# uncertain\_panda Documentation

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### Contents

1	Content           1.1         Examples           1.2         Bootstrapping           1.3         API	<b>3</b> 3 3 3
2	Why is the panda uncertain?	5
3	How to use it?         3.1       Comparison in A/B testing	<b>7</b> 7
4	Features	9
5	How does it work?	11
6	Other packages	13

uncertain\_panda helps you with constructing uncertainties of quantities calculated on your pandas data frames, by applying the method of bootstrapping.

#### Content

#### 1.1 Examples

To be filled.

### 1.2 Bootstrapping

Suppose you want to calculate a quantity f(X) on your data frame X. Bootstrapping samples multiple versions  $Y_i$  of X by drawing elements with replacement from the data frame with the same length the data frame itself. On all these  $Y_i$ , the function f is evaluated, creating a distribution of possible values for f(X). The standard deviation of this distribution is the (symmetric) uncertainty returned by uncertain\_panda. If you request the asymmetric uncertainty, the 1 sigma quantile in both directions around the median is returned. You can find some more information on bootstrapping in the net, e.g. on wikipedia.

#### 1.3 API

To be filled.

### Why is the panda uncertain?

Have you ever calculated quantities on your pandas data frame/series and wanted to know their uncertainty? Did you ever wondered if the difference in the average of two methods is significant?

Then you want to have an uncertain panda!

uncertain\_panda helps you calculate uncertainties on arbitrary quantities related to your pandas data frame e.g. mean, median, quantile or min/max and every other arbitrary function on pandas data frames!

You can use any measured data (e.g. from A/B testing, recorded data from an experiment or any type of tabular data) and calculate any quantity using pandas and uncertain\_panda will give you the uncertainty on this quantity.

#### How to use it?

#### First, install the package

```
pip install uncertain_panda
```

Now, just import pandas from the uncertain\_panda package and prefix unc before every calculation to get the value with the uncertainty:

```
from uncertain_panda import pandas as pd
series = pd.Series([1, 2, 3, 4, 5, 6, 7])
series.unc.mean()
```

That's it! The return value is an instance of the uncertainty Variable from the superb uncertainties package. As this package already knows how to calculate with uncertainties, you can use the results as if they were normal numbers in your calculations.

series.unc.mean() + 2\* series.unc.std()

Super easy!

You can find some more examples in *Examples*.

### 3.1 Comparison in A/B testing

Suppose you have done some A/B testing with a brand new feature you want to introduce. You have measured the quality of your service before (A) and after (B) the feature introduction. The averge quality is better, but is the change significant?

A first measure for this problem might be the uncertainty of the average, so lets calculate it:

data\_frame.groupby("feature\_introduced").quality.unc.mean()

which will not only give you the two average qualities but also their uncertainties.

#### Features

The development has just started and there is a lot that can still be added. Here is a list of already implemented features

- Automatic calculation of uncertainties of every built in pandas function for
  - data frames
  - series
  - grouped data frames

using the prefix unc before the function name, e.g.

```
df.unc.mean()
```

In the background, it used the method of bootstrapping (see below) to calculate the uncertainties.

- Possibility to calculate asymmetric or symmetric uncertainties, with unc or unc\_asym.
- Opional usage of dask for large data samples. Enable it with

df.unc.mean(pandas=False)

to use dask instead of pandas.

• Plotting functionality for uncertainties with

df.unc.mean().plot\_with\_uncertainties(kind="bar")

for a nice error-bar plot.

• Full configurable bootstrapping with either using pandas built-in methods or dask (optionally enabled). Just pass the options to your called method, e.g.

df.unc.mean(number\_of\_draws=300)

to use 300 draws in the bootstrapping.

How does it work?

Under the hood, uncertain\_panda is using bootstrapping for calculating the uncertainties. Find more information on bootstrapping in *Bootstrapping*.

Other packages

There are probably plenty of packages out there for this job - but the only known one I am aware of is the bootstrapped package. Compared to this package, uncertain\_panda tries to automate the quantity calculation and works for arbitrary functions as well can use dask for the calculation. bootstrapped is very nice for sparse arrays, which is not (yet) implemented in uncertain\_panda.