#### **Effective Programming Practices for Economists**

# Data management with pandas

**Merging datasets** 

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#### **Motivation**

- Often when you download data, it comes in several files
- While you might not like it, this is often because the data providers respected the normal forms!
- Or it comes from very different sources
- In this screencast we show you how to merge or concatenate DataFrames

### **Concatenating DataFrames vertically**

>>> top			
		continent	life_exp
country	year		
Cuba	2002	Americas	77.16
	2007	Americas	78.27
>>> botto	m		
		continent	life_exp
country	year		
Cnain			
Spain	2002	Europe	79.78
Spain	2002	Europe	79.78 80.94

	nd	concat	([+on	bottom]	1
>>>	pa.	concat	TOD,	DOTTOM	)

		contin	ent	life_exp
country	year			
Cuba	2002	Americas	77.16	
	2007	Americas	78.27	
Spain	2002	Europe	79.78	
	2007	Europe	80.94	

- concat stacks DataFrames on top of each other
- aligned by columns
- index needs to be compatible
- list can have more than two elements

## **Concatenating DataFrames horizontally**

>>> left

	country	continent	year	life_exp
0	Cuba	Americas	2002	77.16
1	Cuba	Americas	2007	78.27
2	Spain	Europe	2002	79.78

>>> right

	country	year	gdp_per_cap	pop
0	Cuba	2007	8948.10	11416987
1	Spain	2002	24835.47	40152517
2	Spain	2007	28821.06	40448191

>>> pd.concat([left, right], axis="columns")

		continent	life_exp	gdp_per_cap	рор
country	year				
Cuba	2002	Americas	77.16	6340.65	11226999
	2007	Americas	78.27	8948.10	11416987
Spain	2002	Europe	79.78	24835.47	40152517
	2007	Europe	80.94	28821.06	40448191

- with axis="columns", DataFrames are stacked horizontally
- Used to be axis=1

# eful with non-meaningful indices

>>> pd.concat([left, right], axis="columns")

ountry	continent	year	life_exp		country	continent	year	life_exp	country	year	gdp_per_cap	
ba	Americas	2002	77.16	0	Cuba	Americas	2002	77.16	Cuba	2007	8948.10	1
ba	Americas	2007	78.27	1	Cuba	Americas	2007	78.27	Spain	2002	24835.47	4
ain	Europe	2002	79.78	2	Spain	Europe	2002	79.78	Spain	2007	28821.06	4

t

ıntry	year	gdp_per_cap	pop
oa	2007	8948.10	11416987
ain	2002	24835.47	40152517
ain	2007	28821.06	40448191

### 1:1 merges

```
>>> left
     country
                         gdp_per_cap
                 year
                                              pop
     Cuba
                 2002
                         6340.65
                                         11226999
     Cuba
                 2007
                         8948.10
                                         11416987
     Spain
                 2002
                         24835.47
                                         40152517
>>> right
     country
                 year
                         gdp_per_cap
                                              pop
     Cuba
                 2007
                         8948.10
                                         11416987
     Spain
                 2002
                         24835.47
                                         40152517
     Spain
                 2007
                         28821.06
                                         40448191
```

>>>	pd.merge	(left,	right,	<pre>on=["country",</pre>	"year"])
	painierge	(	ı igile,	on-[ country ,	y cur ] )

	country	continent	year	life_exp	gdp_per_cap	рор
0	Cuba	Americas	2007	78.27	8948.10	11416987
1	Spain	Europe	2002	79.78	24835.47	40152517

- merge does not align on index by default
- can change using arguments left\_index=True and right\_index=True
- can also use merge method on DataFrame (becomes "left" frame)
- by default, it does an inner join

```
>>> pd.merge(left, right, on=["country", "year"], how="inner")
```

country	continent	year	life_exp	gdp_per_cap	pop
Cuba	Americas	2007	78.27	8948.10	11416987
Spain	Europe	2002	79.78	24835.47	40152517
	Cuba	Cuba Americas	Cuba Americas 2007	Cuba Americas 2007 78.27	Cuba Americas 2007 78.27 8948.10

>>> pd.merge(left, right, on=["country", "year"], how="left")

	country	continent	year	life_exp	gdp_per_cap	рор
0	Cuba	Americas	2002	77.16	nan	nan
1	Cuba	Americas	2007	78.27	8948.10	11416987.00
2	Spain	Europe	2002	79.78	24835.47	40152517.00

>>> pd.merge(left, right, on=["country", "year"], how="outer")

	country	continent	year	life_exp	gdp_per_cap	рор
0	Cuba	Americas	2002	77.16	nan	nan
1	Cuba	Americas	2007	78.27	8948.10	11416987.00
2	Spain	Europe	2002	79.78	24835.47	40152517.00
3	Spain	NaN	2007	nan	28821.06	40448191.00

- The how argument determines which rows are kept
- The default "inner" is not always a good choice

#### m:1 merges

>>> left

>>> pd.merge(left, right, on="country")

	country	year	life_exp
0	Cuba	2002	77.16
1	Cuba	2007	78.27
2	Spain	2002	79.78
3	Spain	2007	80.94

	country	year	life_exp	capital
0	Cuba	2002	77.16	Havana
1	Cuba	2007	78.27	Havana
2	Spain	2002	79.78	Madrid
3	Spain	2007	80.94	Madrid

>>> right

		country		capital
0	Cuba		Havana	
1	Spain		Madrid	

- The type of merge is determined by the data, not by calling a different function
- m:1 means that many entries in left are matched to one entry in right

#### Other merges

- There are also "1:m" and "m:m" merges
- Check the pandas tutorial for details

#### Concat vs. merge

- Use concat if it is safe to do
  - Index / columns are compatible
  - Only 1:1 merging
- Use merge
  - if you do anything outside of 1:1 merging
  - if you need more control

### Check your data before and after

- Many people are afraid of merging
- This is because merges often go wrong
- Reason: badly prepared data
  - Want to do a 1:1 merge but merge key contains duplicates