New to Plotly?

Plotly's Python library is free and open source! <u>Get started (https://plot.ly/python/getting-started/)</u> by dowloading the client and <u>reading the primer (https://plot.ly/python/getting-started/)</u>.

You can set up Plotly to work in online_(https://plot.ly/python/getting-started/#initialization-for-online-plotting)) or offline_(https://plot.ly/python/getting-started/#initialization-for-online-plotting)) mode, or in jupyter notebooks (https://plot.ly/python/getting-started/#start-plotting-online).

We also have a quick-reference <u>cheatsheet (https://images.plot.ly/plotly-documentation/images/python_cheat_sheet.pdf)</u> (new!) to help you get started!

Imports

The tutorial below imports NumPy (http://www.numpy.org/), Pandas (https://plot.ly/pandas/intro-to-pandas-tutorial/), SciPy (https://www.scipy.org/), and Statsmodels (http://statsmodels.sourceforge.net/stable/).

```
In [1]: import plotly.plotly as py
import plotly.graph_objs as go
from plotly.tools import FigureFactory as FF

import numpy as np
import pandas as pd
import scipy

import statsmodels
import statsmodels.api as sm
from statsmodels.formula.api import ols
```

One-Way ANOVA

An Analysis of Variance Test or an ANOVA is a generalization of the t-tests to more than 2 groups. Our null hypothesis states that there are equal means in the populations from which the groups of data were sampled. More succinctly:

$$\mu_1 = \mu_2 = \dots = \mu_n$$

for n groups of data. Our alternative hypothesis would be that any one of the equivalences in the above equation fail to be met.

```
In [2]: moore = sm.datasets.get_rdataset("Moore", "car", cache=True)

data = moore.data
data = data.rename(columns={"partner.status" :"partner_status"}) # make name pythonic

moore_lm = ols('conformity ~ C(fcategory, Sum)*C(partner_status, Sum)', data=data).fit()
table = sm.stats.anova_lm(moore_lm, typ=2) # Type 2 ANOVA DataFrame

print(table)

sum_sq df F \
C(fcategory, Sum)
C(fcategory, Sum)
11.614700 2.0 0.276958
C(partner_status, Sum)
212.213778 1.0 10.120692
```

```
C(partner_status, Sum) 212.213778 1.0 10.120692 C(fcategory, Sum):C(partner_status, Sum) 175.488928 2.0 4.184623 Residual 817.763961 39.0 NaN

PR(>F)
C(fcategory, Sum) 0.759564 C(partner_status, Sum) 0.0022874 C(fcategory, Sum):C(partner_status, Sum) 0.022572 Residual NaN
```

In this ANOVA test, we are dealing with an F-Statistic and not a p-value. Their connection is integral as they are two ways of expressing the same thing. When we set a significance level at the start of our statistical tests (usually 0.05), we are saying that if our variable in question takes on the 5% ends of our distribution, then we can start to make the case that there is evidence against the null, which states that the data belongs to this particular distribution.

The F value is the point such that the area of the curve past that point to the tail is just the p-value. Therefore:

$$Pr(>F) = p$$

For more information on the choice of 0.05 for a significance level, check out this page (http://www.investopedia.com/exam-guide/cfa-level-1/quantitative-methods/hypothesis-testing.asp).

Let us import some data for our next analysis. This time some data on tooth growth:

```
In [3]: data = pd.read_csv('https://raw.githubusercontent.com/plotly/datasets/master/tooth_growth_csv')
df = data[0:10]
table = FF.create_table(df)
py.iplot(table, filename='tooth-data-sample')
```

```
Out[3]: 🕡
```

Two-Way ANOVA

In a Two-Way ANOVA, there are two variables to consider. The question is whether our variable in question (tooth length 1en) is related to the two

```
other variables supp and dose by the equation:
                                             len = supp + dose + supp \times dose
  In [4]: | formula = 'len ~ C(supp) + C(dose) + C(supp):C(dose)'
           model = ols(formula, data).fit()
           aov_table = statsmodels.stats.anova.anova_lm(model, typ=2)
           print(aov_table)
                                           df
                                  sum_sq
                                                        F
                                                                  PR(>F)
                                           1.0 15.571979 2.311828e-04
           C(supp)
                             205.350000
                            2426.434333 2.0 91.999965 4.046291e-18
108.319000 2.0 4.106991 2.186027e-02
           C(dose)
           C(supp):C(dose)
                             712.106000 54.0
           Residual
                                                      NaN
                                                                     NaN
  In [1]: from IPython.display import display, HTML
           display(HTML('<link href="//fonts.googleapis.com/css?family=Open+Sans:600,400,300,200|Inconsolata|Ubuntu+M
           ono:400,700" rel="stylesheet" type="text/css" />'))
           display(HTML('<link rel="stylesheet" type="text/css" href="http://help.plot.ly/documentation/all_static/cs
           s/ipython-notebook-custom.css">'))
           ! pip install git+https://github.com/plotly/publisher.git --upgrade
           import publisher
           publisher.publish(
                'python-Anova.ipynb', 'python/anova/', 'Anova | plotly',
                'Learn how to perform a one and two way ANOVA test using Python.',
               title='Anova in Python | plotly',
               name='Anova',
               language='python',
               page_type='example_index', has_thumbnail='false', display_as='statistics', order=8,
               ipynb= '~notebook_demo/108')
           Collecting git+https://github.com/plotly/publisher.git
             Cloning https://github.com/plotly/publisher.git to /var/folders/ld/6cl3s_150wd40tdjq2b03jxh0000gp/T/pip-
           KRiKaE-build
           Installing collected packages: publisher
             Found existing installation: publisher 0.10
               Uninctalling nublicher_0 10.
```