

Getting more out of Matplotlib with GR

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Bilbao | EuroPython 2015 | Josef Heinen | @josef_heinen



Visualization needs

- ✓ visualize and analyzing two- and three-dimensional data sets
- ✓ plot 2D data for real-time monitoring purposes (signal processing)
- ✓ visualize large data sets, probably with a dynamic component, preferably in real-time
- ✓ create publication-quality and web-ready graphics
- ✓ create animations or videos on the fly

Python visualization solutions

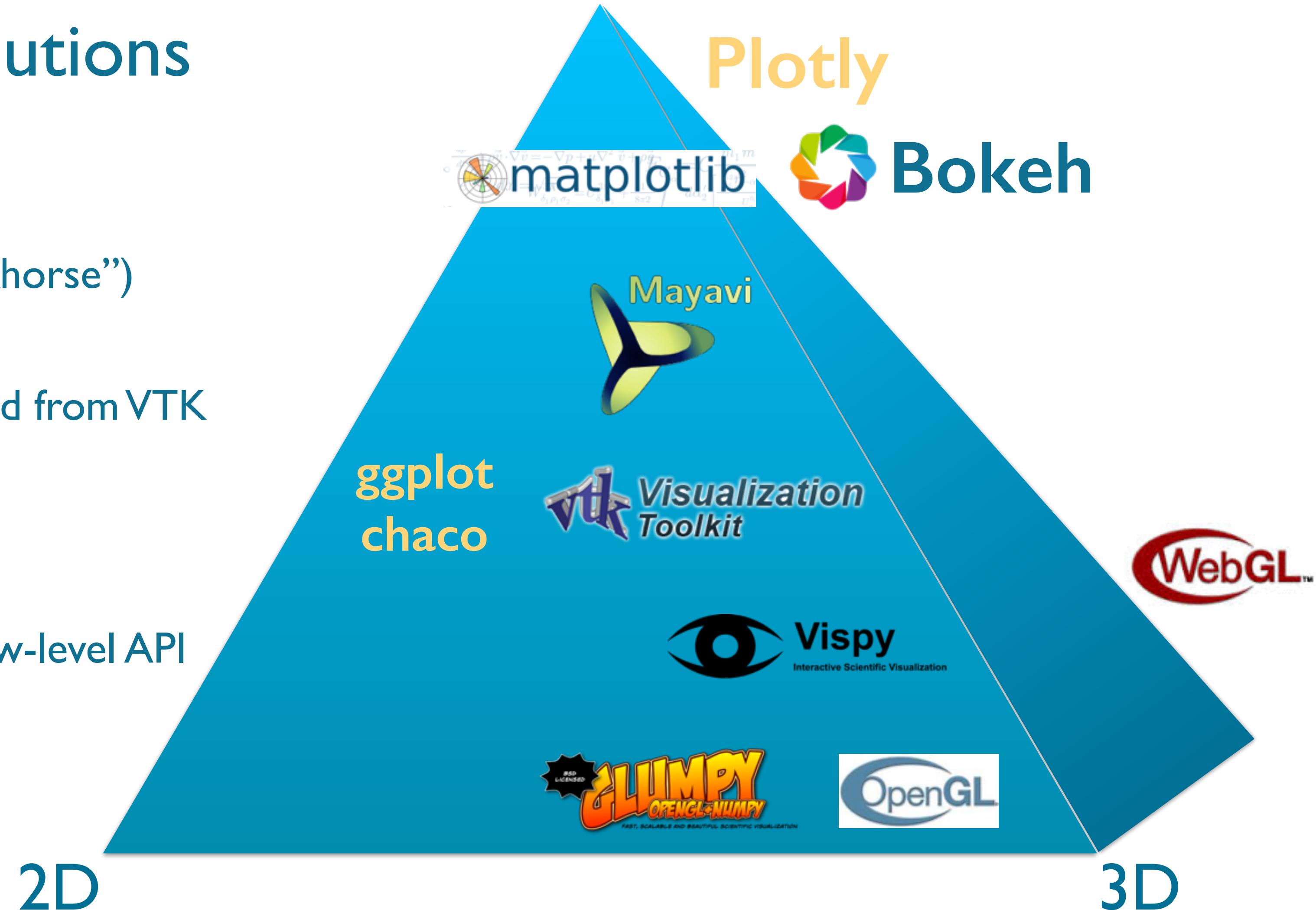
Matplotlib — de-facto standard (“workhorse”)
→ Browser solutions: Bokeh, plot.ly

Mayavi (mlab) — powerful, but overhead from VTK

ggplot, chaco — statistical, 2D graphics

VTK — versatile, but difficult to learn

Vispy, Glumpy, OpenGL — fast, but low-level API

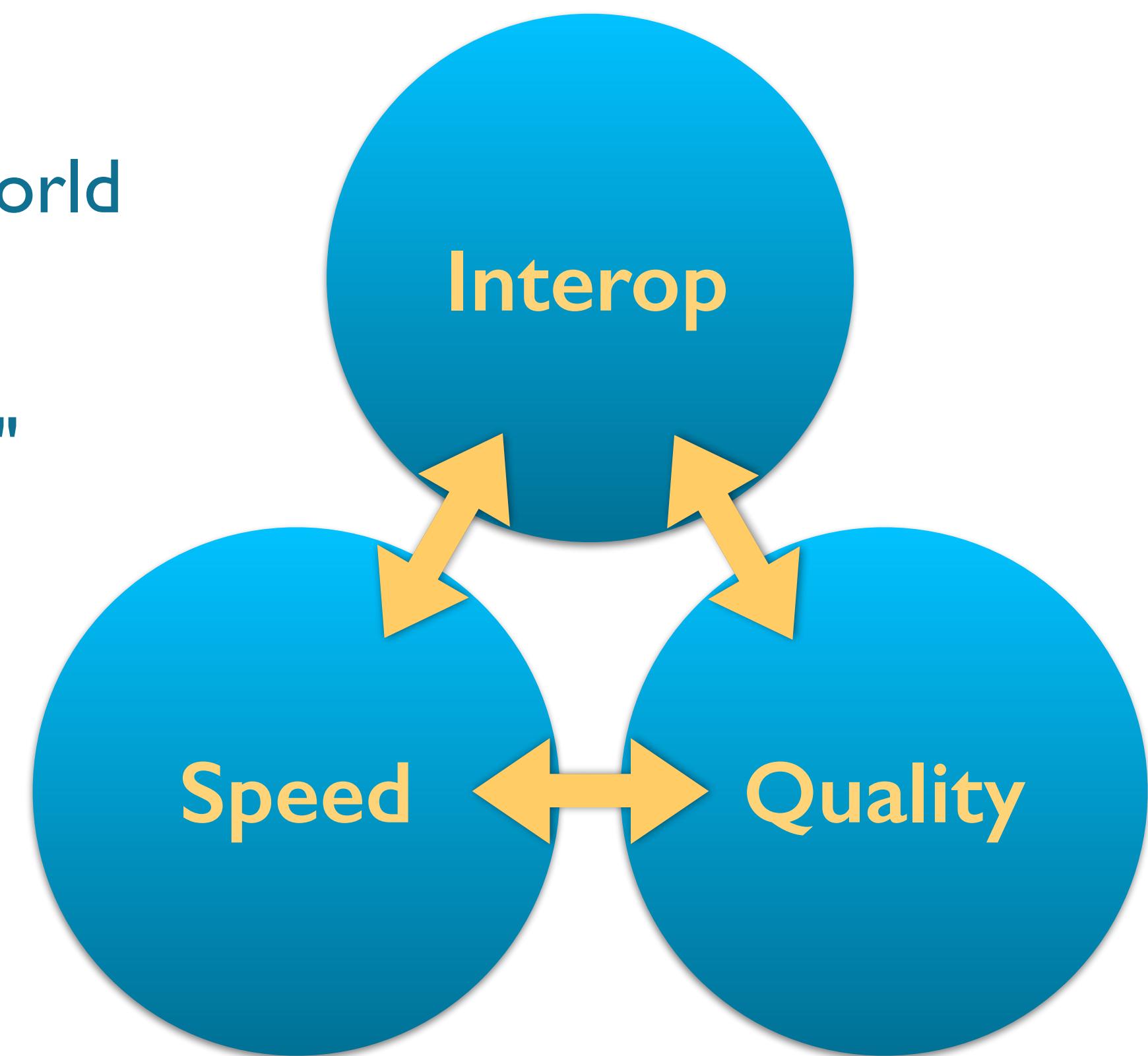


Problems so far — Crux of the matter

separated 2D and (hardware accelerated) 3D world

some graphics backends "only" produce "figures"
⇒ no presentation of continuous data streams

speed up "only" by means of backend specific
code ⇒ poor performance on large data sets



Where to go from here?

How can we improve the performance?

- ✓ Several Python modules can be compiled into native code, making them much faster (Cython)
- ✓ Compiling hotspots on the fly (Numba, PyPy) can significantly speed up numerical code segments
- ✓ Use hardware acceleration, but ...
... these approaches cannot easily be applied to visualization software! 

⇒ Could another backend speedup Matplotlib and improve interop ?

Use GR to achieve more graphics performance

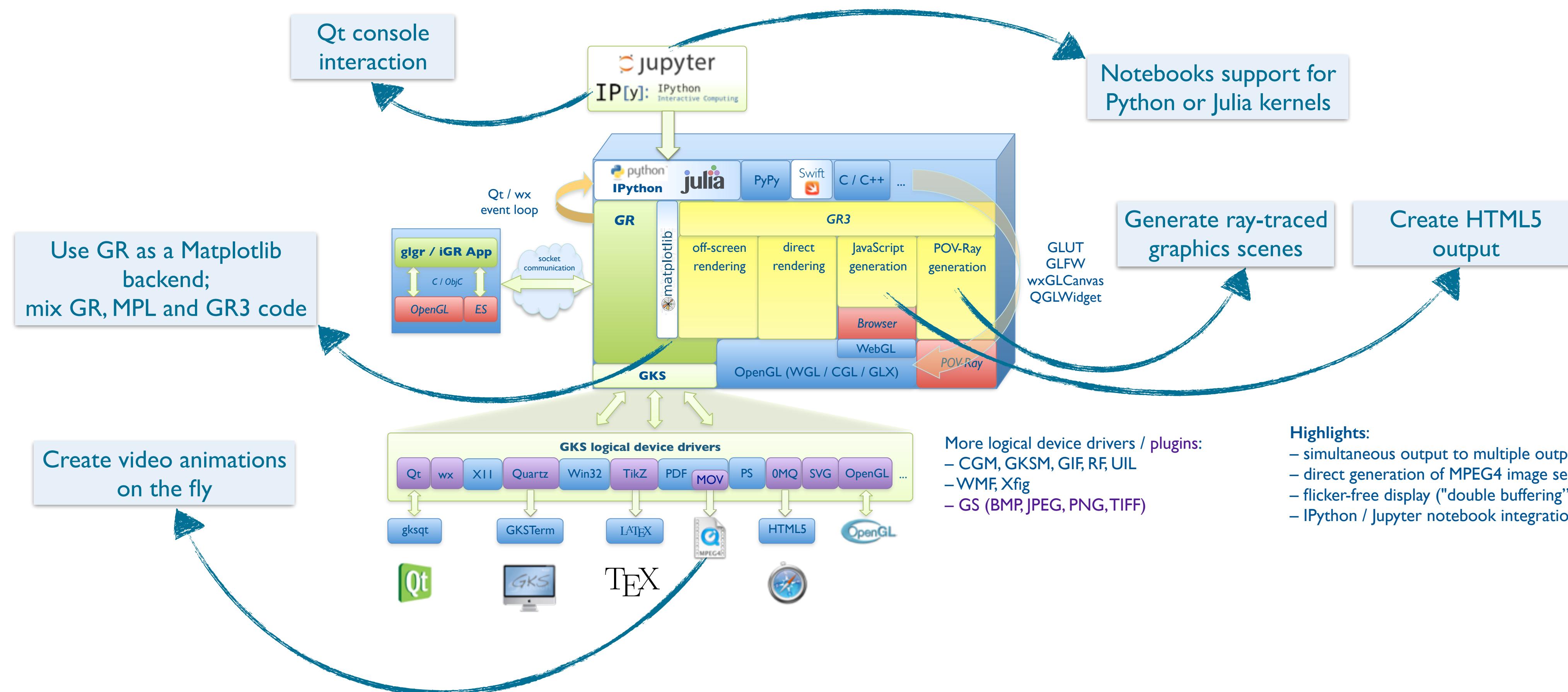
- ✓ procedural graphics backend (completely written in C)
 - ⇒ presentation of continuous data streams
- ✓ builtin support for 2D plotting and OpenGL (GR3)
 - ⇒ coexistent 2D and 3D world
- ✓ interoperability with GUI toolkits and Web frameworks
 - ⇒ good user interaction



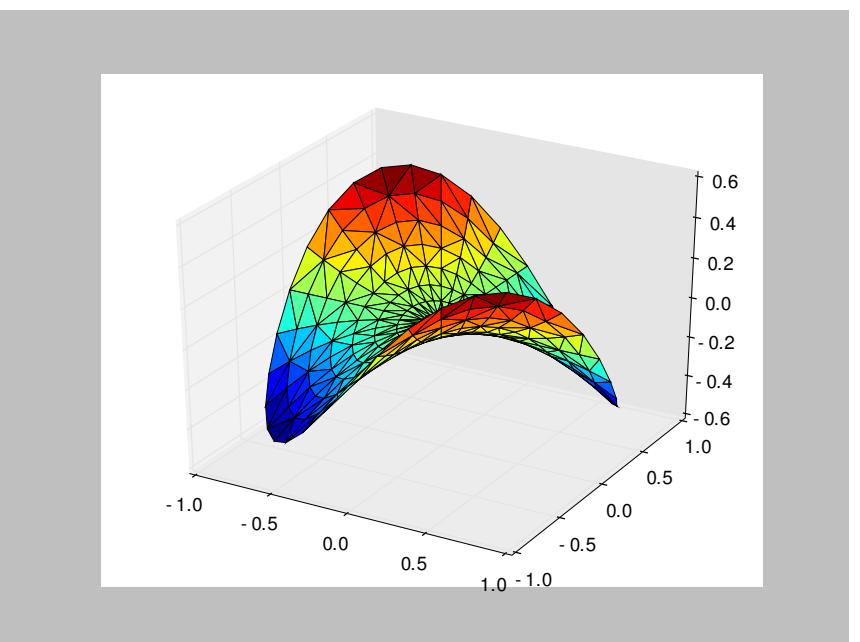
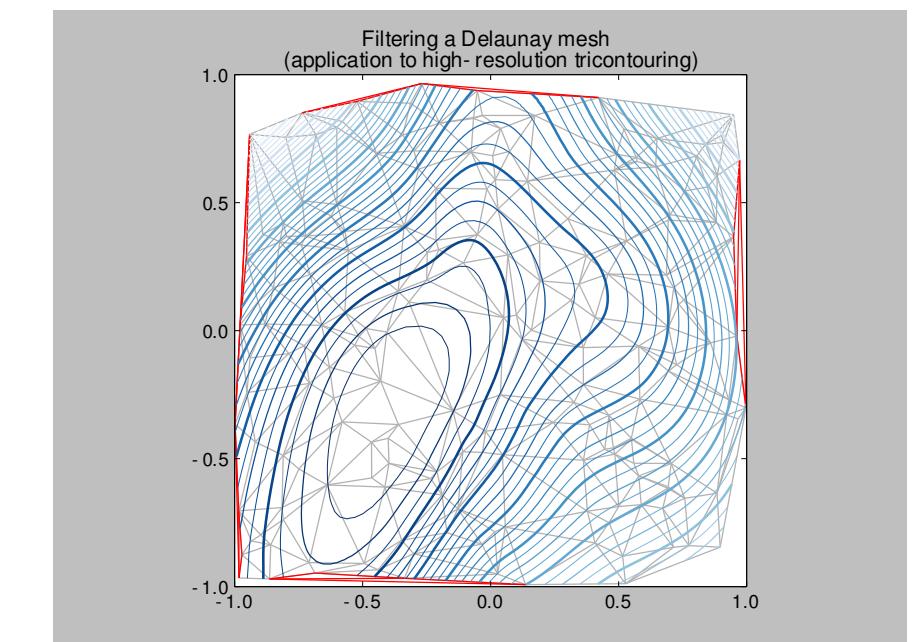
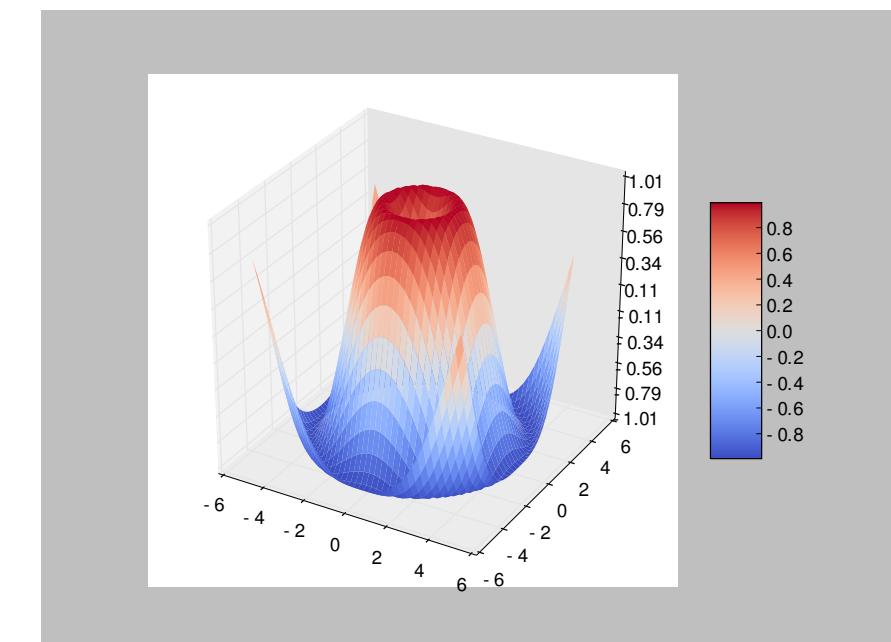
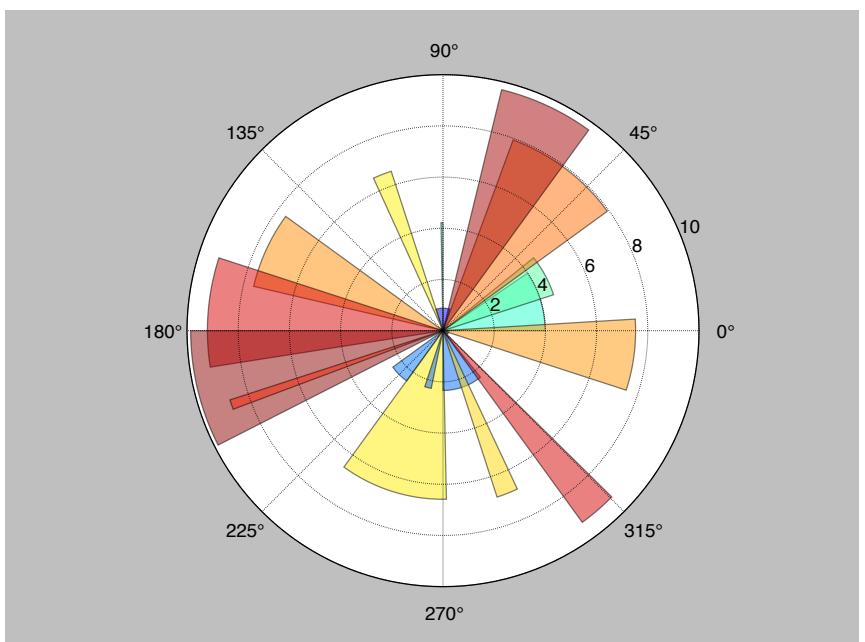
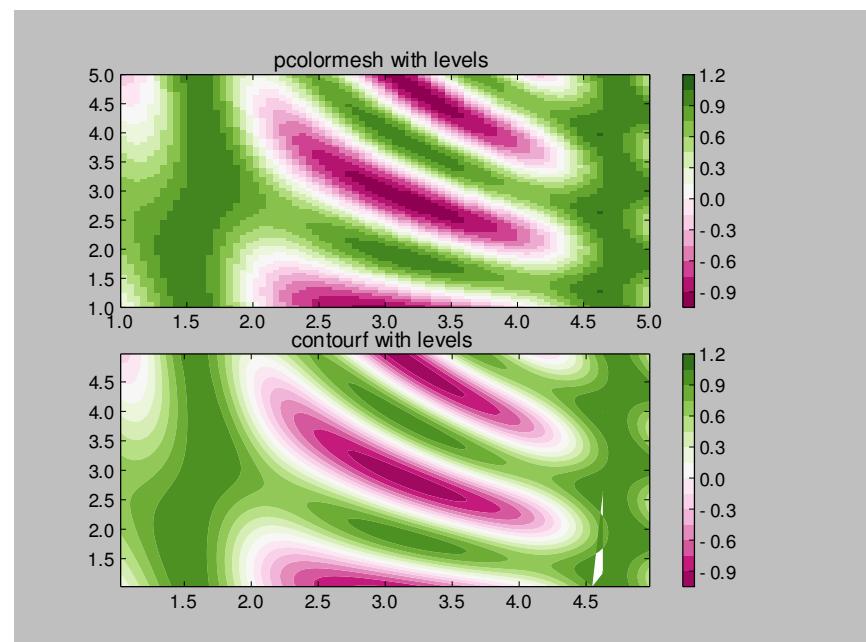
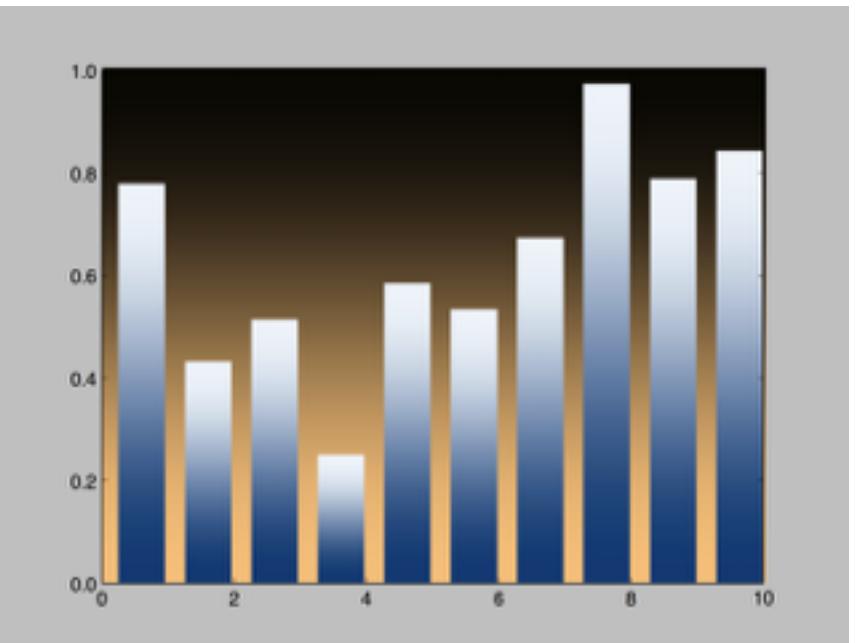
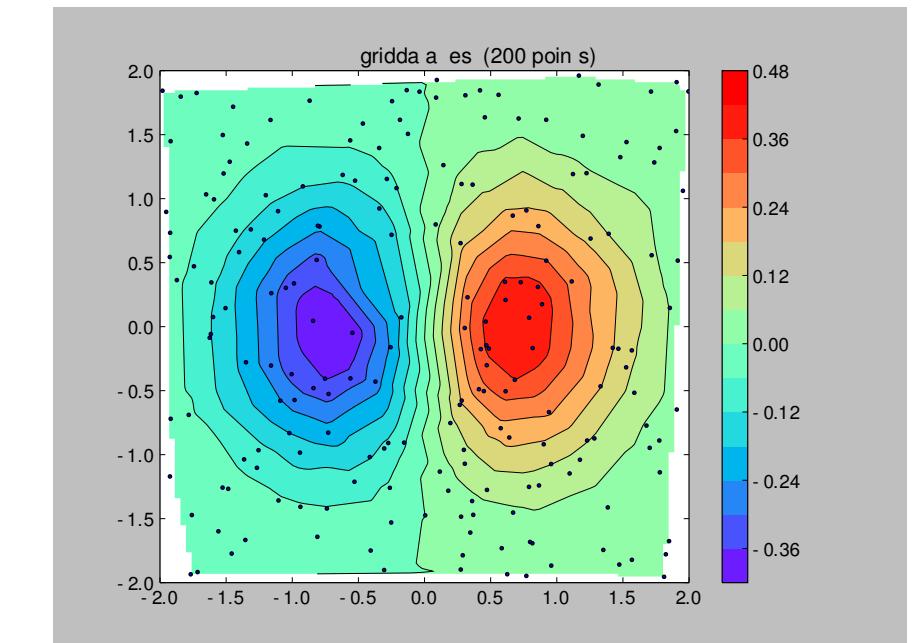
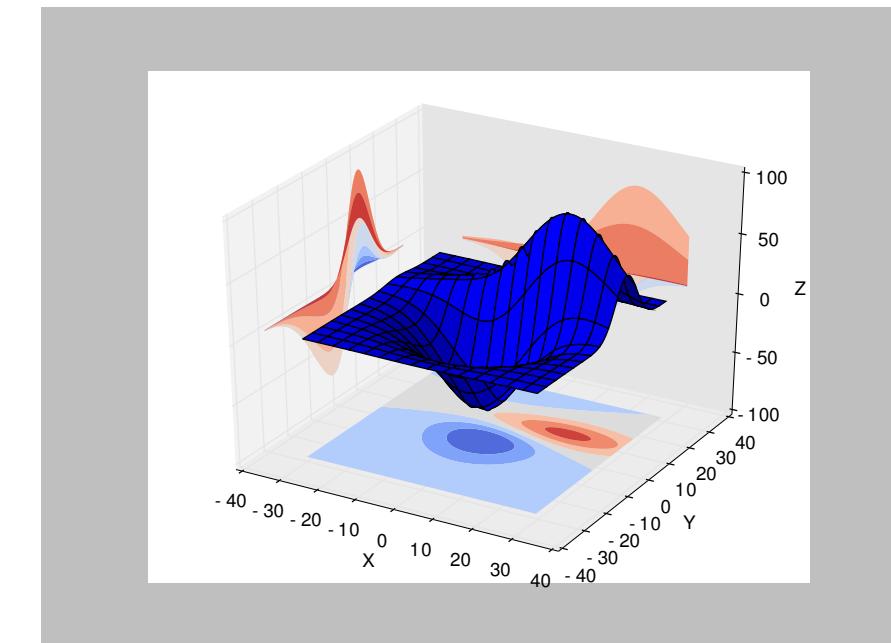
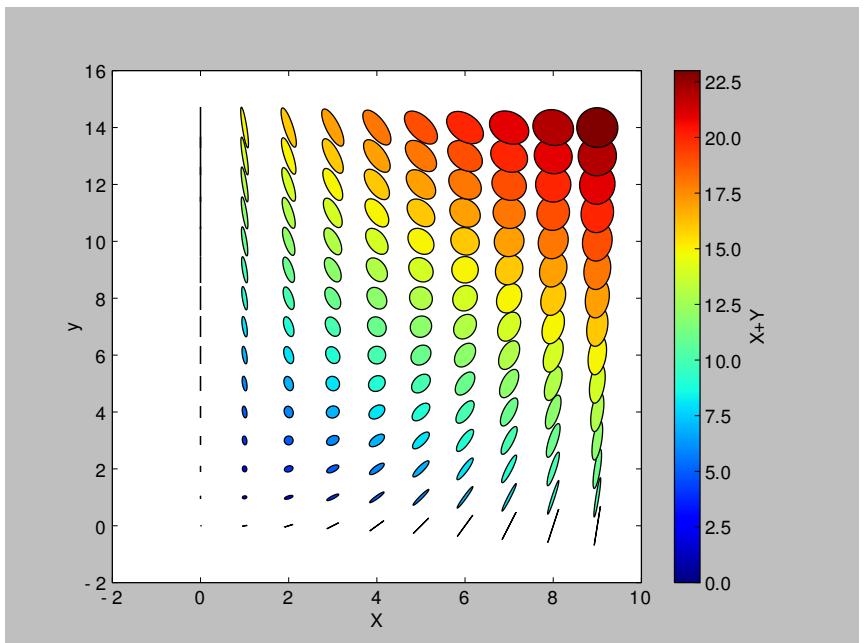
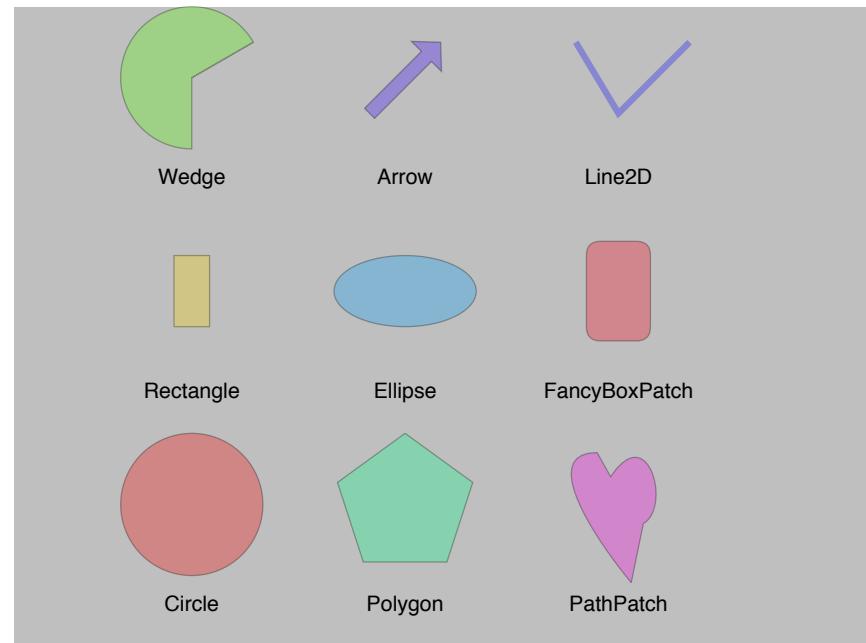
Use GR to extend Matplotlib's capabilities

- ✓ combine the power of Matplotlib and GR
 - ⇒ next Matplotlib release will allow selecting the backend by setting the environment variable `MPLBACKEND`
- ✓ produce video contents on the fly by adding a single line of code
 - ⇒ no need to import an animation module or write extra code
- ✓ create plots containing both 2D and 3D graphics elements

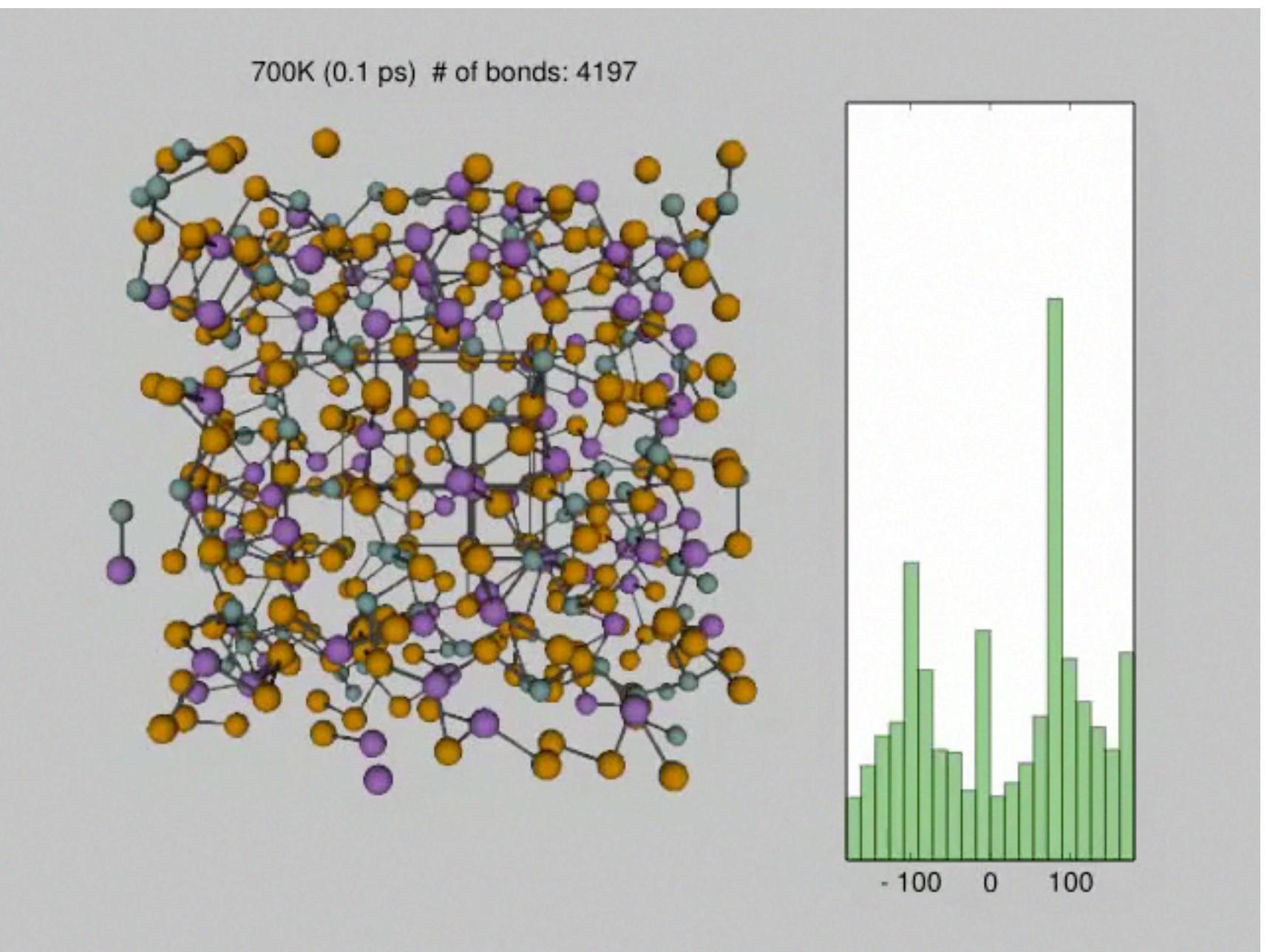
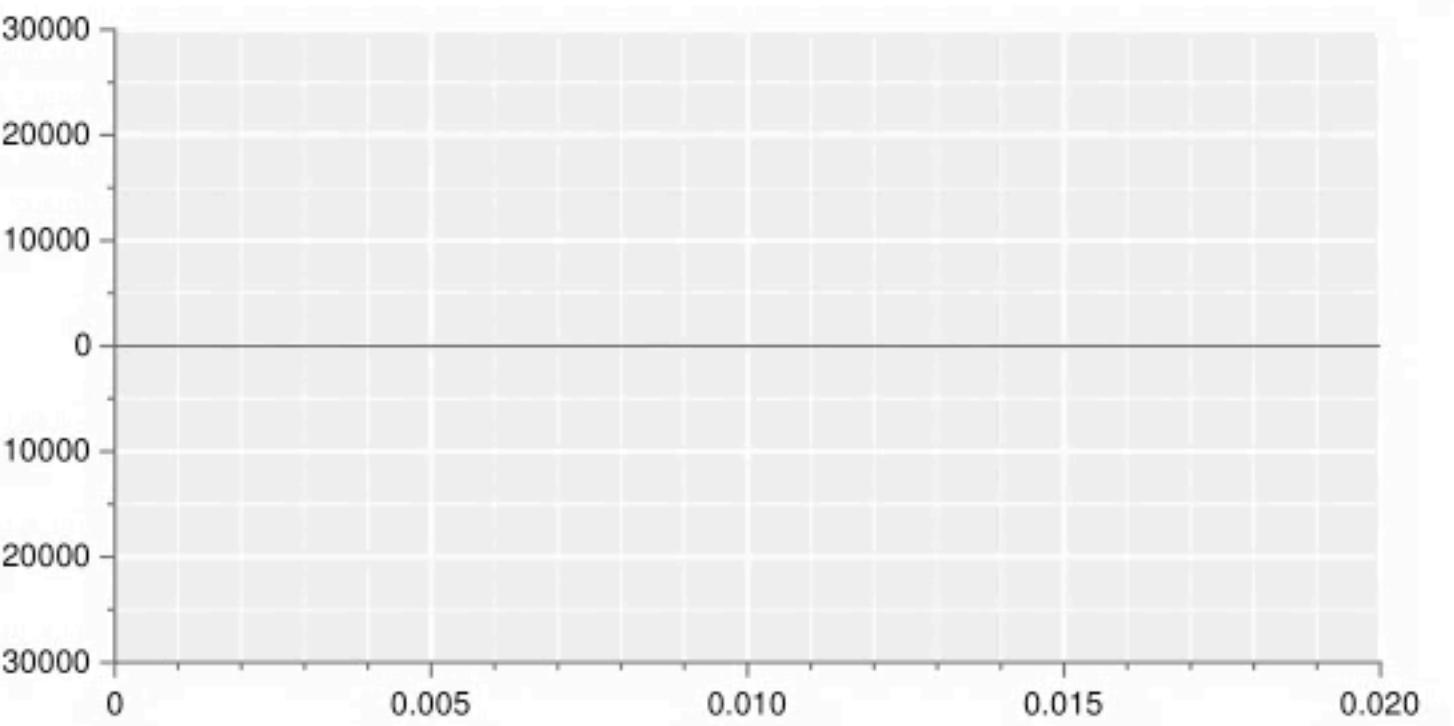
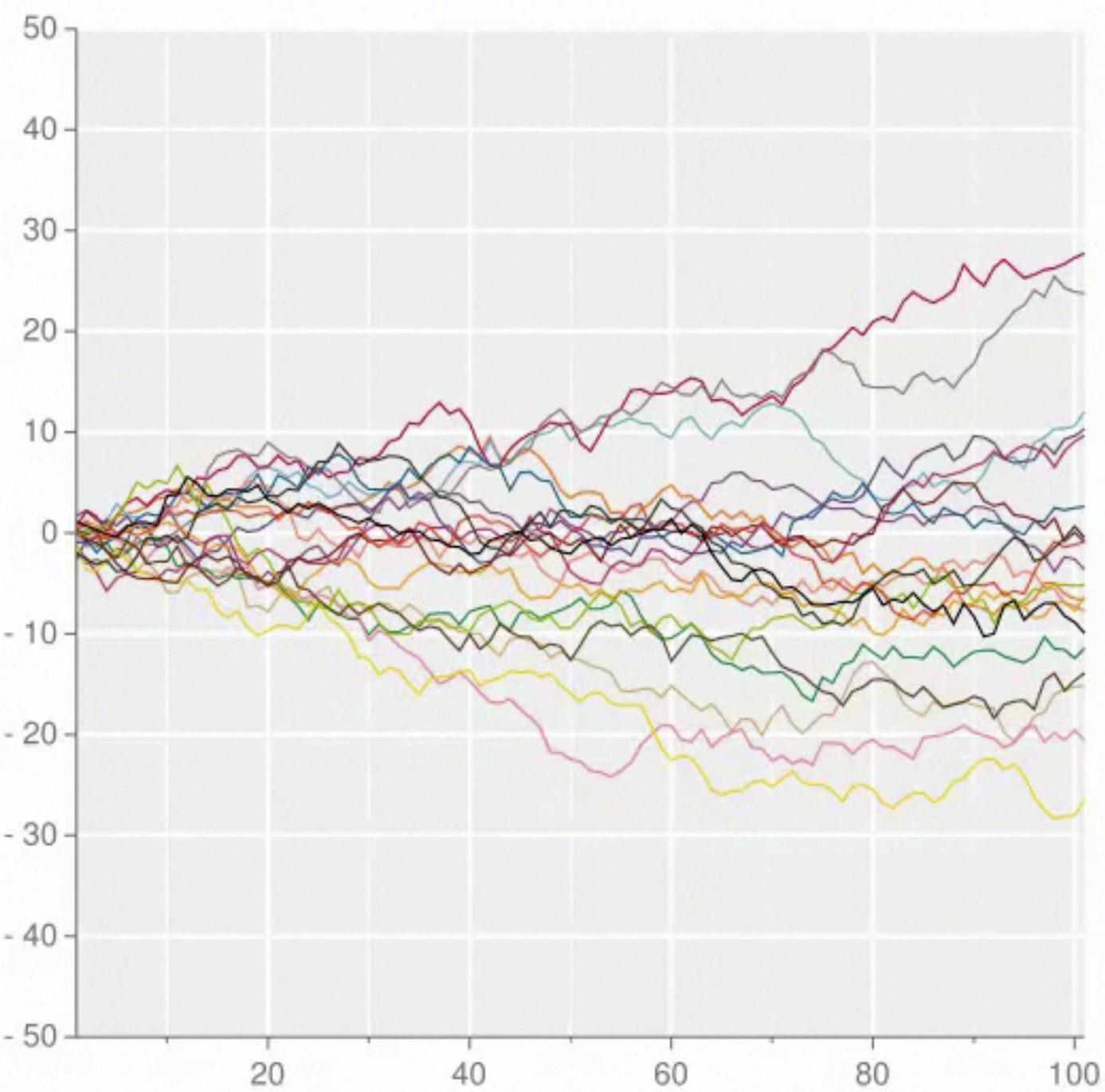
How it works: GR layer architecture



Matplotlib using the GR backend

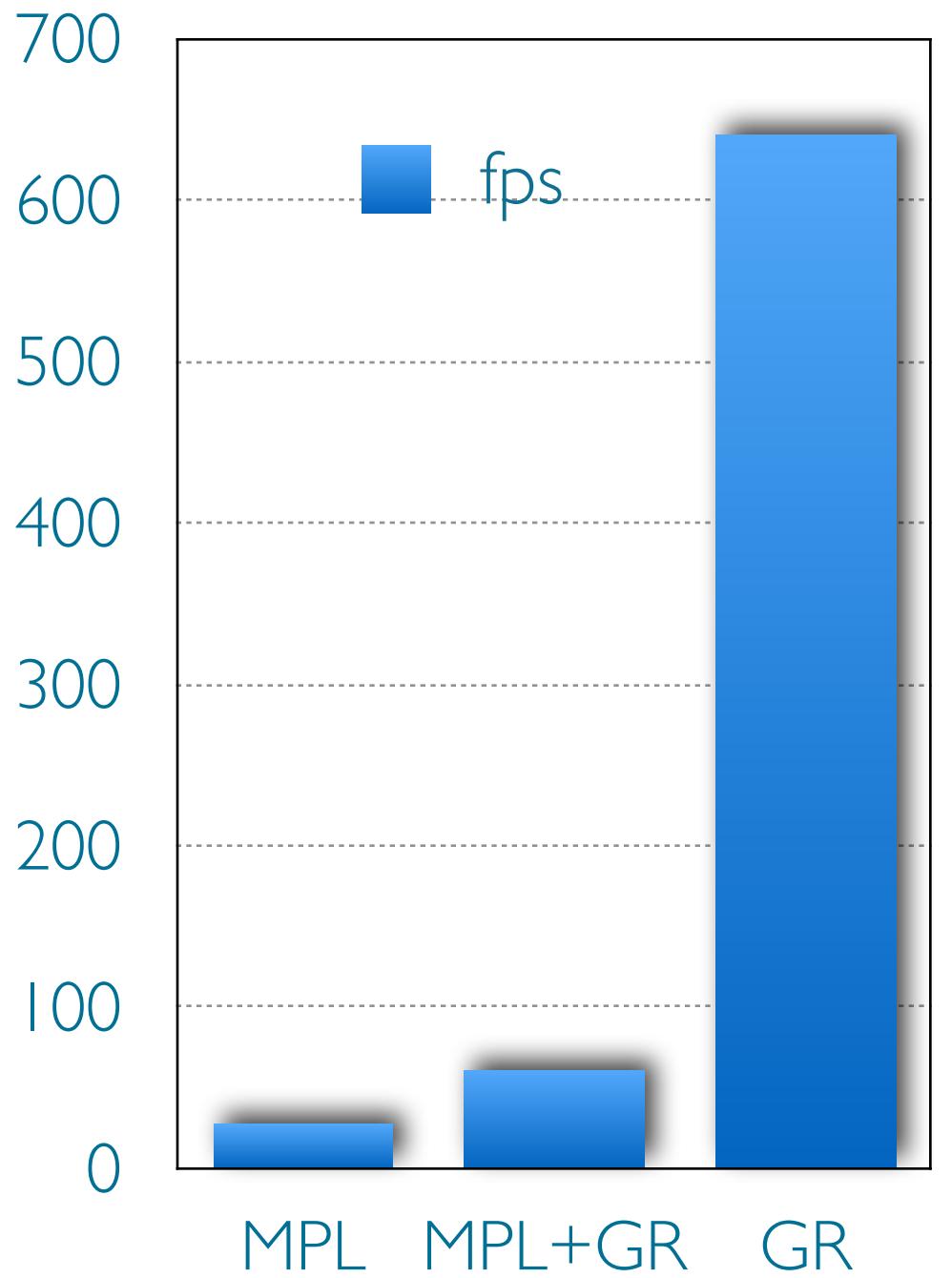


GR in action ...



GR / Jupyter

Performance (anim.py)



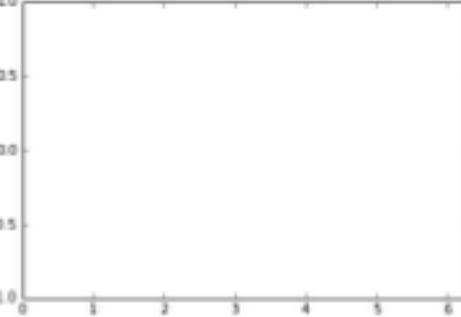
Animated graphics performance comparison: Matplotlib vs. GR

Let's start with a Matplotlib example ...

```
In [1]: from numpy import arange, sin, pi
x = arange(0, 2 * pi, 0.01)

In [2]: %matplotlib inline
import matplotlib.pyplot as plt
import matplotlib.animation as anim

In [3]: fig = plt.figure()
ax = plt.axes(xlim=[0, 2*pi], ylim=[-1,1])
```



```
In [4]: line, = ax.plot(x, sin(x))
def animate(i):
    line.set_data(x, sin(x + i/10.0)) # update the data
    return line,
```

```
In [5]: ani = anim.FuncAnimation(fig, animate, frames=200, interval=40, repeat=False)

In [6]: ani.save("anim.mp4")

In [7]: from IPython.display import HTML
HTML('<video controls autoplay src="data:video/x-m4v;base64,{0}">'.format(open("anim.mp4", "rb").read().encode("base64")))
```

At this point, you should restart the kernel, as the Matplotlib backend can only be set once!
The numpy staff also has to be run again ...

GR / mogli / Matplotlib interoperability example

- use matplotlib package to draw a histogram of dihedral angles
- use mogli package (GR) to read and visualize a sequence of GeSbTe molecules
- add 2D plot using GR
- load numpy array (with dihedral angles)

```
In [1]: %matplotlib inline
environment['MPLBACKEND'] = 'module://gr.matplotlib.backend_gr'
import matplotlib.pyplot as plt

In [2]: import mogli
molecules = mogli.read("data/700K.xyz")

In [3]: import gr
gr.inline("mov")
gr.setregenflags(gr.MPL_POSTPONE_UPDATE)

In [4]: import numpy as np
angles = np.load("data/700K.npy")

In [5]: lens = []
for t in range(100):
    plt.clf()
    fig = plt.subplot(111)
    fig.xaxis.set_ticks([-100, 0, 100])
    fig.yaxis.set_ticks([-10, 0, 10])
    plt.ylim(0, 1000)
    plt.hist(angles[t], 20, normed=0, facecolor='g', alpha=0.5)
    plt.show()

    gr.setviewport(0.05, 0.7, 0.05, 0.7)
    gr.setwindow(0, 1, 0, 1)
    mogli.draw(molecules[t])

    gr.settextalign(gr.TEXT_HALIGN_CENTER, gr.TEXT_VALIGN_HALF)
    gr.text(0.35, 0.7, "700K (%.1f ps) # of bonds: %d" % (t / 10.0, np.size(angles[t])))
    lens.append(np.size(angles[t]))
    if t > 0:
        gr.setwindow(0, 10, 3500, 5000)
        gr.setViewport(0.1, 0.6, 0.05, 0.1)
        gr.axes(1, 0, 3500, 2, 0, 0.005)
        gr.polyline(np.arange(t+1) / 10.0, lens)

    gr.update()

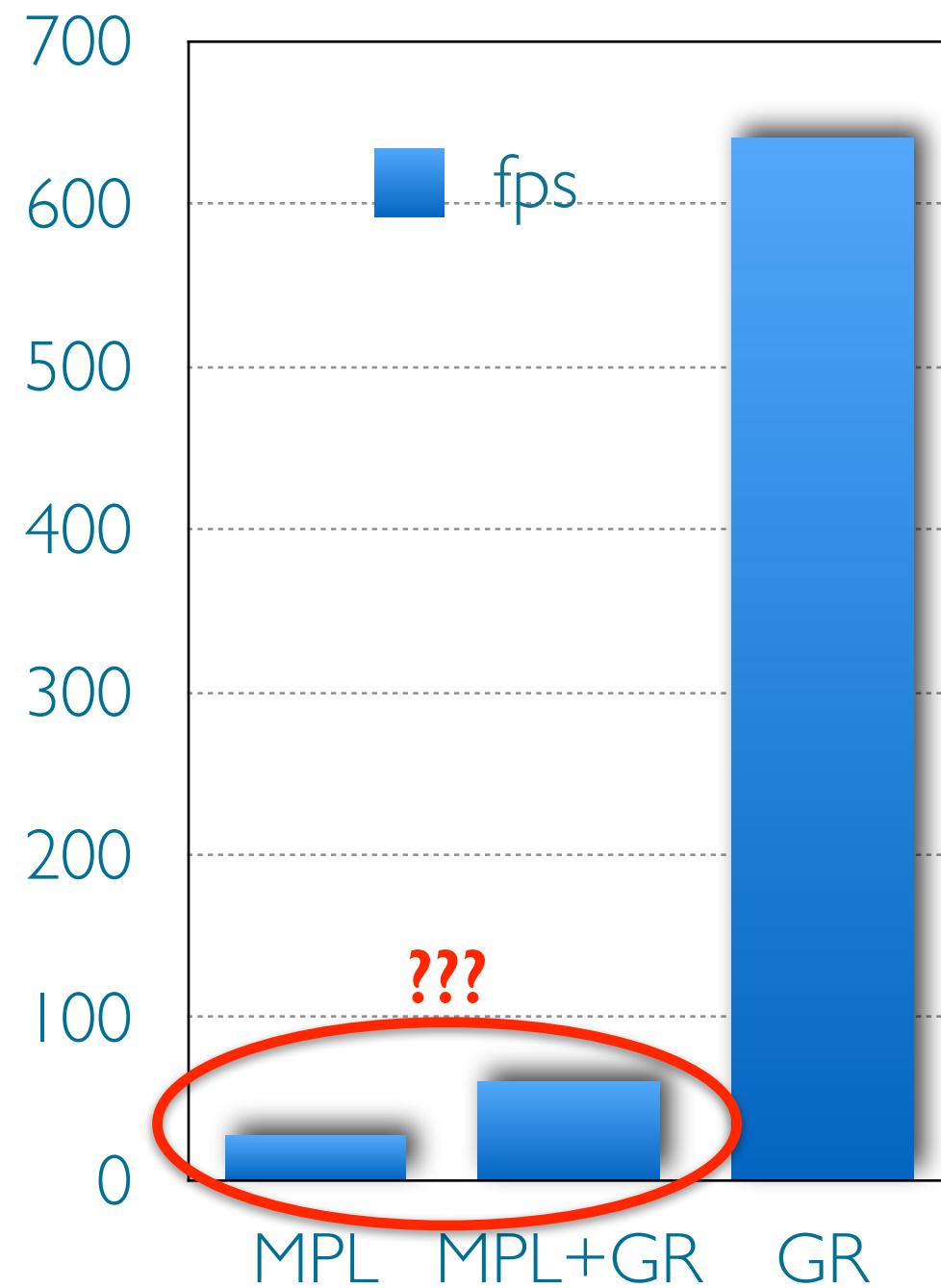
In [6]: gr.show()
Out[6]:
```

700K (9.9 ps) # of bonds: 4549



click images to view notebooks ...

Performance analysis


MPL
MPL + GR
GR

<i>ncalls</i>	<i>cumtime</i>	<i>filename:lineno(function)</i>
398	6.852	{method'draw'of'_macosx.FigureCanvas'objects}
29378/397	6.771	artist.py:57(draw_wrapper)
397	6.769	figure.py:1004(draw)
397	6.574	_base.py:1989(draw)
794	5.894	axis.py:1106(draw)
5161	4.601	axis.py:232(draw)
199	3.616	pyplot.py:175(pause)
10719	3.609	lines.py:661(draw)
199	3.480	pyplot.py:551(draw)
7940	1.044	text.py:581(draw)

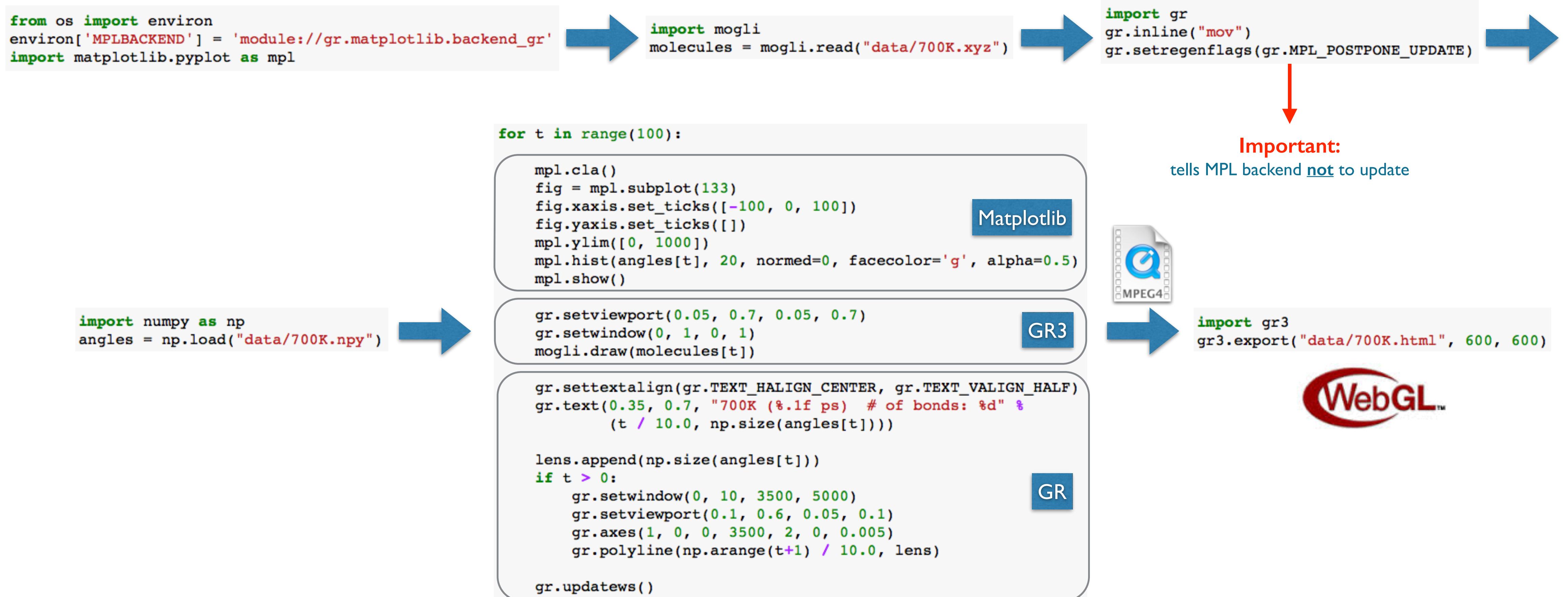
<i>ncalls</i>	<i>cumtime</i>	<i>filename:lineno(function)</i>
199	4.412	pyplot.py:551(draw)
199	4.410	backend_gr.py:227(draw)
14726/199	4.237	artist.py:57(draw_wrapper)
199	4.236	figure.py:1004(draw)
199	4.138	_base.py:1989(draw)
398	3.770	axis.py:1106(draw)
2587	3.073	axis.py:232(draw)
5373	2.642	lines.py:661(draw)
5174	1.202	backend_bases.py:237(draw_markers)

<i>ncalls</i>	<i>cumtime</i>	<i>filename:lineno(function)</i>
199	3.263	__init__.py:1910(plot)
199	3.184	__init__.py:250(updatews)

most time spent in
backend wrapper

No room for further
optimizations on the
backend side

GR + GR3 + Matplotlib interop



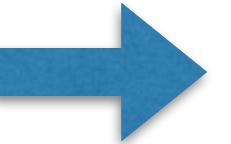
Inline graphics

Matplotlib

```
%matplotlib inline
import matplotlib.pyplot as mpl

fig, ax = mpl.subplots()
for i in arange(1, 200):
    clear_output(wait=True)
    ax.cla()
    ax.plot(x, sin(x + i / 10.0))
    display(fig)

mpl.close()
```



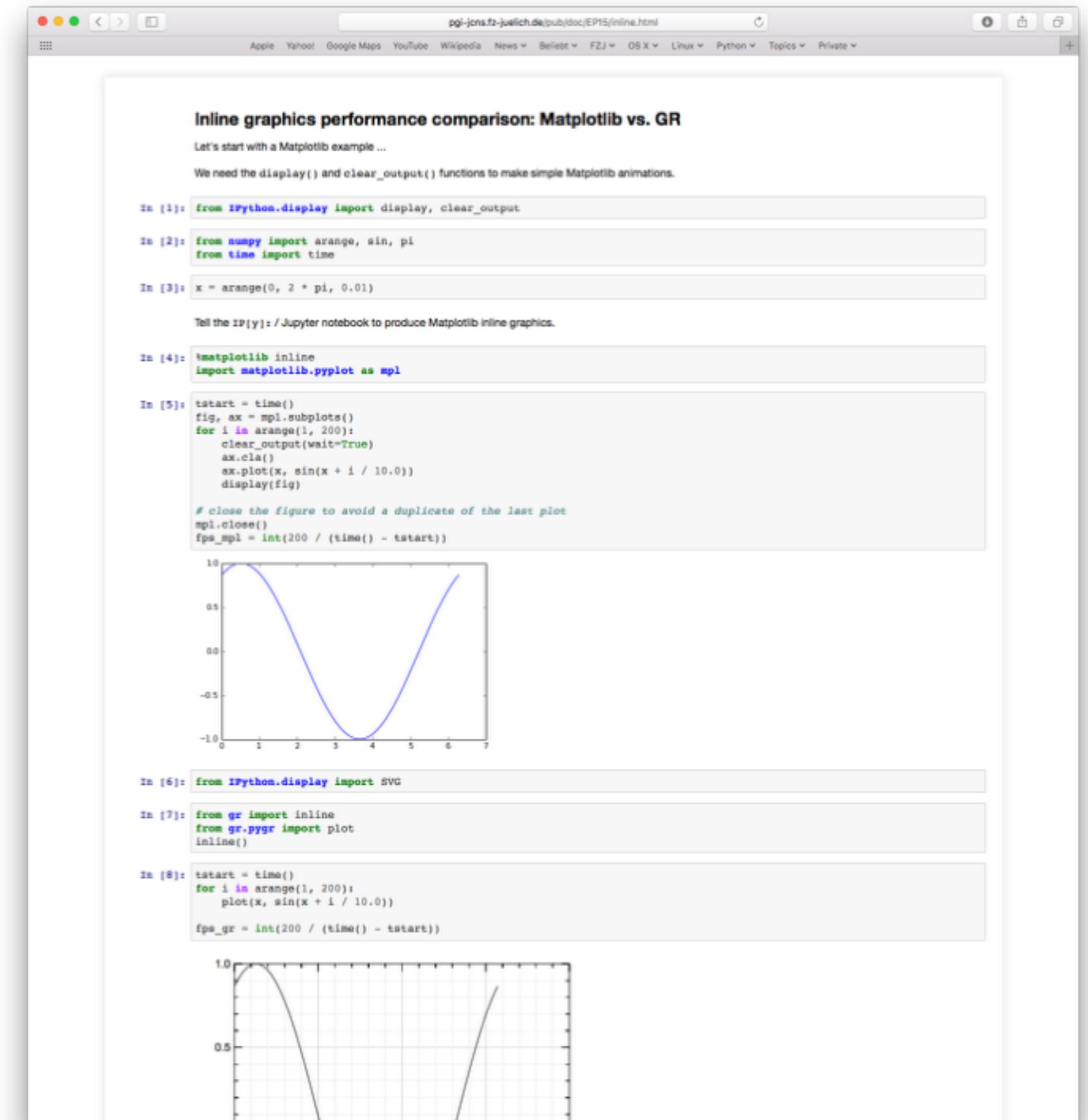
GR

```
from gr import inline
from gr.pygr import plot
inline()

for i in arange(1, 200):
    plot(x, sin(x + i / 10.0))
```



~ 10 times faster



Demos

- ✓ Animated graphics performance comparison: Matplotlib vs. GR
(`anim.ipynb`)
- ✓ GR / mogli / Matplotlib interoperability example (`interop.ipynb`)
- ✓ Inline graphics performance comparison: Matplotlib vs. GR
(`inline.ipynb`)
- ✓ Simple spectral (`specgram.ipynb`)

Outlook (GR release v0.15.0)

GR + GKS can be transpiled to JS
(Emscripten: LLVM-to-JavaScript compiler)

→ Use cases:

- ✓ embed JS code in IP[y]: or IJulia (Jupyter)
- ✓ parse GKS JavaScript logical device driver generated display list in browser

JavaScript

```
var gr = new GRO();
var t = 0;
var x = new Array(629);
var y = new Array(629);

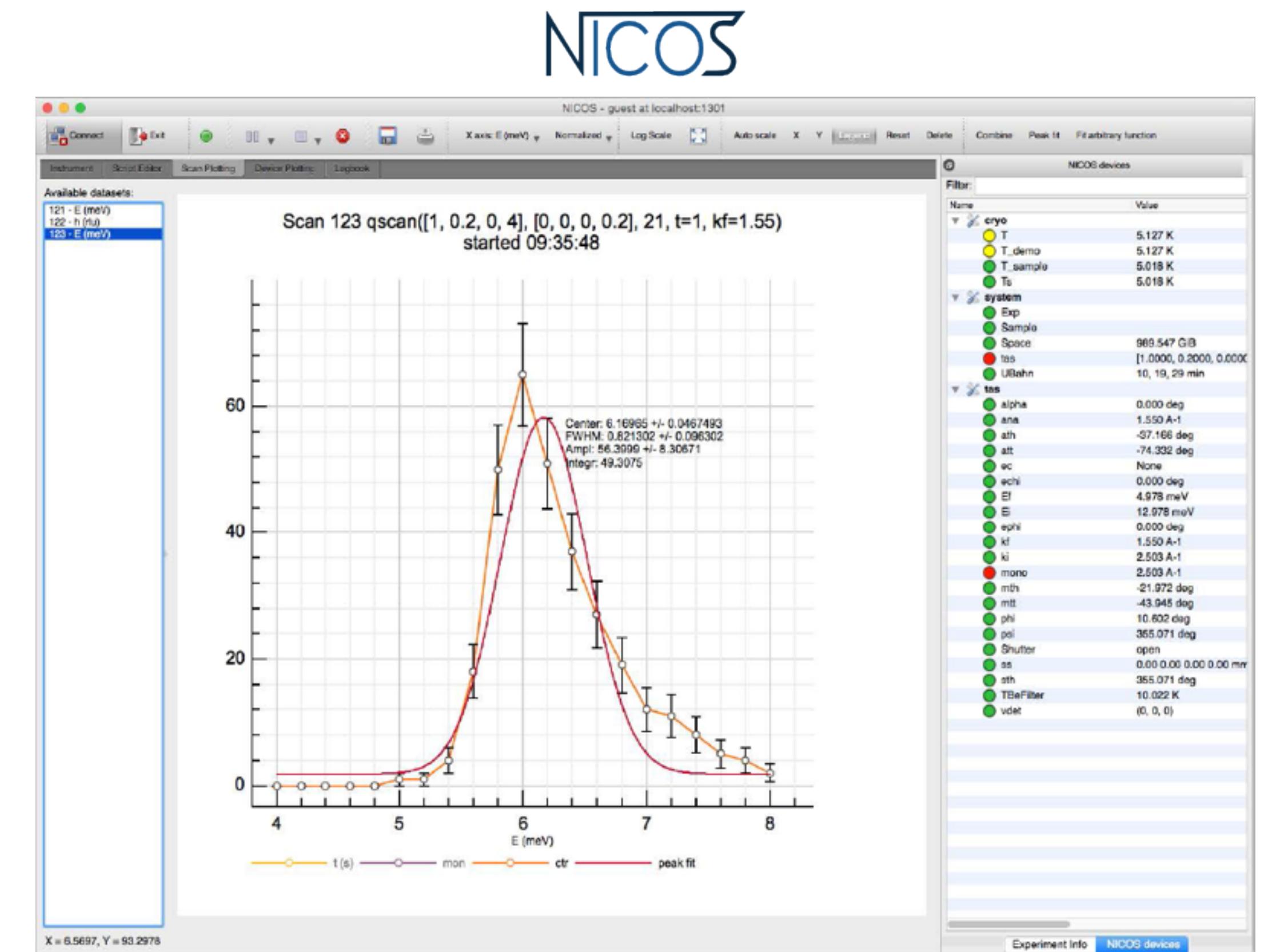
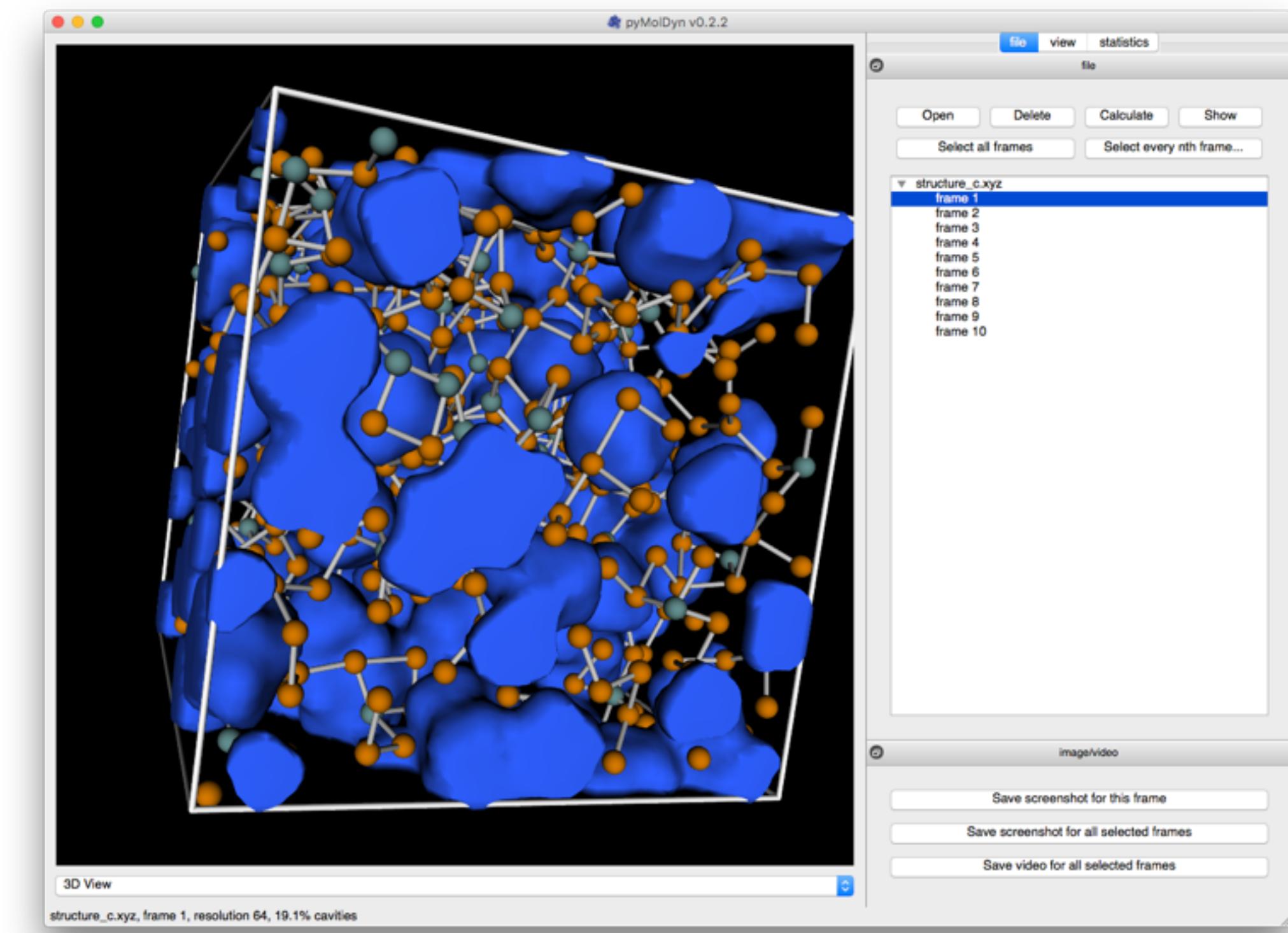
var draw = function() {
    gr_clearws();
    var i;
    for (i = 0; i < 629; i++) {
        x[i] = i / 630.0 * 2 * Math.PI;
        y[i] = Math.sin(x[i] + t / 10.0);
    }

    gr_setviewport(0.1, 0.95, 0.1, 0.95);
    gr_setwindow(0, 8, -1, 1);
    gr_setcharheight(0.020);
    gr_grid(0.5, 0.1, 0, -1, 4, 5);
    gr_axes(0.5, 0.1, 0, -1, 4, 5, 0.01);
    gr_polyline(629, x, y);
    gr_updatews();
    t = t + 1;
    if (t < 200) {
        setTimeout(draw, 1);
    }
};

draw();
```

What else can GR be used for?

pyMolDyn



see Poster session: *Embedding visualization applications with pygr by Christian Felder*

Conclusions

- ✓ Using the GR Matplotlib backend has not turned out satisfactory as the speedups were not as expected
- ✓ GR adds more plotting capabilities to Matplotlib allowing to mix 2D drawings and 3D graphics scenes or create movies on the fly
- ✓ Producing plots / figures is much faster with the GR framework (speedup for plots > 20, > 100 respectively)

What happens next?

- ✓ integrate JavaScript GKS logical device driver
- ✓ provide more convenience function
- ✓ migrate the GR3 library to *modern OpenGL* (using OpenGL shader language)
 - ⇒ visualize millions of vertices / faces
- ✓ simplify the installation

Resources

- ✓ Website: <http://gr-framework.org>
- ✓ GR framework: <https://github.com/jheinen/gr>
- ✓ PyPI: <https://pypi.python.org/pypi/gr>
- ✓ Talk material: [Getting more out of Matplotlib with GR](#)



Thank you for your attention

Questions?

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Thanks to:

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