

Pandas Tutorial

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Table of contents

Pandas Tutorial

Quach Huy
Tung

Hands on examples

Introduction to
Pandas

Pandas objects

Indexing and
selection

Data operations

Handling missing
data

Groupby &
Aggregation

Merge, join,
concatenate

Vectorized string
operations

Exercises

SF Salaries

Ecommerce

Purchases

- 1 Hands on examples
 - Introduction to Pandas
 - Pandas objects
 - Indexing and selection
 - Data operations
 - Handling missing data
 - Groupby & Aggregation
 - Merge, join, concatenate
 - Vectorized string operations
- 2 Exercises
 - SF Salaries
 - Ecommerce Purchases

Hmmm, Pandas ?

Pandas Tutorial

Quach Huy
Tung

Hands on
examples

Introduction to
Pandas

Pandas objects

Indexing and
selection

Data operations

Handling missing
data

Groupby &
Aggregation

Merge, join,
concatenate

Vectorized string
operations

Exercises

SF Salaries

Ecommerce

Purchases

1 What it is?:

- Data analysis
- Data manipulation
- Fast, flexible, easy to use, built on top of Python

2 What is it for?:

- Calculate statistics and answer questions about the data
- Clean the data
 - Removing missing values
 - Filtering rows or columns by some criteria
 - Visualize the data
 - Store the cleaned, transformed data back into a CSV, other file or database

Series

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Hands on examples

Introduction to
Pandas

Pandas objects

Indexing and
selection

Data operations

Handling missing
data

Groupby &
Aggregation

Merge, join,
concatenate

Vectorized string
operations

Exercises

SF Salaries

Ecommerce

Purchases

1 Series object: values, index

2 Series object construction

- From array
- From dictionary

3 Some methods of Series object:

- Agregation: `sum()`, `min()`, `max()`, `mean()`, `std()`, ...
- `describe()`, ...

Dataframe

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Hands on examples

Introduction to
Pandas

Pandas objects

Indexing and
selection

Data operations

Handling missing
data

Groupby &
Aggregation

Merge, join,
concatenate

Vectorized string
operations

Exercises

SF Salaries

Ecommerce

Purchases

- 1 Dataframe object: index, columns
- 2 Dataframe construction
- 3 Some methods on Dataframe object:
 - describe(), info(), ...
 - Agregation: sum(), min(), max(), mean(), std(), ...
 - Drop columns
 - Rename columns

Indexing & selection in Series

Pandas Tutorial

Quach Huy
Tung

Hands on examples

Introduction to
Pandas

Pandas objects

Indexing and
selection

Data operations

Handling missing
data

Groupby &
Aggregation

Merge, join,
concatenate

Vectorized string
operations

Exercises

SF Salaries

Ecommerce

Purchases

- 1 Series as dictionary
- 2 Series as one-dimensional array
 - Slicing by explicit index
 - Slicing by implicit integer index
 - Masking
 - Fancy indexing
- 3 `loc[]`, `iloc[]`

Indexing & selection in DataFrame

Pandas Tutorial

Quach Huy
Tung

Hands on examples

Introduction to
Pandas

Pandas objects

Indexing and
selection

Data operations

Handling missing
data

Groupby &
Aggregation

Merge, join,
concatenate

Vectorized string
operations

Exercises

SF Salaries

Ecommerce

Purchases

1 DataFrame as dictionary

2 DataFrame as two-dimensional array

Data operations

Pandas Tutorial

Quach Huy
Tung

Hands on examples

Introduction to
Pandas

Pandas objects

Indexing and
selection

Data operations

Handling missing
data

Groupby &
Aggregation

Merge, join,
concatenate

Vectorized string
operations

Exercises

SF Salaries

Ecommerce

Purchases

- 1 Element-wise operations: `applymap()`
- 2 Row(column)-wise operations: `apply()` with axis

Handling missing data

Pandas Tutorial

Quach Huy
Tung

Hands on examples

Introduction to
Pandas

Pandas objects

Indexing and
selection

Data operations

Handling missing
data

Groupby &
Aggregation

Merge, join,
concatenate

Vectorized string
operations

Exercises

SF Salaries

Ecommerce

Purchases

1 Check missing data: `isnull()`, `notnull()`

2 Drop missing values:

- Drop by row
- Drop by column
- Some advanced options

3 Fill missing values:

- Fill by values
- Fill by methods: `ffill`, `bfill`

Groupby demystified

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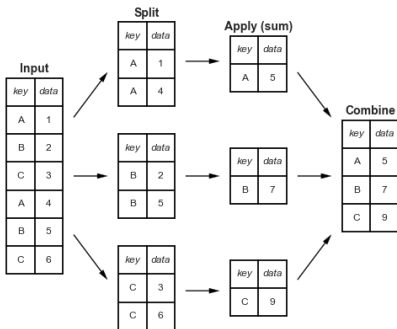
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Hands on examples

Introduction to
Pandas
Pandas objects
Indexing and
selection
Data operations
Handling missing
data
Groupby &
Aggregation
Merge, join,
concatenate
Vectorized string
operations

Exercises

SF Salaries
Ecommerce
Purchases



Aggregation - Filter - Transform

Pandas Tutorial

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Tung

Hands on examples

Introduction to
Pandas
Pandas objects
Indexing and
selection
Data operations
Handling missing
data
Groupby &
Aggregation
Merge, join,
concatenate
Vectorized string
operations

Exercises

SF Salaries
Ecommerce
Purchases

1 Aggregation:

- `count()`
- `first()`, `last()`
- `mean()`, `median()`, `std()`, `var()`
- `min()`, `max()`

2 Filter

3 Transform

Concatenate - Append

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Hands on examples

Introduction to
Pandas

Pandas objects

Indexing and
selection

Data operations

Handling missing
data

Groupby &
Aggregation

**Merge, join,
concatenate**

Vectorized string
operations

Exercises

SF Salaries

Ecommerce

Purchases

1 Concatenate:

- Concatenate by axis
- Some advanced options: `join`, `ignore_index`

Merge - Join

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Hands on examples

Introduction to
Pandas
Pandas objects
Indexing and
selection
Data operations
Handling missing
data
Groupby &
Aggregation
**Merge, join,
concatenate**
Vectorized string
operations

Exercises

SF Salaries
Ecommerce
Purchases

1 Relational Algebra: Descartes product

2 Join:

- Inner
- Outer
- Left, Right
- Some advanced options: on, left_on, right_on, suffixes

Vectorized string operations

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Tung

Hands on examples

Introduction to
Pandas

Pandas objects

Indexing and
selection

Data operations

Handling missing
data

Groupby &
Aggregation

Merge, join,
concatenate

**Vectorized string
operations**

Exercises

SF Salaries

Ecommerce

Purchases

Some methods on vectorized string operations:

- Length: `.str.len()`
- Slicing: `.str[:]`
- Regex

Questions - Part 1

Pandas Tutorial

Quach Huy
Tung

Hands on examples

Introduction to
Pandas
Pandas objects
Indexing and
selection
Data operations
Handling missing
data
Groupby &
Aggregation
Merge, join,
concatenate
Vectorized string
operations

Exercises

SF Salaries
Ecommerce
Purchases

- Import pandas
- Read Salaries.csv as a dataframe called sal.
- Check the head of the DataFrame.
- Use the .info() method to find out how many entries there are.
- What is the average BasePay ?
- What is the highest amount of OvertimePay in the dataset ?
- What is the job title of JOSEPH DRISCOLL ?
- How much does JOSEPH DRISCOLL make (including benefits)?
- What is the name of highest paid person (including benefits)?

Questions - Part 2

Pandas Tutorial

Quach Huy
Tung

Hands on examples

Introduction to
Pandas
Pandas objects
Indexing and
selection
Data operations
Handling missing
data
Groupby &
Aggregation
Merge, join,
concatenate
Vectorized string
operations

Exercises

SF Salaries
Ecommerce
Purchases

- What is the name of lowest paid person (including benefits)? Do you notice something strange about how much he or she is paid?
- What was the average (mean) BasePay of all employees per year? (2011-2014) ?
- How many unique job titles are there?
- What are the top 5 most common jobs?
- How many Job Titles were represented by only one person in 2013? (e.g. Job Titles with only one occurrence in 2013?)
- How many people have the word Chief in their job title?
- Is there a correlation between length of the Job Title string and Salary?

Questions - Part 1

Pandas Tutorial

Quach Huy
Tung

Hands on examples

Introduction to
Pandas
Pandas objects
Indexing and
selection
Data operations
Handling missing
data
Groupby &
Aggregation
Merge, join,
concatenate
Vectorized string
operations

Exercises

SF Salaries
Ecommerce
Purchases

- Load data from csv and set it to Pandas DF ecom
- Check the head, the tail of ecom DF
- How many rows and columns are there?
- What is the average Purchase Price?
- What were the highest and lowest purchase prices?
- How many people have English 'en' as their Language of choice on the website?
- How many people have the job title of "Lawyer" ?
- How many people made the purchase during the AM and how many people made the purchase during PM ?

Questions - Part 2

Pandas Tutorial

Quach Huy
Tung

Hands on examples

Introduction to
Pandas
Pandas objects
Indexing and
selection
Data operations
Handling missing
data
Groupby &
Aggregation
Merge, join,
concatenate
Vectorized string
operations

Exercises

SF Salaries
Ecommerce
Purchases

- What are the 5 most common Job Titles?
- Someone made a purchase that came from Lot: "90 WT" , what was the Purchase Price for this transaction?
- What is the email of the person with the following Credit Card Number: 4926535242672853
- How many people have American Express as their Credit Card Provider and made a purchase above \$95 ?
- **How many people have a credit card that expires in 2025?**
- **What are the top 5 most popular email providers/hosts (e.g. gmail.com, yahoo.com, etc...)?**