#### Data Visualization with Dash

(IE481, Lab #3)

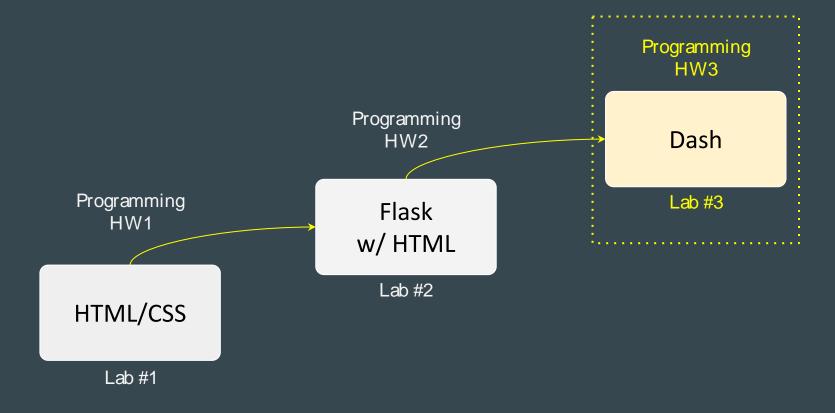
•••

Joonyoung Park 2020.04.02

#### Lab#3 Announcement

- All Lab#3 practice source codes (<u>link</u>)
- Lab#3 practices will proceed as below:
  - Editing tools: PyCharm IDE (only for editing) // using any others is okay
  - Executions: <u>Using CLI</u> (Command Line Interface)
  - Testing: using local server, the last practice will be hosted via Heroku
- For progress reporting: after each practice, upload your practice result
  - Please upload your screenshot of each practice result to this document (<u>Link</u>)
- All of the practice answer codes will be shared after finishing the Lab#3

#### This week...



# Dash

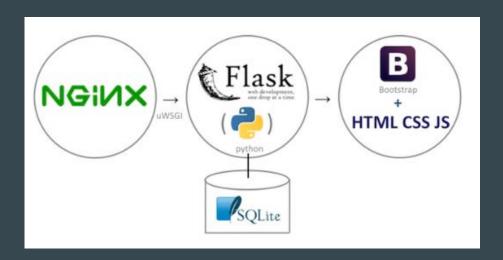
## What is Dash?

# Python framework for building web applications

# What is the difference between Dash and Flask?

# Flask is generic web framework based on Jinja2 and Werkzeug

(Werkzeug: WSGI library)



# Dash is specialized for building analytical web applications (E.g., Data visualization)



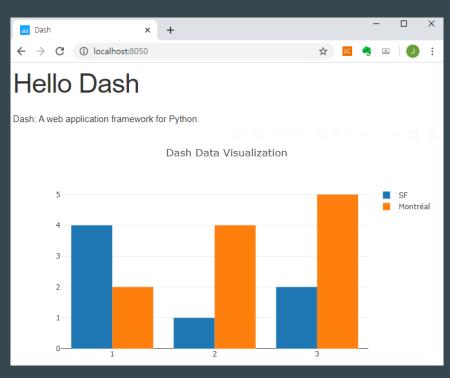
Built on Plotly, React.js, and Flask

# How to use Dash with Flask?

#### An example of using Dash with Hask

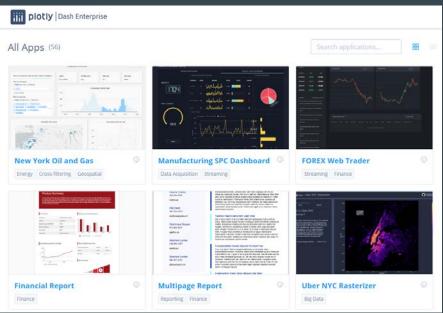
Dash uses Flask for the server

```
2 from flask import Flask
 3 import dash
 4 import dash_core_components as dcc
 5 import dash_html_components as html
  external_stylesheets = ['https://codepen.io/chriddyp/pen/bWLwqP.css']
   server = Flask( name
10 app = dash.Dash(__name__, server=server, external_stylesheets=external_stylesheets)
12 app.layout = html.Div(children=[
       html.H1(children='Hello Dash'),
       html.Div(children='''
          Dash: A web application framework for Python.
       dcc.Graph(
           id='example-graph',
           figure={
               'data': [
                   {'x': [1, 2, 3], 'y': [4, 1, 2], 'type': 'bar', 'name': 'SF'},
                  {'x': [1, 2, 3], 'y': [2, 4, 5], 'type': 'bar', 'name': u'Montréal'},
               'layout': {
                   'title': 'Dash Data Visualization'
31 ])
                                          Running Flask server
       app.run server(debug=True
```



#### Using Dash for data visualization

- Open source python framework for creating 'analytical' web application
- Integrating with Flask for building a variety of data-driven web applications
- Usually used with Plotly library and React is for data analytics app (e.g., dashboard application)



A variety of examples of Dashboard applications using Dash with Plotly

#### Goal

- Understand a basic operation of Dash framework
- Learn how to use Dash for developing interactive web applications
- Learn how to process and visualize data using Dash and Plotly
- Practice how to use Dash and Plotly for data visualization

### Dash Basic

#### Practice scope

- Practice 1: Dash basic operation (displaying a static graph)
- Practice 2: Dash layout (Color change, resize, and align)
- Practice 3: Dash callback
- Practice 4: Interactive Graph with callback and data imports

#### An example of Dash application

- Import an external CSS file to style web page
- Create a Dash app with importing the CSS file

```
2 from flask import Flask
3 import dash
 4 import dash_core_components as dcc
 5 import dash html components as html
  external_stylesheets = ['https://codepen.io/chriddyp/pen/bWLwgP.css']
 9 server = Flask( name
 app = dash.Dash(__name__, server=server, external_stylesheets=external_stylesheets)
12 app.layout = html.Div(children=[
       html.H1(children='Hello Dash'),
      html.Div(children='''
          Dash: A web application framework for Python.
       dcc.Graph(
           id='example-graph',
          figure={
               'data': [
                  {'x': [1, 2, 3], 'y': [4, 1, 2], 'type': 'bar', 'name': 'SF'},
                  {'x': [1, 2, 3], 'y': [2, 4, 5], 'type': 'bar', 'name': u'Montréal'},
               'layout': {
                   'title': 'Dash Data Visualization'
31 ])
33 if __name__ == '__main__':
      app.run server(debug=True)
```

#### An example of Dash application

- Using 'dash\_core\_components' to include and use Dash components (e.g., Graph) in a web page
- Using 'dash\_html\_components' to provide page layout information

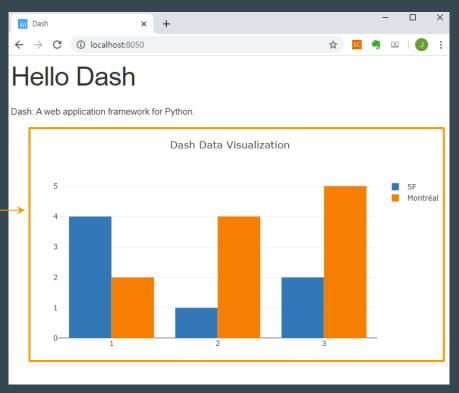
```
2 from flask import Flask
 3 import dash
 4 import dash core components as dcc
 5 import dash_html_components as html
  external stylesheets = ['https://codepen.io/chriddyp/pen/bWLwgP.css']
 9 server = Flask( name )
10 app = dash.Dash(__name__, server=server, external_stylesheets=external_stylesheets)
                                                         dash_html_components
  app.lavout = html.Div(children=[
      html.H1(children='Hello Dash'),
      html.Div(children='''
          Dash: A web application framework for Python.
                                                         dash core components
      dcc.Graph(
          id='example-graph',
          figure={
                  {'x': [1, 2, 3], 'y': [4, 1, 2], 'type': 'bar', 'name': 'SF'},
                  {'x': [1, 2, 3], 'y': [2, 4, 5], 'type': 'bar', 'name': u'Montréal'}
                   'title': 'Dash Data Visualization'
33 if __name__ == '__main__':
      app.run server(debug=True)
```

```
<div>
<h1> Hello Dash </h1>
<div>
Dash: A Web application framework for Python
</div>
{Graph}
</div>
```

#### An example of Dash application

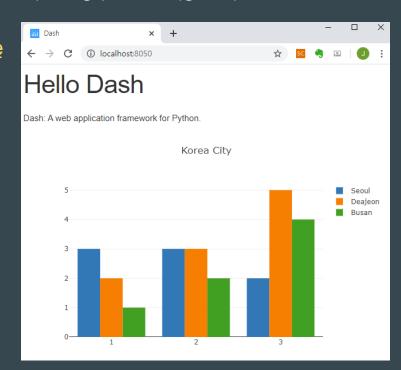
Code result

```
2 from flask import Flask
 3 import dash
 4 import dash_core_components as dcc
 5 import dash_html_components as html
 7 external_stylesheets = ['https://codepen.io/chriddyp/pen/bWLwgP.css']
 9 server = Flask( name )
10 app = dash.Dash(__name__, server=server, external_stylesheets=external_stylesheets)
12 app.layout = html.Div(children=[
      html.H1(children='Hello Dash'),
      html.Div(children='''
          Dash: A web application framework for Python.
      dcc.Graph(
           id='example-graph',
           figure={
               'data': [
                  {'x': [1, 2, 3], 'y': [4, 1, 2], 'type': 'bar', 'name': 'SF'},
                  {'x': [1, 2, 3], 'y': [2, 4, 5], 'type': 'bar', 'name': u'Montréal'},
               'layout': {
                   'title': 'Dash Data Visualization'
33 if __name__ == '__main__':
      app.run_server(debug=True)
```



#### Practice #1: Displaying 3 bar charts

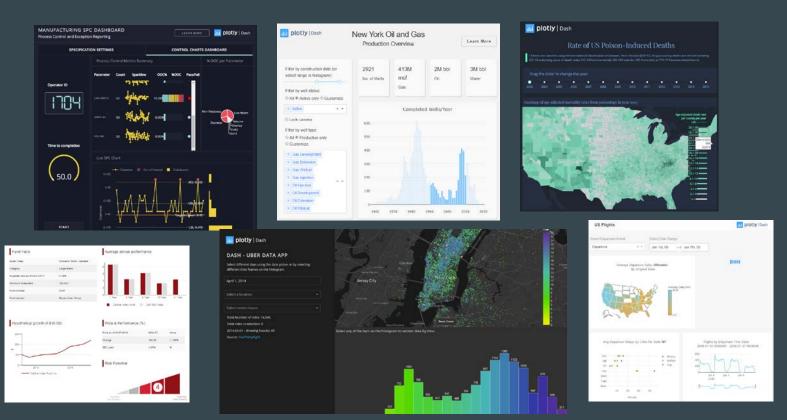
- Display 3 bar charts
- Each chart name is the Korea city: Seoul(blue), Daejeon(orange), Busan(green)
- You may use this skeleton source code: <u>link</u>
- Check and upload your screenshot for grading: <a href="here">here</a>



# Dash Layout

#### Before learning..

#### Many Dash layouts and styles available....



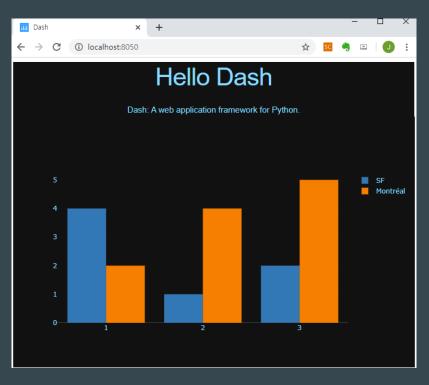
#### Practice scope

- Practice 1: Dash basic operation (displaying a static graph)
- Practice 2: Dash layout (Color change, resize, and align)
- Practice 3: Dash callback
- Practice 4: Interactive Graph with callback and data imports

#### Dash layout: Change color

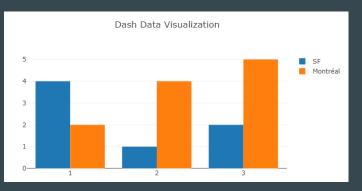
Applying color styles to Dash components

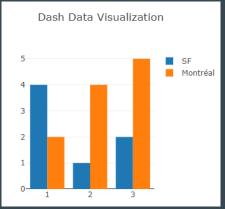
```
> Styles to apply
   colors = {
       'background': '#111111',
       'text': '#7FDBFF'
 6 app.layout = Mml.Div style={'backgroundColor': colors['background']}, children=[
       html.H1(
           children='Hello Dash',
           style={
               'textAlian' 'center'.
               'color': colors['text']
      html.Div(children='Dash: A web application framework for Python.', style={
           'textAlian': 'center'.
           'color': colors['text']
       dcc.Graph(
           id='example-graph-2',
           figure={
               'data': [
                   {'x': [1, 2, 3], 'y': [4, 1, 2], 'type': 'bar', 'name': 'SF'},
                   {'x': [1, 2, 3], 'y': [2, 4, 5], 'type': 'bar', 'name': u'Montréal'},
               'layout': {
                   'plot_bgcolor': colors['background'],
                    'paper_bgcolor': colors['background'],
                       'color': colors['text']
36 ])
```



#### Dash layout: Resizing layout

Using width, height of 'layout'





#### Dash layout: Aligning layout

• To arrange layout horizontally, apply 'inline-block' style to '<div>'

```
1 html.Div(
       dcc.Graph(
           id='example-graph-1',
           figure={
               'data': [
                  {'x': [1, 2, 3], 'y': [4, 1, 2], 'type': 'bar', 'name': 'SF'},
                  {'x': [1, 2, 3], 'y': [2, 4, 5], 'type': 'bar', 'name': u'Montréal'},
               'layout': {
                   'width': 700,
                   'height': 400
           'display': 'inline-block',
           'border': '2px black solid'
20 html.Div(
           id='example-graph-2',
           figure={
               'data': [
                  {'x': [1, 2, 3], 'y': [4, 1, 2], 'type': 'bar', 'name': 'SF'},
                   {'x': [1, 2, 3], 'y': [2, 4, 5], 'type': 'bar', 'name': u'Montréal'},
               'layout': {
                   'width': 400,
                   'height': 400
       style={
          'display': 'inline-block'.
           'border': '2px black solid'
```



#### Dash layout: Aligning layout

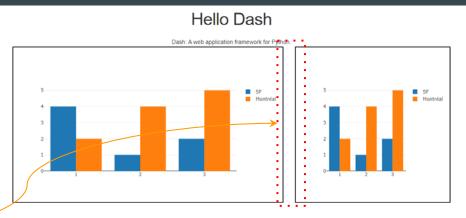
```
1 html.Div(children=[
        html.Div(
             dcc.Graph(
                  id='example-graph-1',
                  figure={
                       'data': [
                           {'x': [1, 2, 3], 'y': [4, 1, 2], 'type': 'bar', 'name': 'SF'}, 
{'x': [1, 2, 3], 'y': [2, 4, 5], 'type': 'bar', 'name': u'Montréal'},
                       'layout': {
                            'width': 700,
                            'height': 400
                                                                     2 divisions are arranged
                                                                              horizontally
                  'display': 'inline-block'
                  'border': '2px black solld
        html.Div(
             dcc.Graph(
                  id='example-graph-2',
                  figure={
                           {'x': [1, 2, 3], 'y': [4, 1, 2], 'type': 'bar', 'name': 'SF'}, 
{'x': [1, 2, 3], 'y': [2, 4, 5], 'type': 'bar', 'name': u'Montréal'},
                       'layout': {
                            'width': 400.
                            'height': 400
             style={
                  'display': 'inline-block',
                  'border': '2px black solid'
41 ], style={
        'display': 'flex',
         'justify-content': 'center'
```



2 divisions are aligned center

#### Dash layout: Aligning layout

```
1 html.Div(children=[
       html.Div(
           dcc.Graph(
               id='example-graph-1',
               figure={
                   'data': [
                       {'x': [1, 2, 3], 'y': [4, 1, 2], 'type': 'bar', 'name': 'SF'},
                       {'x': [1, 2, 3], 'y': [2, 4, 5], 'type': 'bar', 'name': u'Montréal'},
                   'layout': {
                        'width': 700,
                       'height': 400
           style={
               'display': 'inline-block',
               'border': '2px black solid'
       html.Div(
           dcc.Graph(
               id='example-graph-2',
               figure={
                       {'x': [1, 2, 3], 'y': [4, 1, 2], 'type': 'bar', 'name': 'SF'},
                       {'x': [1, 2, 3], 'y': [2, 4, 5], 'type': 'bar', 'name': u'Montréal'},
                   'layout': {
                       'width': 400.
                       'height': 400
               'marginLeft': 30,
               'display': 'inline-block',
               'border': '2px black solid'
41 ], style={
       'display': 'flex',
       'justify-content': 'center'
```



You can have space with margin options (e.g., 'marginLeft': 30)

#### Practice #2: Changing Dash component styles

- Styling your Dash layout as below (Fig. result screenshot)
- Using color options, 'inline-block', and flex options (see pp.24)
- You may use this skeleton source code: <u>link</u>
- Check and upload your screenshot for grading: <u>here</u>



### Dash Callback

- There are 2 types of callback: Input, Output
- Input callback is used to receive and process a user's input data
- Output callback is used to display results of the process

- In the callback,
  - we declared that Input is the 'value' property of the component that has the ID 'my-id'
  - $\circ$  our output is the 'children' property of the component with the ID 'my-div'

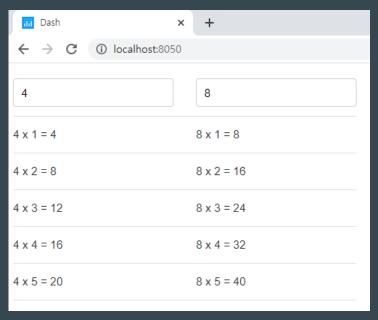
- In the callback,
  - we declared that Input is the 'value' property of the component that has the ID 'my-id'
  - our output is the 'children' property of the component with the ID 'my-div'

```
1 app.layout = html.Div([
                                                                                   iii Dash
      dcc.Input(id='my-id', value='initial value', type='text'),
      html.Div(id='my-div')
                                                                                                   localhost:8050
4])
                                                                                                    ① User input some text
                                                                                  IE481
  @app.callback(
      Output(component_id='my-div', component_property='children'),
                                                                                 You've entered "IE481"
      [Input(component_id='my-id', component_property='value')]
10 )
  def bb(cc):
      return 'You\'ve entered "{}"'.format(cc)
                       2 Callback function will be called
                       (3) Callback function returns results
```

- There are 2 types of callback: Input, Output
- Input callback is used to receive and process user's input data
- Output callback is used to display results of the process

#### Practice #3: Multiple input/output callback

- Design and build multiple input/output callback for multiplication table
- Just display 5 lines only (see Fig.)
- You may use this skeleton source code: <u>link</u>
- Check and upload your screenshot for grading: <u>here</u>

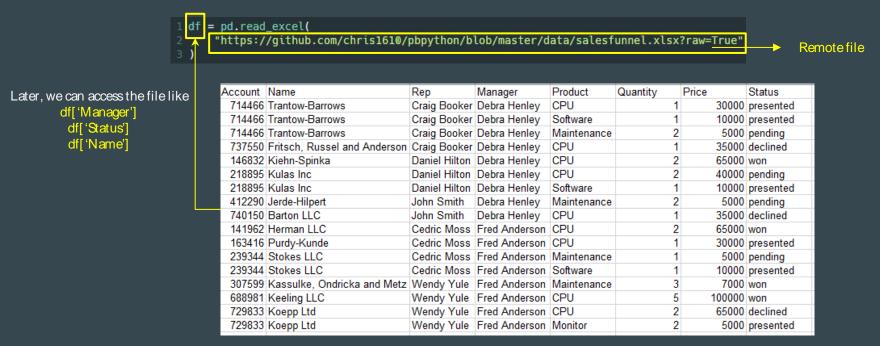


# Interactive Graph

### Import data + Callback

#### Import data (.xlsx data)

- Step 1: Install 'xIrd' python package (command 'pip install xIrd')
- Step 2: Read excel file using 'pandas' module



#### Callback operation

- Step 1: User choose some value in the Dropdown interface
- Step 2: Callback function is executed → Executing callback body → Return results (display outputs)

② Callback function is executed whenever user select any choice

```
def update_graph(Manager):
1 app.layout = html.Div([
                                                                                                                                                         Sales Funnel Report
                                                                         if Manager == "All Managers":
       html.H2("Sales Funnel Report"),
                                                                            df_plot = df.copy()
      html.Div(
                                                                                                                                                                           ① User choose some option (value)
                                                                            df plot = df[df['Manager'] == Manager]
               dcc.Dropdown(
                   id="Manager",
                                                                         pv = pd.pivot_table(
                                                                                                                                                                      Customer Order Status for All Managers
                   options=[{
                                                                            df_plot,
                                                                             index=['Name'],
                        'label': i.
                                                         execution
                                                                            columns=["Status"],
                        'value': i
                                                                            values=['Quantity'],
                   } for i in mgr_options],
                                                                                                                                                                                                           Pending
                                                                            aggfunc=sum,
                   value='All Managers'),
                                                                            fill value=0)
           style={'width': '25%',
                                                                         trace1 = go.Bar(x=pv.index, y=pv[('Quantity', 'declined')], name='Declined')
                  'display': 'inline-block'}),
                                                                         trace2 = go.Bar(x=pv.index, y=pv[('Quantity', 'pending')], name='Pending')
       dcc.Graph(id='funnel-graph'),
                                                                         trace3 = go.Bar(x=pv.index, y=pv[('Quantity', 'presented')], name='Presented')
                                                                         trace4 = go.Bar(x=pv.index, y=pv[('Quantity', 'won')], name='Won')
                                        Filled in the graph
                                                                         return {
18 @app.callback(
                                                                             'data': [trace1, trace2, trace3, trace4],
      dash.dependencies.Output('funnel-graph', 'figure'),
                                                                             'lavout':
      [dash.dependencies.Input('Manager', 'value')])
                                                                                 title='Customer Order Status for {}'.format(Manager),
                                                                                 barmode='stack')
```

3 Callback function returns results

#### Detailed callback operation (in this example)

- Step 1: User choose one of manager (one of between 'Debra Henley' and 'Fred Anderson') (Callback Input)
- Step 2: Based on the 'Manager' information from step 1, a pivot\_table will be filled with related information
  - $\circ$  E.g., df['Name']  $\rightarrow$  index, df['Status']  $\rightarrow$  columns

```
def update_graph(Manager):
    if Manager == "All Managers":
        df_plot = df.copy()
        df_plot = df[df['Manager'] == Manager]
    pv = pd.pivot table(
        df plot.
                                  Filled with the information
        index=['Name'], <--
                                  related with 'Fred Anderson'
        columns=["Status"].
        values=['Quantity'],
        aggfunc=sum,
        fill_value=0)
    trace1 = go.Bar(x=pv.index, y=pv[('Quantity', 'declined')], name='Declined')
    trace2 = go.Bar(x=pv.index, y=pv[('Quantity', 'pending')], name='Pending')
    trace3 = go.Bar(x=pv.index, y=pv[('Quantity', 'presented')], name='Presented')
    trace4 = go.Bar(x=pv.index, y=pv[('Quantity', 'won')], name='Won')
    return {
         'data': [trace1, trace2, trace3, trace4],
         'layout':
        go.Layout(
            title='Customer Order Status for {}'.format(Manager),
            barmode='stack')
```

| Account | Name                         | Rep           | Manager       | Product     | Quantity | Price  | Status    |
|---------|------------------------------|---------------|---------------|-------------|----------|--------|-----------|
| 714466  | Trantow-Barrows              | Craig Booker  | Debra Henley  | CPU         | 1        | 30000  | presented |
| 714466  | Trantow-Barrows              | Craig Booker  | Debra Henley  | Software    | 1        | 10000  | presented |
| 714466  | Trantow-Barrows              | Craig Booker  | Debra Henley  | Maintenance | 2        | 5000   | pending   |
| 737550  | Fritsch, Russel and Anderson | Craig Booker  | Debra Henley  | CPU         | 1        | 35000  | declined  |
| 146832  | Kiehn-Spinka                 | Daniel Hilton | Debra Henley  | CPU         | 2        | 65000  | won       |
| 218895  | Kulas Inc                    | Daniel Hilton | Debra Henley  | CPU         | 2        | 40000  | pending   |
| 218895  | Kulas Inc                    | Daniel Hilton | Debra Henley  | Software    | 1        | 10000  | presented |
| 412290  | Jerde-Hilpert                | John Smith    | Debra Henley  | Maintenance | 2        | 5000   | pending   |
| 740150  | Barton LLC                   | John Smith    | Debra Henley  | CPU         | 1        | 35000  | declined  |
| 141962  | Herman LLC                   | Cedric Moss   | Fred Anderson | CPU         | 2        | 65000  | won       |
| 163416  | Purdy-Kunde                  | Cedric Moss   | Fred Anderson | CPU         | 1        | 30000  | presented |
| 239344  | Stokes LLC                   | Cedric Moss   | Fred Anderson | Maintenance | 1        | 5000   | pending   |
| 239344  | Stokes LLC                   | Cedric Moss   | Fred Anderson | Software    | 1        | 10000  | presented |
| 307599  | Kassulke, Ondricka and Metz  | Wendy Yule    | Fred Anderson | Maintenance | 3        | 7000   | won       |
| 688981  | Keeling LLC                  | Wendy Yule    | Fred Anderson | CPU         | 5        | 100000 | won       |
| 729833  | Koepp Ltd                    | Wendy Yule    | Fred Anderson | CPU         | 2        | 65000  | declined  |
| 729833  | Koepp Ltd                    | Wendy Yule    | Fred Anderson | Monitor     | 2        | 5000   | presented |
|         |                              |               |               |             |          |        |           |

Assuming that a user choose the 'Fred Anderson' in the Dropdown interface

#### Detailed callback operation (in this example)

- Step 3: Using Plotly graph objects, information of x-axis and y-axis is filled
- Step 4: Return the completed Plotly graph objects (here, 'trace1' ~ 'trace2') (Callback Output)

```
def update graph(Manager):
    if Manager == "All Managers":
        df plot = df.copv()
        df plot = df[df['Manager'] == Manager]
    pv = pd.pivot_table(
                                      'Name' column is used for the x-axis
        df plot.
         index=['Name'].
        columns=["Status"],
        values=['Ouantity'].
        aggfunc=sum,
        fill_value=0)
                                 y=pv[('Quantity', 'declined')], name='Declined')
    trace1 = qo.Bar(x=pv.index
    trace2 = go.Bar(x=pv.index
                                 v=pv[('Quantity', 'pending')], name='Pending')
    trace3 = go.Bar(x=pv.index
                                 y=pv[('Quantity', 'presented')], name='Presented')
                                 y=pv[('Quantity', 'won')], name='Won')
    trace4 = go.Bar(x=pv.index.
    return {
         'data': [trace1, trace2, trace3, trace4],
         'layout':
        go.Layout(
            title='Customer Order Status for {}'.format(Manager),
             barmode='stack')
```

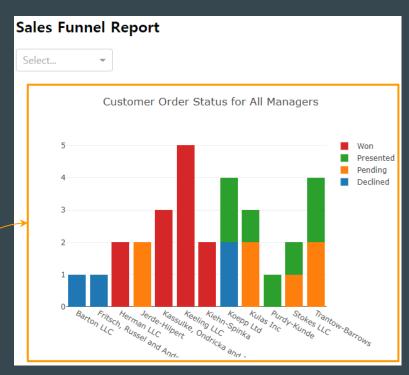
```
Account Name
                                                Manager
                                                              Product
                                                                           Quantity
                                                                                                   Status
 714466 Trantow-Barrows
                                    Craig Booker Debra Henley
                                                                                             3000
                                                                                                   presented
 714466 Trantow-Barrows
                                    Craig Booker Debra Henley
                                                                                                   presented
 714466 Trantow-Barrows
                                   Craig Booker Debra Henley
                                                             Maintenance
                                                                                              500
                                                                                                   pending
 737550 Fritsch, Russel and Anderson Craig Booker Debra Henley
                                                                                             3500 declined
 146832 Kiehn-Spinka
                                   Daniel Hilton Debra Henley
                                                                                             6500
 218895 Kulas Inc.
                                   Daniel Hilton Debra Henley
                                                                                             4000 pending
 218895 Kulas Inc.
                                                                                             1000 presented
                                   Daniel Hilton Debra Henley
 412290 Jerde-Hilpert
                                                                                              500 pending
                                   John Smith Debra Henley Maintenance
 740150 Barton LLC
                                    John Smith Debra Henley
                                                                                             3500 declined
 141962 Herman LLC
                                                                                             6500
                                    Cedric Moss Fred Anderson CPU
 163416 Purdy-Kunde
                                    Cedric Moss Fred Anderson CPU
                                                                                             3000 presented
 239344 Stokes LLC
                                                                                              500 pending
 239344 Stokes LLC
                                    Cedric Moss Fred Anderson Software
                                                                                             1000 presented
 307599 Kassulke, Ondricka and Metz Wendy Yule Fred Anderson Maintenanc
                                                                                              700 won
 688981 Keeling LLC
                                   Wendy Yule Fred Anderson CPU
                                                                                            10000
 729833 Koepp Ltd
                                   Wendy Yule Fred Anderson CPU
                                                                                             6500 declined
 729833 Koepp Ltd
                                   Wendy Yule Fred Anderson Monitor
                                                                                               500 presented
```

'Quantity' of each 'Status' put together in y-axis

#### Detailed callback operation (in this example)

Step 5: Display the Plotly graph objects to the web page

```
def update_graph(Manager):
    if Manager == "All Managers":
        df plot = df.copy()
    else:
        df plot = df[df['Manager'] == Manager]
    pv = pd.pivot table(
        df_plot,
        index=['Name'].
        columns=["Status"],
        values=['Quantity'],
        aggfunc=sum,
        fill value=0)
    trace1 = go.Bar(x=pv.index, y=pv[('Quantity', 'declined')], name='Declined')
    trace2 = qo.Bar(x=pv.index, y=pv[('Quantity', 'pending')], name='Pending')
    trace3 = go.Bar(x=pv.index, y=pv[('Quantity', 'presented')], name='Presented')
    trace4 = go.Bar(x=pv.index, y=pv[('Quantity', 'won')], name='Won')
    return {
         'data': [trace1, trace2, trace3, trace4],
        'lavout':
        go.Layout(
            title='Customer Order Status for {}'.format(Manager),
            barmode='stack')
```



#### Programming assignment #3: COMD-19 status in Korea

- Design dropdown interface to select a city of Korea
- Display the status of disease of each city according to choosing the city in the dropdown
- Insert this COVID-19 status dashboard in your homepage and host it in Heroku
- More detailed instructions will be delivered with dataset after class

