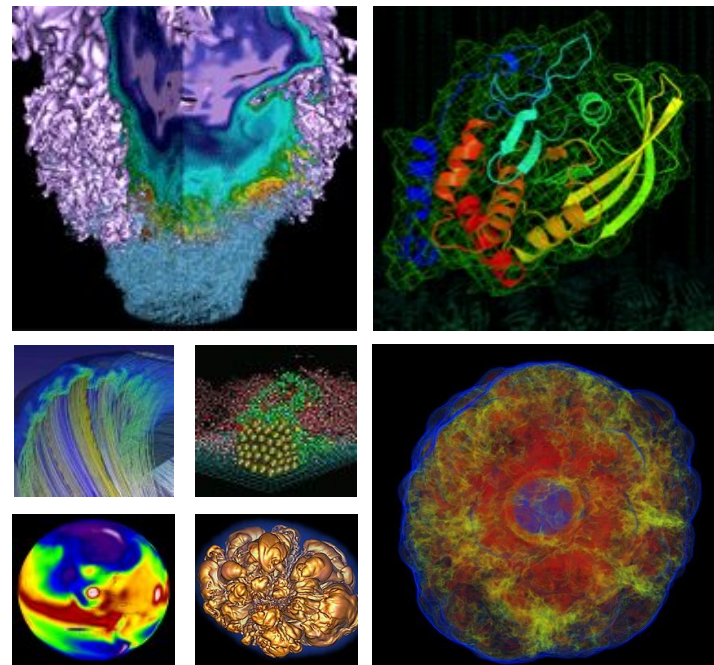


Declarative Python Visualization with Altair



Annette Greiner

NERSC Data Day, October 27, 2022

Declarative Versus Imperative



Imperative

```
draw axes
draw ticks
#layer one
for item in data:
    set color
    draw item
#layer two
for item in data:
    ...
```

Declarative

```
chart(data).points.encode(
    column1 as x position,
    column2 as y position,
    column3 as color
)
```

Declarative Versus Imperative



Imperative

```
draw axes
draw ticks
#layer one
for item in data:
    set color
    draw item
#layer two
for item in data:
    ...
```

How

Declarative

```
chart(data).points.encode(
    column1 as x position,
    column2 as y position,
    column3 as color
)
```

What

Declarative Versus Imperative



Declarative visualization
lets you think
about data and relationships
rather than control flow.

What is Altair?

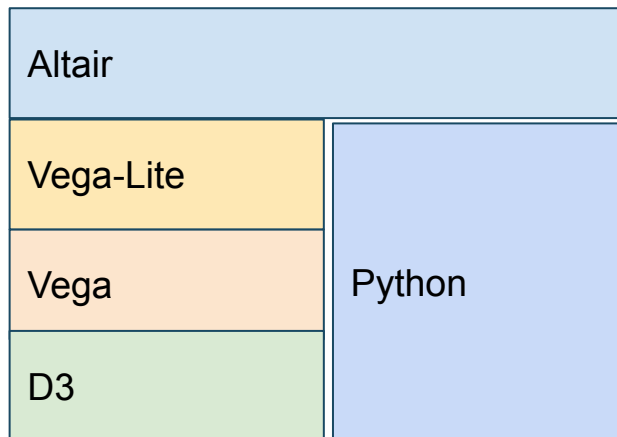


A python library based on Vega-Lite

Vega-Lite is a high-level grammar of graphics based on Vega

Vega is a declarative grammar with a runtime built on D3

D3 is a low-level Javascript library for data visualization



<https://altair-viz.github.io>

D3 JavaScript Library



D3js.org

Web outputs!
interaction!



Vega Spec for an Area Graph



```
{
  "$schema":
    "https://vega.github.io/schema/vega/v5.json",
  "description": "A basic area chart example.",
  "width": 500,
  "height": 200,
  "padding": 5,

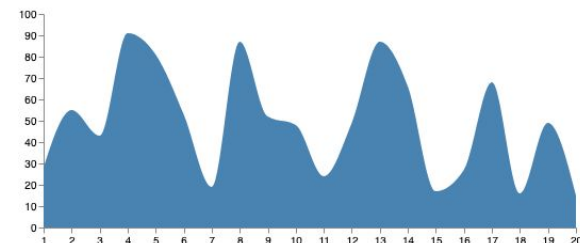
  "signals": [
    {
      "name": "interpolate",
      "value": "monotone",
      "bind": {
        "input": "select",
        "options": [
          "basis",
          "cardinal",
          "catmull-rom",
          "linear",
          "monotone",
          "natural",
          "step",
          "step-after",
          "step-before"
        ]
      }
    }
  ],

  "data": [
    {
      "name": "table",
      "values": [
        {"u": 1, "v": 28}, {"u": 2, "v": 55},
        {"u": 3, "v": 43}, {"u": 4, "v": 91},
        {"u": 5, "v": 81}, {"u": 6, "v": 53},
        {"u": 7, "v": 19}, {"u": 8, "v": 87},
        {"u": 9, "v": 52}, {"u": 10, "v": 48},
        {"u": 11, "v": 24}, {"u": 12, "v": 49},
        {"u": 13, "v": 87}, {"u": 14, "v": 66},
        {"u": 15, "v": 17}, {"u": 16, "v": 27},
        {"u": 17, "v": 68}, {"u": 18, "v": 16},
        {"u": 19, "v": 49}, {"u": 20, "v": 15}
      ]
    }
  ],

  "scales": [
    {
      "name": "xscale",
      "type": "linear",
      "range": "width",
      "zero": false,
      "domain": {"data": "table", "field": "u"}
    },
    {
      "name": "yscale",
      "type": "linear",
      "range": "height",
      "nice": true,
      "zero": true,
      "domain": {"data": "table", "field": "v"}
    }
  ],

  "axes": [
    {
      "orient": "bottom", "scale": "xscale", "tickCount": 20,
      "orient": "left", "scale": "yscale"
    }
  ],

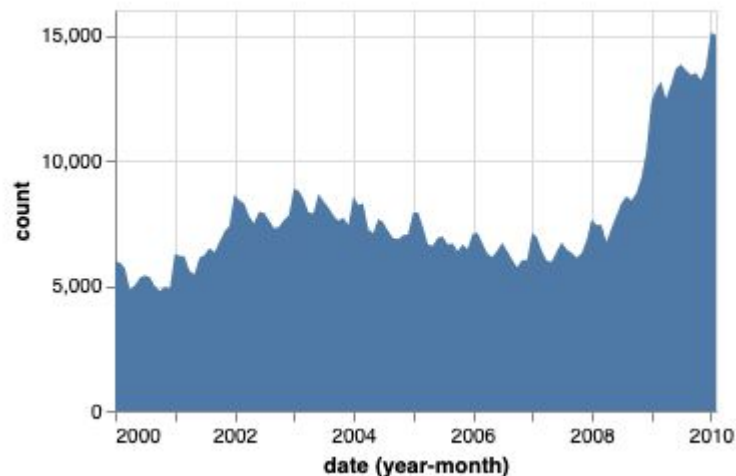
  "marks": [
    {
      "type": "area",
      "from": {"data": "table"},
      "encode": {
        "enter": {
          "x": {"scale": "xscale", "field": "u"},
          "y": {"scale": "yscale", "field": "v"},
          "y2": {"scale": "yscale", "value": 0},
          "fill": {"value": "steelblue"}
        },
        "update": {
          "interpolate": {"signal": "interpolate"},
          "fillOpacity": {"value": 1}
        },
        "hover": {
          "fillOpacity": {"value": 0.5}
        }
      }
    }
  ]
}
```



Vega-Lite Spec for an Area Graph



```
{
  "$schema": "https://vega.github.io/schema/vega-lite/v5.json",
  "width": 300,
  "height": 200,
  "data": {"url": "data/unemployment-across-industries.json"},
  "mark": "area",
  "encoding": {
    "x": {
      "timeUnit": "yearmonth", "field": "date",
      "axis": {"format": "%Y"}
    },
    "y": {
      "aggregate": "sum", "field": "count",
      "title": "count"
    }
  }
}
```

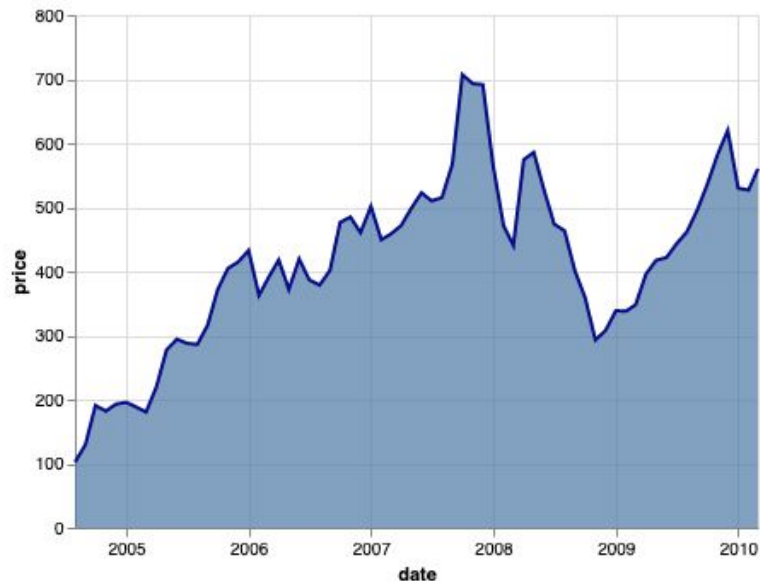


An Area Graph in Altair



```
From vega_datasets import data  
source = data.stocks()
```

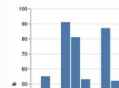
```
alt.Chart(source).transform_filter(  
    'datum.symbol==='GOOG'  
)  
.mark_area(  
    line={'color':'darkblue'}).encode(  
    alt.X('date:T'),  
    alt.Y('price:Q')  
)
```



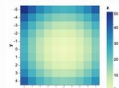
Gallery



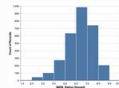
Simple Charts



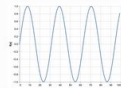
Simple Bar Chart



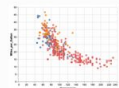
Simple Heatmap



Simple Histogram



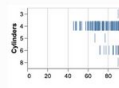
Simple Line Chart



Simple Scatter Plot with Tooltips



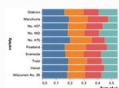
Simple Stacked Area Chart



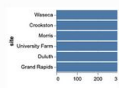
Simple Strip Plot



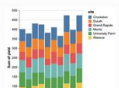
Layered Bar Chart



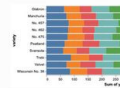
Normalized Stacked Bar Chart



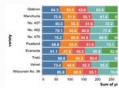
Sorted Bar Chart



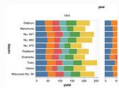
Stacked Bar Chart



Stacked Bar Chart with Sorted Segments



Stacked Bar Chart with Text Overlay

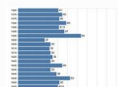


Trellis Stacked Bar Chart

Bar Charts



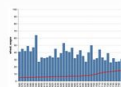
Bar Chart with Highlighted Bar



Bar Chart with Labels



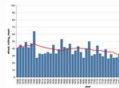
Bar Chart with Line at Mean



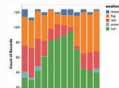
Bar Chart with Line on Dual Axis



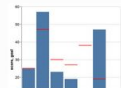
Bar Chart with Negative Values



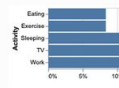
Bar Chart with Rolling Mean



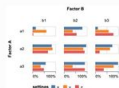
Bar Chart with rounded edges



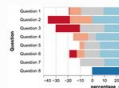
Bar and Tick Chart



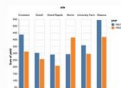
Calculating Percentage of Total



Compact Trellis Grid of Bar Charts

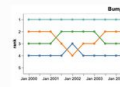


Diverging Stacked Bar Chart

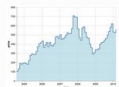


Grouped Bar Chart

Line Charts



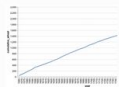
Bump Chart



Filled Step Chart



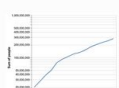
Line Chart with Confidence Interval Band



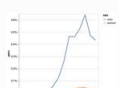
Line Chart with Cumulative Sum



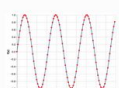
Line Chart with Layered Aggregates



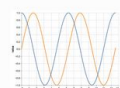
Line Chart with Logarithmic Scale



Line Chart with Percent axis



Line Chart with Points



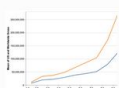
Line Chart with Sequence Generator



Line Chart with Varying Size

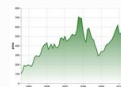


Line Chart with datum

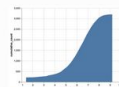


Line Chart with datum for color

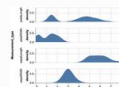
Area Charts



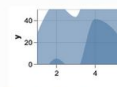
Area Chart with Gradient



Cumulative Count Chart



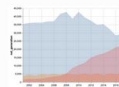
Faceted Density Estimates



Horizon Graph



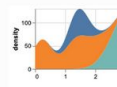
Interval Selection Example



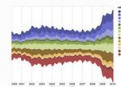
Layered Area Chart



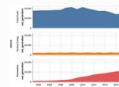
Normalized Stacked Area Chart



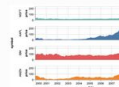
Stacked Density Estimates



Streamgraph



Trellis Area Chart

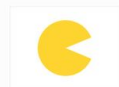


Trellis Area Sort Chart

Circular Plots



Donut Chart



Pacman Chart



Pie Chart



Pie Chart with Labels

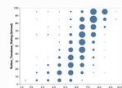


Radial Chart

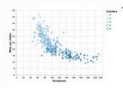
Gallery



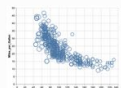
Scatter Plots



Binned Scatterplot



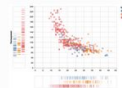
Brushing Scatter Plot to show data on a table



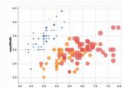
Bubble Plot



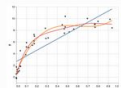
Connected Scatterplot (Lines with Custom Paths)



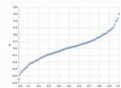
Dot Dash Plot



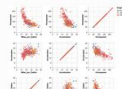
Multifeature Scatter Plot



Polynomial Fit Plot with Regression Transform



Quantile-Quantile Plot



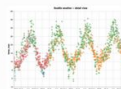
Scatter Matrix



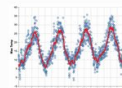
Scatter Plot with Href



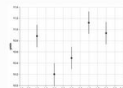
Scatter Plot with LOESS Lines



Scatter Plot with Minimap



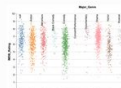
Scatter Plot with Rolling Mean



Simple Scatter Plot with Errorbars



Simple Scatter Plot with Labels



Striplot

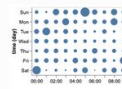
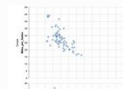


Table Bubble Plot (Github Punch Card)

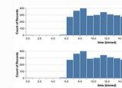


Trellis Scatter Plot

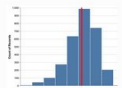


Wind Vector Map

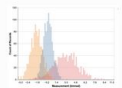
Histograms



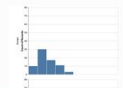
Histogram with Responsive Bins



Histogram with a Global Mean Overlay



Layered Histogram



Trellis Histogram

Maps



Choropleth Map



Locations of US Airports



Repeated Choropleth Map



US Income by State: Wrapped Facet

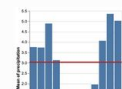


World Map

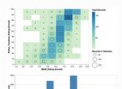


World Projections

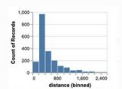
Interactive Charts



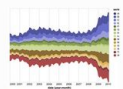
Interactive Average



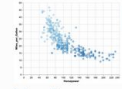
Interactive Chart with Cross-Highlight



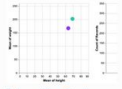
Interactive Crossfilter



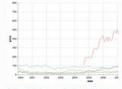
Interactive Legend



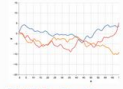
Interactive Rectangular Brush



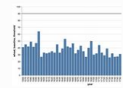
Interactive Scatter Plot and Linked Layered Histogram



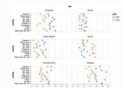
Multi-Line Highlight



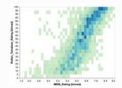
Multi-Line Tooltip



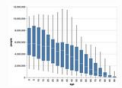
Bar Chart with Highlighted Segment



Becker's Barley Trellis Plot (wrapped facet)



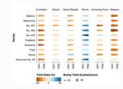
Binned Heatmap



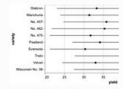
Boxplot with Min/Max Whiskers



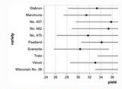
Candlestick Chart



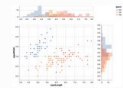
Comet Chart Example



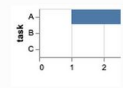
Error Bar with Standard Deviation



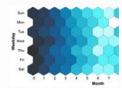
Error Bars showing Confidence Interval



Facetted Scatterplot with marginal histograms



Gantt Chart



Hexbin Chart

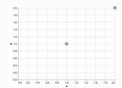
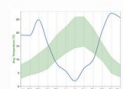


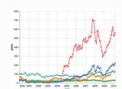
Image tooltip



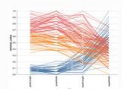
Isotype Grid



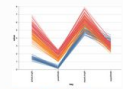
Layered chart with Dual-Axis



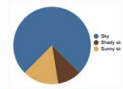
Multiple Marks



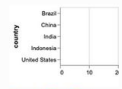
Normalized Parallel Coordinates Example



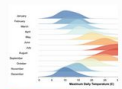
Parallel Coordinates Example



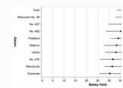
Pyramid Pie Chart



Ranged Dot Plot



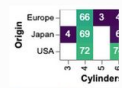
Ridgeline plot Example



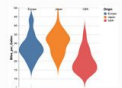
Sorted Error Bars showing Confidence Interval



Stem and Leaf Plot



Text over a Heatmap



Violin Plot

What Can Altair Take as Input?



Dataframes

CSV

TSV

JSON

URLs

Geo data (e.g., GeoDataFrame, GeoJSON)

What Can Altair Output?



JSON

HTML

PDF

SVG

PNG

Altair in Jupyter at NERSC



Create a Conda env to use as a Jupyter kernel

```
agreiner@cori06>module load python
agreiner@cori06>conda create -n altair python=3.9 ipykernel altair
agreiner@cori06>conda activate altair
(altair) agreiner@cori06>python -m ipykernel install --user --name altair
--display-name Altair
Installed kernelspec altair in
/global/u1/a/agreiner/.local/share/jupyter/kernels/altair
```

Grab some handy datasets to play with

```
(altair) agreiner@cori06>conda install -c conda-forge vega_datasets
```

https://github.com/altair-viz/vega_datasets

Altair in Jupyter at NERSC



File Edit View Run Kernel Git Tabs Settings Help

FAVORITES

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- \$SCRATCH
- \$SCRATCH
- \$PSCRATCH

FILE BROWSER

Filter files by name

/ ... / a / agreiner /

Name	Last Modified
slurm-362...	seconds ago
slurm-918...	10 months ago
spot.zip	3 years ago
subsetmd5	12 years ago
super_pret...	7 years ago
testing2	4 months ago
todo.txt	3 months ago
Untitled.ip...	3 days ago
Untitled1.i...	34 minutes ago
Untitled2.i...	an hour ago
Untitled3.i...	an hour ago
Untitled5.i...	3 months ago
Visdemo.i...	4 years ago

global/homes/a/agreiner

Notebook

NERSC Python	Altair	ATLAS ML training -	ATLAS ML training - GNN	Julia 1.4.2
Julia 1.6.5	Julia 1.7.2	Julia 1.8.0-beta1	PyROOT	PyROOT - Python3
pyspark (2.0.0)	pytorch-1.7.1-gpu	pytorch-1.9.0-gpu	pytorch-ngc-20.03-v0	pytorch-ngc-20.06-v0
pytorch-v1.5.0-gpu	R	tensorflow-v1.15.0-gpu	tensorflow-v2.0.0-gpu	tensorflow-v2.2.0-gpu

Console

Demo



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Thank You



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