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PYTHON

Calculate monthly returns...with Pandas

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(<https://quantdare.com/author/mgreco/>) 27/09/2017

Calculating returns on a price series is one of the most basic calculations in finance, but it can become a headache when we want to do aggregations for weeks, months, years, etc. In Python, the Pandas library makes this aggregation very easy to do, but if we don't pay attention we could still make mistakes. Assuming that we want the return of the whole month, and we are not interested, for example, in the returns accumulated so far. These latter returns require that they be normalized to be comparable with the other returns.

Simple motivation

Given some prices on business days, you can get the trailing returns per month for the situation that we want to calculate. With this in mind, I'd like to describe how to avoid miscalculating monthly returns.

Note

Before you start, you may need some dependencies to do this:

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```
1 # to install dependencies with anaconda installed
2 $ conda install pandas numpy pandas-datareader seaborn matplotlib
3 # else
```

```
4 $ pip install pandas numpy pandas-datareader seaborn matplotlib
```

install.sh hosted with ❤ by GitHub

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Let's get to work

We're going to work with the shares of "Banco do Brazil SA." Our first step is to download yahoo finance data using pandas_datareader:

```
1 >>> today = '20170926' # to make static this script.
2 >>> tckr = 'BBAS3.SA' # Banco do Brasil SA
3 # download data
4 >>> data = pdr.get_data_yahoo(tckr, 2014, today)
5 >>> data = data.asfreq('B') # add frequency needed for some pandas functionalities releated with
6 >>> data.columns = data.columns.map(lambda col: col.lower())
```

code1.py hosted with ❤ by GitHub

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Let's see what the data looks like:

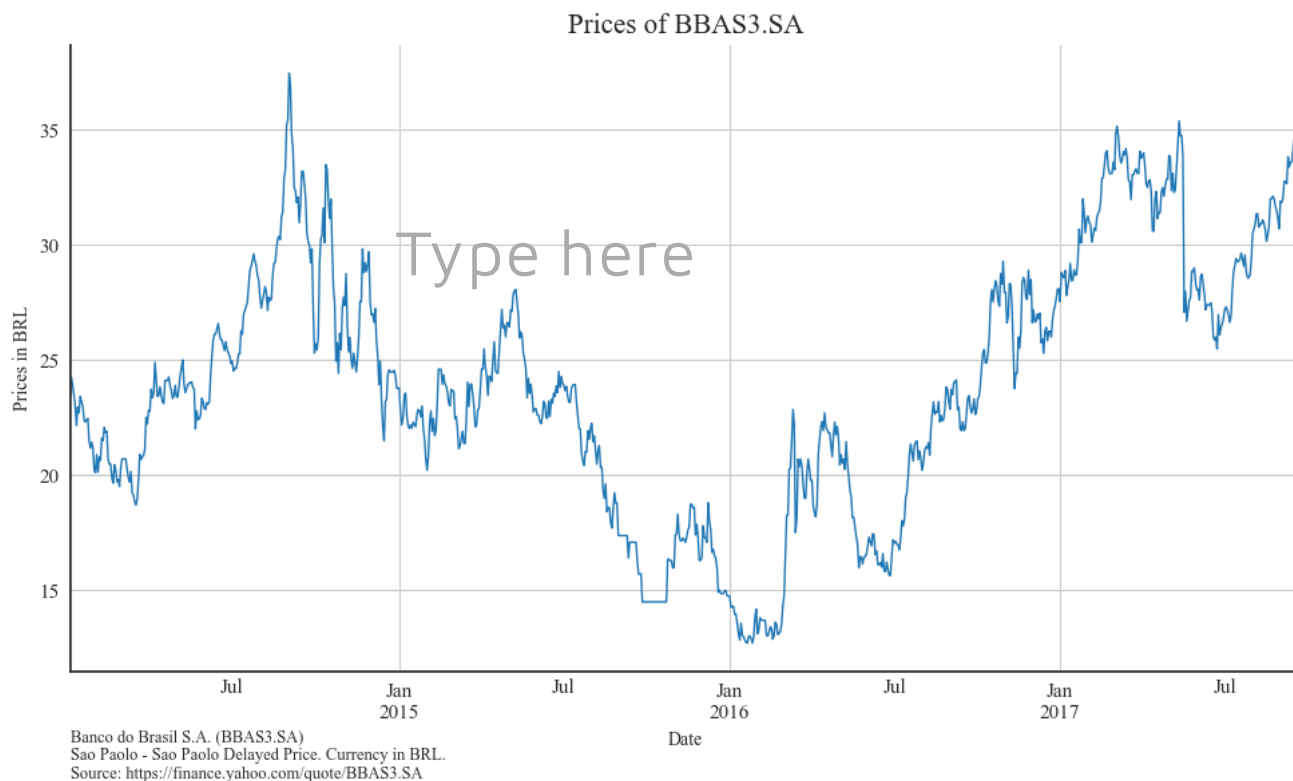
```
1 >>> data
2
3 Date
4 20140102    24.450001    24.480000    23.950001    24.000000    18.998478
5 20140103    24.020000    24.250000    23.850000    24.250000    19.196381
6 20140106    24.020000    24.049999    23.610001    23.889999    18.911404
7 20140107    23.900000    24.100000    23.420000    23.480000    18.586851
8 20140108    23.500000    23.570000    22.969999    23.010000    18.214798
9 ....
10 20170920    34.660000    35.130001    34.310001    34.759998    34.759998
11 20170921    35.400002    35.970001    35.220001    35.520000    35.520000
12 20170922    35.369999    35.419998    35.020000    35.299999    35.299999
13 20170925    35.619999    35.740002    34.759998    34.799999    34.799999
14 20170926    35.160000    35.279999    34.950001    35.160000    35.160000
```

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If we plot the closing prices, we'll see this:

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Now we'll work with closing prices. We're going to calculate the monthly returns, so we can do the following*:

* At the end of this post you will find the auxiliary functions used in the code, such as "total_return"

```

1
2 # Approach 1: starting from prices
3 # =====
4 >>> approach1 = results_storage.groupby(['year', 'month'], )['close'].apply(total_return)
5 >>> approach1.tail(12)
6
7 year  month
8 2016   10      0.254927
9        11      0.020043
10       12      0.055222
11 2017    1      0.129630
12        2      0.058861
13        3      0.005060
14        4     -0.030115
15        5     -0.137291
16        6     -0.044223
17        7      0.056312

```

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```

18      8      0.047782
19      9      0.102540
20  Name: close, dtype: float64

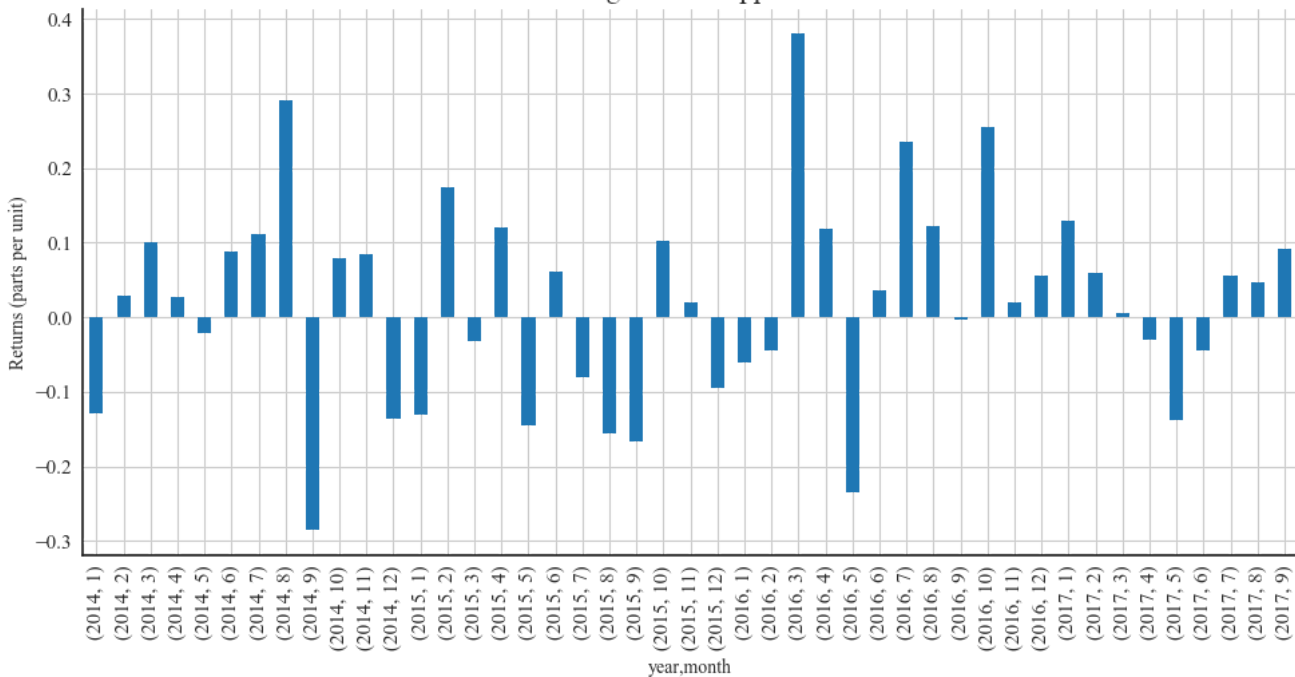
```

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Trailing returns: Approach 1



Banco do Brasil S.A. (BBAS3.SA)
 Sao Paulo - Sao Paulo Delayed Price. Currency in BRL.
 source: <https://finance.yahoo.com/quote/BBAS3.SA>

The problem of this approximation is that it leaves out one day in the calculation of each monthly return, as it only takes into account the prices that belong to the month in question and completely omits all other information.

For the calculation to be correct, you must include the closing price on the day *before* the first day of the month, i. e. the last day of the previous month.

We can see it with an example: if we select month 8 of 2017, and see the prices that have been used to calculate returns, we will see that the series starts on August 1st and ends on August 31st. We have left out July 31st!, this happens every month.

```

1  >>> select_idx = (2017, 8)
2  >>> idx_approach1 = results_storage.groupby(['year', 'month'])['close'].groups[select_idx]
3  >>> last_group = results_storage.loc[idx_approach1]
4

```

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		close	year	month	day	week_day	week_day_name
5							
6	Date						
7	20170801	29.299999	2017	8	1	1	Tuesday
8	20170802	30.480000	2017	8	2	2	Wednesday
9	20170803	30.680000	2017	8	3	3	Thursday
10	20170804	30.870001	2017	8	4	4	Friday
11	20170807	31.350000	2017	8	7	0	Monday
12	...						
13	20170825	32.000000	2017	8	25	4	Friday
14	20170828	31.700001	2017	8	28	0	Monday
15	20170829	31.490000	2017	8	29	1	Tuesday
16	20170830	31.170000	2017	8	30	2	Wednesday
17	20170831	30.700001	2017	8	31	3	Thursday

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It should also be mentioned that the last month (the current month) is not comparable with the rest of the months since it has not yet finished.

A second approach

Okay, as a second approach to incorporate the previous data, I could calculate the returns first, *then* group and calculate the total return with that series:

```

1 # Approach 2: starting from daily returns
2 # =====
3 >>> r = prices.pct_change()
4 >>> approach2 = r.groupby((r.index.year, r.index.month))\
5 >>> .apply(total_return_from_returns)
6 >>> approach2.tail(12)
7
8 Date  Date
9 2016  10    0.284649
10      11   -0.026972
11      12   -0.014386
12 2017   1    0.107512
13      2    0.063966
14      3    0.020242
15      4   -0.027243
16      5   -0.137291
17      6   -0.054340
18      7    0.070896
19      8    0.069686

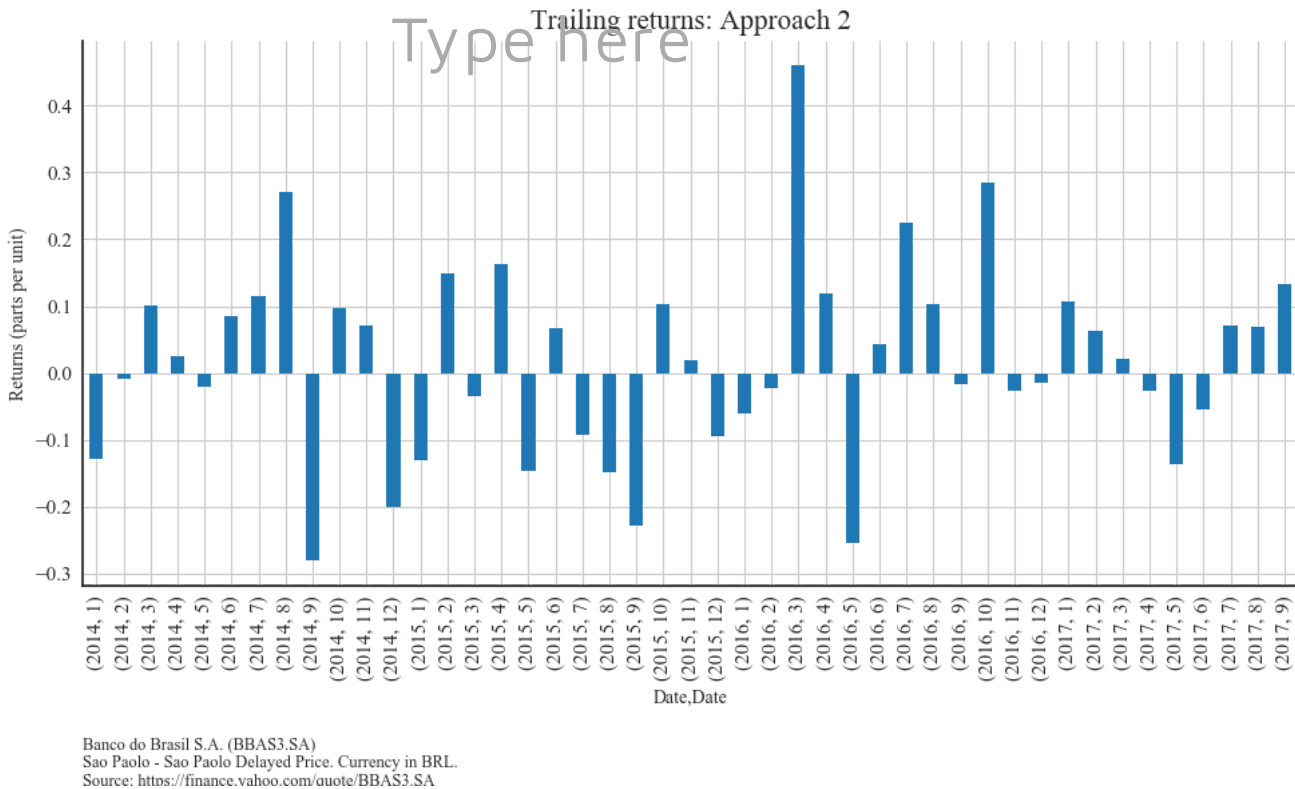
```

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```
20          9          0.145277
21  Name: close, dtype: float64
```

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However, all that glitters is not gold; this approximation has a problem in the first value. We still don't have the price before the one needed to make the calculation. The remaining months would be correctly calculated with the exception of the last return (current month), which is again not comparable with the rest.

The third approach

So, what can we do? The most correct result would come from first decimating the price series by taking only the last working day of the month, then grouping by year and month, and with the resulting series calculate, finally, the returns.

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```
1  # Approach 3: Now yes, the definitive approach
2  # =====
3  >>> approach3 = results_storage.asfreq('BM')
```

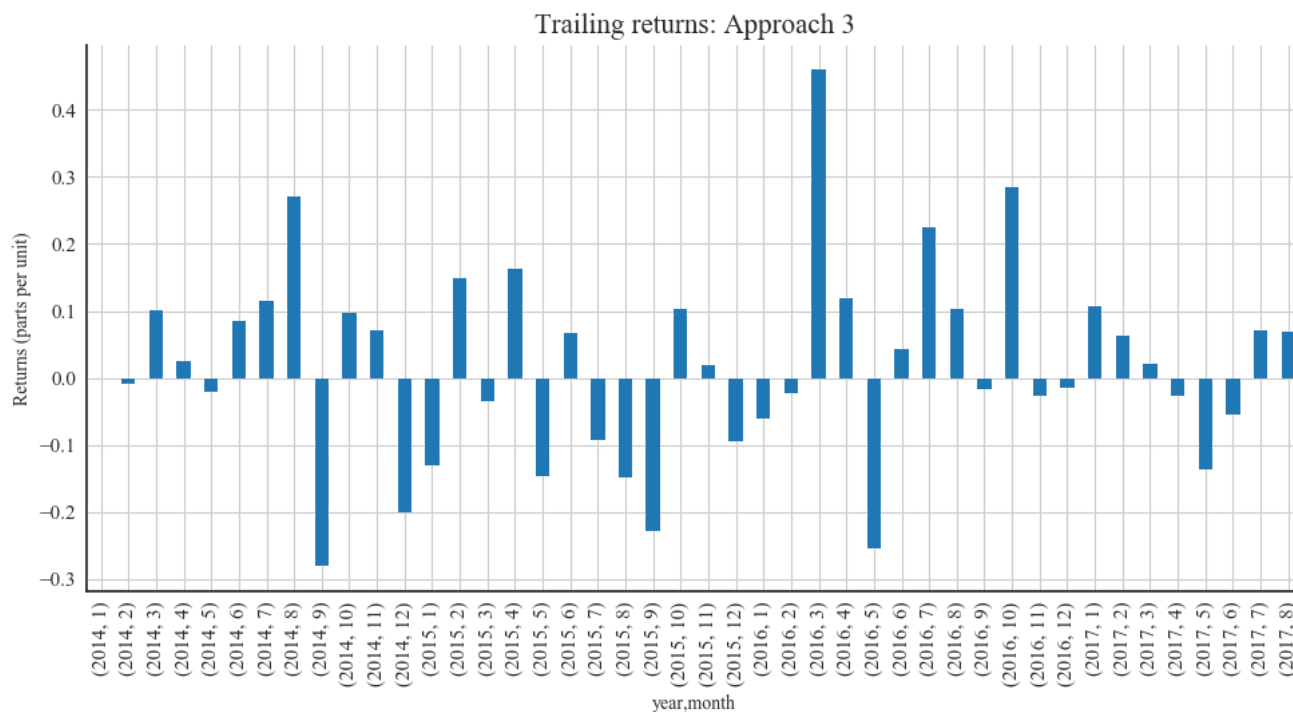
```

4  >>> .set_index(['year', 'month'])\
5  >>> .close\
6  >>> .pct_change()
7  >>> approach3.tail(12)
8
9  year  month
10 2016   9    -0.017665
11      10     0.284649
12      11    -0.026972
13      12    -0.014386
14 2017   1     0.107512
15      2     0.063966
16      3     0.020242
17      4    -0.027243
18      5    -0.137291
19      6    -0.054340
20      7     0.070896
21      8     0.069686
22  Name: close, dtype: float64

```

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The good thing about this approximation is that it doesn't return values for the first or last month with prices available, which can save us some calculation errors.

Conclusion

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It's unfortunately very easy to make mistakes with these kinds of calculations. Pandas makes things much simpler, but sometimes can also be a double-edged sword. Nothing like a quick reading to avoid those potential mistakes. As we can see on the plot, we can underestimate or overestimate the returns obtained.

```
1 # Comparing all approaches
2 # =====
3 >>> all_approaches = pd.concat([approach1, approach2, approach3], axis=1,
4 >>>                               keys=['approach1', 'approach2', 'approach3'])
5
6 >>> all_approaches
```

			approach1	approach2	approach3
9	year	month			
10	2014	1	-0.129583	-0.129583	NaN
11		2	0.028827	-0.009095	-0.009095
12		3	0.101449	0.101449	0.101449
13		4	0.026778	0.025877	0.025877
14		5	-0.021377	-0.021377	-0.021377
15		6	0.087527	0.085627	0.085627
16		7	0.111467	0.115493	0.115493
17		8	0.291743	0.269841	0.269841
18		9	-0.285916	-0.281250	-0.281250
19		10	0.078988	0.096047	0.096047
20		11	0.085130	0.071042	0.071042
21		12	-0.136578	-0.199663	-0.199663
22	...				
23	2016	10	0.254927	0.284649	0.284649
24		11	0.020043	-0.026972	-0.026972
25		12	0.055222	-0.014386	-0.014386
26	2017	1	0.129630	0.107512	0.107512
27		2	0.058861	0.063966	0.063966
28		3	0.005060	0.021242	0.021242
29		4	0.050115	0.057251	0.057251
30		5	-0.137291	-0.137291	-0.137291
31		6	-0.044223	-0.054340	-0.054340

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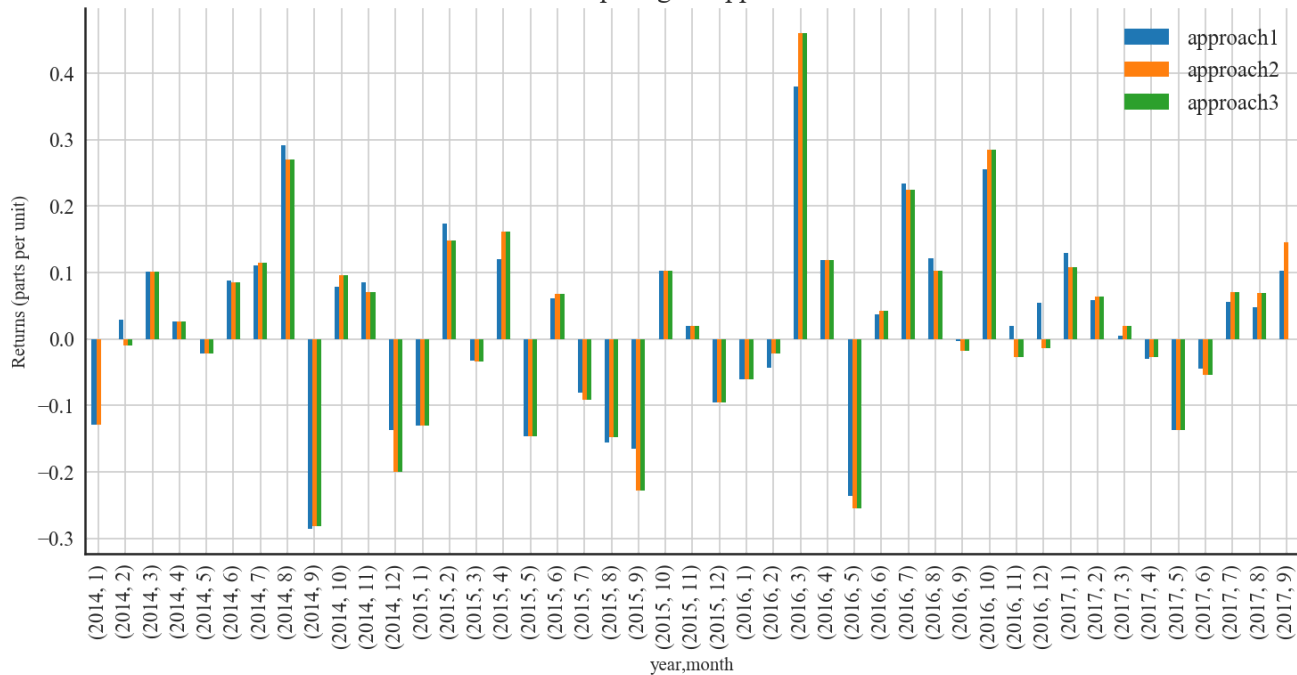
32	7	0.056312	0.070896	0.070896
33	8	0.047782	0.069686	0.069686
34	9	0.102540	0.145277	NaN

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Comparing all approaches



Banco do Brasil S.A. (BBAS3.SA)
 Sao Paulo - Sao Paulo Delayed Price. Currency in BRL.
 Source: <https://finance.yahoo.com/quote/BBAS3.SA>

- Approximation 1, gives us some miscalculations.
- Approximation 2, is a little closer to what we are looking for, but it has values that we should not use.
- Approximation 3, is the best method to use for this calculation.

Appendix: useful functions

```

1  # useful functions
2  # =====
3  def total_return(prices):
4      """Returns the return between the first and last value of the DataFrame.
5      Parameters
6      -----
7      prices : pandas.Series or pandas.DataFrame
8      Returns
  
```

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```

9         -----
10        total_return : float or pandas.Series
11            Depending on the input passed returns a float or a pandas.Series.
12        """
13        return prices.iloc[-1] / prices.iloc[0] - 1
14
15
16    def total_return_from_returns(returns):
17        """Retuns the return between the first and last value of the DataFrame.
18        Parameters
19        -----
20        returns : pandas.Series or pandas.DataFrame
21        Returns
22        -----
23        total_return : float or pandas.Series
24            Depending on the input passed returns a float or a pandas.Series.
25        """
26        return (returns + 1).prod() - 1
27
28
29    def plot_this(df, title, figsize=None, ylabel='',
30                 output_file='imgs/fig_rets_approach1.png', bottom_adj=0.25,
31                 txt_ymin=-0.4, bar=False):
32        if bar:
33            ax = df.plot.bar(title=title, figsize=figsize)
34        else:
35            ax = df.plot(title=title, figsize=figsize)
36        sns.despine()
37        plt.ylabel(ylabel)
38        plt.tight_layout()
39        plt.text(0, txt_ymin, asset_info, transform=ax.transAxes, fontsize=9)
40        plt.gcf().subplots_adjust(bottom=bottom_adj)
41        plt.savefig(output_file, **kw_save)

```

aux_functions.py hosted with ❤ by GitHub

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Bonus

I have prepared a notebook with the complete code so that it can be executed and played with: Check it out here!

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Ettore Errazuriz

Why not `Df.resample("M").last().pct_change(1)` ?

💬 Reply

🕒 1 year ago ^

Mgreco (<https://quantdare.com/author/mgreco/>)

Hello Ettore Errazuriz, sorry for the late reply. Yes, It seems to be a good point, although it seems to work well it fails in the same way as "approach 2", at the end it gives us a return that shouldn't be there. I've updated the notebook picking up your proposal, you can have a look at it [here](https://github.com/mmgreco/quantdare_posts/blob/master/calcular_retornos/agregate_returns.ipynb) (https://github.com/mmgreco/quantdare_posts/blob/master/calcular_retornos/agregate_returns.ipynb), and/or run it online [here](https://beta.mybinder.org/v2/gh/mmgreco/quantdare_posts/master?filepath=calcular_retornos/agregate_returns.ipynb) (https://beta.mybinder.org/v2/gh/mmgreco/quantdare_posts/master?filepath=calcular_retornos/agregate_returns.ipynb). Thank you very much for your question!! 😊

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