## PPOL564: Data Science I

Unit 03: User-defined functions (part one)

## Goals for today's session

- ► Review of upcoming deadlines
- ► Part three of previous lecture (row and column subsetting)
- User-defined functions
  - ► Lecture slides + example
  - Group activity
- ► Walk through notebook with plotting example code

# Upcoming deadlines

- ▶ **Problem set one:** returned by Monday 09/06
- ► Final project intro: will release guideline doc soon; review questions in class Wednesday 09/14
- ▶ **Problem set two:** due Friday 09/16

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# Example from material on aggregating data

Used a one-line function (lambda function) to sort offenses from most to least frequent and pull the most-frequent offense:

```
dc_crim_2020.groupby(['WARD',
'SHIFT']).agg({'OFFENSE':
lambda x: x.value_counts(sort = True,
ascending = False).index[0]})
```

# Lambda functions versus "normal" python functions

- ▶ Lambda functions: think of as *single-use*, *throwaway* functions code works there but if we wanted to perform similar operation (eg find most frequent weapon used), would need to copy/paste that lambda function into different aggregation calls
- ► "Normal" python functions covered in DataCamp: defined using the def command helps us save time/make code more readable by avoiding repetitive code

# Same example putting the code inside a function

```
1 def most_common(one_col: pd.Series):
      Function to return name of most common category
      Parameters:
          one_col (pd. Series): pandas series
      Returns:
          top (str): string with name of most frequent category
      1.1.1
      ## sort values
      sorted_series = one_col.value_counts(sort = True, ascending =
12
      False)
      ## get top
13
      top = sorted_series.index[0]
14
      ## return
15
      return (top)
16
18 ## execute
dc_crim_2020.groupby(['WARD',
               'SHIFT']).agg({'OFFENSE':
                lambda x: most_common(x) })
```

# Three ingredients in a user-defined function

1. Name of function and inputs: name is arbitrary; multiple inputs are separated by commas (later, we'll cover setting inputs to default values) def most\_common(one\_col: pd.Series):

2. **Meat of function:** what the function does inside with the inputs

```
## sort values
sorted_series = one_col.value_counts(sort = True,
ascending = False)
## get top
top = sorted_series.index[0]
```

3. **Return statement (if any):** returning one or more outputs; note that non-returned objects (eg in this example, the sorted\_series) are discarded

```
## return
return(top)
```

# Building a function together

See first part of this notebook to follow along with the code:

02\_functions\_part1\_blank.ipynb

### Task

Write a function that takes in two arguments—a dataframe and an integer of a Ward number

- ► The function should subset to:
  - ► That ward
  - ► The ward immediately "below" that ward (if focal ward is Ward 2, Ward 1)
  - ► The ward immediately äbove" that ward (if focal ward is Ward 2, Ward 3)
- ► Find the number of unique crime reports (unique CCN) in each ward
- ► Should print the name + number of crimes in the ward with the most unique crime reports of that comparison set (returns nothing)

## Breaking down into steps

- Get the **meat** of the function working outside the function with one example
- 2. Figure out what parts of that meat you want to generalize
- 3. Get that generalization working outside the function
- 4. Construct the function
- Execute it on the one example and make sure it produces same output as step 1
- 6. Execute it on multiple examples

# Meat of function with one example (ward 3)

```
1 ## get list of wards + neighbors
2 neighbor_wards = [3 - 1, 3 + 1]
3 \text{ wards\_touse} = [3] + \text{neighbor\_wards}
5 ## then, use isin command to subset the data
6 ## to those wards
7 df_focal = dc_crim_2020 [dc_crim_2020 .WARD. isin (wards_touse)].copy()
9 ## then, use groupby to find unique
ward_ccn = df_focal.groupby('WARD')['CCN'].nunique().reset_index
12 ## finally , get the top one (multiple ways)
top_ward = ward_ccn.sort_values(by = 'CCN',
              ascending = False). head(1)
14
16 ## print
print("Ward with most reports of neighbors is WARD" + str(top_ward
      ['WARD']. values [0]) +
       " with N reports: " + str(top_ward.CCN.values[0]))
18
```

# Many things we could generalize

Focusing on bolded two (ward and dataframe name) but large list; depends on what we want to use function to do:

- ► Ward we're focusing on (hard coded to 3)
- ▶ Name of data frame (hard coded to dc\_crim\_2020
- Name of ward column (hard coded to WARD)
- ▶ Number of neighbors to look at (hard coded to 1 above and 1 below)
- Name of crime identifier column (hard coded to CCN)

# Highlighting parts where ward and dataframe name are hard coded

```
## get list of wards + neighbors
neighbor_wards = [3 - 1, 3 + 1]
wards_touse = [3] + neighbor_wards
## then, use isin command to subset the data
## to those wards
df_focal = dc_crim_2020[dc_crim_2020.WARD.isin(wards_touse)].copy()
## then, use groupby to find unique
ward_ccn = df_focal.groupby('WARD')['CCN'].nunique().reset_index()
## finally, get the top one (multiple ways)
top_ward = ward_ccn.sort_values(by = 'CCN',
            ascending = False).head(1)
```

# Replace hard-coded parts with placeholder

```
## get list of wards + neighbors
neighbor_wards = [focal_ward - 1, focal_ward + 1]
wards_touse = [focal_ward] + neighbor_wards
## then, use isin command to subset the data
## to those wards
df_focal = df [df.WARD.isin(wards_touse)].copy()
## then, use groupby to find unique
ward_ccn = df_focal.groupby('WARD')['CCN'].nunique().reset_index()
## finally, get the top one (multiple ways)
top_ward = ward_ccn.sort_values(by = 'CCN',
            ascending = False).head(1)
```

## Can still test outside the function

```
## testing obj
focal_ward = 3
df = dc_crim_2020.copy()
## get list of wards + neighbors
neighbor_wards = [focal_ward - 1, focal_ward + 1]
wards_touse = [focal_ward] + neighbor_wards
## then, use isin command to subset the data
## to those wards
df_focal = df [df.WARD.isin(wards_touse)].copy()
## then, use groupby to find unique
ward_ccn = df_focal.groupby('WARD')['CCN'].nunique().reset_index()
## finally, get the top one (multiple ways)
top_ward = ward_ccn.sort_values(by = 'CCN',
            ascending = False).head(1)
```

# Then, putting it all together for the function

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15 16

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(see notebook for documentation; omitted here on slide for space reasons) 1 def compare\_wards(focal\_ward: int , df: pd.DataFrame): ## get list of wards to use  $neighbor\_wards = [focal\_ward - 1, focal\_ward + 1]$ wards\_touse = [focal\_ward] + neighbor\_wards ## subset to those df\_focal = df[df.WARD.isin(wards\_touse)].copy() ## find crimes per ward ward\_ccn = df\_focal.groupby('WARD')['CCN'].nunique(). reset\_index() ## finally, get the top one  $top\_ward = ward\_ccn.sort\_values(by = 'CCN', ascending = False).$ head(1) ## print print ("Ward with most reports of neighbors is WARD" + \ str(top\_ward['WARD'].values[0]) + " with N reports: " + str(top\_ward.CCN.values[0]))

# Executing repeatedly: can combine with list comprehension

```
## repetitive execution

compare_wards(focal_ward = 3, df = dc_crim_2020)

compare_wards(focal_ward = 6, df = dc_crim_2020)

## using list comprehension

[compare_wards(focal_ward = i, df = dc_crim_2020)

for i in [3, 6]]
```

Latter may be especially useful if the function returns something that we later want to combine

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# Break for group activity

We provide the "outside of function" code; you work to generalize this into a function and execute

Section 2 of this notebook: 02\_functions\_part1\_blank.ipynb

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- ► Walk through notebook with plotting example code
  - Can use any plotting syntax for problem set popular ones are matplotlib (covered by DataCamp last chapter of introduction to pandas); seaborn; plotnine
  - ► Notebook gives plotnine syntax; more practice next week