VWA_Analyse_LC-ESI-MS

October 25, 2017

```
In [22]: def cc(arg):
             return mcolors.to_rgba(arg, alpha=0.6)
In [23]: def detect_peaks(x, mph=None, mpd=1, threshold=0, edge='rising',
                          kpsh=False, valley=False, show=False, ax=None):
             """Detect peaks in data based on their amplitude and other features.
             Parameters
             _____
             x : 1D array_like
                 data.
             mph : {None, number}, optional (default = None)
                 detect peaks that are greater than minimum peak height.
             mpd : positive integer, optional (default = 1)
                 detect peaks that are at least separated by minimum peak distance
                 number of data).
             threshold : positive number, optional (default = 0)
                 detect peaks (valleys) that are greater (smaller) than `threshold
                 in relation to their immediate neighbors.
             edge : {None, 'rising', 'falling', 'both'}, optional (default = 'rising', 'falling', 'both')
                 for a flat peak, keep only the rising edge ('rising'), only the
                 falling edge ('falling'), both edges ('both'), or don't detect a
                 flat peak (None).
             kpsh : bool, optional (default = False)
                 keep peaks with same height even if they are closer than `mpd`.
             valley : bool, optional (default = False)
                 if True (1), detect valleys (local minima) instead of peaks.
             show : bool, optional (default = False)
                 if True (1), plot data in matplotlib figure.
             ax : a matplotlib.axes.Axes instance, optional (default = None).
             Returns
             _____
             ind : 1D array_like
                 indeces of the peaks in `x`.
```

```
Not.es
The detection of valleys instead of peaks is performed internally by :
negating the data: `ind_valleys = detect_peaks(-x)`
The function can handle NaN's
See this IPython Notebook [1]_.
References
_____
.. [1] http://nbviewer.ipython.org/github/demotu/BMC/blob/master/notel
Examples
>>> from detect_peaks import detect_peaks
>>> x = np.random.randn(100)
>>> x[60:81] = np.nan
>>> # detect all peaks and plot data
>>> ind = detect_peaks(x, show=True)
>>> print (ind)
>>> x = np.sin(2*np.pi*5*np.linspace(0, 1, 200)) + np.random.randn(200)
>>> # set minimum peak height = 0 and minimum peak distance = 20
>>> detect_peaks(x, mph=0, mpd=20, show=True)
>>> x = [0, 1, 0, 2, 0, 3, 0, 2, 0, 1, 0]
>>> # set minimum peak distance = 2
>>> detect_peaks(x, mpd=2, show=True)
>>> x = np.sin(2*np.pi*5*np.linspace(0, 1, 200)) + np.random.randn(200)
>>> # detection of valleys instead of peaks
>>> detect_peaks(x, mph=0, mpd=20, valley=True, show=True)
>>> x = [0, 1, 1, 0, 1, 1, 0]
>>> # detect both edges
>>> detect_peaks(x, edge='both', show=True)
>>> x = [-2, 1, -2, 2, 1, 1, 3, 0]
>>> # set threshold = 2
>>> detect_peaks(x, threshold = 2, show=True)
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```

 $x = np.atleast_1d(x).astype('float64')$

return np.array([], dtype=int)

if x.size < 3:

if valley: x = -x

```
# find indices of all peaks
dx = x[1:] - x[:-1]
# handle NaN's
indnan = np.where(np.isnan(x))[0]
if indnan.size:
    x[indnan] = np.inf
    dx[np.where(np.isnan(dx))[0]] = np.inf
ine, ire, ife = np.array([[], [], []], dtype=int)
if not edge:
    ine = np.where((np.hstack((dx, 0)) < 0) & (np.hstack((0, dx)) > 0)
else:
    if edge.lower() in ['rising', 'both']:
        ire = np.where((np.hstack((dx, 0))) \le 0) & (np.hstack((0, dx)))
    if edge.lower() in ['falling', 'both']:
        ife = np.where((np.hstack((dx, 0)) < 0) & (np.hstack((0, dx)))
ind = np.unique(np.hstack((ine, ire, ife)))
# handle NaN's
if ind.size and indnan.size:
    # NaN's and values close to NaN's cannot be peaks
    ind = ind[np.in1d(ind, np.unique(np.hstack((indnan, indnan-1, indn
# first and last values of x cannot be peaks
if ind.size and ind[0] == 0:
    ind = ind[1:]
if ind.size and ind[-1] == x.size-1:
    ind = ind[:-1]
# remove peaks < minimum peak height
if ind.size and mph is not None:
    ind = ind[x[ind] >= mph]
# remove peaks - neighbors < threshold
if ind.size and threshold > 0:
    dx = np.min(np.vstack([x[ind]-x[ind-1], x[ind]-x[ind+1]]), axis=0)
    ind = np.delete(ind, np.where(dx < threshold)[0])
# detect small peaks closer than minimum peak distance
if ind.size and mpd > 1:
    ind = ind[np.argsort(x[ind])][::-1] # sort ind by peak height
    idel = np.zeros(ind.size, dtype=bool)
    for i in range(ind.size):
        if not idel[i]:
            # keep peaks with the same height if kpsh is True
            idel = idel \mid (ind \ge ind[i] - mpd) \& (ind \le ind[i] + mpd)
                & (x[ind[i]] > x[ind] if kpsh else True)
            idel[i] = 0 # Keep current peak
    # remove the small peaks and sort back the indices by their occur.
    ind = np.sort(ind[~idel])
if show:
    if indnan.size:
        x[indnan] = np.nan
```

```
if valley:
                     x = -x
                 _plot(x, mph, mpd, threshold, edge, valley, ax, ind)
             return ind
         def _plot(x, mph, mpd, threshold, edge, valley, ax, ind):
             """Plot results of the detect_peaks function, see its help."""
             try:
                 import matplotlib.pyplot as plt
             except ImportError:
                 print('matplotlib is not available.')
             else:
                 if ax is None:
                     _, ax = plt.subplots(1, 1, figsize=(8, 4))
                 ax.plot(x, 'b', lw=1)
                 if ind.size:
                     label = 'valley' if valley else 'peak'
                     label = label + 's' if ind.size > 1 else label
                     ax.plot(ind, x[ind], '+', mfc=None, mec='r', mew=2, ms=8,
                             label='%d %s' % (ind.size, label))
                     ax.legend(loc='best', framealpha=.5, numpoints=1)
                 ax.set_xlim(-.02*x.size, x.size*1.02-1)
                 ymin, ymax = x[np.isfinite(x)].min(), x[np.isfinite(x)].max()
                 yrange = ymax - ymin if ymax > ymin else 1
                 ax.set_ylim(ymin - 0.1*yrange, ymax + 0.1*yrange)
                 ax.set_xlabel('Data #', fontsize=14)
                 ax.set_ylabel('Amplitude', fontsize=14)
                 mode = 'Valley detection' if valley else 'Peak detection'
                 ax.set_title("%s (mph=%s, mpd=%d, threshold=%s, edge='%s')"
                              % (mode, str(mph), mpd, str(threshold), edge))
                 # plt.grid()
                 plt.show()
In [24]: import numpy as np
         import pandas as pd
         import matplotlib.pyplot as plt
         from matplotlib import colors as mcolors
         from scipy.signal import argrelextrema
         from scipy.signal import find_peaks_cwt
         from numpy import trapz
In [25]: data = pd.io.parsers.read_csv("Kuerbis_Analyse_7min_LC-ESI-MS_12min.csv")
         helpvalue = ['617', '619', '629', '631', '633.23', '633.29', '645', '647.2
```

```
#helpvalue = ['619', '633.23', '645', '647', '675', '821']
         xs = data[['Zeit']].values
         xs = np.hstack(xs)
         list_x_values = []
         list_y_values = []
         list_catabolite = []
         list_isomer = []
In [26]: ys = 0
         i = 0
         highest_peak = []
         fig = plt.figure(figsize=(20,10))
         ax = plt.axes()
         area_617 = 0
         area_619 = 0
         area_631 = 0
         area_63329 = 0
         area_645 = 0
         area_647 = 0
         area_659 = 0
         area 661 = 0
         area_675 = 0
         area 793 = 0
         area_795 = 0
         area_807 = 0
         area_809 = 0
         area_821 = 0
         height_617 = 0
         height_619 = 0
         height_631 = 0
         height_63329 = 0
         height_645 = 0
         height_647 = 0
         height_659 = 0
         height 661 = 0
         height_675 = 0
         height_793 = 0
         height_795 = 0
         height_807 = 0
         height_809 = 0
         height_821 = 0
         distance_for_integration = 0.1
```

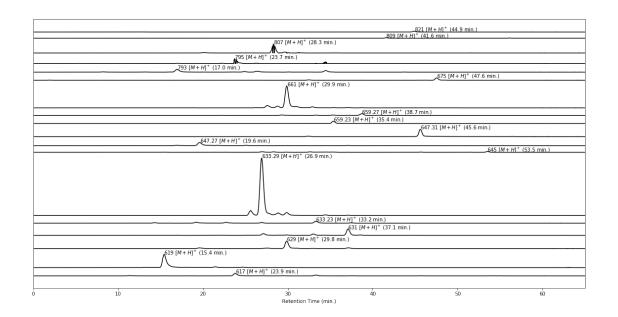
```
for h in helpvalue:
    ys = data[[helpvalue[i]]].values
    ys = np.hstack(ys)
   highest_peak.append(ys.max())
    if (i == 0):
        print (helpvalue[i])
        area_617 = trapz(ys, dx=distance_for_integration)
        height_617 = ys.max()
    elif (i == 1):
        print (helpvalue[i])
        area_619 = trapz(ys, dx=distance_for_integration)
        height_619 = ys.max()
    elif (i == 3):
        print(helpvalue[i])
        area_631 = trapz(ys, dx=distance_for_integration)
        height_631 = ys.max()
    elif (i == 5):
        print (helpvalue[i])
        area 63329 = \text{trapz}(ys, dx=\text{distance for integration})
        height_63329 = ys.max()
    elif (i == 6):
        print (helpvalue[i])
        area_645 = trapz(ys, dx=distance_for_integration)
        height_645 = ys.max()
    elif (i == 7):
        print (helpvalue[i])
        area_647 = trapz(ys, dx=distance_for_integration)
        height_647 = ys.max()
    elif (i == 10):
        print (helpvalue[i])
        area_659 = trapz(ys, dx=distance_for_integration)
        height 659 = ys.max()
    elif (i == 11):
        print (helpvalue[i])
        area_661 = trapz(ys, dx=distance_for_integration)
        height_661 = ys.max()
    elif (i == 12):
        print (helpvalue[i])
        area_675 = trapz(ys, dx=distance_for_integration)
        height_675 = ys.max()
    elif (i == 13):
        print (helpvalue[i])
        area_793 = trapz(ys, dx=distance_for_integration)
        height_793 = ys.max()
    elif (i == 14):
```

```
print (helpvalue[i])
        area_795 = trapz(ys, dx=distance_for_integration)
        height_795 = ys.max()
    elif (i == 15):
        print (helpvalue[i])
        area_807 = trapz(ys, dx=distance_for_integration)
        height 807 = ys.max()
    elif (i == 16):
        print (helpvalue[i])
        area_809 = trapz(ys, dx=distance_for_integration)
        height_809 = ys.max()
    elif (i == 17):
        print(helpvalue[i])
        area_821 = trapz(ys, dx=distance_for_integration)
        height_821 = ys.max()
    i = i+1
Ka_617 = area_631/area_617
Kh 617 = height 631/height 617
Ka_{619} = area_{63329}/area_{619}
Kh 619 = height 63329/height 619
Ka_645 = area_659/area_645
Kh_645 = height_659/height_645
Ka_647 = area_661/area_647
Kh_647 = height_661/height_647
Ka2_647 = area_675/area_647
Kh2_647 = height_675/height_647
Ka_793 = area_807/area_793
Kh_793 = height_807/height_793
Ka2_{793} = area_{821}/area_{793}
Kh2_793 = height_821/height_793
Ka_795 = area_809/area_795
Kh_795 = height_809/height_795
print('Ka 617')
print (Ka 617)
print (Kh_617)
print('Ka_619')
print (Ka_619)
print (Kh_619)
print('Ka_645')
print (Ka_645)
print (Kh_645)
print('Ka_647')
print (Ka_647)
print (Kh_647)
print('Ka2_647')
```

```
print (Ka2_647)
print (Kh2_647)
print('Ka_793')
print (Ka_793)
print (Kh 793)
print('Ka2_793')
print (Ka2 793)
print (Kh2_793)
print('Ka_795')
print (Ka_795)
print (Kh_795)
highest_peak = np.array(highest_peak).max()
ys = 0
i=0
previous_mass = 0
for h in helpvalue:
    ys = data[[helpvalue[i]]].values
    ys = np.hstack(ys)
    y = []
    for x in ys:
        y.append(((x/highest_peak)*100)+previous_mass+10)
    y = np.array(y)
    previous_mass = y.max()
    x_max_arg = y.argmax()
    #local_maxima = argrelextrema(y, np.greater, order=200)
    #local_maxima = find_peaks_cwt(y, np.arange(1, 350))
    local_maxima = detect_peaks(y, mph=0.04, mpd=350)
    \#first_isomer = np.partition(np.array(y).flatten(), -1)[-1]
    #first_isomer = np.round(np.array(np.hstack(y)[local_maxima])).argsort
    #print(first_isomer)
    #y_help = np.sort(y[local_maxima])
    line = plt.plot(xs, y, color = 'black', label = h + '[M+H]^+^')
    ax.annotate(xy=(xs[x_max_arg], previous_mass), s = h + r' $[M+H]^+$ (
    list_x_values.append(xs[x_max_arg])
    list_y_values.append(previous_mass)
    list_catabolite.append(h)
    \#u = 1
```

```
#for x in xs[local_maxima]:
                  \#ax.annotate(xy=(x, y[np.where(x)]), s = h + r' $[M+H]^+$-Isomer
                  #list_x_values.append(x)
                  #list_y_values.append(y[np.where(x)])
                  #list_catabolite.append(h)
                  #list_isomer.append(u)
                  \#u = u+1
             i = i+1
         plt.yticks([])
         plt.xlabel('Retention Time (min.)')
         plt.xlim(0,65)
         plt.savefig('Kuerbis_Analyse_Reaktion3h_LC-ESI-MS.png')
         plt.show()
617
619
631
633.29
645
647.27
659.27
661
675
793
795
807
809
821
Ka_617
2.04496546098
2.61835424334
Ka 619
3.72894401481
4.30577315565
Ka_645
0.952718937384
1.90972196983
Ka 647
4.46006879328
6.6850336666
Ka2_647
0.50313171312
0.722832075087
Ka_793
```

```
0.998319279587
3.20375262079
Ka2_793
0.112793086295
0.266083083593
Ka_795
0.118012120986
0.093094387365
```



```
ys = y
     line = plt.plot(xs, ys, color = 'black', label = '')
     highest_peak = np.array(list_y_values).max()
     helper = []
      for t in list_y_values:
           helper.append(((t/highest_peak) *100))
      list_y_values = helper
     i = 0
      for index in list_x_values:
           h = list_catabolite[i]
           \#u = list_isomer[i]
           text = h + r' \$[M+H]^+ ('+str(np.round(index, 1))+' min.)'
           plt.annotate(
                      text, xy=(index, 0), xycoords='data',
                      xytext=(index, list_y_values[i]), textcoords='data',
                      rotation=0, size=12, horizontalalignment='center', verticalal:
                      arrowprops=dict(arrowstyle='-', color="#808080", linewidth=0.4
           i = i+1
      \#ax.annotate(xy=(x, y[np.where(x)]), s = h + r' \$[M+H]^+\$-Isomer'+str(u)
     plt.xlabel('Retention Time (min.)')
     plt.ylabel('Relative abundance')
     plt.xlim(0,65)
     plt.savefig('Kuerbis_Analyse_Ganzes_Spektrum.png')
     plt.show()
                                                  821 [M+H]<sup>+</sup> (44.9 min.)
809 [M+H]<sup>+</sup> (41.6 min.)
100
                                 807 [M + H]+ (28.3 min.)
                           795 [M + H]+ (23.7 min.)
                  793 [M + H]+ (17.0 min.)
                                                          675 [M+H]+ (47.6 min.)
                                   661 [M+H]+ (29.9 min.)
                                         659.27 [M + H] + (38.7 min.)
659.23 [M + H] + (35.4 min.)
                                                       647.31 [M + H] + (45.6 min.)
                     647.27 [M + H]+ (19.6 min.)
                                                                  645 [M + H]+ (53.5 min.)
                              633.29 [M+H]+ (26.9 min.)
                                       633.23 [M + H] + (33.2 min.)
631 [M + H] + (37.1 min.)
                                   629 [M+H]+ (29.8 min.)
                619 [M + H]+ (15.4 min.)
                           617 [M + H] + (23.9 min.)
```

Retention Time (min.)