscale('log')
```

Creating a Prob. Dens. Function (and
using \LaTeX)

Basics

1D data

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2D data

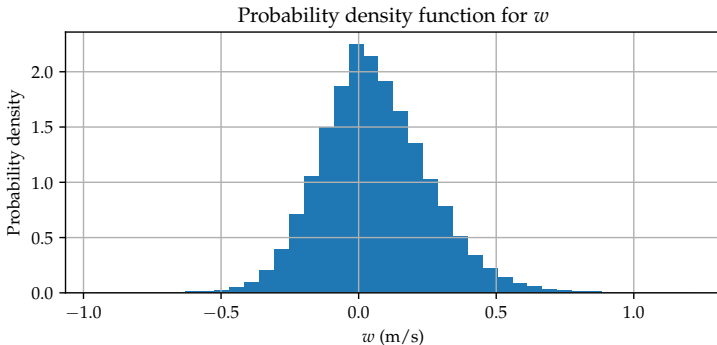
Types of plot
(scalars)Types of plot
(flow)

Colormaps

3D data

(anima-
tions)

Refs.



```
from matplotlib import rc
rc('font', family='serif', serif='Palatino')
rc('text', usetex=True)
PDF, bin_edges = np.histogram(W, bins=40, density=True)
bin_mid = (bin_edges[:-1]+bin_edges[1:])/2
plt.bar(bin_mid,PDF, width=width)
```

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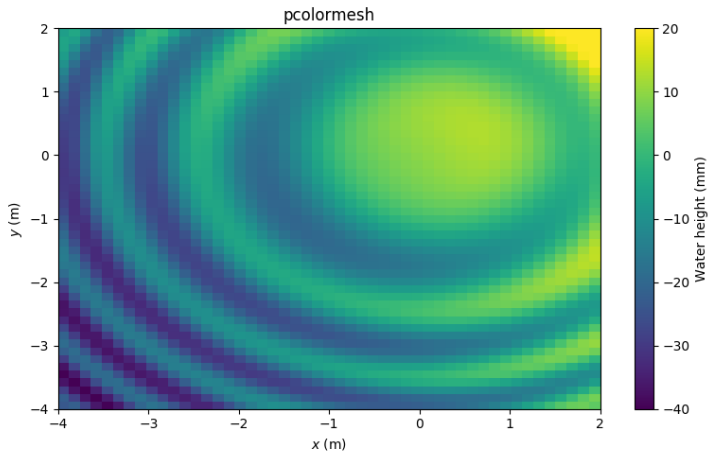
Types of plot
(scalars)
Types of plot
(flow)
Colormaps

3D data (anima- tions)

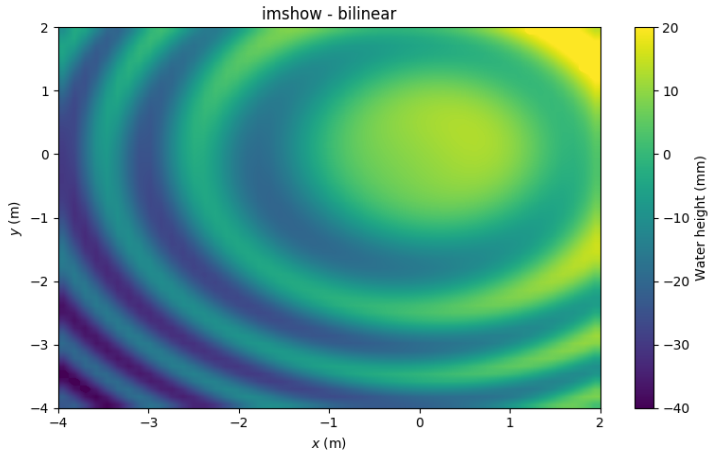
Refs.

Two more things to worry about when plotting 2D data

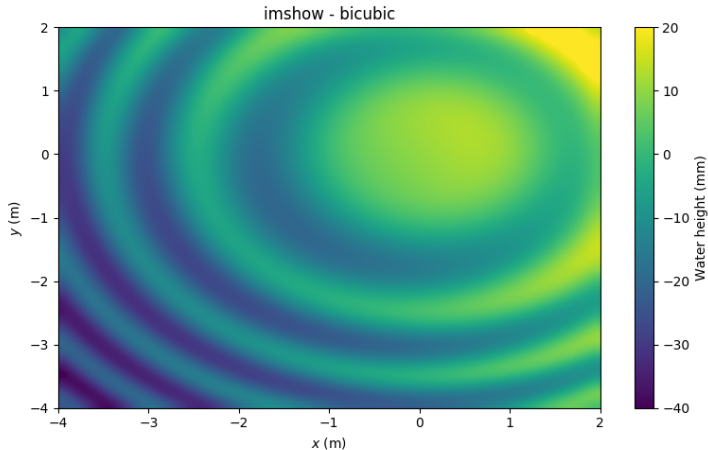
- Type of plot
- Colorbar



```
plt.pcolormesh(x, y, data, vmin=-40, vmax=20)  
plt.colorbar(label='Water height (mm)')
```



```
plt.imshow(data, interpolation='bilinear', origin='lower',  
           aspect='auto', extent=[x.min(), x.max(), y.min(), y.max()],  
           vmin=-40, vmax=20)  
plt.colorbar(label='Water_height(mm)')
```

```
plt.imshow(data, interpolation='bicubic', origin='lower',  
           aspect='auto', extent=[x.min(), x.max(), y.min(), y.max()],  
           vmin=-40, vmax=20)  
plt.colorbar(label='Water height (mm)')
```

Sometimes the interpolation can make a big difference

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2D data

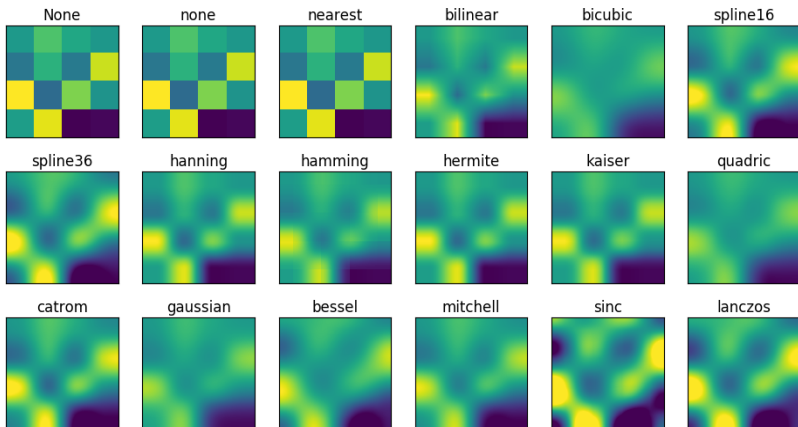
Types of plot
(scalars)

Types of plot
(flow)

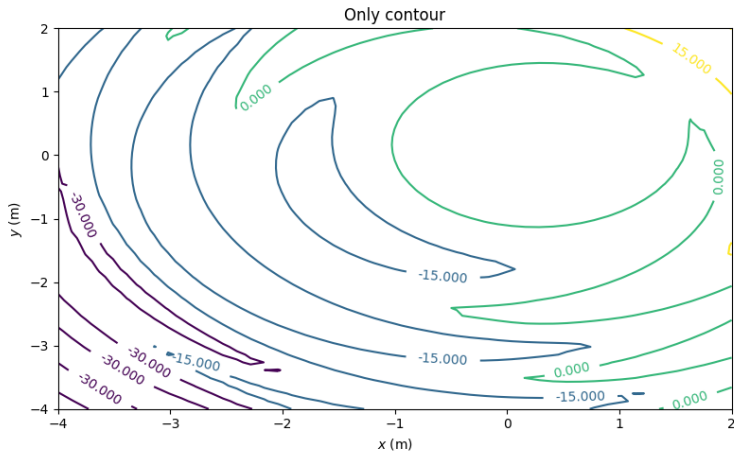
Colormaps

3D data
(anima-
tions)

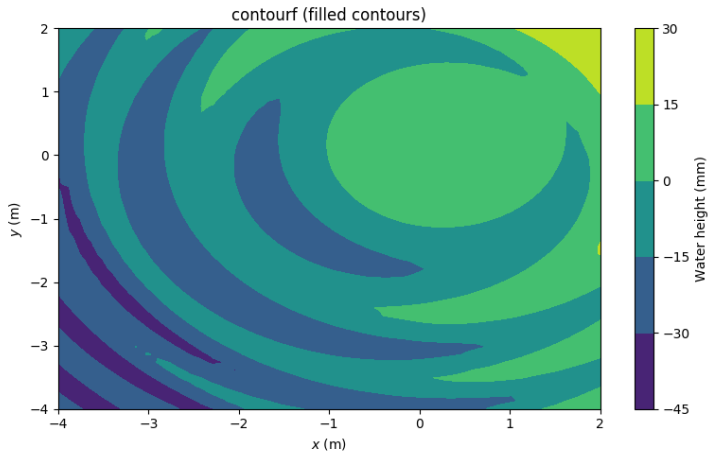
Refs.



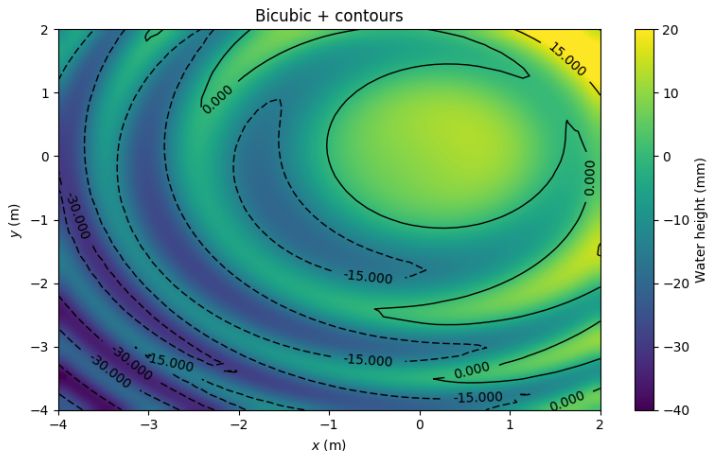
Taken from *Matplotlib Gallery* (2017).



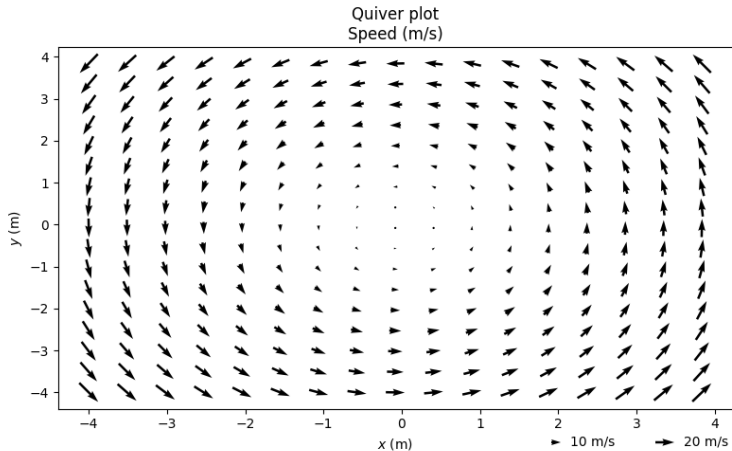
```
CS = plt.contour(x, y, z, 5)  
plt.clabel(CS, inline=1, fontsize=10)
```



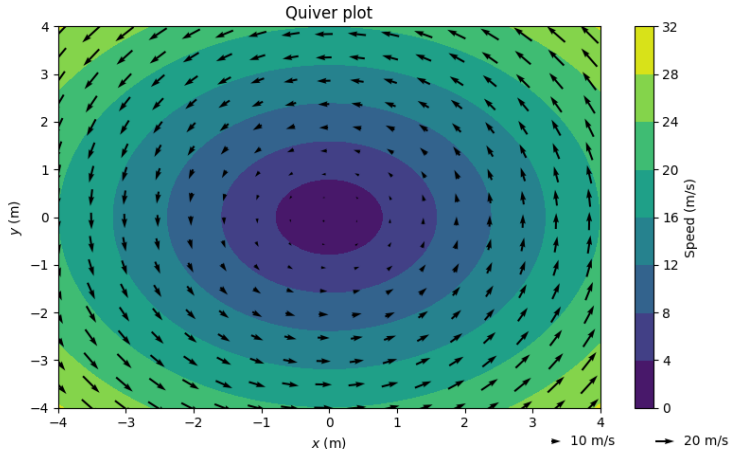
```
plt.contourf(x, y, z, 5)  
plt.colorbar(label='Water height (mm)')
```



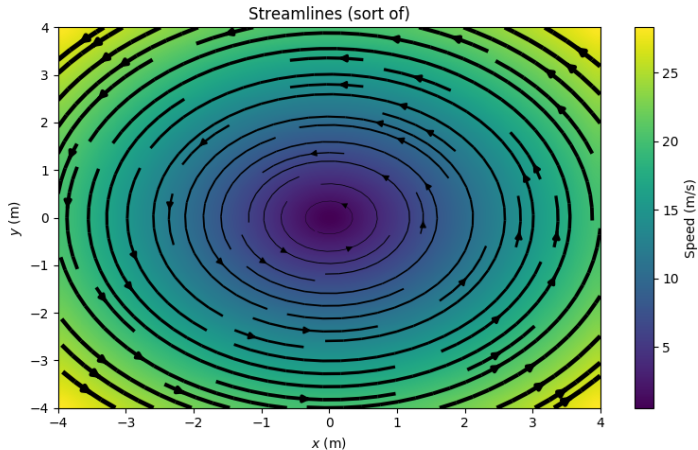
```
plt.imshow(z, interpolation='bicubic', origin='lower',  
           extent=[-4,2,-4,2], aspect='auto', vmin=-40, vmax=20)  
plt.colorbar(label='water_height (mm)')  
cs = plt.contour(x, y, z, 5, colors='black', linewidths=1.0)  
plt.clabel(cs, inline=1, fontsize=10)
```



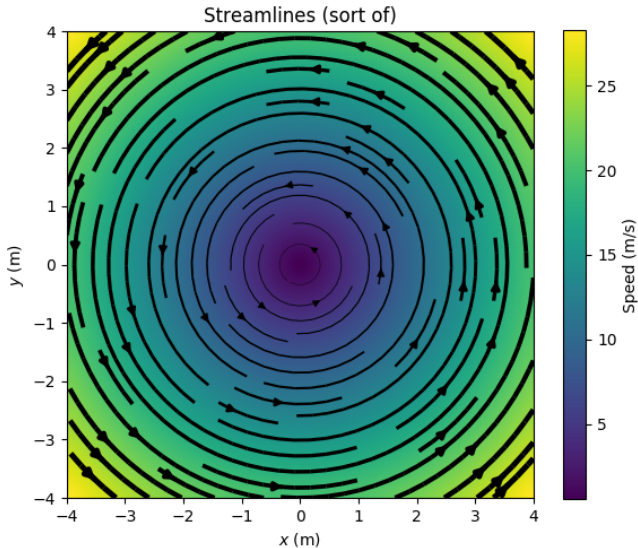
```
Q = plt.quiver(x, y, U, V, pivot='mid',  
               scale_units='dots', scale=1)  
plt.quiverkey(Q, 0.9, 0.05, 20, r'20 m/s',  
              labelpos='E', coordinates='figure')  
plt.quiverkey(Q, 0.75, 0.05, 10, r'10 m/s',  
              labelpos='E', coordinates='figure')
```



```
plt.contourf(x,y,speed)
plt.colorbar(label='Speed (m/s)')
Q = plt.quiver(x, y, U, V, pivot='mid',
               scale_units='dots', scale=1)
plt.quiverkey(Q, 0.9, 0.05, 20, r'20 m/s',
              labelpos='E', coordinates='figure')
plt.quiverkey(Q, 0.75, 0.05, 10, r'10 m/s',
              labelpos='E', coordinates='figure')
```



```
plt.imshow(speed, origin='power', interpolation='bicubic',  
           extent=[x.min(), x.max(), y.min(), y.max()], aspect='auto')  
plt.colorbar(label='Speed (m/s)')  
plt.streamplot(x,y,U,V, linewidth=nspeed, color='k')
```

```
plt.imshow(speed, origin='power', interpolation='bicubic',  
           extent=[x.min(), x.max(), y.min(), y.max()], aspect=1)  
plt.colorbar(label='Speed (m/s)')  
plt.streamplot(x,y,U,V, linewidth=nspeed, color='k')
```

The color scale is important

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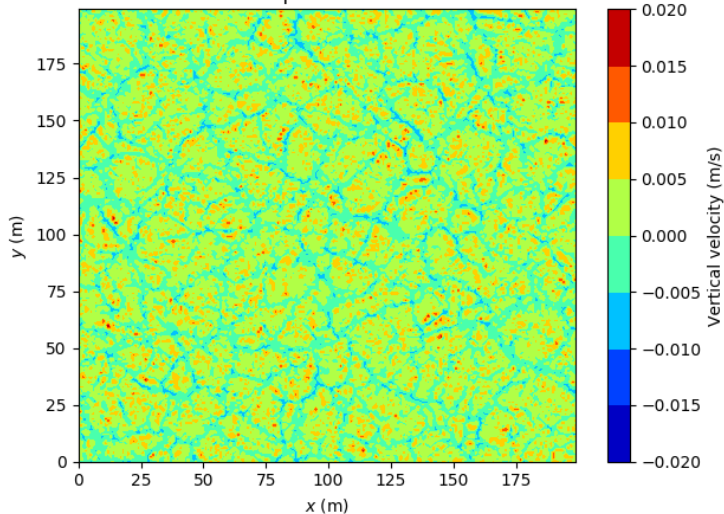
Refs.

- Prefer a scale that has continuous color perception
- Scale depends on the characteristic of your data (clear +/- dichotomy?)
- Plotting log also might be useful

Different colormaps animation

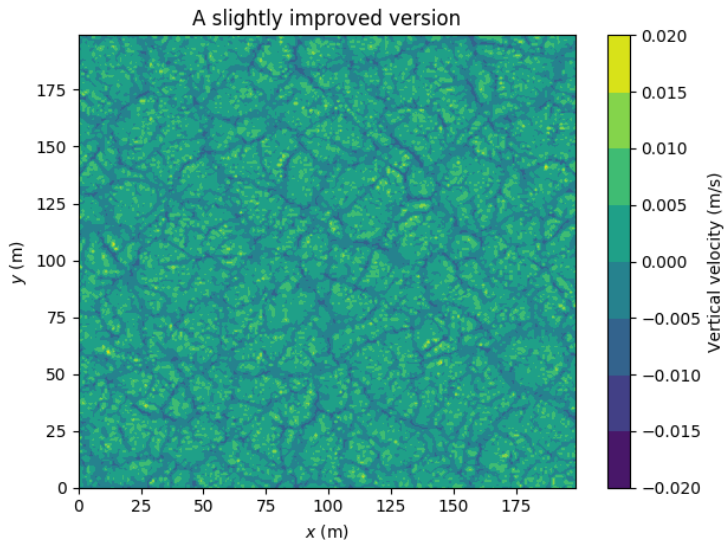
Jet colormap

First plot looks bad



```
plt.contourf(w0, cmap='jet')
```

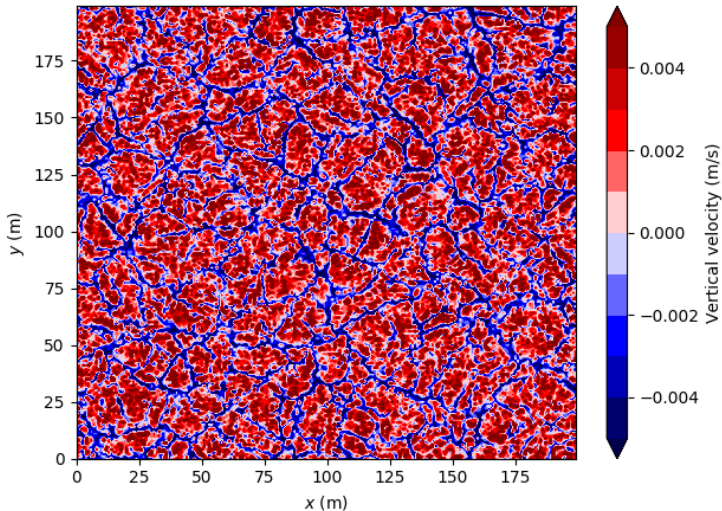
Viridis colormap



```
plt.contourf(w0, cmap='viridis')
```

Symmetric (divergent) colormap

A better version



```
plt.contourf(w0, cmap='seismic')
```

Some features might be easier to see

Basics

1D data

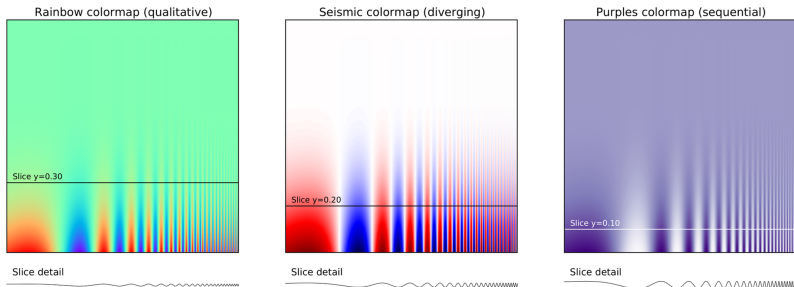
Semilog plot
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2D data

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3D data (animations)

Refs.



Taken from Rougier, Droettboom, and Bourne, (2014).

Temperature animation

```
# Data reading happens before this
fig = plt.figure()
ims = []

for it in range(300):
    im = plt.imshow(T[it], animated=True, cmap='viridis',
                    origin='lower', extent=[0, 1e3, 0, 1e3],
                    vmin=T.min(), vmax=T.max(), interpolation='bicubic')
    tx = im.axes.text(0, 0, 'Timestep: {}'.format(it),
                     color='black')
    ims.append([im, tx])

plt.colorbar(label='T⊥(K)')
plt.xlabel('$x$ (m)')
plt.ylabel('$y$ (m)')
plt.title('Temperature at the top of a convective ocean')
plt.tight_layout()
ani = animation.ArtistAnimation(fig, ims, interval=50,
                                blit=True, repeat_delay=1000)
ani.save('T_surf.mp4', dpi=150)
```

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Refs.

Oil animation

```
# Data reading happens before this
```

```
fig = plt.figure()
ims = []
for it in range(300):
    im = plt.imshow(C[it], animated=True, cmap='plasma',
                    origin='lower', extent=[0, 1e3, 0, 1e3],
                    vmin=0., vmax=10., interpolation='bicubic')
    tx = im.axes.text(0, 0, 'Timestep: {}'.format(it),
                     color='white')
    ims.append([im, tx])

plt.colorbar(label='Oil Concentration (kg/m3)')
plt.xlabel('$x$ (m)')
plt.ylabel('$y$ (m)')
plt.title('Concentration at the top of a convective ocean')
plt.tight_layout()
ani = animation.ArtistAnimation(fig, ims, interval=50,
                                blit=True, repeat_delay=1000)
ani.save('C_linear.mp4', dpi=150)
```

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Refs.

Oil animation

```
# Data reading happens before this
from matplotlib.colors import LogNorm
fig = plt.figure()
ims = []
for it in range(300):
    im = plt.imshow(C[it], animated=True, cmap='plasma',
                    origin='lower', extent=[0, 1e3, 0, 1e3],
                    vmin=1.e-4, vmax=10., interpolation='bicubic',
                    norm=LogNorm())
    tx = im.axes.text(0, 0, 'Timestep: {}'.format(it),
                     color='white')
    ims.append([im, tx])

plt.colorbar(label='Oil Concentration (kg/m3)')
plt.xlabel('$x$ (m)')
plt.ylabel('$y$ (m)')
plt.title('Concentration at the top of a convective ocean')
plt.tight_layout()
ani = animation.ArtistAnimation(fig, ims, interval=50,
                                blit=True, repeat_delay=1000)
ani.save('C_log.mp4', dpi=150)
```

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Refs.

- Slides and scripts are going to be available
- Written in Python3, but should work with Python2



Matplotlib Gallery. 2017. URL:
<https://matplotlib.org/gallery.html> (visited on
05/05/2017).



Nicolas P. Rougier. *matplotlib-tutorial: Version 1.0*.
Aug. 2015. DOI: [10.5281/zenodo.28747](https://doi.org/10.5281/zenodo.28747). URL:
<https://doi.org/10.5281/zenodo.28747>.



Nicolas P. Rougier, Michael Droettboom, and
Philip E. Bourne. “Ten Simple Rules for Better Figures”.
In: *PLOS Computational Biology* 10.9 (Sept. 2014),
pp. 1–7. DOI: [10.1371/journal.pcbi.1003833](https://doi.org/10.1371/journal.pcbi.1003833). URL:
<https://doi.org/10.1371/journal.pcbi.1003833>.