```
In [1]: import pandas as pd
          pd.options.mode.chained assignment = None # default='warn'
          from datetime import datetime, date, timedelta
          import pickle
 In [2]: now = datetime.now().date()
          sdate= datetime.now().date()-timedelta(days=365*2)
          datediff = (now-sdate).days
 In [3]: allwind = pd.read pickle('brommer_raw_2020-10-04_2022-10-03.pkl')
 In [4]: | allwind[::len(allwind)//10]
 Out[4]:
                       Date
                                Time
                                      Season
                                             Month
                                                     Daypart
                                                             Temp
                                                                   Wind Azimuth
                                                                                 Speed
                                                                                        Gust
                o 2020-10-04 12:04 AM
                                                Oct Overnight
                                                                            90.0
                                         Fall
                                                              55.6
                                                                    East
                                                                                    0.0
                                                                                         0.0
            20405 2020-12-14 12:34 AM
                                                                   WSW
                                       Winter
                                                Dec
                                                    Overnight
                                                              45.4
                                                                           247.5
                                                                                    0.0
                                                                                         0.9
            40810 2021-02-23 12:24 AM
                                                    Overnight
                                                                   WSW
                                                                           247.5
                                       Winter
                                                Feb
                                                              49.4
                                                                                    0.0
                                                                                         0.0
            61215 2021-05-20
                                                                            45.0
                             7:24 AM
                                       Spring
                                               May
                                                     Morning
                                                              47.6
                                                                     NE
                                                                                    1.2
                                                                                         4.0
            81620 2021-07-30
                             1:29 PM
                                     Summer
                                                Jul
                                                      Midday
                                                              63.9
                                                                     SW
                                                                           225.0
                                                                                    4.3
                                                                                         8.0
           102025 2021-10-09
                                                Oct Afternoon
                             4:29 PM
                                                                           247.5
                                         Fall
                                                              67.8
                                                                   WSW
                                                                                    3.0
                                                                                         8.0
           122430 2021-12-19
                             9:52 PM
                                       Winter
                                                Dec
                                                     Evening
                                                              51.1
                                                                    SSW
                                                                           202.5
                                                                                    7.0
                                                                                         8.0
           142835 2022-03-01
                             8:14 PM
                                       Spring
                                                     Evening
                                                              54.9
                                                                    East
                                                                            90.0
                                                                                    0.9
                                                                                         6.0
                                                Mar
           163240 2022-05-12 12:24 AM
                                               May Overnight
                                                              47.7
                                                                    NNE
                                                                            22.5
                                                                                    2.4
                                                                                         4.0
                                       Spring
           183645 2022-07-23 12:19 AM Summer
                                                    Overnight
                                                              56.2
                                                                    West
                                                                           270.0
                                                                                    0.9
                                                                                         3.0
           204050 2022-10-03 11:39 PM
                                         Fall
                                                Oct Overnight
                                                              57.8 WNW
                                                                           292.5
                                                                                    0.2
                                                                                         2.0
In [37]:
          wind wsw = allwind.query('Wind == "WSW"')
          wind ene = allwind.query('Wind == "ENE"')
In [82]: print(f'wsw = {round(100*len(wind wsw)/len(allwind),1)}*
                                                                               ene = {round(10)}
                          ene = 4.2%
          wsw = 3.2%
In [51]: def dftostrFF(df):
               print(df.reset index(drop=False).to string(index=False))
          def dftostrTT(df):
               print(df.reset index(drop=True).to string(index=True))
          def dftostrTF(df):
               print(df.reset index(drop=True).to string(index=False))
          def dftostrFT(df):
               print(df.reset index(drop=False).to string(index=True))
```

```
In [48]: | ordir={"North":0.0,
              "NNE":22.5,
              "NE": 45.0,
              "ENE":67.5,
              "East":90.0,
              "ESE":112.5,
              "SE":135.0,
              "SSE":157.5,
              "South":180,
              "SSW":202.5,
              "SW":225.0,
              "WSW":247.5,
              "West":270.0,
              "WNW":292.5,
              "NW":315.0,
              "NNW":337.5}
         revdir = [(value, key) for key, value in ordir.items()]
         print('mapping of 16 angular wind directions to 16 compass points:\n')
         print(pd.DataFrame(revdir,columns=['Azimuth','Compass']).to_string(index=Fa
         revord = dict(revdir)
```

mapping of 16 angular wind directions to 16 compass points:

```
Azimuth Compass
          North
    0.0
   22.5
            NNE
   45.0
             NE
   67.5
            ENE
   90.0
           East
  112.5
            ESE
  135.0
              SE
  157.5
             SSE
  180.0
          South
  202.5
             SSW
  225.0
              SW
  247.5
            WSW
  270.0
           West
  292.5
            WNW
  315.0
             NW
  337.5
            NNW
```

```
In [49]: def ordinalify(df,groupcol,grouporder):
    avgdir = df.groupby(groupcol)['Azimuth'].mean()[grouporder]
    avgint = avgdir.astype(int)
    clsdir = round(avgdir/22.5,0)*22.5
    dford = pd.concat([pd.concat([pd.DataFrame(avgint),pd.DataFrame(clsdir)
    dford.columns=['Azimuth','Closest','Compass']
    dford = dford.reset_index(drop=False)
    return dford
```

```
In [52]: print("average wind Azimuth by season and daypart:\n")
    dfs = allwind.groupby(['Season','Daypart'])['Azimuth'].mean().round(1)
    dfs = dfs.reset_index(drop=False)
    dfs['Season'] = pd.Categorical(dfs['Season'], ['Winter','Spring','Summer','
    dfs['Daypart'] = pd.Categorical(dfs['Daypart'], ['Overnight','Morning','Mid
    dftostrTF(dfs.sort_values(['Season','Daypart']))
```

average wind Azimuth by season and daypart:

```
Season
         Daypart Azimuth
Winter Overnight
                    171.5
Winter
         Morning
                    165.7
Winter
          Midday
                    175.7
Winter Afternoon
                    194.0
Winter
         Evening
                    175.4
Spring Overnight
                    133.5
Spring
         Morning
                    134.0
Spring
          Midday
                    158.1
Spring Afternoon
                    151.4
                    152.7
Spring
         Evening
Summer Overnight
                    157.5
Summer
         Morning
                    147.4
Summer
          Midday
                    180.9
Summer Afternoon
                    163.8
         Evening
                    146.7
Summer
  Fall Overnight
                    140.6
  Fall
         Morning
                    146.9
  Fall
          Midday
                    179.0
  Fall Afternoon
                    181.2
                    152.6
  Fall
         Evening
```

```
In [53]: print("average wind speed by season and daypart:\n")
         dfs = allwind.groupby(['Season','Daypart'])['Speed'].mean().round(1)
         dfs = dfs.reset_index(drop=False)
         dfs['Season'] = pd.Categorical(dfs['Season'], ['Winter', 'Spring', 'Summer', '
         dfs['Daypart'] = pd.Categorical(dfs['Daypart'], ['Overnight', 'Morning', 'Mid
         dftostrTF(dfs.sort values(['Season','Daypart']))
         average wind speed by season and daypart:
                  Daypart
         Season
                           Speed
         Winter Overnight
                              1.3
         Winter
                  Morning
                              1.3
         Winter
                   Midday
                              3.8
         Winter Afternoon
                              2.8
         Winter
                  Evening
                              1.5
         Spring Overnight
                              1.2
         Spring
                  Morning
                             1.6
         Spring
                   Midday
                              4.6
                              5.1
         Spring Afternoon
         Spring
                  Evening
                              3.0
         Summer Overnight
                              1.2
         Summer
                  Morning
                              1.7
         Summer
                   Midday
                              4.1
         Summer Afternoon
                              4.9
                              3.2
         Summer
                  Evening
           Fall Overnight
                              0.9
           Fall
                  Morning
                              1.2
           Fall
                   Midday
                              3.1
           Fall Afternoon
                              2.9
           Fall
                  Evening
                              1.5
In [16]: print("ascending avg wind speed by season and daypart:\n")
         dftostrTF(dfs.sort values('Speed'))
         ascending avg wind speed by season and daypart:
         Season
                  Daypart Speed
           Fall Overnight
                              0.9
         Spring Overnight
                              1.2
         Summer Overnight
                              1.2
           Fall
                  Morning
                             1.2
         Winter
                  Morning
                             1.3
         Winter Overnight
                              1.3
           Fall Evening
                              1.5
                             1.5
         Winter
                  Evening
         Spring
                  Morning
                             1.6
         Summer
                  Morning
                             1.7
         Winter Afternoon
                              2.8
           Fall Afternoon
                              2.9
         Spring
                  Evening
                              3.0
           Fall
                   Midday
                              3.1
         Summer Evening
                              3.2
         Winter
                  Middav
                              3.8
                   *** ----
```

```
In [17]: print("unweighted average wind azimuth direction by season:\n")
    orderszn = ['Winter','Spring','Summer','Fall']
    dftostrTF(ordinalify(allwind,'Season',orderszn))
    print("\n\nunweighted average wind azimuth direction by month:\n")
    ordermth=['Jan','Feb','Mar','Apr','May','Jun','Jul','Aug','Sep','Oct','Nov'
    dftostrTF(ordinalify(allwind,'Month',ordermth))
```

unweighted average wind azimuth direction by season:

Season	Azimuth	Closest	Compass
Winter	175	180.0	South
Spring	144	135.0	SE
Summer	159	157.5	SSE
Fall	157	157.5	SSE

unweighted average wind azimuth direction by month:

```
Month
       Azimuth Closest Compass
            164
                   157.5
  Jan
                              SSE
  Feb
            190
                   180.0
                            South
            167
                   157.5
                              SSE
  Mar
  Apr
            107
                   112.5
                              ESE
            158
                   157.5
  May
                              SSE
                   157.5
                              SSE
  Jun
            161
  Jul
            158
                   157.5
                              SSE
  Aug
            157
                   157.5
                              SSE
                   157.5
  Sep
            156
                              SSE
            155
                   157.5
                              SSE
  Oct
  Nov
            160
                   157.5
                              SSE
            173
                   180.0
  Dec
                            South
```

```
In [61]: def groupwavg(groupcol,grouporder):
    wgtdir = (nnwind['Speed']).multiply(nnwind['Azimuth'])
    dfwgt = pd.concat([nnwind,pd.DataFrame(wgtdir,columns=['Wgtdir'])],axis
    dfsum = dfwgt.groupby(groupcol).sum()
    wavgd = (dfsum.Wgtdir/dfsum.Speed)
    wintd = wavgd.astype(int)
    wclsd = round(wavgd/22.5,0)*22.5
    wcomp = wclsd.map(revord)
    dfwavg = pd.concat([pd.concat([wintd,wclsd],axis=1),wcomp],axis=1)
    dfwavg.columns = ['Azimuth','Closest','Compass']
    dfwavg = dfwavg.reset_index(drop=False)
    dfwavg[groupcol] = pd.Categorical(dfwavg[groupcol], grouporder)
    return dfwavg.sort_values(groupcol)
```

```
In [20]: nnwind = allwind[allwind['Azimuth'].notnull()]
```

```
In [25]: print("speed weighted average wind azimuth direction by Season:\n")
    dftostrTF(groupwavg('Season',['Winter','Spring','Summer','Fall']))
    print("\n\nspeed weighted average wind azimuth direction by Month:\n")
    dftostrTF(groupwavg('Month',ordermth))
```

speed weighted average wind azimuth direction by Season:

Season	Azimuth	Closest	Compass
Winter	185	180.0	South
Spring	165	157.5	SSE
Summer	161	157.5	SSE
Fall	169	180.0	South

speed weighted average wind azimuth direction by Month:

onth	Azimuth	Closest	Compass
Jan	174	180.0	South
Feb	204	202.5	SSW
Mar	185	180.0	South
Apr	132	135.0	SE
May	177	180.0	South
Jun	166	157.5	SSE
Jul	159	157.5	SSE
Aug	158	157.5	SSE
Sep	161	157.5	SSE
Oct	170	180.0	South
Nov	180	180.0	South
Dec	175	180.0	South

difference in monthly average azimuth without vs with wind speed as weigh ts:

```
Month Azimuth
  Jan
             32
             32
  Feb
             -8
  Mar
            -97
  Apr
  May
            -16
  Jun
              2
             -8
  Jul
            -28
  Aug
            -21
  Sep
  Oct
            -25
            -10
  Nov
             12
  Dec
```

difference in seasonal average azimuth without vs with wind speed as weig hts:

```
Season Azimuth
Winter 6
Spring -21
Summer -2
Fall -28
```

```
In [59]: list(ordir.keys())
```

```
Out[59]: ['North',
            'NNE',
            'NE',
            'ENE',
            'East',
            'ESE',
            'SE',
            'SSE',
            'South',
            'SSW',
            'SW',
            'WSW',
            'West',
            'WNW',
            'NW',
            'NNW']
```

```
In [80]: allwind.query("Azimuth.isnull()")
```

Out[80]:

	Date	Time	Season	Month	Daypart	Temp	Wind	Azimuth	Speed	Gust
2480	2020-10-12	2:44 PM	Fall	Oct	Afternoon	82.7	NaN	NaN	0.0	1.0
2481	2020-10-12	2:49 PM	Fall	Oct	Afternoon	82.8	NaN	NaN	0.0	1.0
2482	2020-10-12	2:54 PM	Fall	Oct	Afternoon	82.9	NaN	NaN	0.0	1.0
2483	2020-10-12	2:59 PM	Fall	Oct	Afternoon	83.1	NaN	NaN	0.0	1.9
2484	2020-10-12	3:04 PM	Fall	Oct	Afternoon	83.1	NaN	NaN	0.0	2.0
203848	2022-10-03	6:49 AM	Fall	Oct	Morning	53.4	NaN	NaN	1.1	3.0
203851	2022-10-03	7:04 AM	Fall	Oct	Morning	53.4	NaN	NaN	1.7	3.0
203855	2022-10-03	7:24 AM	Fall	Oct	Morning	53.4	NaN	NaN	1.2	4.0
203856	2022-10-03	7:29 AM	Fall	Oct	Morning	53.4	NaN	NaN	1.4	3.0
203861	2022-10-03	7:54 AM	Fall	Oct	Morning	54.4	NaN	NaN	1.2	3.0

7115 rows × 10 columns

```
In [79]:
         [print(x) for x in allwind.query("Azimuth.isnull()").Date.unique()]
         2020-10-12
         2020-11-06
         2020-11-08
         2020-11-09
         2020-11-17
         2020-11-25
         2020-11-26
         2020-11-27
         2020-12-07
         2020-12-08
         2020-12-17
         2020-12-20
         2020-12-21
         2020-12-22
         2020-12-23
         2020-12-26
         2020-12-28
         2020-12-31
         2021-01-05
In [81]: | allwind.groupby('Wind')['Speed'].mean().round(1).mean()
Out[81]: 2.1374999999999997
In [ ]:
```

```
In [64]: print("average wind speed by direction:\n")
         dfs = allwind.groupby('Wind')['Speed'].mean().round(1)
         dfs = dfs.reset_index(drop=False)
         dfs['Wind'] = pd.Categorical(dfs['Wind'], list(ordir.keys()))
         dftostrTF(dfs.sort_values('Wind'))
         print("ascending avg wind speed by direction:\n")
         dftostrTF(dfs.sort values('Speed'))
         average wind speed by direction:
          Wind Speed
         North
                   1.9
           NNE
                   1.5
            NE
                   1.2
            ENE
                   1.9
                   2.2
          East
                   3.0
            ESE
             SE
                   2.0
            SSE
                   1.5
         South
                   2.3
                   3.4
            SSW
             SW
                   2.8
                   2.0
           \mathtt{WSW}
                   1.4
          West
            WNW
                   2.4
            NW
                   2.6
                   2.1
           NNW
         ascending avg wind speed by season and daypart:
          Wind Speed
             NE
                   1.2
                   1.4
          West
                   1.5
           NNE
                   1.5
            SSE
            ENE
                   1.9
         North
                   1.9
                   2.0
             SE
                   2.0
           WSW
                   2.1
           NNW
                   2.2
          East
         South
                   2.3
           WNW
                   2.4
             NW
                   2.6
             SW
                   2.8
                   3.0
            ESE
            SSW
                   3.4
```