

## Deviations From Normality

```
In [29]: # Import needed modules
%load_ext autoreload
%autoreload 2

import pandas as pd
import edhex_risk_kit as erk
```

The autoreload extension is already loaded. To reload it, use:  
%reload\_ext autoreload

```
In [4]: hfi = erk.get_hifi_returns()
```

```
In [5]: hfi.head()
```

Out[5]:

	Convertible Arbitrage	CTA Global	Distressed Securities	Emerging Markets	Equity Market Neutral	Event Driven	Fixed Income Arbitrage	Global Macro	Long/Short Equity	Merger Arbitrage
date										
1997-01	0.0119	0.0393	0.0178	0.0791	0.0189	0.0213	0.0191	0.0573	0.0281	0.0150
1997-02	0.0123	0.0298	0.0122	0.0525	0.0101	0.0084	0.0122	0.0175	-0.0006	0.0034
1997-03	0.0078	-0.0021	-0.0012	-0.0120	0.0016	-0.0023	0.0109	-0.0119	-0.0084	0.0060
1997-04	0.0086	-0.0170	0.0030	0.0119	0.0119	-0.0005	0.0130	0.0172	0.0084	-0.0001
1997-05	0.0156	-0.0015	0.0233	0.0315	0.0189	0.0346	0.0118	0.0108	0.0394	0.0197

```
In [6]: pd.concat([hfi.mean(), hfi.median(), hfi.mean()>hfi.median()], axis = 'columns')
```

Out[6]:

	0	1	2
Convertible Arbitrage	0.005508	0.0065	False
CTA Global	0.004074	0.0014	True
Distressed Securities	0.006946	0.0089	False
Emerging Markets	0.006253	0.0096	False
Equity Market Neutral	0.004498	0.0051	False
Event Driven	0.006344	0.0084	False
Fixed Income Arbitrage	0.004365	0.0055	False
Global Macro	0.005403	0.0038	True
Long/Short Equity	0.006331	0.0079	False
Merger Arbitrage	0.005356	0.0060	False
Relative Value	0.005792	0.0067	False
Short Selling	-0.001701	-0.0053	True
Funds Of Funds	0.004262	0.0052	False

$$S(R) = \frac{E[(R - E(R))^3]}{\sigma_R^3}$$

```
In [8]: erk.skewness(hfi).sort_values()
```

```
Out[8]: Fixed Income Arbitrage    -3.940320
        Convertible Arbitrage    -2.639592
        Equity Market Neutral    -2.124435
        Relative Value           -1.815470
        Event Driven             -1.409154
        Merger Arbitrage         -1.320083
        Distressed Securities    -1.300842
        Emerging Markets         -1.167067
        Long/Short Equity        -0.390227
        Funds Of Funds          -0.361783
        CTA Global               0.173699
        Short Selling            0.767975
        Global Macro             0.982922
        dtype: float64
```

```
In [11]: import scipy.stats
         scipy.stats.skew(hfi)
```

```
Out[11]: array([-2.63959223,  0.17369864, -1.30084204, -1.16706749, -2.12443538,
               -1.40915356, -3.94032029,  0.98292188, -0.39022677, -1.32008333,
               -1.81546975,  0.76797484, -0.36178308])
```

```
In [13]: #see if they match up
         erk.skewness(hfi)
```

```
Out[13]: Convertible Arbitrage    -2.639592
        CTA Global               0.173699
        Distressed Securities    -1.300842
        Emerging Markets         -1.167067
        Equity Market Neutral    -2.124435
        Event Driven             -1.409154
        Fixed Income Arbitrage   -3.940320
        Global Macro             0.982922
        Long/Short Equity        -0.390227
        Merger Arbitrage         -1.320083
        Relative Value           -1.815470
        Short Selling            0.767975
        Funds Of Funds          -0.361783
        dtype: float64
```

## module skewness returns same as scipy

```
In [15]: import numpy as np
         normal_rets = np.random.normal(0, .15, size=(263,1))
```

```
In [18]: erk.skewness(normal_rets)
```

```
Out[18]: 0.03483464934841344
```

## Kurtosis

$$K(R) = \frac{E[(R - E(R))^4]}{\sigma_R^4}$$

```
In [21]: erk.kurtosis(normal_rets)
```

```
Out[21]: 3.47533504118101
```

```
In [22]: erk.kurtosis(hfi)
```

```
Out[22]: Convertible Arbitrage      23.280834
          CTA Global                  2.952960
          Distressed Securities      7.889983
          Emerging Markets          9.250788
          Equity Market Neutral     17.218555
          Event Driven              8.035828
          Fixed Income Arbitrage    29.842199
          Global Macro              5.741679
          Long/Short Equity         4.523893
          Merger Arbitrage          8.738950
          Relative Value            12.121208
          Short Selling             6.117772
          Funds Of Funds           7.070153
          dtype: float64
```

```
In [23]: scipy.stats.kurtosis(normal_rets)
```

```
Out[23]: array([0.47533504])
```

```
In [24]: scipy.stats.jarque_bera(normal_rets)
```

```
Out[24]: (2.5291527875869226, 0.28235887978449625)
```

```
In [26]: '''
          If you run it this way it will look at the data set as one whole
          and will not give you a distributed value for each fund
          '''
          scipy.stats.jarque_bera(hfi)
```

```
Out[26]: (25656.585999171326, 0.0)
```

```
In [30]: erk.is_normal(normal_rets)
```

```
Out[30]: True
```

```
In [31]: # To apply is_normal to each column
hfi.aggregate(erk.is_normal)
```

```
Out[31]: Convertible Arbitrage    False
CTA Global                      True
Distressed Securities           False
Emerging Markets                False
Equity Market Neutral           False
Event Driven                    False
Fixed Income Arbitrage          False
Global Macro                    False
Long/Short Equity               False
Merger Arbitrage                False
Relative Value                  False
Short Selling                   False
Funds Of Funds                  False
dtype: bool
```

```
In [32]: ffme = erk.get_ffme_returns()
erk.skewness(ffme)
```

```
Out[32]: SmallCap    4.410739
LargeCap    0.233445
dtype: float64
```

```
In [33]: erk.kurtosis(ffme)
```

```
Out[33]: SmallCap    46.845008
LargeCap    10.694654
dtype: float64
```

```
In [34]: ffme.aggregate(erk.is_normal)
```

```
Out[34]: SmallCap    False
LargeCap    False
dtype: bool
```

```
In [ ]:
```