



Building interactive web apps in Dash

PyData Warsaw 2018



idash.pl

Who we are

Our training

- Machine learning,
- Artificial intelligence,
- Neural Networks,
- Bayesian inference,
- Statistical modelling,
- Efficient reporting,
- Web scraping,
- Data visualisation,
- Data related web app frameworks (Dash, Shiny),
- Relational and non-relational databases,
- Introductions to Data Science languages (Python, R, SQL).

and much more.

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- Allows to quickly share your results in an appealing way.
- No other programming language required - just Python!
- Uses Plotly.js, React and Flask under the hood.
- It's **free!** (MIT License)



YouTube

Search

PLOTCON

New York City - November 15-18, 2016



0:03 / 28:58



PLOTCON 2016: Chris Parmer, Dash: Shiny for Python

Dataset

Two CSV's:

- **flights.csv** - contains information about flights from three New York City airports in 2013. It stores data such as:
 - flight hour (**hour** column),
 - flight distance (**distance** column),
 - departure delay (**dep_delay** column)
 - etc.
- **airlines.csv** - contains airline short name (**carrier** column) and full name (**name** column).

App demo

Agenda

- Dash background

Agenda

- Dash background
- Static layout elements

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- Dynamic layout elements

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- Dash background
- Static layout elements
- Dynamic layout elements
- Making the output react to the input
- Basics of caching

Technical details

Python & packages

We recommend using Python 3. Packages required: dash, dash_core_components, dash_html_components, dash_table, pandas, numpy, plotly.

Materials

- Workshop slide deck [idash.pl/dash_intro](https://dash.idash.pl/dash_intro)
- Project on [github repository](#)
- Final Dash app on dash.idash.pl

Let's get started!

Open the project!

App structure

app.py

App structure

```
# Load packages
import dash
import dash_html_components as html

# Initialize the app
app = dash.Dash()

# Create a layout
app.layout = html.Div()

# Run the app
if __name__ == '__main__':
    app.run_server(debug=True)
```

How to build the layout

Who of you know basics of HTML?

Who of you know basics of CSS?

Dash HTML Components

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```
import dash_html_components as html

html.H1(
    children = 'Hello!'
)
```

Hello!

Dash HTML Components

All HTML tags are available but you'll most likely end up using only few of them:

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...at least on the beginning. Full list of HTML tags can be found [here](#).

Dash HTML Components

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```
import dash_html_components as html

html.Div(
    children = [
        html.H1('Hello!'),
        html.H3('First words from Dash')
    ],
    style = {
        'backgroundColor' : '#0cb4ce',
        'color' : '#fff'
    },
    className = 'myCssClass'
)
```

Hello!

First words from Dash

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Catches to remember:

- In Dash you need to **capitalize** the first letter of all HTML tag names.
- The `class` attribute is called `className`.
- The `children` argument is always the first one, so its name can be omitted.
- The `style` attribute takes the form of a Python dictionary where all keys are **camel cased**.

Dash Core Components

Dash Core Components

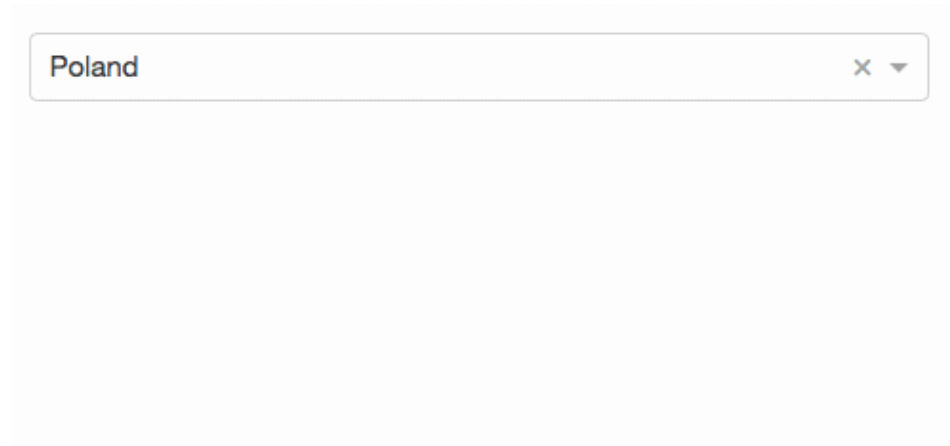
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```
import dash_core_components as dcc

dcc.Dropdown(
    id="country",
    options=[
        {'label': 'Poland', 'value': 'PL'},
        {'label': 'Germany', 'value': 'DE'},
        {'label': 'United States', 'value': 'US'}
    ],
    value='PL'
)
```

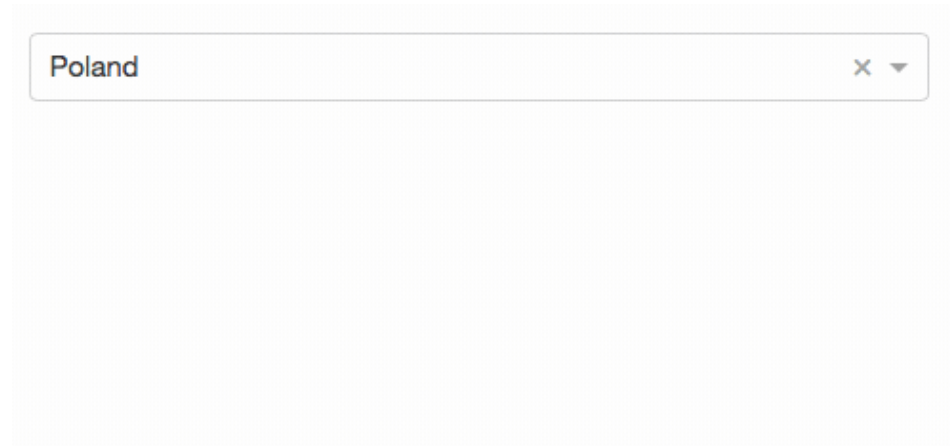


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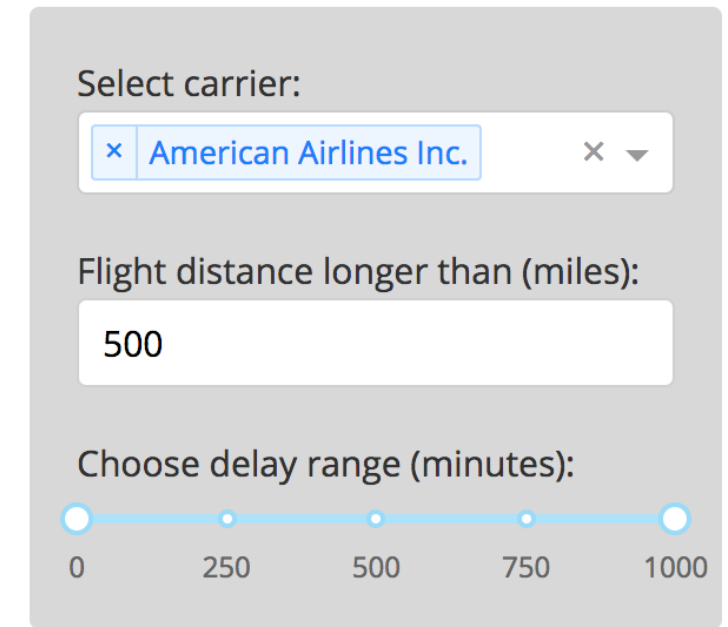


Full list of available components can be found [here](#).

Task 1 (15 minutes)

Create new HTML layout element (`div`) containing the following components:

- A component which shows a list of airlines ("name" column in the "airlines" data frame). The list should enable choosing more than one airline at once. Use `ui-element` class.
- A component, which allows to determine a minimal flight distance. Use `ui-element` class.
- A component, in which user is able to choose a range from 0 to 1000. Try to add marks from 0 to 1000 with step 250.



Select carrier:

× American Airlines Inc. × ▼

Flight distance longer than (miles):

500

Choose delay range (minutes):

0 250 500 750 1000

The div will get grey and positioned correctly if you add `sidebar`, `four` and `columns` CSS classes.

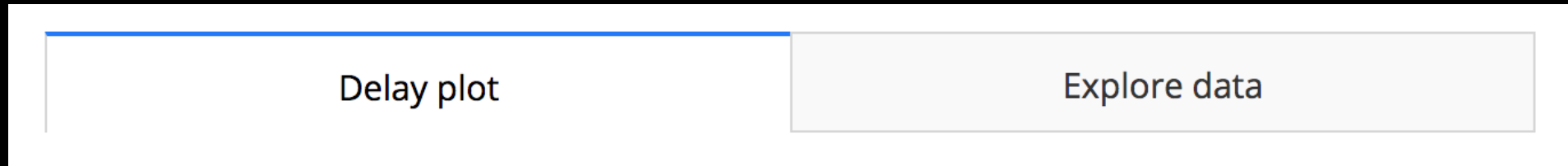
<https://bit.ly/2DIpfYO>

Task 2 (6 minutes)

One of the core components is a tabset. Try to add one on the right. To do this, create another HTML `div` element with `eight` and `columns` classes.

It should contain two tabs - "Delay plot" and "Explore data":

- Tabs should have an `id = tabs`,
- Each Tab should have `custom-tab` class,
- Each Tab should have `custom-tab` class once is selected.



<https://bit.ly/2TfTZAa>

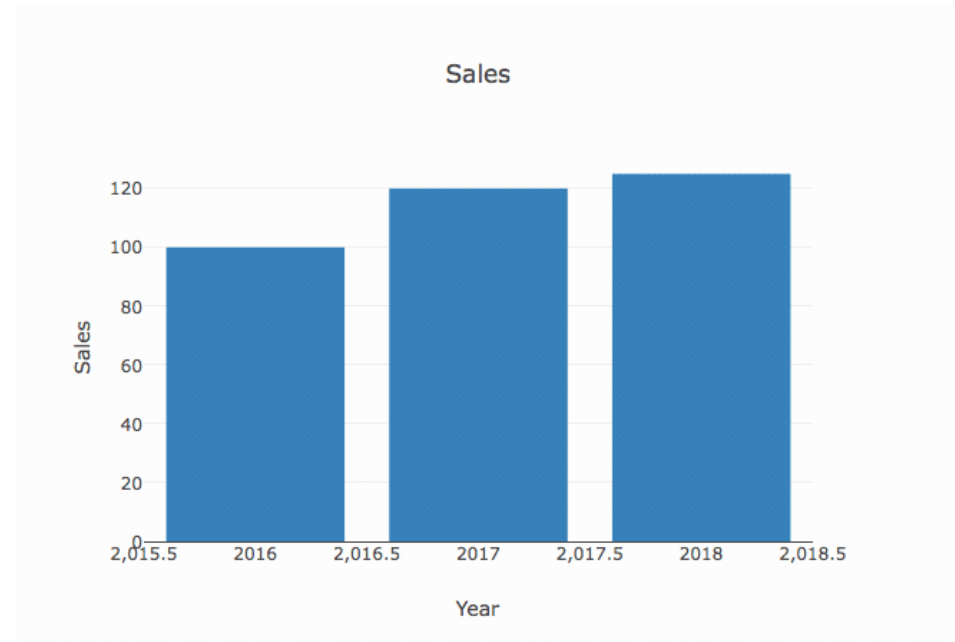
Plots & tables

Plots

The dash-core-components library contains a Graph component allowing to use plotly visualisations in the app.

```
import dash_core_components as dcc
import plotly.graph_objs as go

dcc.Graph(
    id="my-graph",
    figure=go.Figure(
        data=[
            go.Bar(
                x=[2016, 2017, 2018],
                y=[100, 120, 125],
            )
        ],
        layout=go.Layout(
            title='Sales',
            yaxis=dict(title='Sales'),
            xaxis=dict(title='Year')
        )
    )
)
```



Adding a static plot

Tables

The `dash_table` library contains a component allowing to easily render tables.

```
import dash_table
import pandas as pd

data=pd.DataFrame({
    'year': [2016, 2017, 2018],
    'sales': [100, 120, 125]
})

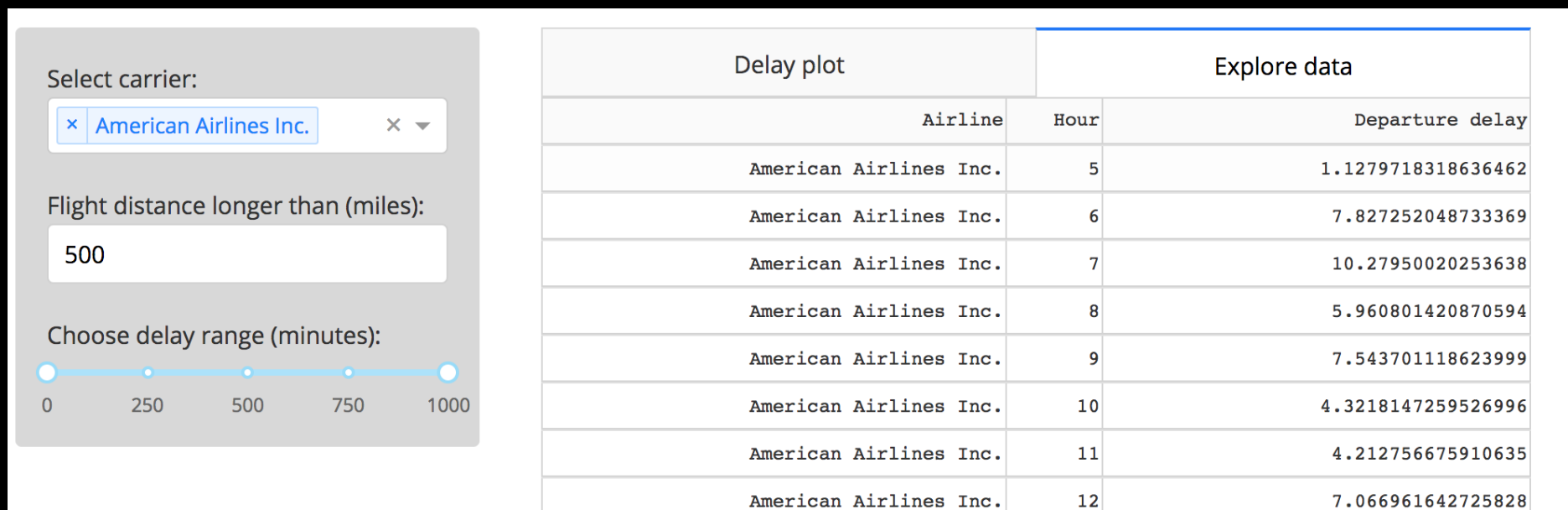
dash_table.DataTable(
    id='table',
    columns=[
        {"name": i, "id": i} for i in data.columns
    ],
    data=data.to_dict("rows")
)
```

year	sales
2016	100
2017	120
2018	125

Task 3 (5 minutes)

Create a static table in the "Explore data" which presents the same aggregated data as shown in the plot. You can find a proper chunk of code in `static_elements.py` script.

Remember to include it in the `layout`.



<https://bit.ly/2Bbx95P>

Questions?

Making the app react to user input (callbacks)

What is reactivity?

Callbacks

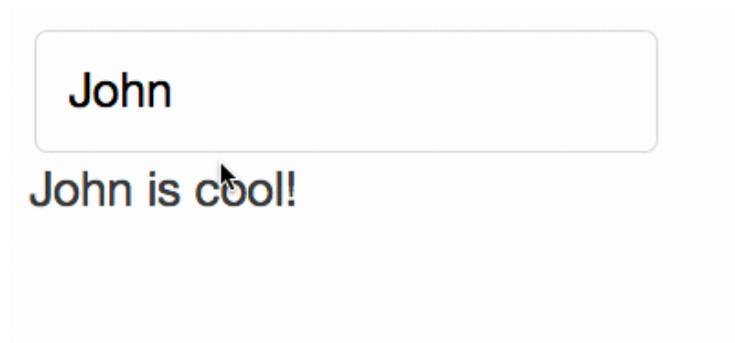
Callbacks **bind** components responsible for **inputting values** (like sliders, dropdowns etc.) with components responsible for presenting results (plots, tables, etc.).

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```
app.layout = html.Div([
    dcc.Input(id='name', value='John', type='text'),
    html.Div(id='sentence')
])

@app.callback(
    dash.dependencies.Output(
        component_id='sentence',
        component_property='children'
    ),
    [dash.dependencies.Input(
        component_id='name',
        component_property='value'
    )]
)
def update_output_div(input_value):
    return f'{input_value} is cool!'
```

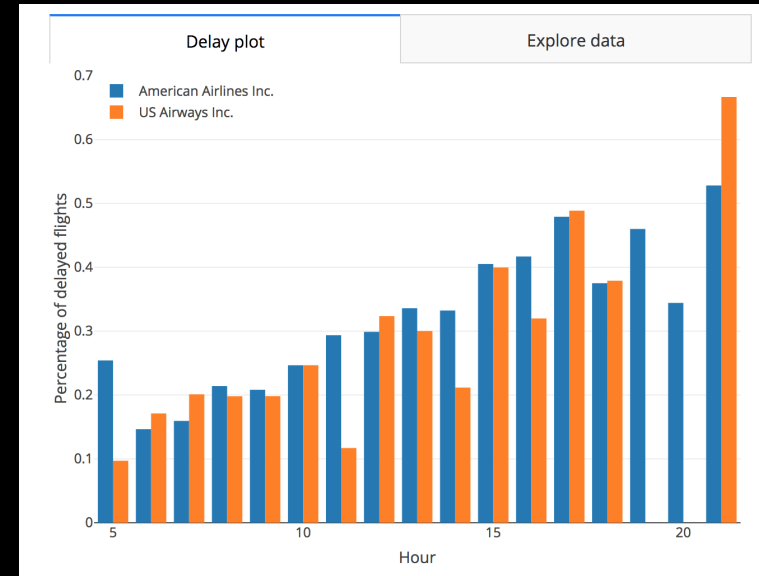


Building text object with input/s in our app

Task 4 (10 minutes)

Let's make a reactive plot! Use `callback`; it should response to any changes made in control panel. Use the code from `static_element.py`

1. Based on `static_sum_flights` function, create a `reactive_sum_flights` function including all dependencies (core components) to modify `agg_data` DataFrame.
2. The plot should show the percentage of delayed flights per hour in terms of airlines.
3. *Make the table react to user input as well.



Task 4 (10 minutes)

Hint How to calculate percentage of delayed flights

<https://bit.ly/2PtW8Pc>

**What do you think can be improved
in the app code?**

Sharing data between callbacks (caching)

Global variables

How about making a callback so it modifies a global variable?

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By default Dash serves the app to multiple users at once using a single Python process. If you modify a global variable **other user sessions might be influenced.**

Dash can also be run using multiple Python workers that executes callbacks on parallel. However, worker memory is not shared. If you change a global variable in one callback, workers handling other callbacks won't see that change!

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[Link to the example](#)

Sharing data with a hidden div

```
### app.layout ###  
html.Div(id='data', style={'display': 'none'})
```


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html.Div(id='data', style={'display': 'none'})
```

```
### First callback ###  
@app.callback(  
    dash.dependencies.Output('data', 'children')  
    [Input(...)]  
)  
def foo_fun():  
    df = ...  
    return df.to_json(date_format = 'iso', orient = 'split')
```

Sharing data with a hidden div

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def foo_fun():  
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```

Then, you can use `pd.read_json()` to retrieve the data in another callback.

Task 5* (7 minutes)

Modify `callbacks` in order to remove duplicated code.

<https://bit.ly/2QLjJTm>

We're looking for trainers!

**If you need training, you know who to
contact! ;)**



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