D3 in Jupyter

PyData NYC 2015

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https://github.com/stitchfix/d3-jupyter-tutorial

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temperature_histories

localhost:8889/notebooks/temperature_histories.ipynb

jupyter temperature_histories Last Checkpoint: 2 minutes ago (autosaved)

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Code Cell Toolbar: None

Monthly Temperature Histories: Example D3 in Jupyter

This example uses data from the Daily Global Weather Measurements data set, originally collected by the National Climactic Data Center and available as a public data set on Amazon Web Services (AWS). Only selected weather stations are shown. See this blog post for a description of the data wrangling to produce the smaller csv files used in this example.

This example uses D3 for an integrated multi-part visualization with interactivity and animation.

Notebook Config

In [1]:
```
from IPython.core.display import display, HTML
from string import Template
import pandas as pd
import json
```

In [2]:
```
HTML('<script src="http://d3js.org/d3.v3.js"></script>')
```

Out[2]:

Data Reading and Formatting

In [3]:
```
worldmap_data = json.loads(open('data/worldmap.json','r').read())
```

In [4]:
```
sites_data_stations = pd.read_csv('data/stations.csv')
sites_data_stations.head()
```

https://github.com/stitchfix/d3-jupyter-tutorial

polyFill_d3

localhost:8889/notebooks/polyFill_d3.ipynb#

jupyter polyFill_d3 Last Checkpoint: Yesterday at 7:48 PM (autosaved)

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Markdown Cell Toolbar: None

PolyFill: Example of D3 in Jupyter

This example shows the combined use of Python and D3 for a randomized 2D space-filling algorithm and visualization. It uses D3's force-directed graph methods. For description of the example's motivations and space-filling algorithm see this blog post.

Libraries

In [1]:
```
from IPython.core.display import HTML
from string import Template
import pandas as pd
import random, math
```

In [2]:
```
HTML('<script src="http://d3js.org/d3.v3.js"></script>')
```

Out[2]:

Methods

Geometry methods

In [3]:
```
def dotproduct(v1, v2):
    return sum((a*b) for a, b in zip(v1, v2))

def vectorLength(v):
```

https://github.com/stitchfix/d3-jupyter-tutorial

jupyter sigma_js_graph Last Checkpoint: Last Sunday at 11:54 AM (autosaved)

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Markdown Cell Toolbar: None

Network Diagram with Sigma.js

This example uses sigma.js to visualize a network produced in python.

Notebook Config

In [1]:
```
from IPython.core.display import display, HTML
from string import Template
import pandas as pd
import json, random
```

In [2]:
```
HTML('''
<script src="lib/sigmajs/sigma.min.js"></script>
<script src="js/sigma-add-method-neighbors.js"></script>
''')
```

Out[2]:

Network Construction

In [3]:
```
random.seed(42)

n_nodes = 40
n_edges = 200
```

Overview

1. Why you may occasionally wish to do this (but likely not all the time)
2. Hello DOM!
3. Meet bl.ocks.org, I think you'll be great friends
4. A simple D3 scatterplot in Jupyter
5. A bar chart with interactivity (hello again DOM!)
6. Networks, maps and more
7. D3_lib.py (if you want to)
8. Discussion: From sketch to notebook frame

1. Why you may occasionally wish to do this (but likely not all the time)

Why not all the time?

matplotlib, mpld3, bokeh, seaborn, toyplot, vispy, vincent, ...

1. Why you may occasionally wish to do this (but likely not all the time)

Why not all the time?

matplotlib, mpld3, bokeh, seaborn, toyplot, vispy, vincent, ...

Okay. Then why bother at all?

1. Maybe you just want the ultimate freedom in your data visualization, and you happen to have some extra time on your hands, and/or you happen to be a D3 wiz.
2. Maybe the perfect visualization for your analytical needs is not readily available with other graphing tools, but there is a D3 example out there that would be perfect with just some minor tweaks.
3. Maybe you are collaborating with a front-end person on a custom viz

https://github.com/stitchfix/d3-jupyter-tutorial

Just a heads up before we dig in.

If you are not already familiar with html, css and javascript, your eyes may glaze over a bit during the first part of this tutorial.

But get what you can out of it, as understanding how it works will help you to make the most of D3 in your Jupyter notebooks. I will try to be very clear on the essential pieces of information you need to function, and on the major gotchas for troubleshooting.

And if you get too lost, fear not. At the other end, there is a small helper library and a collection of examples that you can use straight out of the box.

2. Hello DOM!

notebook: **hello_dom.ipynb**

"Oh, you can just call me Document Object Model for short"

Check me out in your browser's development tools. Highlight a particular element using the magnifying glass.

2. Hello DOM!

hello_dom.ipynb

```
from IPython.core.display import HTML
HTML( '<h1>Hello DOM!</h1>' )
```

in general ... HTML([insert a html string here and I will put it in the DOM])

(I will put it in the div assigned to the output_result of the code block that I am in.)

jupyter hello_dom

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Code | Cell Toolbar: None

In [1]:
```
from IPython.core.display import HTML
```

In [2]:
```
HTML('''
<h1>Hello DOM!</h1>
''')
```

Out[2]:

Hello DOM!

h1 567.469px × 26px

In [ ]:

Elements | Network | Sources

```
::before
▶<div class="cell code_cell rendered unselected" tabindex="2">…</div>
▼<div class="cell code_cell rendered unselected" tabindex="2">
  ▶<div class="input">…</div>
  ▶<div class="widget-area" style="display: none;">…</div>
  ▼<div class="output_wrapper">
    <div class="out_prompt_overlay prompt" title="click to scroll output; double click to hide" style></div>
    ▼<div class="output" style>
      ▼<div class="output_area">
        <div class="prompt output_prompt">Out[2]:</div>
        ▼<div class="output_subarea output_html rendered_html output_result">
          <h1>Hello DOM!</h1>
        </div>
      </div>
    </div>
    <div class="btn btn-default output_collapsed" title="click to expand output" style="display: none;">. . .</div>
  </div>
</div>
▶<div class="cell code_cell unrendered selected" tabindex="2">…</div>
::after
</div>
<div class="end_space"></div>
</div>
▶<div id="tooltip" class="ipython_tooltip" style="display:none">…</div>
```

2. Hello DOM!

hello_dom.ipynb

Let's add some style...

```
HTML('
<style> … </style>
<h1 class="steely">Hello DOM!</h1>')
```

jupyter hello_dom

File Edit View Insert Cell Kernel Help | Python 2

Code | Cell Toolbar: None

In [2]:
```
HTML('''
<h1>Hello DOM!</h1>
''')
```

Out[2]:

Hello DOM!

In [3]:
```
HTML('''
<style scoped>
.steely {
  color: steelblue;
  font: 16px script;
}
</style>
<h1 class="steely">Hello DOM!</h1>
''')
```

Out[3]:

Hello DOM!

Elements | Network »

```
▼<div id="site" style="height: 528px; display: block;">
  ▼<div id="ipython-main-app">
    ▼<div id="notebook_panel">
      ▼<div id="notebook" tabindex="-1">
        ▼<div class="container" id="notebook-container">
          ::before
          ▶<div class="cell code_cell rendered unselected" tabindex="2">…</div>
          ▶<div class="cell code_cell rendered unselected" tabindex="2">…</div>
          ▼<div class="cell code_cell rendered unselected" tabindex="2">
            ▶<div class="input">…</div>
            ▶<div class="widget-area" style="display: none;">…</div>
            ▼<div class="output_wrapper">
              <div class="out_prompt_overlay prompt" title="click to scroll output; double click to hide" style></div>
              ▼<div class="output" style>
                ▼<div class="output_area">
                  <div class="prompt output_prompt">Out[3]:</div>
                  ▼<div class="output_subarea output_html rendered_html output_result">
                    <style scoped>
                    .steely {
                      color: steelblue;
                      font: 16px script;
                    }
                    </style>
                    <h1 class="steely">Hello DOM!</h1>
```

And some javascript to modify the newly-added DOM element

```
HTML( '…
<h1 class="steely" id="steely-DOM">Hello DOM!</h1>
<script>$('steely-DOM').text("Hello JavaScript!!!")</script>')
```

jupyter hello_dom

File Edit View Insert Cell Kernel Help | Python 2

Code | Cell Toolbar: None

```
<h1 class="steely">Hello DOM!</h1>
''')
```

Out[3]:

Hello DOM!

In [4]:

```
HTML('''
<style scoped>
.steely {
  color: steelblue;
  font: 16px script;
}
</style>
<h1 class="steely" id="steely-DOM">Hello DOM!</h1>
<script>$("#steely-DOM").text("Hello JavaScript!!")</script>
''')
```

Out[4]:

Hello JavaScript!!

Elements | Network » 1

```
</div>
</div>
<div class="btn btn-default output_collapsed"
title="click to expand output" style=
"display: none;">. . .</div>
</div>
</div>
▼<div class="cell code_cell rendered unselected"
tabindex="2">
▶<div class="input">…</div>
▶<div class="widget-area" style="display:
none;">…</div>
▼<div class="output_wrapper">
<div class="out_prompt_overlay prompt" title=
"click to scroll output; double click to
hide" style></div>
▼<div class="output" style>
▼<div class="output_area">
<div class="prompt
output_prompt">Out[4]:</div>
▼<div class="output_subarea output_html
rendered_html output_result">
<style scoped>
.steely {
  color: steelblue;
  font: 16px script;
}
</style>
<h1 class="steely" id="steely-
DOM">Hello JavaScript!!</h1>
<script>$("#steely-DOM").text("Hello
JavaScript!!")</script>
</div>
```

Great. But how does D3 fit into this?

D3 is a JavaScript library. The Ds are for Data Driven Documents.
Think 'Data Driven DOM'.

A core aspect of using the D3 library is the following pattern:

1. Select some array of DOM elements
   Note that this may be an empty array
2. 'Attach' an array of data to that array of DOM elements
   The array lengths need not match. Extra data may 'enter', or DOM elements may 'exit'. D3 coordinates all of this with elegance.
3. Perform some actions for each element in the data array
   This will generally involve modifying the selected DOM elements, or removing or appending new DOM elements, based on the values of the data array.

Appending elements to the DOM with D3

jupyter hello_dom

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Code | Cell Toolbar: None

In [5]:
```
HTML('<script src="lib/d3/d3.min.js"></script>')
```

Out[5]:

In [6]:
```
HTML('''
<style scoped>
.bedazzled {
  color: orange;
}
</style>
<div id="d3-div-1"></div>
<script>

var size_data = [10,20,30];

d3.select("#d3-div-1").selectAll('.bedazzled')
    .data(size_data)
    .enter().append('p')
      .attr("class","bedazzled")
      .style("font-size", function(d){ return "" + d + "px";})
      .text("Hello D3!");

</script>
''')
```

Out[6]: Hello D3!

Hello D3!

Hello D3!

Elements | Network » 1 1

```
tabindex="2">…</div>
▶ <div class="cell code_cell rendered unselected"
tabindex="2">…</div>
▼ <div class="cell code_cell rendered unselected"
tabindex="2">
  ▶ <div class="input">…</div>
  ▶ <div class="widget-area" style="display:
  none;">…</div>
  ▼ <div class="output_wrapper">
      <div class="out_prompt_overlay prompt" title=
      "click to scroll output; double click to
      hide" style></div>
    ▼ <div class="output" style>
      ▼ <div class="output_area">
          <div class="prompt
          output_prompt">Out[6]:</div>
        ▼ <div class="output_subarea output_html
        rendered_html output_result">
            <style scoped>
            .bedazzled {
              color: orange;
            }
            </style>
          ▼ <div id="d3-div-1">
              <p class="bedazzled" style="font-
              size: 10px;">Hello D3!</p>
              <p class="bedazzled" style="font-
              size: 20px;">Hello D3!</p>
              <p class="bedazzled" style="font-
              size: 30px;">Hello D3!</p>
            </div>
          ▶ <script>…</script>
          </div>
        </div>
      </div>
      <div class="btn btn-default output_collapsed"
      title="click to expand output" style=
      "display: none;">. . .</div>
    </div>
```

… div div div div div #d3-div-1 p.bedazzled

Styles | Event Listeners | DOM Breakpoints | Properties

Console | Search | Emulation | Rendering

<top frame> | Preserve log

2. Hello DOM!

hello_dom.ipynb

Just one last step – writing data from Python into the JavaScript for use by D3

jupyter hello_dom

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Code | Cell Toolbar: None

In [7]:
```
size_data = [15,30,45]
```

In [8]:
```
from string import Template
html_template = Template('''
<style scoped> .bedazzled {color: orange;} </style>
<div id="d3-div-2"></div>
<script>

var size_data = $size_data_python ;

d3.select("#d3-div-2").selectAll('.bedazzled')
    .data(size_data)
    .enter().append('p')
      .attr("class","bedazzled")
      .style("font-size", function(d){ return "" + d + "px";})
      .text("Hello D3 with Python data!");

</script>
''')
HTML(html_template.substitute({'size_data_python': str(size_data)}))
```

Out[8]: Hello D3 with Python data!

Hello D3 with Python data!

Hello D3 with Python data!

Elements | Network » 1 1

```
"display: none;">. . .</div>
  </div>
</div>
▶ <div class="cell text_cell rendered unselected" tabindex="2">…</div>
▶ <div class="cell code_cell rendered unselected" tabindex="2">…</div>
▼ <div class="cell code_cell rendered unselected" tabindex="2">
  ▶ <div class="input">…</div>
  ▶ <div class="widget-area" style="display: none;">…</div>
  ▼ <div class="output_wrapper">
      <div class="out_prompt_overlay prompt" title="click to scroll output; double click to hide" style></div>
    ▼ <div class="output" style>
      ▼ <div class="output_area">
          <div class="prompt output_prompt">Out[8]:</div>
        ▼ <div class="output_subarea output_html rendered_html output_result">
            <style scoped> .bedazzled {color: orange;} </style>
          ▼ <div id="d3-div-2">
              <p class="bedazzled" style="font-size: 15px;">Hello D3 with Python data!</p>
              <p class="bedazzled" style="font-size: 30px;">Hello D3 with Python data!</p>
              <p class="bedazzled" style="font-size: 45px;">Hello D3 with Python data!</p>
            </div>
          ▶ <script>…</script>
          </div>
        </div>
      </div>
```

… div div div div div #d3-div-2 p.bedazzled

Styles | Event Listeners | DOM Breakpoints | Properties

Console | Search | Emulation | Rendering

2. Hello DOM!

hello_dom.ipynb

A Brief Review of Key Points:

IPython.core.display.HTML allows you to directly write new DOM elements

With that HTML function, we can add css (<style>) and javascript (<script>) elements, as well as elements (or <h1> elements, etc) for them to act on

D3 is a clever javascript library for DOM modification based on arrays of data

We can write python data directly into <script> element text so that it can be acted upon by D3.

for any late-joiners:

https://github.com/stitchfix/d3-jupyter-tutorial

2. Hello DOM!

hello_dom.ipynb

A Brief Review of Key Points:

IPython.core.display.HTML allows you to directly write new DOM elements

With that HTML function, we can add css (<style>) and javascript (<script>) elements, as well as elements (or <h1> elements, etc) for them to act on

D3 is a clever javascript library for DOM modification based on arrays of data

We can write python data directly into <script> element text so that it can be acted upon by D3.

Sure. Great. But I haven't seen any data visualizations yet...

3. Meet bl.ocks.org, I think you'll be great friends

`d3js.org , bl.ocks.org/mbostock`

(And welcome to data visualization heaven)

`http://bl.ocks.org/mbostock/4060954`

Streamgraph

For continuous data such as time series, a streamgraph can be used in place of stacked bars. This example also demonstrates path transitions to interpolate between different layouts. Streamgraph algorithm, colors, and data generation inspired by Byron and Wattenberg.

Open in a new window.

index.html

```
<!DOCTYPE html>
<meta charset="utf-8">
<title>Streamgraph</title>
<style>

body {
  font-family: "Helvetica Neue", Helvetica, Arial, sans-ser
  margin: auto;
  position: relative;
  width: 960px;
```

`http://bl.ocks.org/mbostock/1353700`

Epicyclic Gearing

From Wikipedia:

> **Epicyclic gearing** or **planetary gearing** is a gear system consisting of one or more outer gears, or *planet* gears, revolving about a central, or *sun* gear. … Epicyclic gearing systems also incorporate the use of an outer ring gear or *annulus*, which meshes with the planet gears.

Use the menu in the top-left to change the frame of reference, fixing the specified gear in-place.

Open in a new window.

index.html

```
<!DOCTYPE html>
<meta charset="utf-8">
<style>
```

`http://bl.ocks.org/mbostock/4063269`

Bubble Chart

Bubble charts encode data in the area of circles. Although less perceptually-accurate than bar charts, they can pack hundreds of values into a small space. Implementation based on work by Jeff Heer. Data shows the Flare class hierarchy, also courtesy Jeff Heer.

Open in a new window.

3. Meet bl.ocks.org, I think you'll be great friends

http://bl.ocks.org/mbostock/4060954

Streamgraph

For continuous data such as time series, a streamgraph can be used in place of stacked bars. This example also demonstrates path transitions to interpolate between different layouts. Streamgraph algorithm, colors, and data generation inspired by Byron and Wattenberg.

Open in a new window.

index.html

```
<!DOCTYPE html>
<meta charset="utf-8">
<title>Streamgraph</title>
<style>

body {
  font-family: "Helvetica Neue", Helvetica, Arial, sans-ser
  margin: auto;
  position: relative;
  width: 960px;
}

button {
  position: absolute;
  right: 10px;
  top: 10px;
}

</style>
<button onclick="transition()">Update</button>
<script src="//d3js.org/d3.v3.min.js"></script>
<script>

var n = 20, // number of layers
    m = 200, // number of samples per layer
    stack = d3.layout.stack().offset("wiggle"),
    layers0 = stack(d3.range(n).map(function() { return bum
    layers1 = stack(d3.range(n).map(function() { return bum

var width = 960,
    height = 500;

var x = d3.scale.linear()
```

Anatomy of a bl.ock

Pretty graphic, often interactive

Short description

html, css and javascript that produces the graphic

data that gets read by script, usually in csv or tsv form

4. A simple D3 scatterplot in Jupyter

iris_scatterplot.ipynb

Using this bl.ocks example: **http://bl.ocks.org/mbostock/3887118**

We will produce this in Jupyter:

In [7]:
```
html_template = Template('''
<style> $css_text </style>
<div id="graph-div"></div>
<script> $js_text </script>
''')
js_text = js_text_template.substitute({'python_data': json.dumps(iris_array_of_dicts),
                                       'graphdiv': 'graph-div'})
HTML(html_template.substitute({'css_text': css_text, 'js_text': js_text}))
```

Out[7]:

5. A bar chart with interactivity

bar_chart_with_update.ipynb

(hello again DOM!)

In [7]:
```
data = pd.DataFrame({'letter': ['A','B','C','D'], 'y': [1,1,1,1]})
data.head()
```

Out[7]:

	letter	y
0	A	1
1	B	1
2	C	1
3	D	1

In [8]:
```
js_text = js_text_template.substitute({'data': json.dumps(data.to_dict(orient='records'))})
HTML(html_template.substitute({'css_text': css_text, 'js_text': js_text}))
```

Out[8]:

watch out for the twist...

6. Networks, maps and more

sigma_js_graph.ipynb

temperature_histories.ipynb

polyFill_d3.ipynb

In [5]:
```
pd.DataFrame(graph_data['edges']).head()
```

Out[5]:

	id	source	target
0	e0	n5	n12
1	e1	n25	n1
2	e2	n10	n20
3	e3	n6	n29
4	e4	n15	n17

Visualization

In [6]:
```
js_text_template = Template(open('js/sigma-graph.js','r').read())

js_text = js_text_template.substitute({'graph_data': json.dumps(graph_data),
                                       'container': 'graph-div'})

html_template = Template('''
<div id="graph-div" style="height:400px"></div>
<script> $js_text </script>
''')
HTML(html_template.substitute({'js_text': js_text}))
```

Out[6]:

In [13]:
```
display(HTML(html_template.substitute({'css_text': css_text, 'js_text': js_text})))
```

7. D3_lib.py (if you want to)

`multiple_simple_examples.ipynb`

We have encapsulated a lot of the boilerplate for this method into an external python file, which in turn calls external files containing your css and js templates.

This just helps to keep things visually clean.

Feel free to use it as is and/or modify it to suit your needs.

8. Discussion: From sketch to notebook frame

randomized_sketch.ipynb

Thank you!

Data Science @ Stitch Fix

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