



Read, inspect, & clean data from csv files



Import & clean data

- Ensure that pd.DataFrame() is same as csv source file
- Stock exchange listings: amex-listings.csv

	Α	<u> </u>	С	D	Е	F	G	Н
1	Stock Symbo	Company Name	Last Sale	Market Capitalization	IPO Year	Sector	Industry	Last Update
2	XXII	22nd Century Group, Inc	1.33	120628490.3	n/a	Consumer No	Farming/See	4/24/17
3	FAX	Aberdeen Asia-Pacific Income Fund Inc	5	1266332595	1986	n/a	n/a	4/24/17
4	IAF	Aberdeen Australia Equity Fund Inc	6.15	139865304.9	n/a	n/a	n/a	4/24/17
5	CH	Aberdeen Chile Fund, Inc.	7.2201	67563457.57	n/a	n/a	n/a	4/24/17
6	ABE	Aberdeen Emerging Markets Smaller Company Opportunities Fund I	13.36	128842971.6	n/a	n/a	n/a	4/24/17
7	FCO	Aberdeen Global Income Fund, Inc.	8.62	75376107.36	1992	n/a	n/a	4/24/17
8	IF	Aberdeen Indonesia Fund, Inc.	7.3299	68200145.64	1990	n/a	n/a	4/24/17
9	ISL	Aberdeen Israel Fund, Inc.	17.65	70564682.35	1992	n/a	n/a	4/24/17
10	ACU	Acme United Corporation.	27.39	91138992.45	1988	Capital Good	Industrial Ma	4/24/17
11	AIII	ACRE Realty Investors, Inc.	1.16	23768939.4	n/a	Consumer Se	Real Estate Ir	4/24/17
12	ATNM	Actinium Pharmaceuticals, Inc.	1.47	82037380.74	n/a	Health Care	Major Pharm	4/24/17
13	AE	Adams Resources & Energy, Inc.	37.8	159425128.8	n/a	Energy	Oil Refining/	4/24/17
14	ADK	Adcare Health Systems Inc	1.06	21122620	n/a	Health Care	Hospital/Nur	4/24/17
15	ADK^A	Adcare Health Systems Inc	21.946	0	n/a	n/a	n/a	4/24/17
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How pandas stores data

- Each column has its own data format stored in dtype
- dtype affects calculation and visualization

pandas dtype	Column characteristics					
object	Text <i>or</i> a mix of text and numeric data					
int64	Numeric: Whole numbers - 64 bits (≤ 2 ⁶⁴)					
float64	Numeric: Decimals <i>or</i> whole numbers with missing values					
datetime64	Date and time information					





Import & inspect data

```
In [1]: import pandas as pd
In [2]: amex = pd.read_csv('amex-listings.csv')
In [3]: amex.info() # To inspect table structure & data types
RangeIndex: 360 entries, 0 to 359
Data columns (total 8 columns):
                          360 non-null object
Stock Symbol
Company Name
                          360 non-null object
Last Sale
                          360 non-null object
                          360 non-null float64
Market Capitalization
IPO Year
                          360 non-null object
                          360 non-null object
Sector
Industry
                          360 non-null object
 Last Update
                          360 non-null object
dtypes: float64(1), object(7)
memory usage: 22.6+ KB
```





Deal with missing values

```
In [7]: amex = pd.read_csv('amex-listings.csv', na_values='n/a')
In [8]: amex.info()
                                            np.nan:
                                            NumPy Not a Number
RangeIndex: 360 entries, 0 to 359
Data columns (total 8 columns):
 Stock Symbol
                         360 non-null object
                         360 non-null object
Company Name
Last Sale
                         346 non-null float64
 Market Capitalization
                        360 non-null float64
                         105 non-null float64
IPO Year
                         238 non-null object
Sector
                         238 non-null object
Industry
                         360 non-null object
 Last Update
 dtypes: float64(3), object(5)
```





Properly parse dates

```
In [7]: amex = pd.read_csv('amex-listings.csv',
       na_values='n/a',
       parse_dates=['Last Update'])
In [8]: amex.info()
RangeIndex: 360 entries, 0 to 359
Data columns (total 8 columns):
Stock Symbol
                          360 non-null object
                         360 non-null object
Company Name
Last Sale
                         346 non-null float64
                         360 non-null float64
Market Capitalization
                          105 non-null float64
IPO Year
Sector
                          238 non-null object
                          238 non-null object
 Industry
                          360 non-null datetime64[ns]
Last Update
dtypes: datetime64[ns](1) float64(3), object(4)
```



Show off the result

```
In [7]: amex.head() # Show first n rows (default: 5)
Out[7]:
     Stock Symbol
                                                      Company Name
                                             22nd Century Group, Inc
             XXII
                               Aberdeen Asia-Pacific Income Fund Inc
              FAX
                                  Aberdeen Australia Equity Fund Inc
              IAF
                                           Aberdeen Chile Fund, Inc.
               CH
                   Aberdeen Emerging Markets Smaller Company Oppo...
   ABE
             Market Capitalization IPO Year
                                                               Sector \
   Last Sale
                                               Consumer Non-Durables
      1.3300
                       1.206285e+08
                                          NaN
      5.0000
                       1.266333e+09
                                       1986.0
                                                                 NaN
      6.1500
                       1.398653e+08
                                          NaN
                                                                  NaN
                       6.756346e+07
     7.2201
                                          NaN
                                                                 NaN
                                          NaN
     13.3600
                       1.288430e+08
                                                                 NaN
                Industry Last Update
  Farming/Seeds/Milling 2017-04-26
                          2017-04-25
                     NaN
                          2017-04-23
                     NaN
                          2017-04-26
                     NaN
                          2017-04-25
                     NaN
```





Let's practice!





Read data from Excel worksheets





Import data from Excel

	Α	В	C	D	E	F	G	
1	Stock Symbol	Company Name	Last Sale	Market Capitalization	IPO Year	Sector	Industry	
2	XXII	22nd Century Group, In	1.33	120628490.3	n/a	Consumer Non-Durables	Farming/Seeds/Milling	
3	FAX	Aberdeen Asia-Pacific Ir	5	1266332595	1986	n/a	n/a	
4	IAF	Aberdeen Australia Equ	6.15	139865304.9	n/a	n/a	n/a	
5	СН	Aberdeen Chile Fund, Ir	7.2201	67563457.57	n/a	n/a	n/a	
6	ABE	Aberdeen Emerging Ma	13.36	128842971.6	n/a	n/a	n/a	
7	FCO	Aberdeen Global Incom	8.62	75376107.36	1992	n/a	n/a	
	amex nasdaq nyse +							

- pd.read_excel(file, sheetname=0)
 - Select first sheet by default with sheetname=0
 - Select by name with sheetname= 'amex'
 - Import several sheets with list such as sheetname=['amex', 'nasdaq']



Import data from one sheet

```
In [1]: amex = pd.read_excel('listings.xlsx', sheetname='amex',
                             na_values='n/a')
In [2]: amex.info()
RangeIndex: 360 entries, 0 to 359
Data columns (total 8 columns):
 Stock Symbol
                         360 non-null object
                         360 non-null object
Company Name
                         346 non-null float64
 Last Sale
Market Capitalization
                         360 non-null float64
                          105 non-null float64
IPO Year
                          238 non-null object
 Sector
                          238 non-null object
Industry
 dtypes: datetime64[ns](1) float64(3), object(4)
```





Import data from two sheets

```
In [3]: listings = pd.read_excel('listings.xlsx',
                            sheetname=['amex', 'nasdaq'],
                            na_values='n/a')
                                              Listings: dictionary
                                                  Keys: sheet names
In [4]: listings['nasdaq'].info()
                                                  Values: DataFrame
RangeIndex: 3167 entries, 0 to 3166
Data columns (total 7 columns):
Stock Symbol
                          3167 non-null object
                          3167 non-null object
Company Name
                          3165 non-null float64
 Last Sale
Market Capitalization
                          3167 non-null float64
 IPO Year
                          1386 non-null float64
                           2767 non-null object
 Sector
                          2767 non-null object
Industry
dtypes: float64(3), object(4)
```





Get sheet names

```
In [5]: xls = pd.ExcelFile('listings.xlsx') # pd.ExcelFile object
In [6]: exchanges = xls.sheet_names
In [7]: exchanges
Out[7]: ['amex', 'nasdaq', 'nyse']
In [8]: nyse = pd.read_excel(xls, sheetname=exchanges[2], na_values='n/a')
In [14]: nyse.info()
RangeIndex: 3147 entries, 0 to 3146
Data columns (total 7 columns):
Stock Symbol 3147 non-null object
              3147 non-null object
Company Name
                        2177 non-null object
Industry
dtypes: float64(3), object(4)
memory usage: 172.2+ KB
```





Let's practice!





Combine data from multiple worksheets





Combine data frames

- Concatenate or "stack" a list of pd. DataFrames
- Syntax: pd.concat([amex, nasdaq, nyse])

Matches on column names

NASDA	AQ Syn	nbol Nan	ne .	Last Sa	ale
0	GC	OG Goog	gle	623.2	1
NYSE	Symbo	I Name		Last Sale	
0	JPM	JP		84.40	
AMEX Sy	ymbol	Name		Last Sale	
0	BTI	British		67.24	
1	IMO				
2					
3					

Exchanges	Symbol	Name	 Last Sale
0	GOOG	Google	 623.21
1			
2			
3			
0	JPM	JP	84.40
1			
2			
3			
0	BTI	British	67.24
1			
2			
3			



Concatenate two data frames

```
In [1]: amex = pd.read_excel('listings.xlsx', sheetname='amex',
                            na_values='n/a')
In [2]: nyse = pd.read_excel('listings.xlsx', sheetname='nyse',
                            na values='n/a')
In [3]: pd.concat([amex, nyse]).info()
Int64Index: 3507 entries, 0 to 3146
Data columns (total 7 columns):
Stock Symbol
             3507 non-null object
              3507 non-null object
Company Name
Last Sale
              3425 non-null float64
Market Capitalization 3507 non-null float64
IPO Year
                        1466 non-null float64
                        2415 non-null object
Sector
                       2415 non-null object
Industry
dtypes: float64(3), object(4)
```





Add a reference column

```
In [4]: amex['Exchange'] = 'AMEX' # Add column to reference source
In [5]: nyse['Exchange'] = 'NYSE'
In [6]: listings = pd.concat([amex, nyse])
In [7]: listings.head(2)
Out[22]:
 Stock Symbol
                                    Company Name Last Sale
                22nd Century Group, Inc
        XXII
                                                     1.33
         FAX Aberdeen Asia-Pacific Income Fund Inc
                                                      5.00
  Market Capitalization IPO Year
                                              Sector
                       NaN Consumer Non-Durables
          1.206285e+08
          1.266333e+09 1986.0
                                                NaN
              Industry Exchange
  Farming/Seeds/Milling
                          AMEX
                   NaN
                          AMEX
```





Combine three data frames





Combine three data frames (2)

```
In [1]: combined_listings.info()
Int64Index: 6674 entries, 0 to 359
Data columns (total 8 columns):
Stock Symbol
             6674 non-null object
             6674 non-null object
Company Name
           6590 non-null float64
Last Sale
Market Capitalization 6674 non-null float64
IPO Year
                   2852 non-null float64
                      5182 non-null object
Sector
                       5182 non-null object
Industry
Exchange
                      6674 non-null object
dtypes: float64(3), object(5)
```





Let's practice!