

Using Python & R in Harmony

PyOhio 2019

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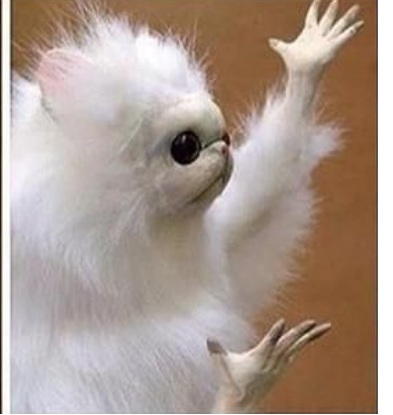
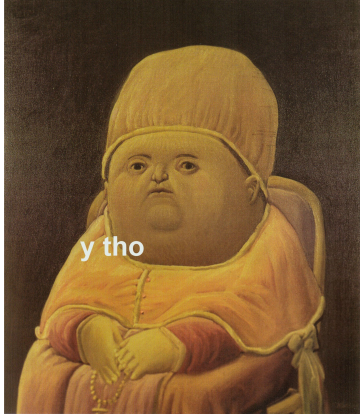


Goals for today's 30-minute talk:

**Build an awareness of
rpy2 & reticulate and
when they're useful**

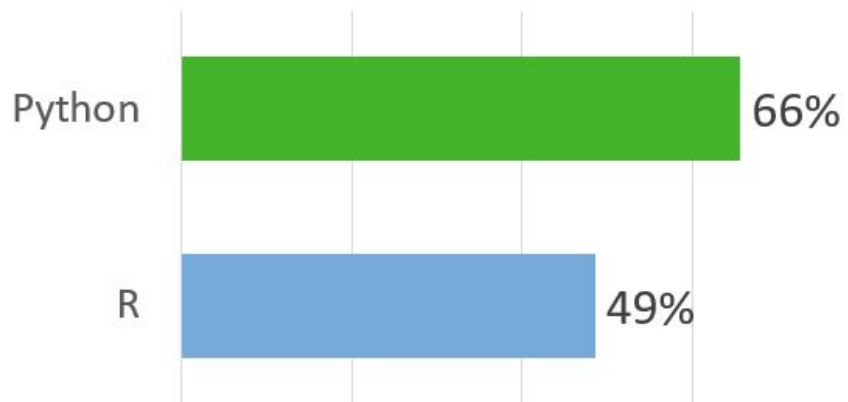
**Understand some basic
operations & syntax of
each library**

**Review some applied
examples & put this
knowledge to work**



Just like hard and soft tacos

KDnuggets Analytics, Data Science, Machine Learning Software Poll, 2016-2018



Why would cross-pollinating languages be useful?

**A package or module
you want to use is
exclusive to one
language**

**You have an existing
script & want to
leverage that instead
of reinventing the
wheel**

**You can simply handle
some workflows more
efficiently with the
other language**



Event: PyOhio 2019

Talk: Using Python & R in Harmony

Date: July 27th, 2019

Code + Slides

bit.ly/2LIzhhbC



Using Python from within R with `reticulate`

What is reticulate?

The **reticulate** package provides a comprehensive set of tools for interoperability between Python and R.

The package includes facilities for:

- **Calling Python from R** in a variety of ways including **R Markdown**, **sourcing Python scripts**, **importing Python modules**, and using Python interactively within an R session.
- **Translation between R and Python objects** (for example, between R and Pandas data frames, or between R matrices and NumPy arrays).
- Flexible **binding to different versions of Python** including **virtual environments** and **Conda environments**.

TLDR: Methods for importing Python modules directly to R, converting objects back & forth between Python and R, tools for managing Python environments

A brief guide to using reticulate within R

Create & use Python virtual environments

```
virtualenv_create('your_env')  
use_virtualenv('your_env')
```

Use raw strings as Python

```
py_eval('print("hello")')
```

Convert R objects to Python objects & vice versa

```
py_to_r([3,4,5])  
r_to_py(c(3,4,5))
```

Install Python packages

```
py_install(c('pandas',  
            'requests'),  
          envname='your_env'))
```

Write Python chunks in RMD

```
```{python}  
print('hello')
```
```

Call Python functions / scripts & supply R objects as inputs

```
py_run_file('cool_script.py')  
  
requests = import('requests')  
url = 'www.google.com'  
requests$get(url)
```

Spinning up a Python virtualenv within R

Python

```
$ mkvirtualenv r_py3_env --python=python3
```

R / Reticulate

```
virtualenv_create(  
  'r_py3_venv' ,  
  python='/usr/local/bin/python3'  
)  
  
use_virtualenv('r_py3_venv')
```

!

You can also use existing environments or use `conda` instead of `virtualenv`

Installing Python modules to virtualenvs from R

Python

```
workon r_py3_env  
  
pip install pandas  
pip install requests
```

R / Reticulate

```
py_install(  
  c('pandas',  
    'requests',  
    'pandas.io'),  
  envname = 'r_py3_venv'  
)
```

!

reticulate will establish its own virtualenv named `r-reticulate` if one isn't specified upon installation

Importing Python modules within R

Python

```
import pandas
import requests
import pandas.io.json
```

R / Reticulate

```
pandas = import('pandas')
requests = import('requests')
pandas_io = import('pandas.io.json')
```

Leveraging Python module functions

Python

```
pandas.pivot()  
  
requests.get()
```

R / Reticulate

```
pandas$pivot()  
  
requests$get()
```

An example with a web API & SF Bay climates

*“If you don’t like the weather in ~~New-England~~
[Ohio] now, just wait five minutes.”*

Mark Twain

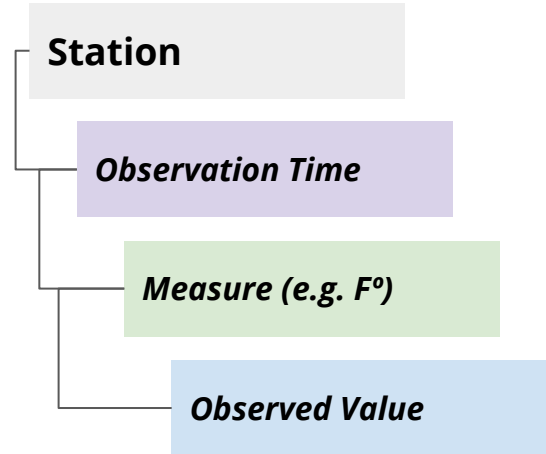


Calling the [weather.gov](https://api.weather.gov) web API

`https://api.weather.gov/stations/{station_id}/observations`

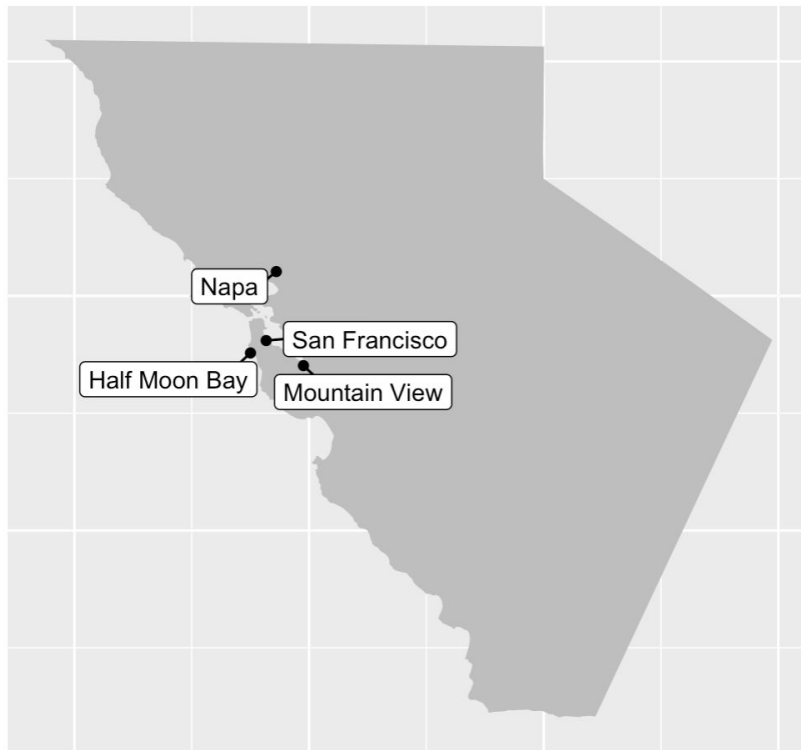
```
curl -s https://api.weather.gov/stations/KSF0/observations | tail -n 75
  "qualityControl": "qc:V"
},
"windGust": {
  "value": null,
  "unitCode": "unit:m_s-1",
  "qualityControl": "qc:Z"
},
"barometricPressure": {
  "value": 101390,
  "unitCode": "unit:Pa",
  "qualityControl": "qc:V"
},
"seaLevelPressure": {
  "value": 101390,
  "unitCode": "unit:Pa",
  "qualityControl": "qc:V"
},
```

JSON Response



Some SF Bay Area stations...

| Station Name | Station Identifier | Latitude | Longitude |
|---------------|--------------------|----------|-----------|
| Half Moon Bay | KHAF | 37.51360 | -122.4996 |
| Mountain View | KNUQ | 37.40583 | -122.0481 |
| Napa | KAPC | 38.20750 | -122.2794 |
| San Francisco | KSFO | 37.61961 | -122.3656 |



Gathering JSON responses with help from Python

```
temperature_data = data.frame(NULL)

for (i in (1:nrow(station_list))){ ## begin parent loop
```

1

```
  ## create the URL we'll use to make the API request
  url = paste('https://api.weather.gov/stations/',
              station_list$station_identifier[i],
              '/observations',
              sep='')

```

2

```
  page = requests$get(url) ## use requests library to fetch the URL from the web

  content = page$content ## isolate to on-page content only

```

3

```
  ## use pandas.io to extract and normalize the JSON content from the request
  content_pandas_io = pandas_io$loads(content)

```

```
[...] continued on next slide
```



Wrangling & stacking observations

1

```
## Now for every leaf j in this normalized JSON, we need to extract the time
of observation observation was recorded and corresponding temperature

for (j in seq_along(content_pandas_io$features)){  ## begin child loop

  record = data.frame(
    date = content_pandas_io$features[[j]]$properties$timestamp[1],
    temperature=content_pandas_io$features[[j]]$properties$temperature[1]$value,
    station_name = station_list$name[i],
    station_id = station
  )

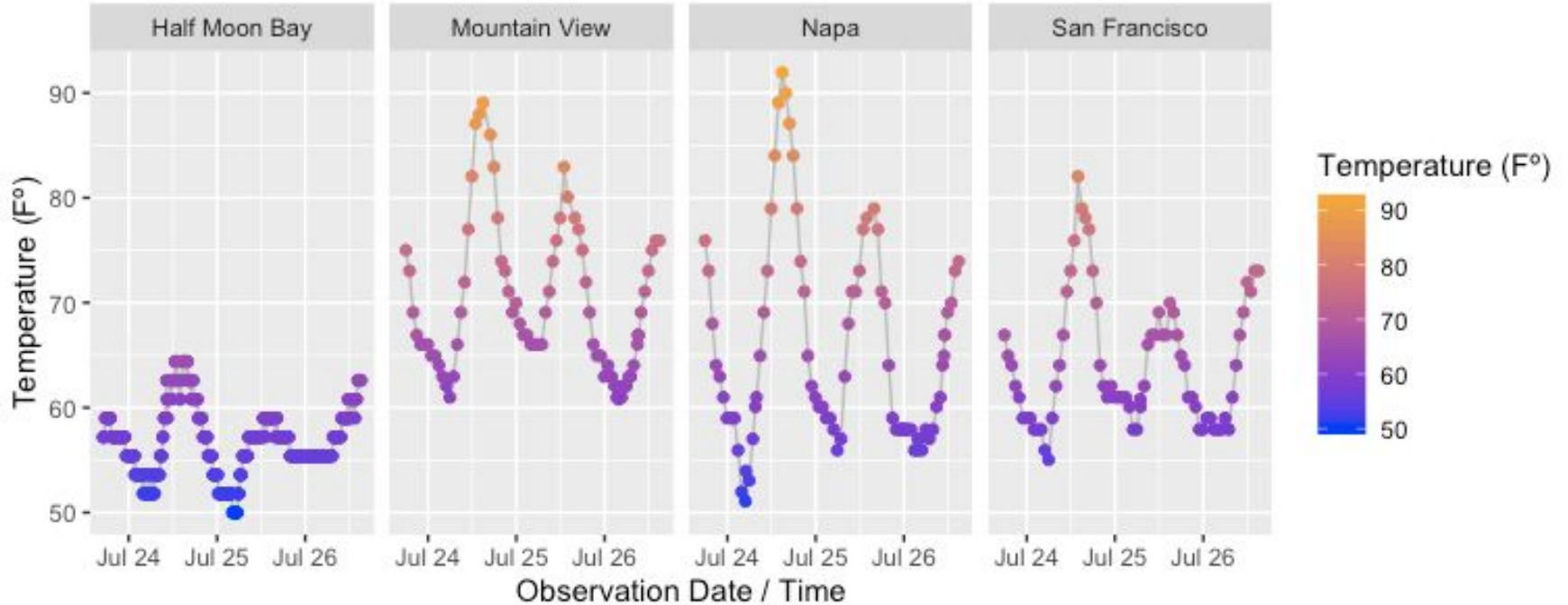
  ## Append this new row to a dataframe containing the final results
  temperature_data = bind_rows(record,temperature_data)

} ## close child loop

} ## close parent loop
```



Recent Bay Area temperatures, visualized!



Using R from within
Python with `rpy2`

What is rpy2?

The **rpy2** provides simple and robust access to R from within Python.

- **Calling R from Python** in a variety of ways including **importing R packages, calling R functions**, and using R interactively within Python.
- **Translation between Python and R objects** (for example, between R and Pandas data frames, or between R matrices and NumPy arrays).

A brief guide to using rpy2 within Python

Install rpy2

- conda
- pip

Import rpy2 modules

```
import rpy2.robjects as robjects
```

Execute R Code

```
In [12]: robjects.r('paste0("he", "llo")')
Out[12]:
R object with classes: ('character',) mapped to:
<StrVector - Python:0x0000023E5C4931C8 / R:
0x0000023E62BD54F0>
['hello']
```

Install R Packages

```
robjects.r("install.packages('package')")
```

Import R Packages

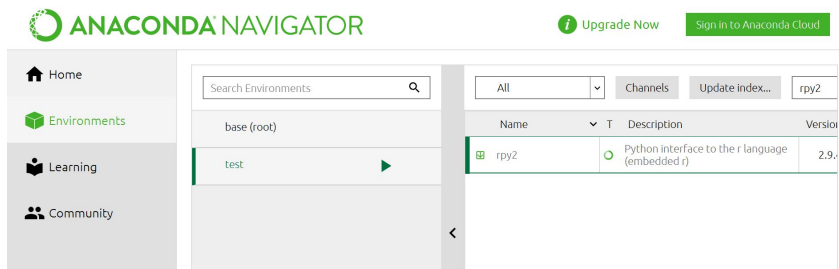
```
package=importr('package')
robjects.r('library(package)')
```

Use R Functions

```
function_name=robjects.r('function_name')
robjects.r('function_name(x,y)')
```

Installing and Importing rpy2

Installing rpy2



```
pip install rpy2
```

```
conda install rpy2
```

Importing rpy2

```
import rpy2.robj as rpy2
```

Gives the `r()` function

```
from rpy2.robj import pandas2ri
```

Makes it easy to convert objects

```
from rpy2.robj.packages import importr
```

Gives the ability to import functions

Executing an R Script

- Use `r()` in `robjects`
- Execute `r` function `seq()` on a date
 - Go back in time 4 periods, inclusive, by increments of 2 months

```
In [6]: date_list = robjects.r("as.character(seq(from = as.Date('2018-01-15'), by = ('-2 months'), length = 4))")
```

```
In [7]: date_list
```

```
Out[7]:
```

```
R object with classes: ('character',) mapped to:
```

```
<StrVector - Python:0x0000027D6B9BEA88 / R:0x0000027D6BF9B7A8>
```

```
['2018-01-15', '2017-11-15', '2017-09-15', '2017-07-15']
```

- `pandas2ri.activate()`

Import R Packages

- Some packages come installed when you install rpy2
- Some packages you have to install `robjects.r("install.packages('package')")`

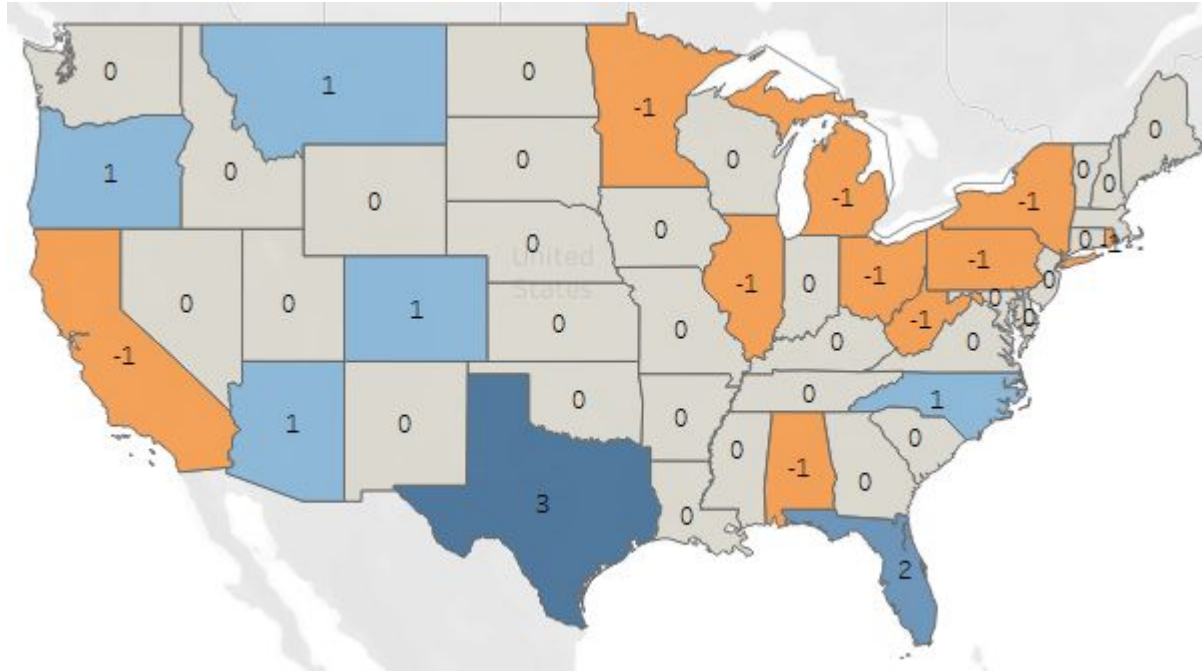
In r()

```
robjects.r('library(forecast)')
```

Import into Python

```
forecast=importr('forecast')
```

Estimating Electoral College Votes by State



Spoiler alert, Ohio and California are estimated to lose a vote

Apparently nice weather only helps so much

Scraping State Population Data

```
for year in range(2000, 2018):  
    # Keeping track of the loop  
    print(year)  
    # This is the URL that has the data  
    url = 'https://fred.stlouisfed.org/release/tables?rid=118&eid=259194&od='  
    # Read in the url  
    url_request = requests.get(url)  
    # Make the soup  
    pop_data = BeautifulSoup(url_request.content, features="lxml")
```



ECONOMIC RESEARCH
FEDERAL RESERVE BANK OF ST. LOUIS

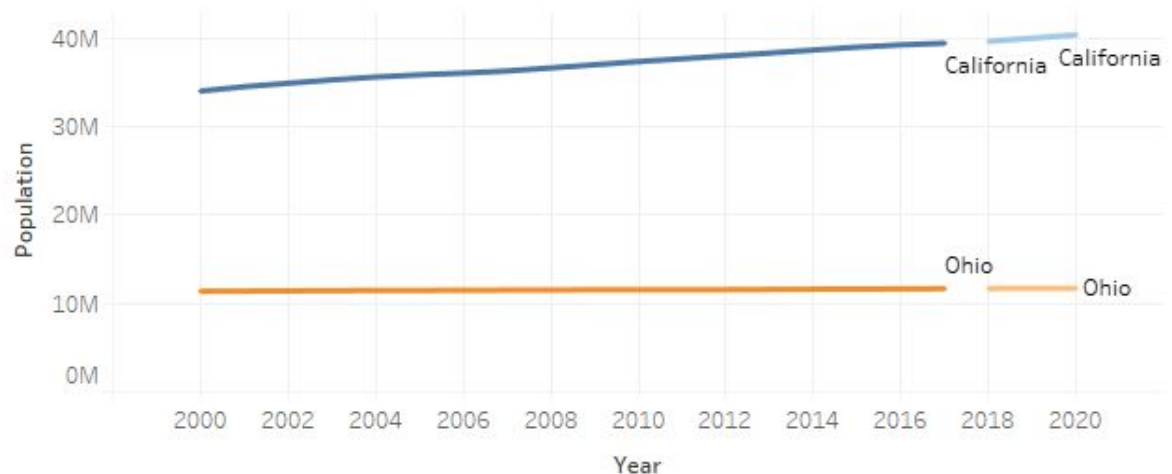
| Name | Period | Value | Thousands of Persons | |
|-----------------|--------|------------|----------------------|----------------------|
| | | | Preceding Period | Year Ago from Period |
| Alabama..... | 2018 | 4,887.871 | 4,875.120 | 4,875.120 |
| Alaska..... | 2018 | 737.438 | 739.786 | 739.786 |
| Arizona..... | 2018 | 7,171.646 | 7,048.876 | 7,048.876 |
| Arkansas..... | 2018 | 3,013.825 | 3,002.997 | 3,002.997 |
| California..... | 2018 | 39,557.045 | 39,399.349 | 39,399.349 |

Using R Functions, Generate Forecasts

```
forecast_ts = ts(data_for_forecast)
```

```
fit = forecast.auto_arima(forecast_ts)
```

```
forecast_output=forecast.forecast(fit,h=2,level=(95.0))
```



Assigning House Seats

- Electoral Votes = House Seats + Senate Seats

```
# While there are seats left to be allocated
while seats < 435:
    # Get the state with the Max priority
    max_state = state_forecasts[state_forecasts['Priority'] == max(state_forecasts['Priority'])]
    # Get the rest of the states
    not_max_state = state_forecasts[state_forecasts['Priority'] != max(state_forecasts['Priority'])]

    # Change the number, priority, and number of seats
    max_state.loc[:, 'A_n'] = max_state['A_n'] + 1
    max_state.loc[:, 'Priority'] = math.sqrt(max_state['Seats'].unique()/(max_state['Seats'].unique()+2))*state_forecasts['Priority']
    max_state.loc[:, 'Seats'] = max_state['Seats'] + 1

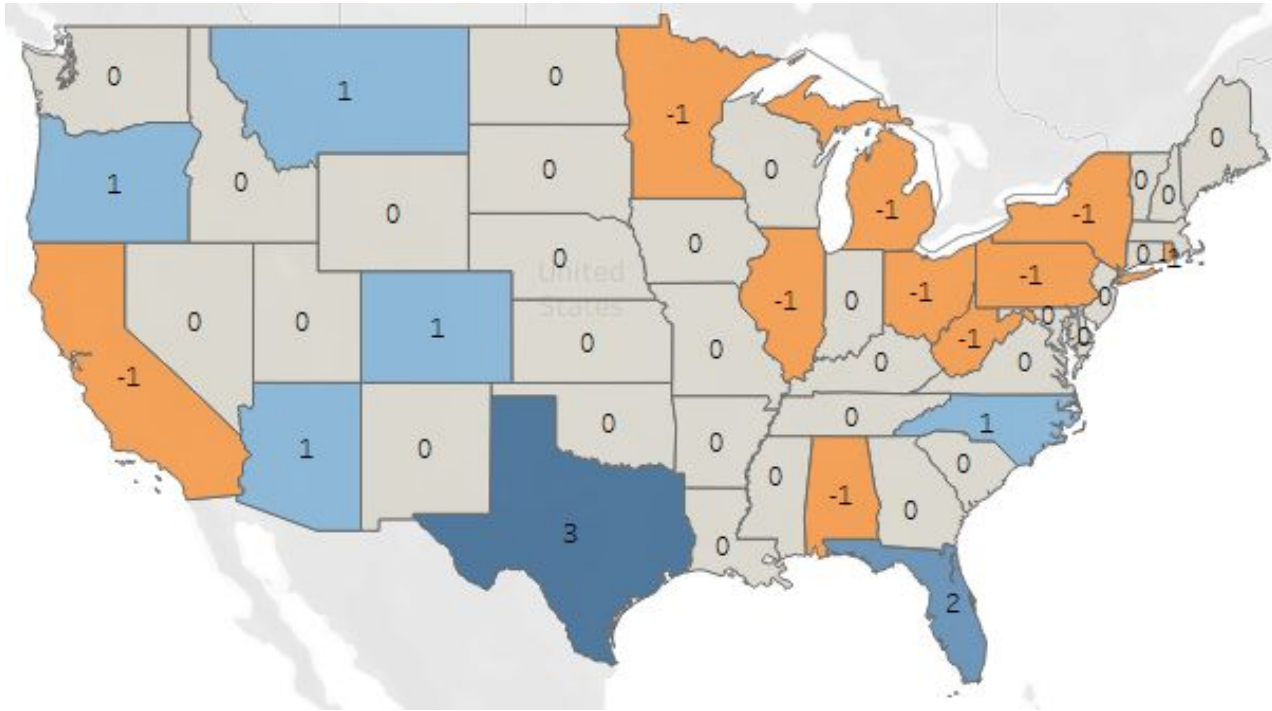
    # Append all of the data back together
    state_forecasts = max_state.append(not_max_state)

    #Add up the number of seats
    seats = sum(state_forecasts['Seats'])
```

$$A_1 = \frac{P}{\sqrt{2}}$$

$$A_{n+1} = \sqrt{\frac{n}{n+2}} A_n$$

Estimating Electoral College Votes by State



Alaska and Hawaii are not forgotten, just both at 0 change

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