



INTRODUCTION TO DATA VISUALIZATION WITH PYTHON

# Visualizing time series



# Datetimes & time series

```
In [1]: type(weather)
Out[1]: pandas.core.frame.DataFrame

In [2]: type(weather.index)
Out[2]: pandas.tseries.index.DatetimeIndex
```

| Date                | Temperature | DewPoint | Pressure |
|---------------------|-------------|----------|----------|
| 2010-01-01 00:00:00 | 46.2        | 37.5     | 1.0      |
| 2010-01-01 01:00:00 | 44.6        | 37.1     | 1.0      |
| 2010-01-01 02:00:00 | 44.1        | 36.9     | 1.0      |
| 2010-01-01 03:00:00 | 43.8        | 36.9     | 1.0      |
| 2010-01-01 04:00:00 | 43.5        | 36.8     | 1.0      |
| ...                 | ...         | ...      | ...      |

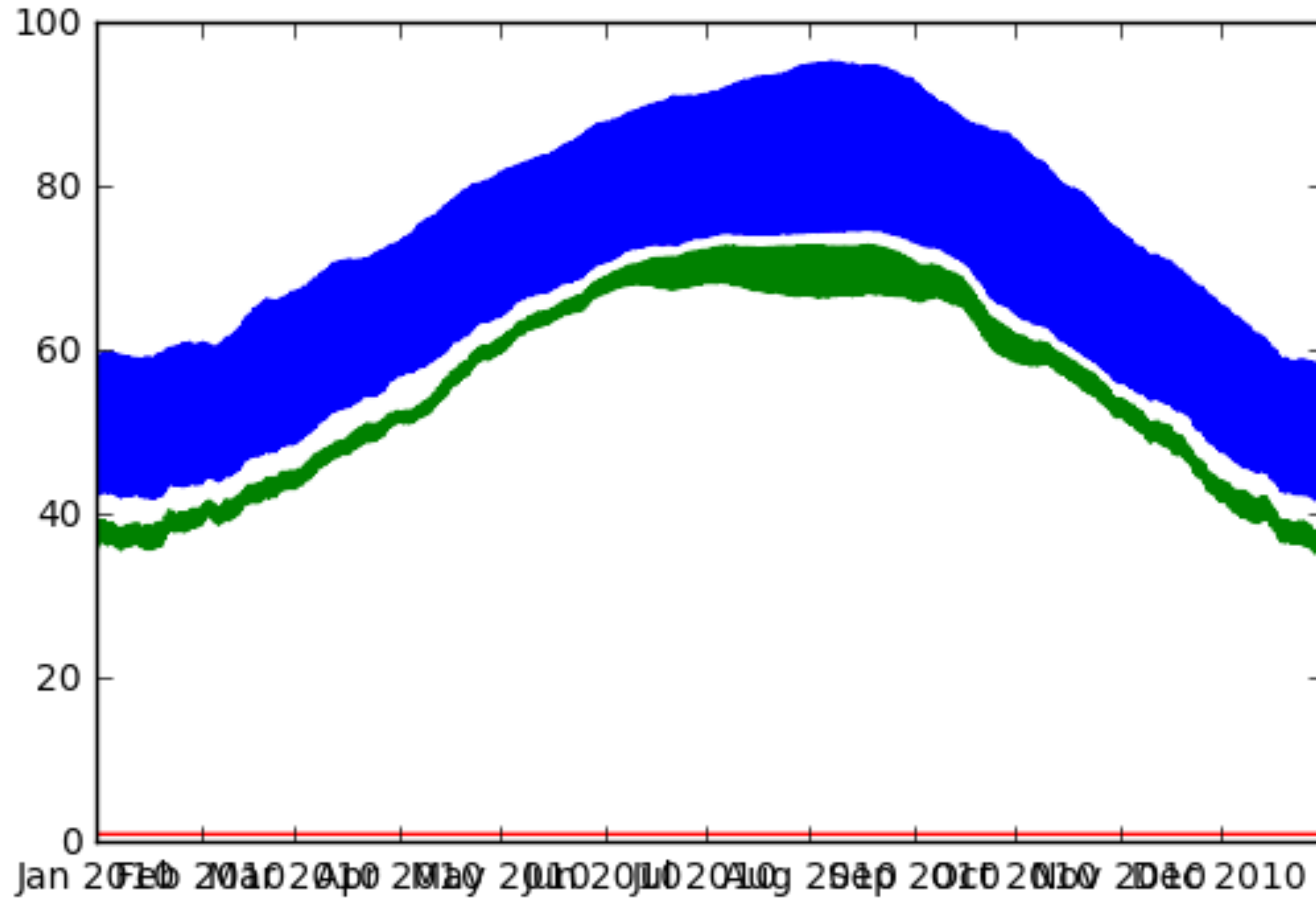
# Plotting DataFrames

```
In [1]: plt.plot(weather)
```

```
In [2]: plt.show()
```



# Plotting DataFrames



# Time series

- Pandas time series: *datetime* as index
- Datetime: represents periods or time-stamps
- Datetime index: specialized slicing
  - e.g., `weather['2010-07-04']`
  - e.g., `weather['2010-03':'2010-04']`
  - e.g., `weather['2010-05']`



# Slicing time series

```
In [1]: temperature = weather['Temperature']
```

```
In [2]: march_apr = temperature['2010-03':'2010-04'] # data of  
      ....: March & April 2010 only
```

```
In [3]: march_apr.shape
```

```
Out[3]: (1463,)
```

```
In [4]: march_apr.iloc[-4:] #extract last 4 entries from time  
series
```

```
Out[4]:
```

```
Date
```

```
2010-04-30 20:00:00    73.3
```

```
2010-04-30 21:00:00    71.3
```

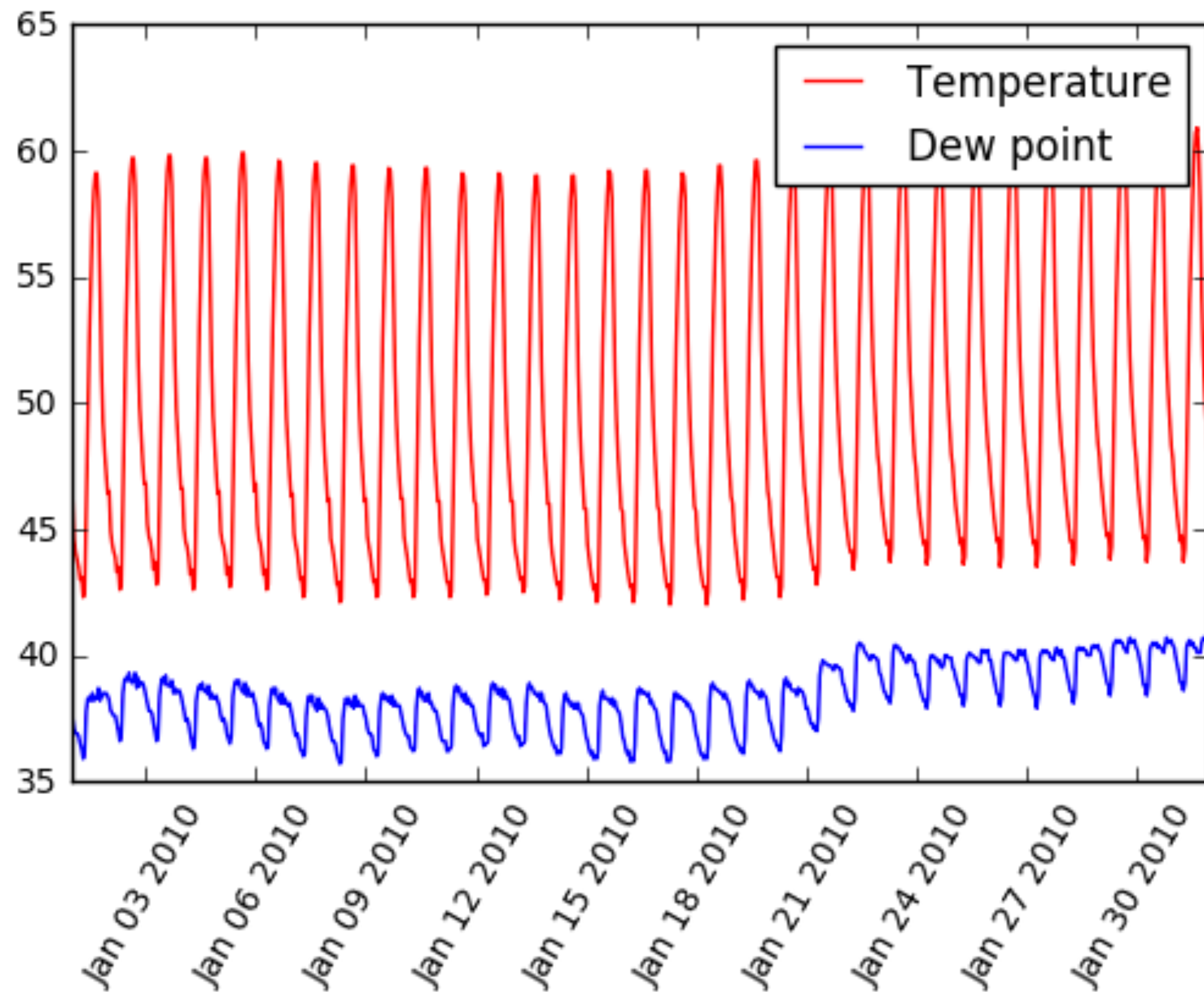
```
2010-04-30 22:00:00    69.7
```

```
2010-04-30 23:00:00    68.5
```

```
Name: Temperature, dtype: float64
```



# Plotting time series slices





# Plotting time series slices

```
In [1]: plt.plot(temperature['2010-01'], color='red',  
...:             label='Temperature')
```

```
In [2] dew point = weather['DewPoint']
```

```
In [3]: plt.plot(dewpoint['2010-01'], color='blue',  
...:             label='Dewpoint')
```

```
In [4]: plt.legend(loc='upper right')
```

```
In [5]: plt.xticks(rotation=60)
```

```
In [6]: plt.show()
```

# Selecting & formatting dates

```
In [1]: jan = temperature['2010-01']
```

```
In [2]: dates = jan.index[::96] # Pick every 4th day
```

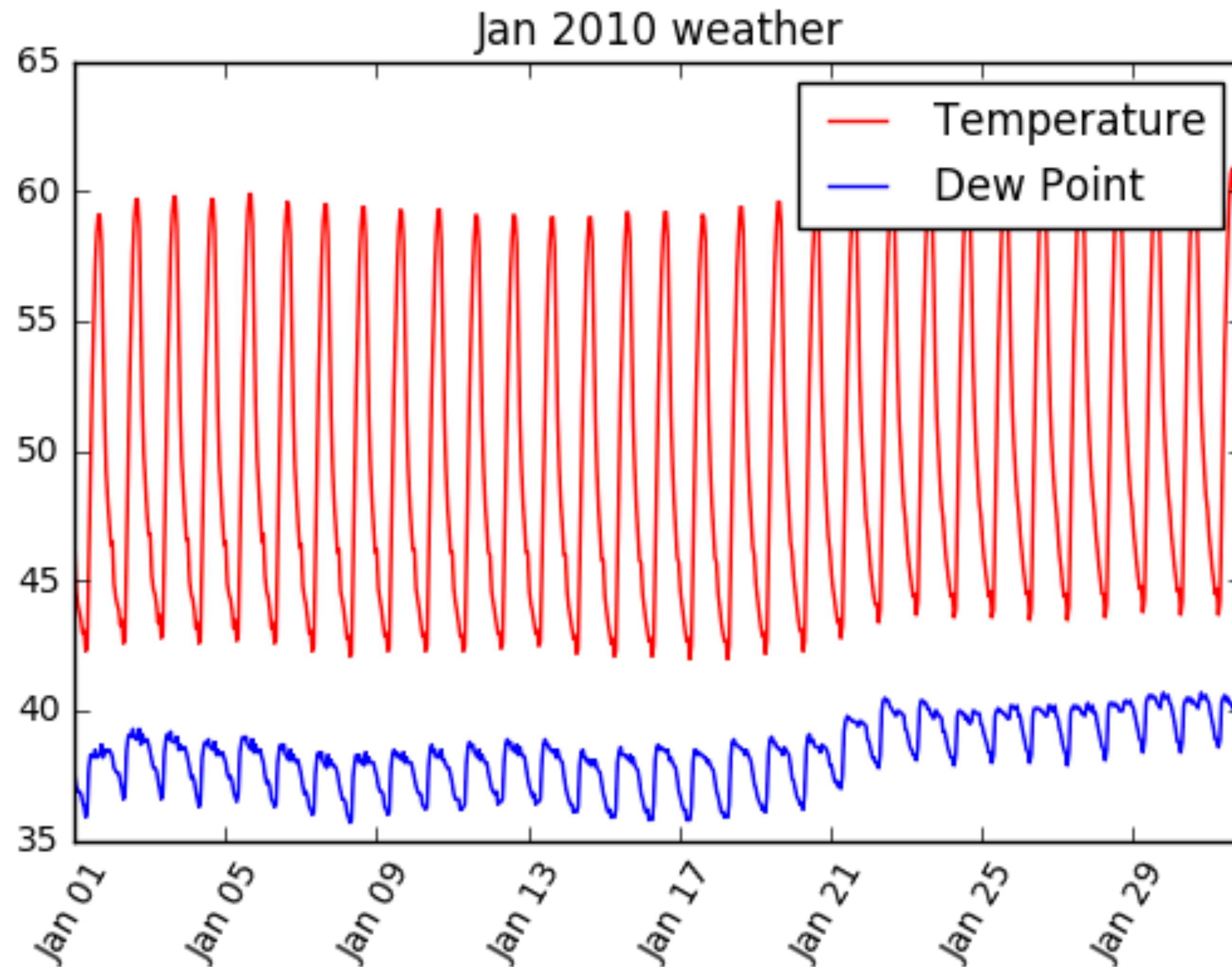
```
In [3]: print(dates)
DatetimeIndex(['2010-01-01', '2010-01-05', '2010-01-09',
              '2010-01-13', '2010-01-17', '2010-01-21', '2010-01-25',
              '2010-01-29'], dtype='datetime64[ns]', name='Date', freq=None)
```

```
In [4]: labels = dates.strftime('%b %d') # Make formatted labels
```

```
In [5]: print(labels)
['Jan 01' 'Jan 05' 'Jan 09' 'Jan 13' 'Jan 17' 'Jan 21' 'Jan 25'
 'Jan 29']
```



# Cleaning up ticks on axis





# Cleaning up ticks on axis

```
In [1]: plt.plot(temperature['2010-01'], color='red',  
...:             label='Temperature')
```

```
In [2]: plt.plot(dewpoint['2010-01'], color='blue',  
...:             label='Dewpoint')
```

```
In [3]: plt.xticks(dates, labels, rotation=60)
```

```
In [4]: plt.legend(loc='upper right')
```

```
In [5]: plt.show()
```



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**Let's practice!**

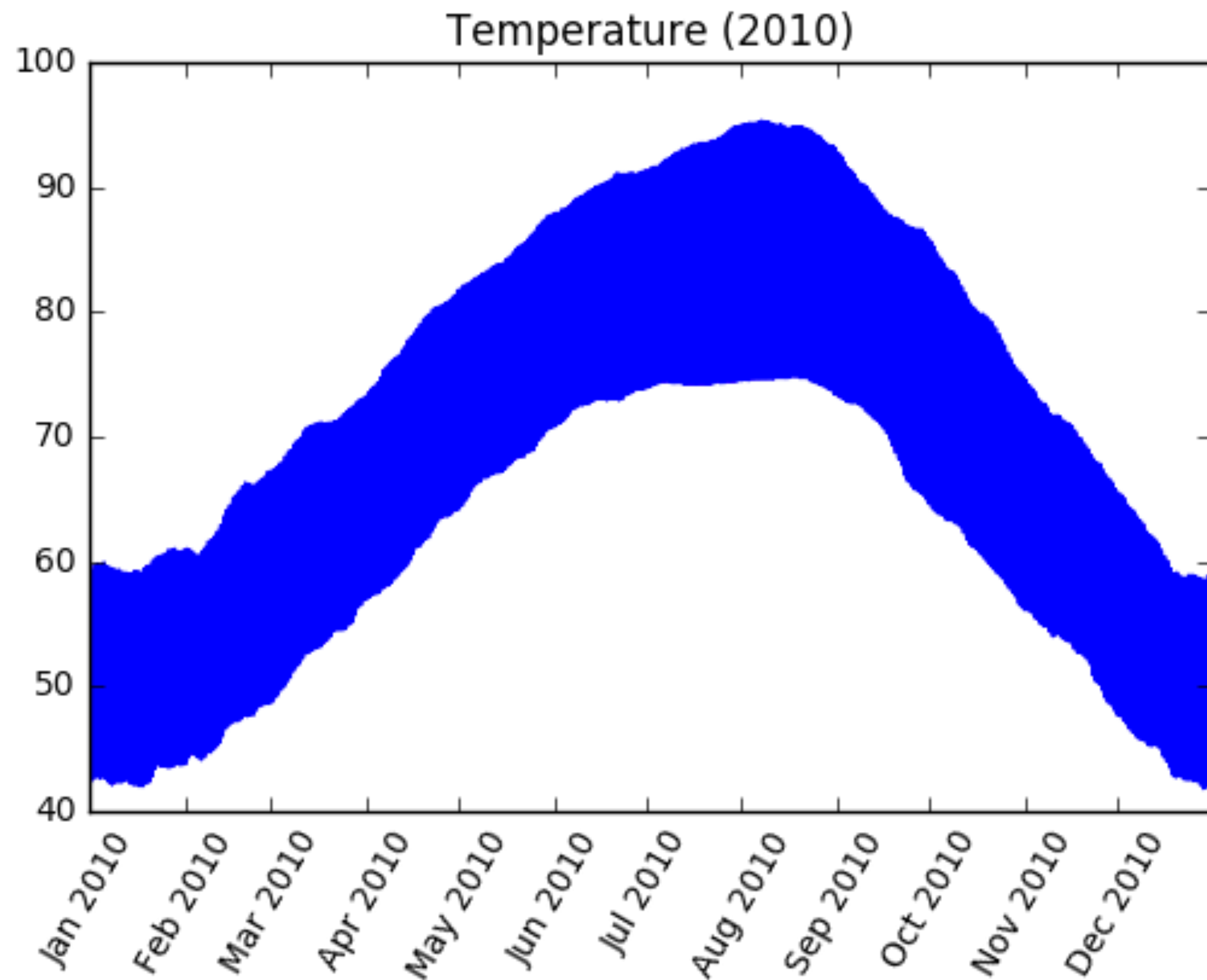


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# **Time series with moving windows**

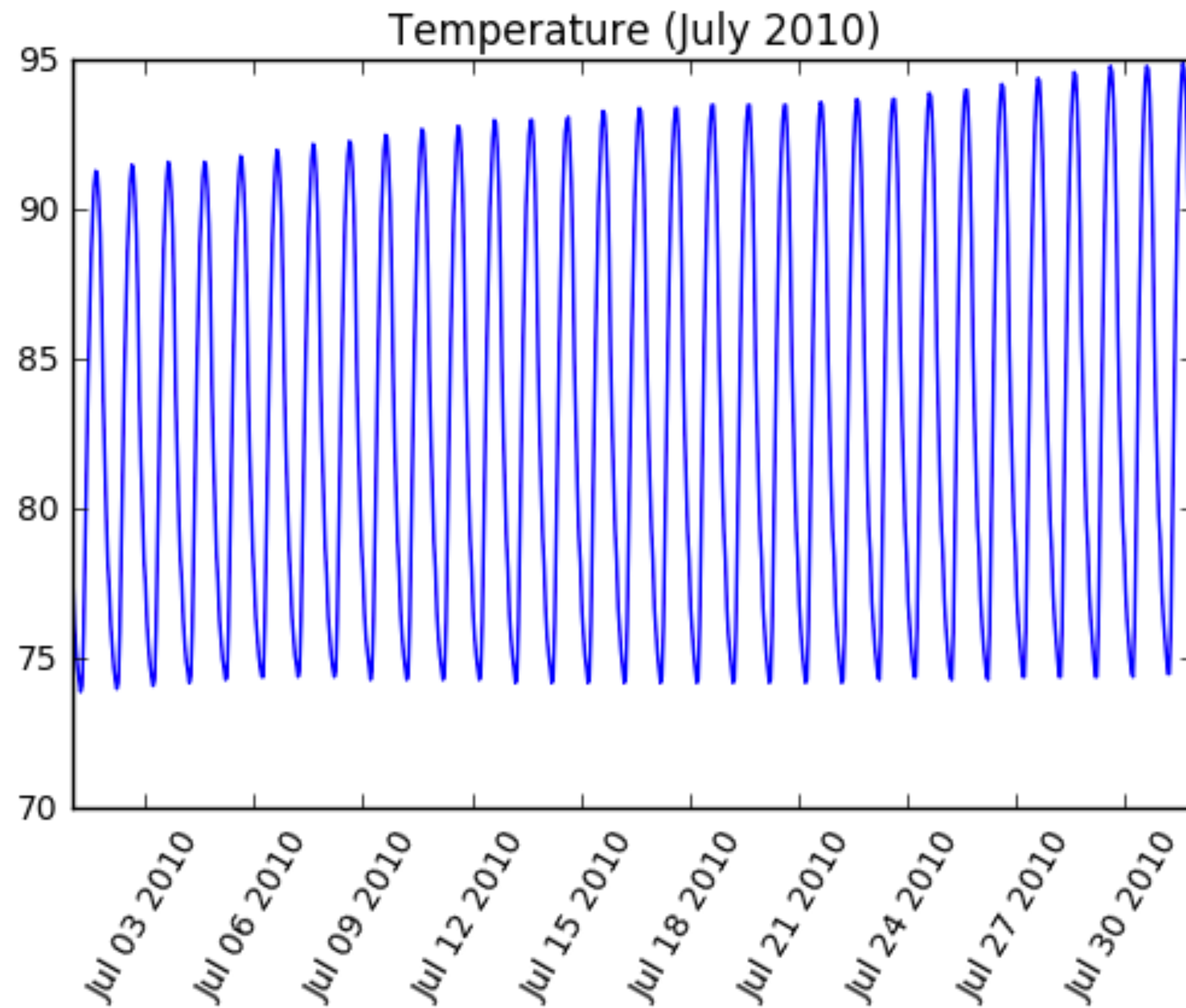


# Hourly data over a year





# Zooming in



# Moving windows & time series

- Moving window calculations
  - Averages
  - Medians
  - Standard deviations
- Extracts information on longer time scales
- See Pandas courses on how to compute



# Moving averages

```
In [1]: smoothed.info() # smoothed computing using moving averages
<class 'pandas.core.frame.DataFrame'>
DatetimeIndex: 8759 entries, 2010-01-01 00:00:00 to 2010-12-31
23:00:00
Data columns (total 5 columns):
14d          8424 non-null float64
1d           8736 non-null float64
3d           8688 non-null float64
7d           8592 non-null float64
dtypes: float64(5)
memory usage: 410.6 KB
```

```
In [2]: print(smoothed.iloc[:3,:])
```

|                     | 14d | 1d  | 3d  | 7d  | Temperature |
|---------------------|-----|-----|-----|-----|-------------|
| Date                |     |     |     |     |             |
| 2010-01-01 00:00:00 | NaN | NaN | NaN | NaN | 46.2        |
| 2010-01-01 01:00:00 | NaN | NaN | NaN | NaN | 44.6        |
| 2010-01-01 02:00:00 | NaN | NaN | NaN | NaN | 44.1        |



# Viewing 24 hour averages

```
In [1]: plt.plot(smoothed['1d']) # moving average over 24 hours
```

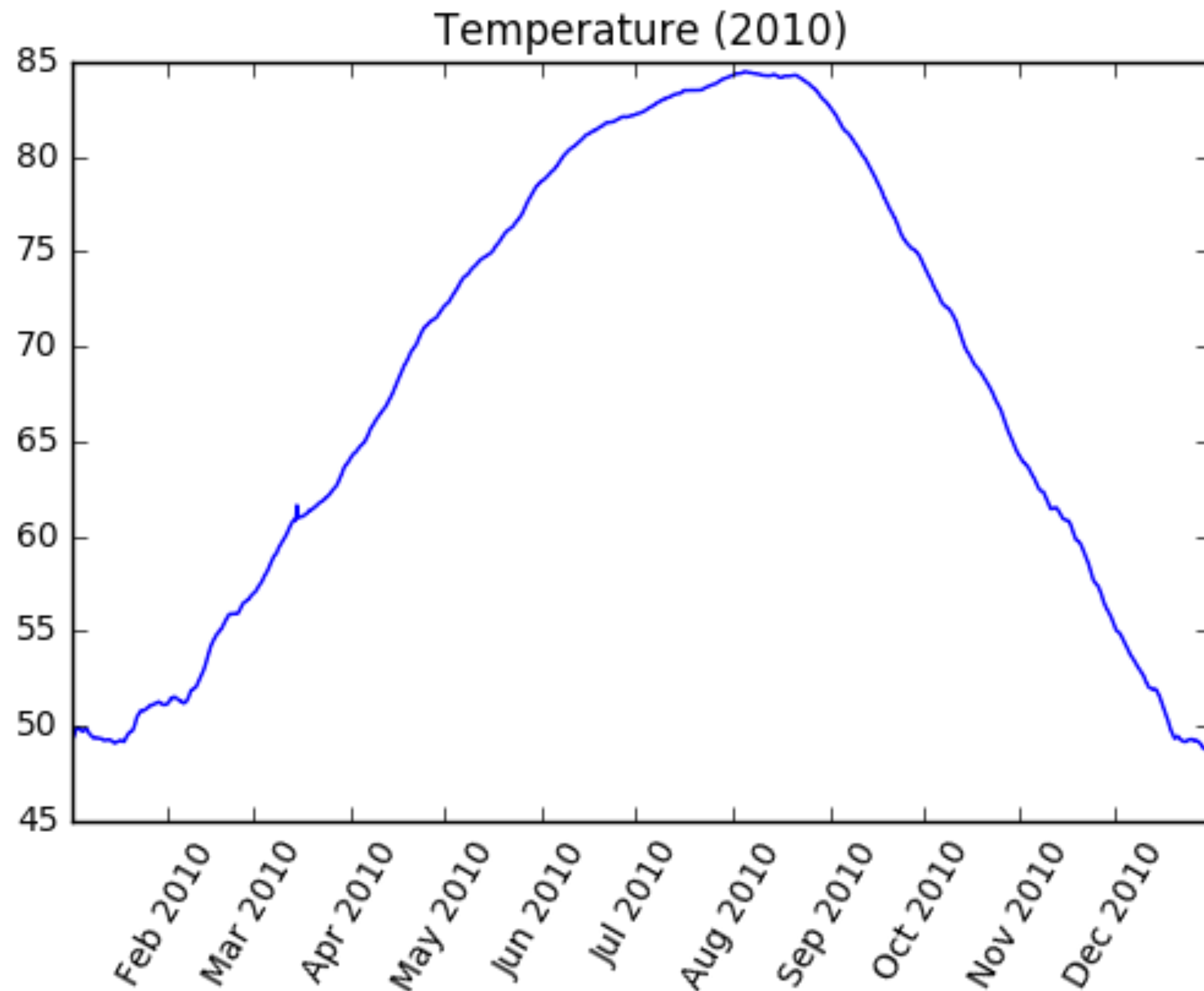
```
In [2]: plt.title('Temperature (2010)')
```

```
In [3]: plt.xticks(rotation=60)
```

```
In [4]: plt.show()
```

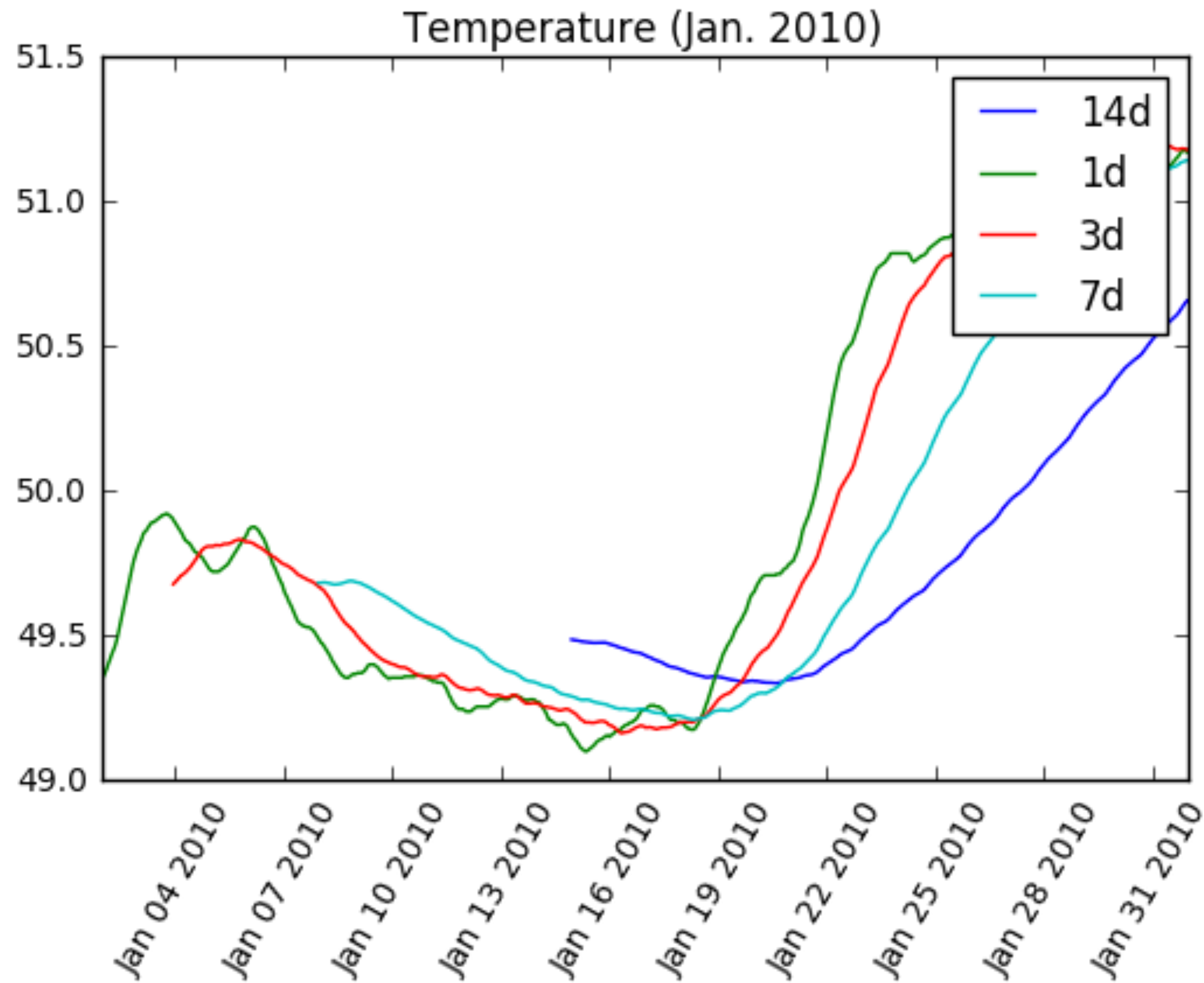


# Viewing 24 hour averages





# Viewing all moving averages





# Viewing all moving averages

```
In [1]: plt.plot(smoothed['2010-01']) # plot  
...: DataFrame for January
```

```
In [2]: plt.legend(smoothed.columns)
```

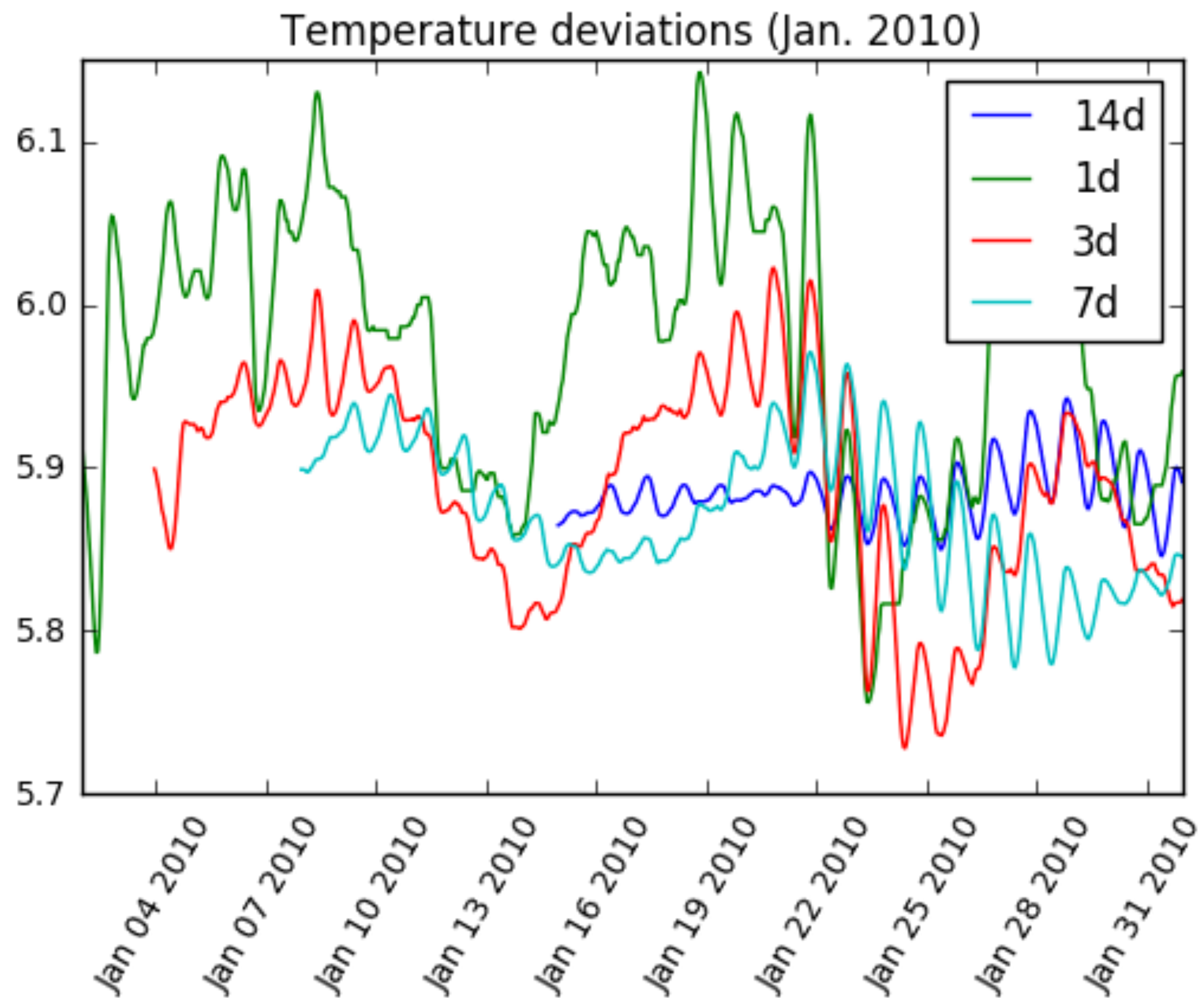
```
In [3]: plt.title('Temperature (Jan. 2010)')
```

```
In [4]: plt.xticks(rotation=60)
```

```
In [5]: plt.show()
```



# Moving standard deviations





# Moving standard deviations

```
In [1]: plt.plot(variances['2010-01'])
```

```
In [2]: plt.legend(variances.columns)
```

```
In [3]: plt.title('Temperature deviations (Jan. 2010)')
```

```
In [4]: plt.xticks(rotation=60)
```

```
In [5]: plt.show()
```



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**Let's practice!**

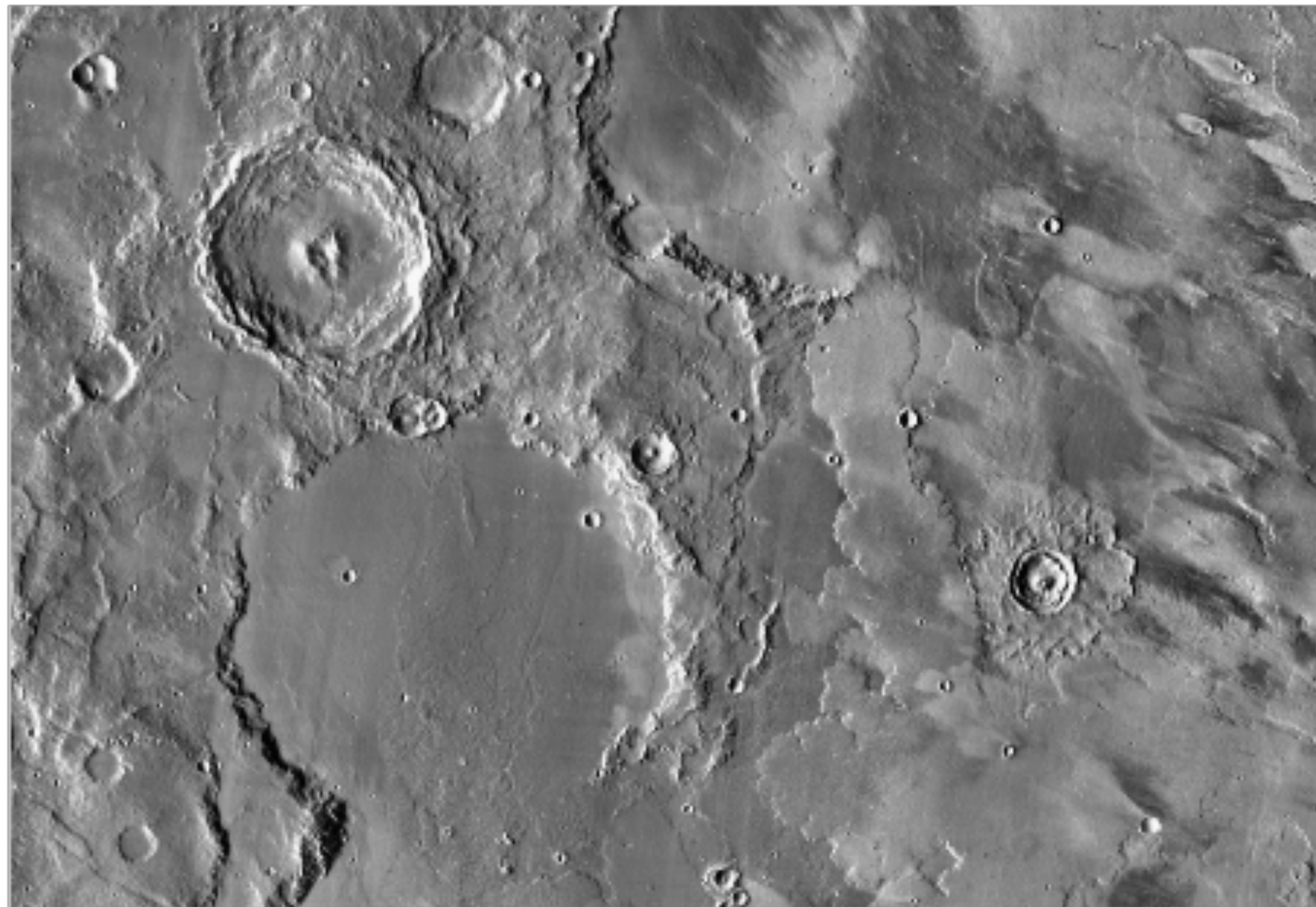


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# Histogram equalization in images



# Original image



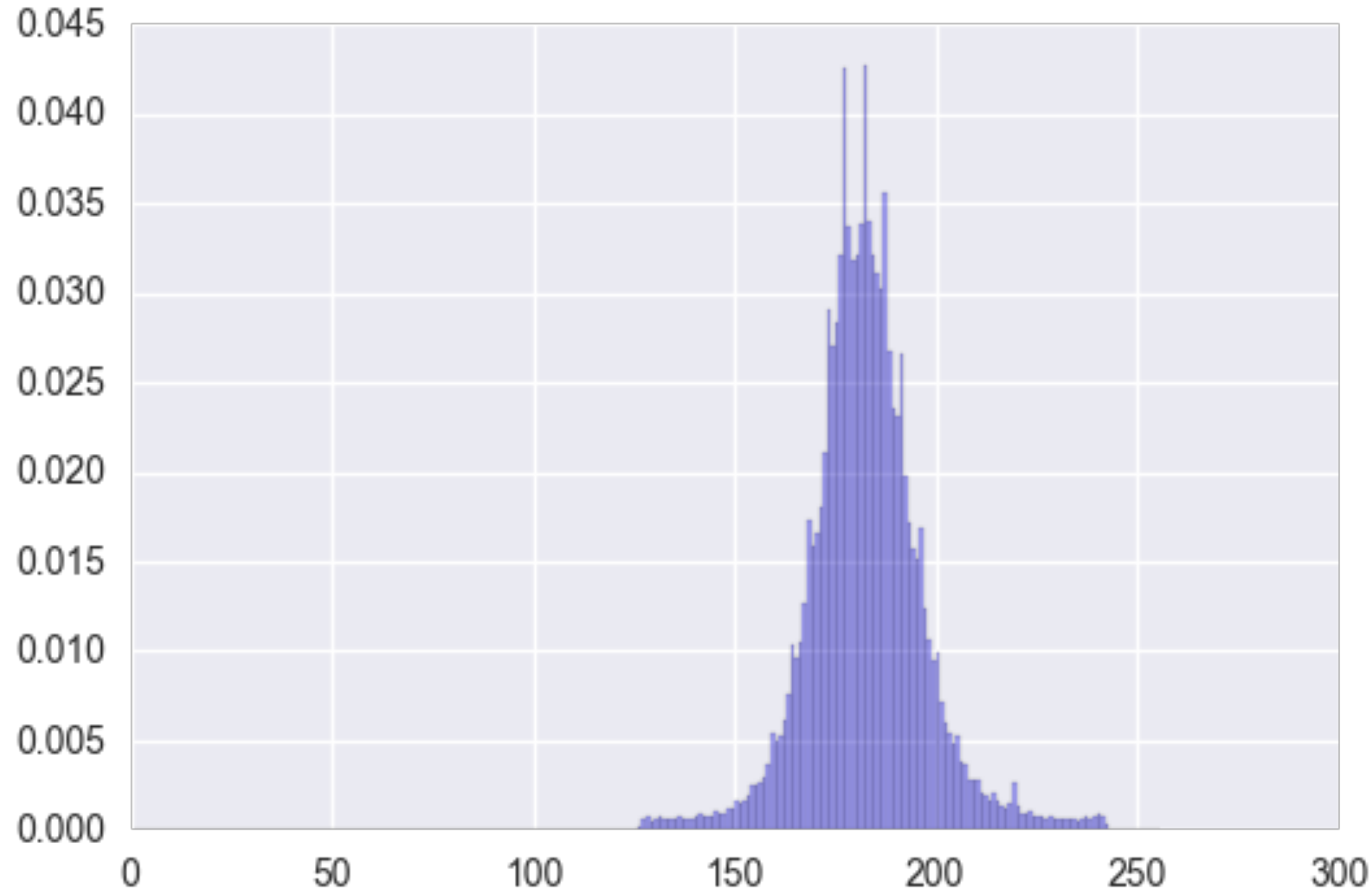
# Equalized image

Equalized image





# Image histograms





# Image histograms

```
In [1]: orig = plt.imread('low-contrast-moon.jpg')
```

```
In [2]: pixels = orig.flatten()
```

```
In [3]: plt.hist(pixels, bins=256, range=(0,256), normed=True,  
....:           color='blue', alpha=0.3)
```

```
In [4]: plt.show()
```

```
In [5]: minval, maxval = orig.min(), orig.max()
```

```
In [6]: print(minval, maxval)  
125 244
```



# Rescaling the image

```
In [1]: minval, maxval = orig.min(), orig.max()
```

```
In [2]: print(minval, maxval)  
125 244
```

```
In [3]: rescaled = (255/(maxval-minval)) * (pixels - minval)
```

```
In [4]: print(rescaled.min(), rescaled.max())  
0.0 255.0
```

```
In [5]: plt.imshow(rescaled)
```

```
In [6]: plt.axis('off')
```

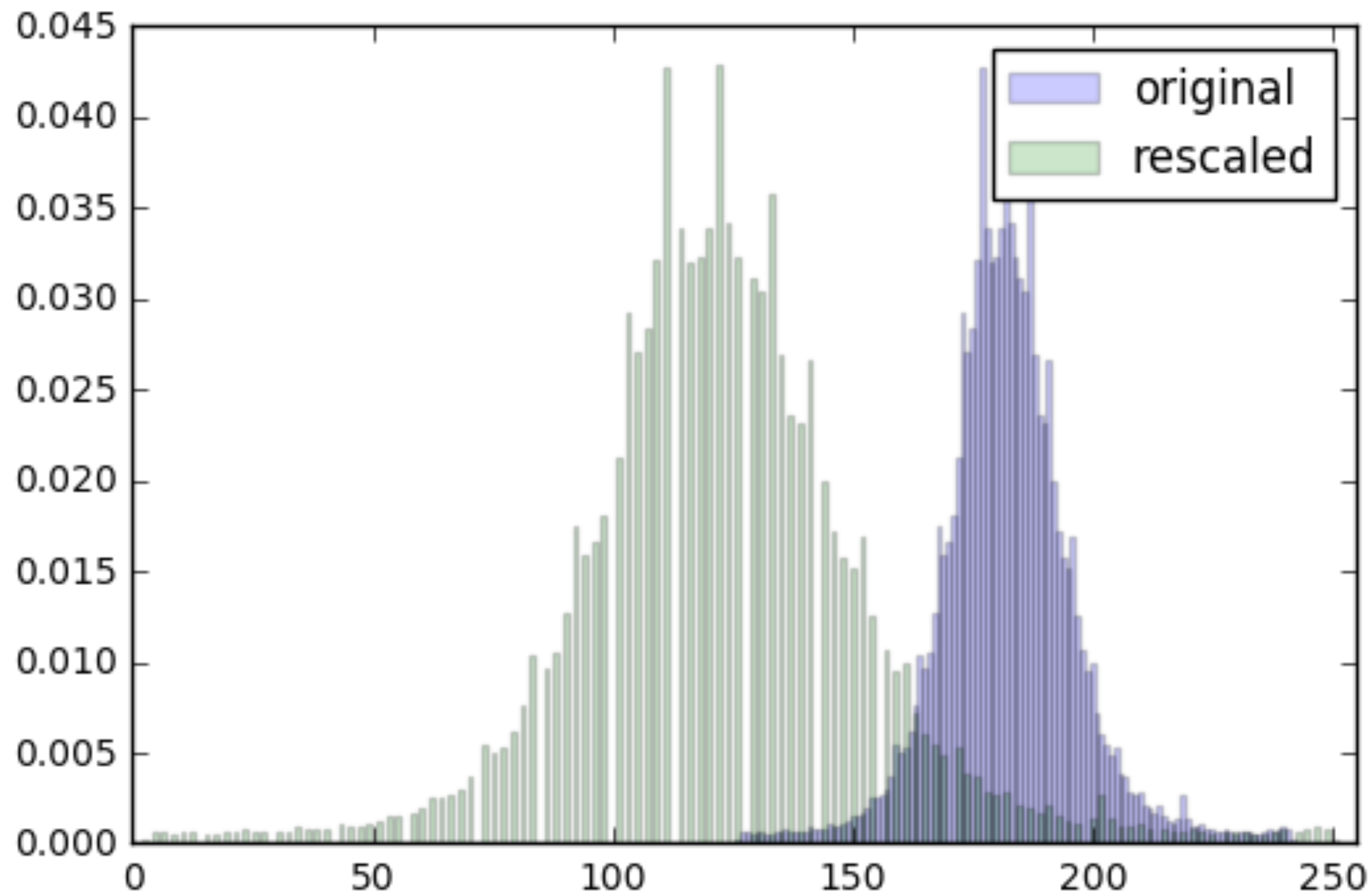
```
In [7]: plt.show()
```



# Rescaled image



# Original & rescaled histograms



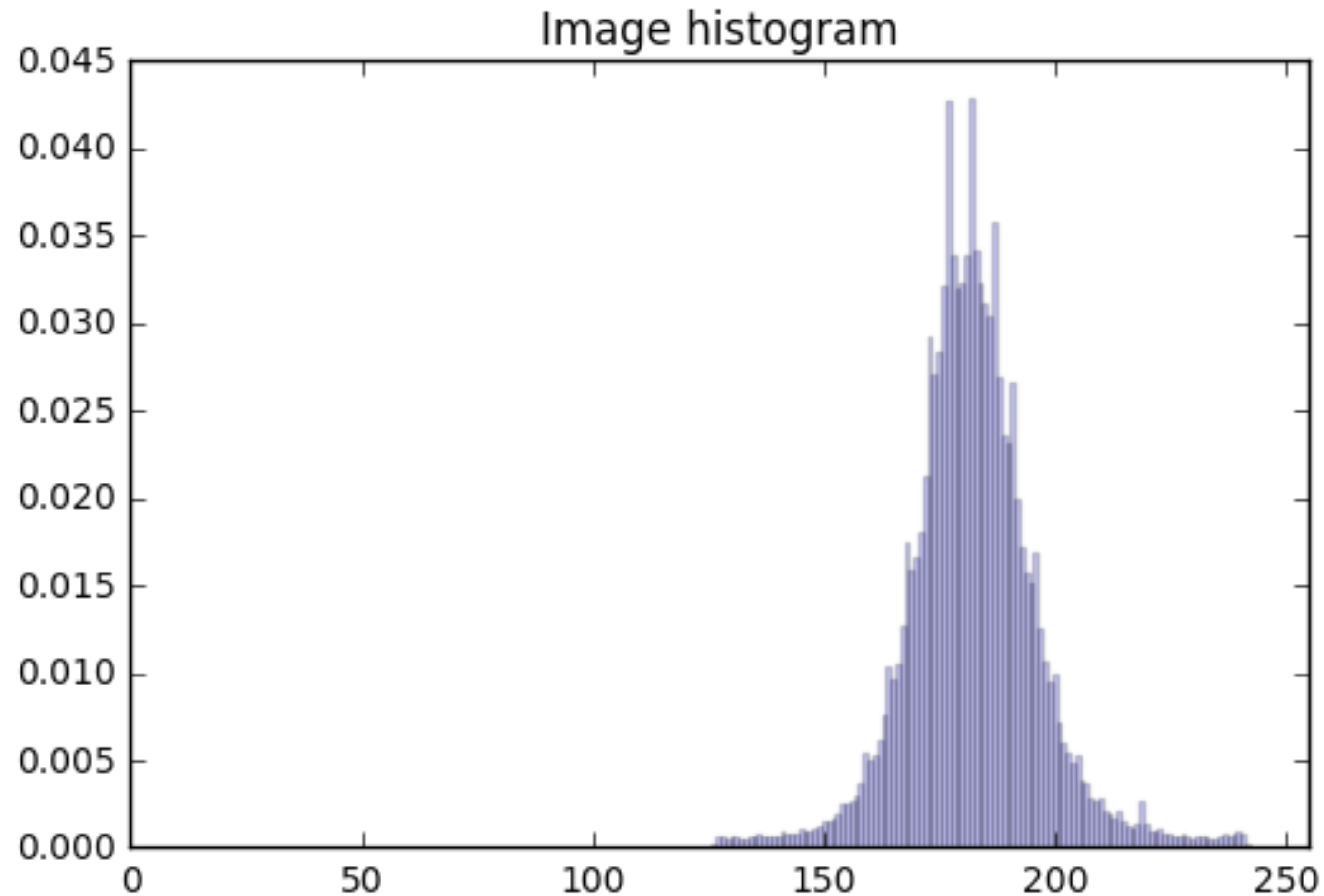


# Original & rescaled histograms

```
In [1]: plt.hist(orig.flatten(), bins=256, range=(0,255),  
....:           normed=True, color='blue', alpha=0.2))  
  
In [2]: plt.hist(rescaled.flatten(), bins=256, range=(0,255),  
....:           normed=True, color='green', alpha=0.2))  
  
In [3]: plt.legend(['original', 'rescaled'])  
  
In [4]: plt.show()
```

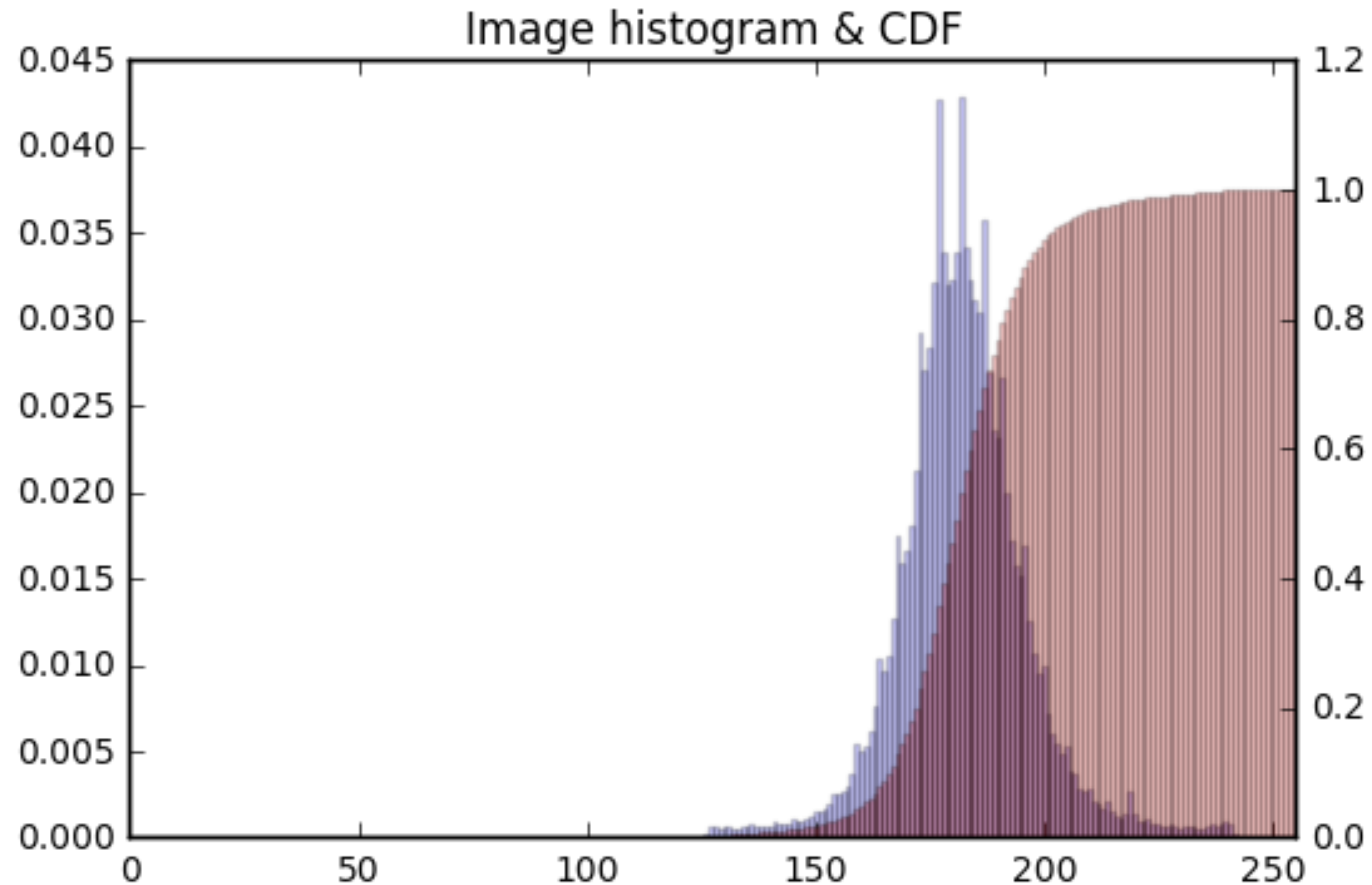


# Image histogram & CDF





# Image histogram & CDF





# Image histogram & CDF

```
In [1]: plt.hist(pixels, bins=256, range=(0,256), normed=True,  
....:          color='blue', alpha=0.3)
```

```
In [2]: plt.twinx()
```

```
In [3]: orig_cdf, bins, patches = plt.hist(pixels,  
....: cumulative=True, bins=256, range=(0,256), normed=True,  
....: color='red', alpha=0.3)
```

```
In [4]: plt.title('Image histogram and CDF')
```

```
In [5]: plt.xlim((0, 255))
```

```
In [6]: plt.show()
```



# Equalizing intensity values

```
In [1]: new_pixels = np.interp(pixels, bins[:-1], orig_cdf*255)
```

```
In [2]: new = new_pixels.reshape(orig.shape)
```

```
In [3]: plt.imshow(new)
```

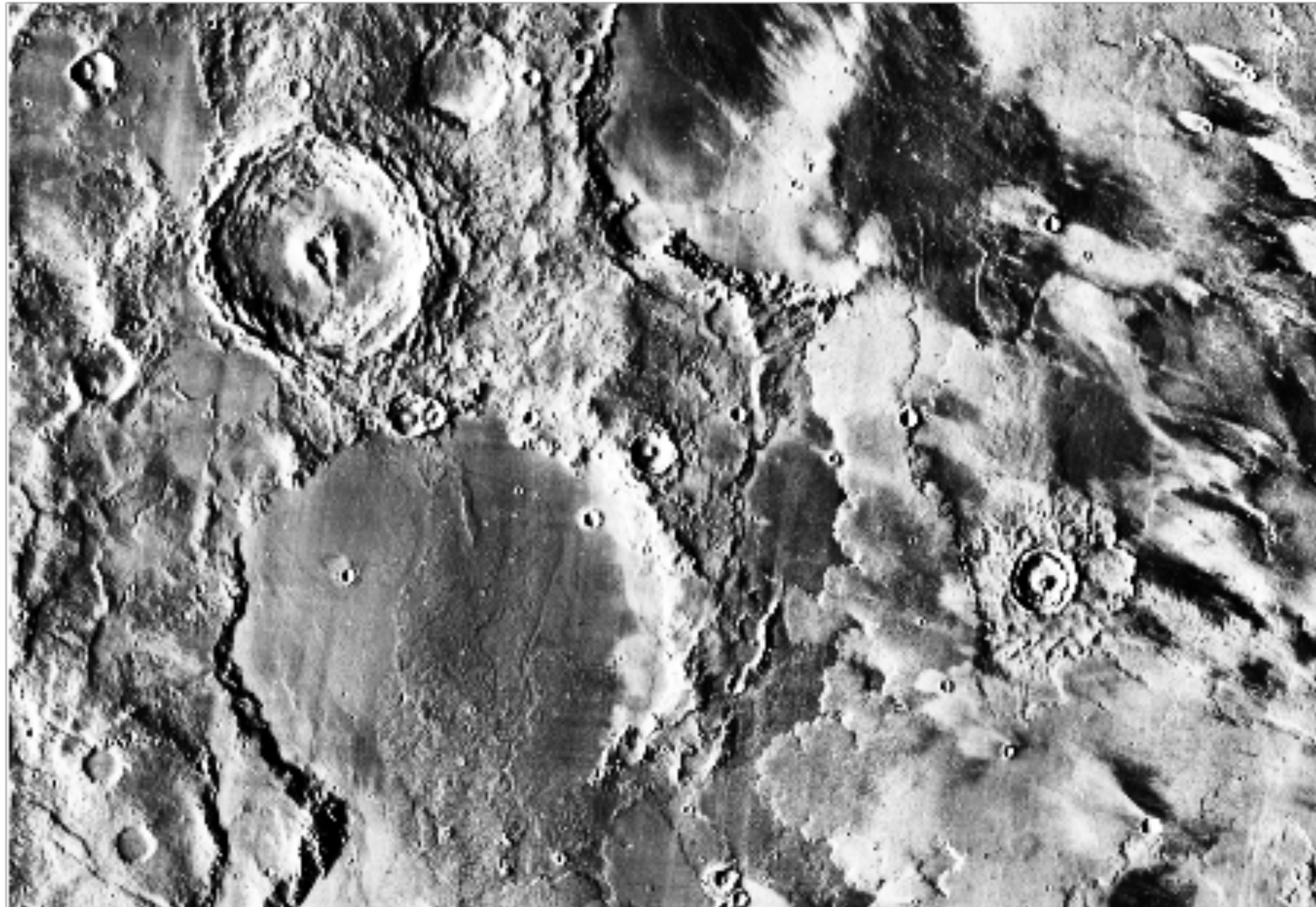
```
In [4]: plt.axis('off')
```

```
In [5]: plt.title('Equalized image')
```

```
In [6]: plt.show()
```

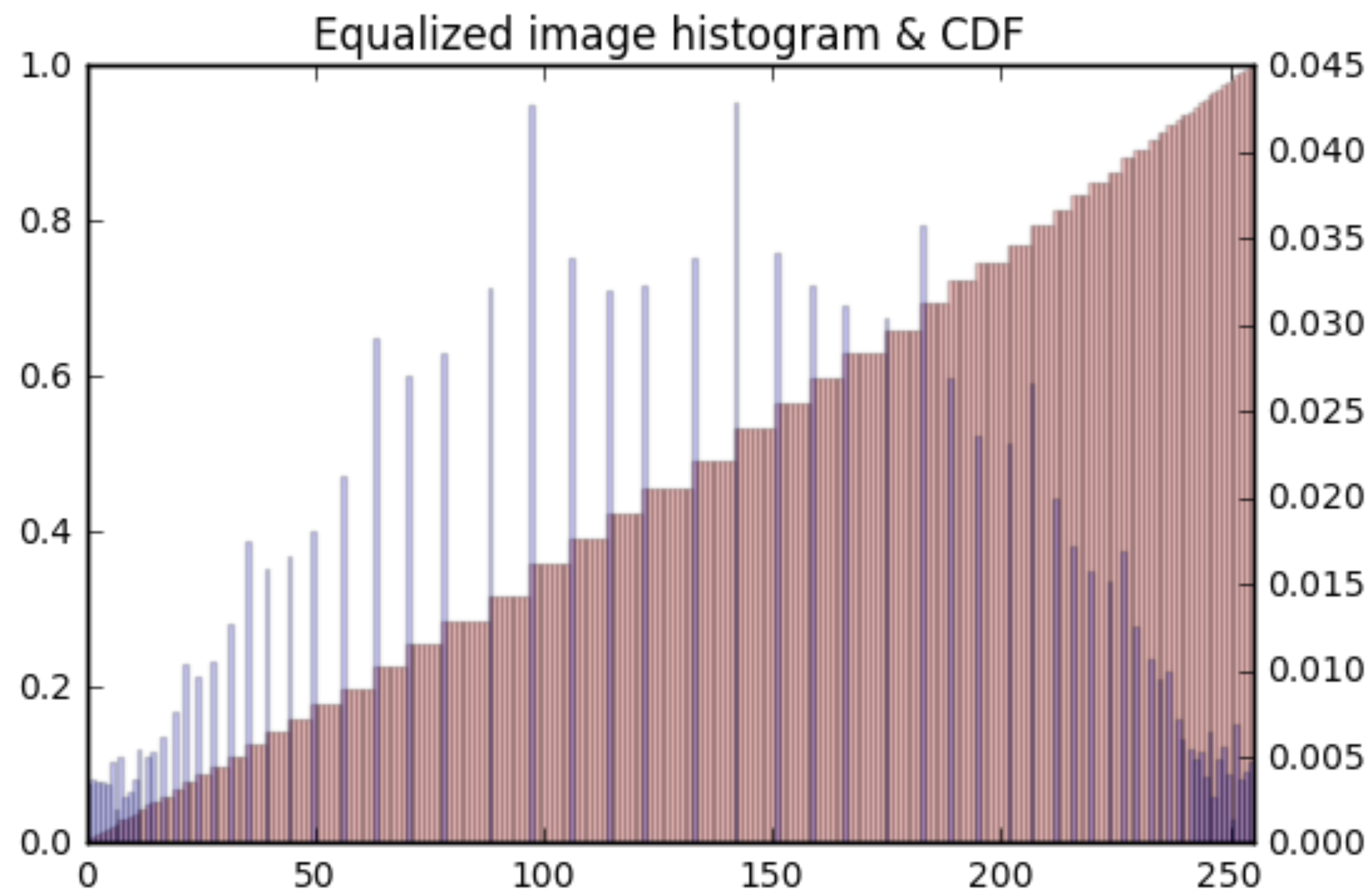
# Equalized image

Equalized image





# Equalized histogram & CDF





# Equalized histogram & CDF

```
In [1]: plt.hist(new_pixels, bins=256, range=(0,256),  
....:          normed=True, color='blue', alpha=0.3)  
  
In [2]: plt.twinx()  
  
In [3]: plt.hist(new_pixels, cumulative=True, bins=256,  
....:          range=(0,256), normed=True, color='red', alpha=0.1)  
  
In [4]: plt.title('Equalized image histogram and CDF')  
  
In [5]: plt.xlim((0, 255))  
  
In [6]: plt.show()
```



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**Let's practice!**



INTRODUCTION TO DATA VISUALIZATION WITH PYTHON

# Congratulations!