asnmt

February 20, 2022

1 Instructions

The assignment is at the bottom!

1.1 This cell automatically downloads Capital Bikeshare data

1.1.1 And here we read in the data

```
[224]: #
  [1]: import seaborn as sns
       import matplotlib.pyplot as plt
       %matplotlib inline
       plt.rcParams['figure.figsize'] = 20, 10
       import pandas as pd
       import numpy as np
       bikes = pd.read_csv('../data/bikeshare.csv.gz')
       bikes.head()
       bikes['start'] = pd.to_datetime(bikes['Start date'], infer_datetime_format=True)
       bikes['end'] = pd.to_datetime(bikes['End date'], infer_datetime_format=True)
       bikes["dur"] = (bikes['Duration (ms)']/1000).astype(int)
       bikes.head()
  [1]:
          Duration (ms)
                              Start date
                                                  End date Start station number
                                            4/1/2016 0:04
       0
                 301295
                         3/31/2016 23:59
                                                                           31280
       1
                 557887
                         3/31/2016 23:59
                                            4/1/2016 0:08
                                                                           31275
       2
                 555944
                         3/31/2016 23:59
                                            4/1/2016 0:08
                                                                           31101
       3
                 766916
                         3/31/2016 23:57
                                             4/1/2016 0:09
                                                                           31226
                 139656 3/31/2016 23:57
                                          3/31/2016 23:59
                                                                           31011
                           Start station End station number \
                          11th & S St NW
                                                        31506
       0
         New Hampshire Ave & 24th St NW
                                                        31114
       1
       2
                          14th & V St NW
                                                        31221
       3
              34th St & Wisconsin Ave NW
                                                        31214
       4
                       23rd & Crystal Dr
                                                        31009
```

start \

End station Bike number Member Type

```
1st & Rhode Island Ave NW
                                  W00022 Registered 2016-03-31 23:59:00
   18th St & Wyoming Ave NW
1
                                  W01294 Registered 2016-03-31 23:59:00
2
              18th & M St NW
                                  W01416
                                          Registered 2016-03-31 23:59:00
3
       17th & Corcoran St NW
                                          Registered 2016-03-31 23:57:00
                                  W01090
           27th & Crystal Dr
                                  W21934
                                          Registered 2016-03-31 23:57:00
                      dur
                  end
```

0 2016-04-01 00:04:00 301 1 2016-04-01 00:08:00 557 2 2016-04-01 00:08:00 555 3 2016-04-01 00:09:00 766 4 2016-03-31 23:59:00 139

[2]: bikes.dur.mean()

[2]: 992.8716543657755

[3]: bikes.dur.std()

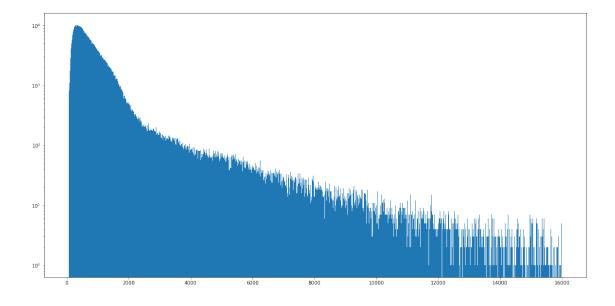
[3]: 2073.9809135296514

[4]: bikes[bikes.dur>16000].shape

[4]: (973, 12)

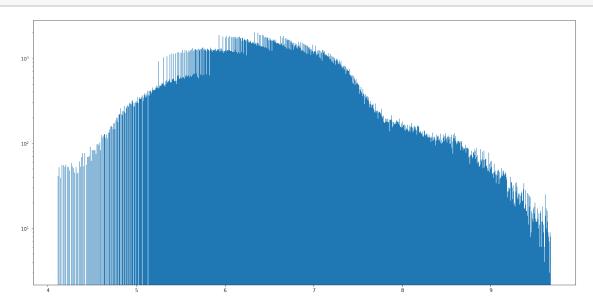
[7]: plt.rcParams['figure.figsize'] = 20, 10

[5]: _=plt.hist(bikes[bikes.dur<16000].dur, log=True, bins=1000)



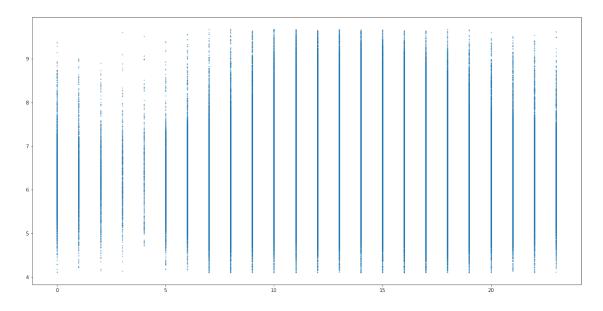
[6]: short = bikes[bikes.dur<16000]

[7]: _=plt.hist(np.log1p(short.dur), log=True, bins=1000)



[8]: plt.scatter(short.start.dt.hour, np.log1p(short.dur), s=.4)

[8]: <matplotlib.collections.PathCollection at 0x7fe598520610>



[9]: np.log1p(0), np.log(0)

```
: RuntimeWarning: divide by zero encountered in log
       np.log1p(0), np.log(0)
 [9]: (0.0, -inf)
[10]: bikes['log_dur'] = np.round(np.log1p(bikes.dur), 1)
[11]: monday = bikes[bikes.start.dt.dayofweek==1]
[12]: dur_hour = monday.groupby(['log_dur', monday.start.dt.hour]).count()
[13]: dur_hour
[13]:
                      Duration (ms)
                                      Start date End date Start station number \
      log_dur start
      4.1
               7
                                   1
                                                1
                                                           1
                                                                                   1
                                   2
                                                2
                                                           2
                                                                                   2
               9
               11
                                                1
                                                           1
                                   1
                                                                                   1
               14
                                   2
                                                2
                                                           2
                                                                                   2
               16
                                   2
                                                2
                                                           2
                                                                                   2
      11.2
               21
                                   2
                                                2
                                                           2
                                                                                   2
      11.3
                                   1
                                                           1
                                                                                   1
               14
                                                1
               17
                                   1
                                                1
                                                           1
                                                                                   1
               19
                                                1
                                                           1
                                                                                   1
                                   1
      11.4
               18
                                   1
                                                                                   1
                      Start station End station number End station Bike number
      log_dur start
      4.1
               7
                                   1
                                                         1
                                                                                     1
                                                                       1
               9
                                   2
                                                         2
                                                                       2
                                                                                     2
               11
                                   1
                                                         1
                                                                       1
                                                                                     1
                                   2
                                                                       2
               14
                                                         2
               16
                                   2
                                                         2
                                                                       2
                                                                                     2
      11.2
                                   2
                                                         2
                                                                       2
                                                                                     2
               21
               14
      11.3
                                   1
                                                         1
                                                                       1
                                                                                     1
               17
                                   1
                                                         1
                                                                       1
                                                                                     1
               19
                                   1
                                                         1
                                                                       1
                                                                                     1
      11.4
               18
                                   1
                                                         1
                                                                       1
                      Member Type start
                                            end
      log_dur start
      4.1
               7
                                 1
                                         1
                                              1
                                                    1
               9
                                 2
                                         2
                                              2
                                                    2
               11
                                 1
                                         1
                                              1
                                                    1
```

/var/folders/xs/2nmb23_93dzdp7pp9j4yl1yr0000gn/T/ipykernel_57323/1076539907.py:1

	14		2	2	2	2
	16		2	2	2	2
•••		•••		•••		
11.2	21		2	2	2	2
11.3	14		1	1	1	1
	17		1	1	1	1
	19		1	1	1	1
11.4	18		1	1	1	1

[1184 rows x 12 columns]

```
[14]: duration_hour = dur_hour.start.unstack().T.fillna(0)
duration_hour
```

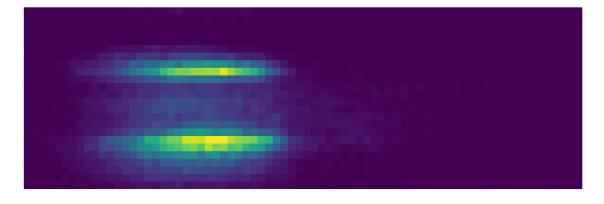
[14]:	U _	4.1	4.2	4.3	4.4	4.5	4.6	4.7	4.8	4.9	5.0		\
	start											•••	
	0	0.0	0.0	0.0	0.0	0.0	1.0	1.0	1.0	2.0	3.0	•••	
	1	0.0	0.0	1.0	1.0	0.0	0.0	0.0	0.0	3.0	1.0	•••	
	2	0.0	0.0	0.0	0.0	0.0	0.0	0.0	2.0	0.0	0.0	•••	
	3	0.0	0.0	0.0	0.0	0.0	0.0	0.0	1.0	0.0	0.0	•••	
	4	0.0	0.0	0.0	0.0	0.0	0.0	1.0	0.0	0.0	1.0	•••	
	5	0.0	0.0	1.0	0.0	0.0	1.0	4.0	1.0	7.0	6.0	•••	
	6	0.0	0.0	0.0	2.0	1.0	2.0	4.0	9.0	11.0	21.0	•••	
	7	1.0	5.0	4.0	1.0	5.0	12.0	25.0	31.0	46.0	46.0	•••	
	8	0.0	3.0	2.0	6.0	7.0	11.0	22.0	52.0	68.0	79.0	•••	
	9	2.0	3.0	2.0	4.0	3.0	11.0	18.0	22.0	28.0	42.0	•••	
	10	0.0	0.0	1.0	3.0	5.0	7.0	8.0	5.0	10.0	31.0	•••	
	11	1.0	0.0	2.0	5.0	4.0	7.0	7.0	10.0	13.0	22.0	•••	
	12	0.0	0.0	4.0	2.0	7.0	6.0	12.0	16.0	36.0	30.0	•••	
	13	0.0	2.0	6.0	3.0	5.0	6.0	4.0	15.0	20.0	36.0	•••	
	14	2.0	0.0	1.0	1.0	3.0	8.0	9.0	11.0	26.0	24.0		
	15	0.0	3.0	0.0	5.0	1.0	7.0	6.0	22.0	26.0	31.0		
	16	2.0	6.0	1.0	11.0	6.0	10.0	14.0	17.0	36.0	35.0		
	17	3.0	7.0	7.0	13.0	12.0	14.0	20.0	36.0	57.0	71.0		
	18	0.0	4.0	7.0	9.0	13.0	20.0	21.0	40.0	79.0	75.0		
	19	3.0	0.0	7.0	7.0	9.0	16.0	19.0	34.0	43.0	52.0		
	20	0.0	7.0	2.0	4.0	2.0	13.0	14.0	19.0	34.0	38.0		
	21	1.0	2.0	1.0	2.0	3.0	6.0	16.0	19.0	26.0	35.0		
	22	1.0	0.0	2.0	2.0	1.0	8.0	1.0	13.0	10.0	20.0		
	23	0.0	0.0	1.0	0.0	2.0	5.0	4.0	8.0	3.0	5.0		
	log_dur	10.5	10.6	10.7	10.8	10.9	11.0	11.1	11.2	11.3	11.4		
	start												
	0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0		
	1	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0		
	2	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0		
	3	0.0	0.0	0.0	1.0	0.0	0.0	0.0	0.0	0.0	0.0		

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4
           0.0
                  0.0
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5
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6
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                               1.0
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7
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8
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9
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13
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14
           0.0
                  0.0
                                      0.0
                                             0.0
                                                                 1.0
                                                                        0.0
                         0.0
                               0.0
                                                    1.0
                                                           0.0
15
           0.0
                  0.0
                         0.0
                               0.0
                                      0.0
                                             0.0
                                                    0.0
                                                           0.0
                                                                 0.0
                                                                        0.0
16
           0.0
                  0.0
                         0.0
                               0.0
                                      2.0
                                             0.0
                                                    0.0
                                                           0.0
                                                                 0.0
                                                                        0.0
17
           0.0
                  0.0
                         0.0
                                             1.0
                                                                        0.0
                               3.0
                                      1.0
                                                    1.0
                                                           0.0
                                                                 1.0
18
           0.0
                  0.0
                         2.0
                               4.0
                                      1.0
                                             0.0
                                                    1.0
                                                           1.0
                                                                 0.0
                                                                        1.0
           0.0
                  1.0
                                             1.0
                                                                 1.0
                                                                        0.0
19
                         2.0
                               3.0
                                      0.0
                                                    0.0
                                                           0.0
20
           0.0
                  1.0
                         1.0
                                      1.0
                                             1.0
                                                    0.0
                                                           0.0
                                                                 0.0
                                                                        0.0
                               1.0
21
           1.0
                  2.0
                         0.0
                               1.0
                                      0.0
                                             0.0
                                                    1.0
                                                           2.0
                                                                 0.0
                                                                        0.0
                                             0.0
22
           1.0
                         1.0
                               0.0
                                      0.0
                                                    0.0
                                                           0.0
                                                                 0.0
                                                                        0.0
                  0.0
23
                                             0.0
                                                                        0.0
           0.0
                  0.0
                         1.0
                               1.0
                                      0.0
                                                    0.0
                                                           0.0
                                                                 0.0
```

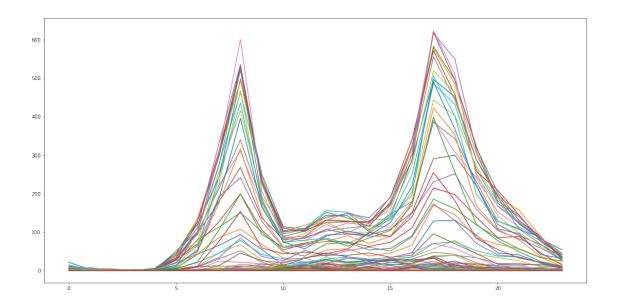
[24 rows x 74 columns]

```
[15]: plt.figure(figsize=(100,100))
plt.imshow(duration_hour)
```

[15]: <matplotlib.image.AxesImage at 0x7fe59857aaf0>



```
[16]: _=plt.plot(duration_hour)
```



```
[20]: bikes['Member Type'].value_counts()
```

[20]: Registered 467432 Casual 84967

Name: Member Type, dtype: int64

1.1.2 Create a new column that represents the hour+minute of the day as a fraction (i.e. 1:30pm = 13.5)

```
[21]: np.round(.65, 1)
```

[21]: 0.6

[22]: (6, 0.6, 0.61666666666667)

[26]:	Duration (ms)	Start date	End date	e Start station number	\
0	301295	3/31/2016 23:59	4/1/2016 0:04	4 31280	
1	557887	3/31/2016 23:59	4/1/2016 0:08	8 31275	
2	555944	3/31/2016 23:59	4/1/2016 0:08	8 31101	
3	766916	3/31/2016 23:57	4/1/2016 0:09	9 31226	

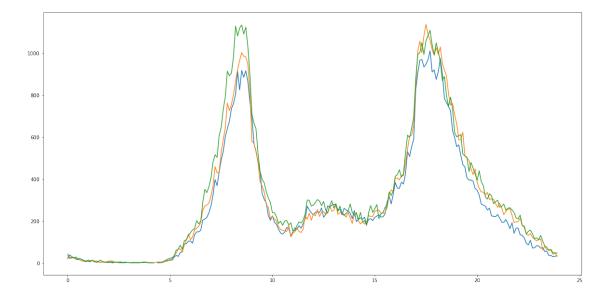
```
4
           139656
                   3/31/2016 23:57 3/31/2016 23:59
                                                                       31011
5
           967713
                   3/31/2016 23:57
                                       4/1/2016 0:13
                                                                       31266
6
           534836
                   3/31/2016 23:57
                                       4/1/2016 0:06
                                                                       31222
7
           243864
                   3/31/2016 23:56
                                       4/1/2016 0:00
                                                                       31228
8
           372524
                   3/31/2016 23:55
                                       4/1/2016 0:01
                                                                       31113
9
           215194
                   3/31/2016 23:55
                                    3/31/2016 23:59
                                                                       31263
10
                   3/31/2016 23:55
                                       4/1/2016 0:03
           498903
                                                                       31243
11
           389082
                   3/31/2016 23:54
                                       4/1/2016 0:01
                                                                       31079
                   3/31/2016 23:54
12
          1680745
                                       4/1/2016 0:22
                                                                       31258
13
                   3/31/2016 23:54
                                       4/1/2016 0:23
          1687026
                                                                       31258
                   3/31/2016 23:53
14
           544541
                                       4/1/2016 0:02
                                                                       31245
15
          1001144 3/31/2016 23:51
                                       4/1/2016 0:08
                                                                       31106
16
          1262663
                   3/31/2016 23:51
                                       4/1/2016 0:12
                                                                       31111
17
           451821
                   3/31/2016 23:51
                                     3/31/2016 23:59
                                                                       31613
                   3/31/2016 23:50
           305172
                                     3/31/2016 23:55
18
                                                                       31269
19
          5230964 3/31/2016 23:50
                                       4/1/2016 1:17
                                                                       31248
                                         Start station
                                                         End station number
0
                                         11th & S St NW
                                                                       31506
1
                        New Hampshire Ave & 24th St NW
                                                                       31114
2
                                         14th & V St NW
                                                                       31221
3
                            34th St & Wisconsin Ave NW
                                                                       31214
4
                                     23rd & Crystal Dr
                                                                       31009
5
                                         11th & M St NW
                                                                       31600
6
                             New York Ave & 15th St NW
                                                                       31278
7
                                         8th & H St NW
                                                                       31600
                           Columbia Rd & Belmont St NW
8
                                                                       31234
9
                                         10th & K St NW
                                                                       31265
10
                        Maryland & Independence Ave SW
                                                                       31209
                              Lee Hwy & N Cleveland St
11
                                                                       31093
12
                                      Lincoln Memorial
                                                                       31269
                                      Lincoln Memorial
13
                                                                       31269
14
                          7th & R St NW / Shaw Library
                                                                       31505
15
                              Calvert & Biltmore St NW
                                                                       31226
16
                                         10th & U St NW
                                                                       31226
17
    Eastern Market Metro / Pennsylvania Ave & 7th ...
                                                                     31617
18
                          3rd St & Pennsylvania Ave SE
                                                                       31639
19
              Smithsonian / Jefferson Dr & 12th St SW
                                                                       31248
                                 End station Bike number Member Type
0
                  1st & Rhode Island Ave NW
                                                           Registered
                                                   W00022
1
                   18th St & Wyoming Ave NW
                                                   W01294
                                                           Registered
2
                              18th & M St NW
                                                           Registered
                                                   W01416
3
                       17th & Corcoran St NW
                                                   W01090
                                                           Registered
4
                           27th & Crystal Dr
                                                   W21934
                                                           Registered
5
                               5th & K St NW
                                                   W20562
                                                                Casual
6
                                                          Registered
                              18th & R St NW
                                                   W20222
```

```
7
                               5th & K St NW
                                                   W20291
                                                           Registered
8
              20th & O St NW / Dupont South
                                                   W20590
                                                           Registered
9
              5th St & Massachusetts Ave NW
                                                   W21876
                                                            Registered
10
                              1st & N St SE
                                                   W20973
                                                            Registered
                     21st St N & N Pierce St
                                                            Registered
11
                                                   W01197
12
               3rd St & Pennsylvania Ave SE
                                                   W01191
                                                                Casual
13
               3rd St & Pennsylvania Ave SE
                                                   W20449
                                                                Casual
14
                      Eckington Pl & Q St NE
                                                   W20888
                                                           Registered
                  34th St & Wisconsin Ave NW
15
                                                   W22196
                                                                Casual
16
                  34th St & Wisconsin Ave NW
                                                                Casual
                                                   W21553
17
             Bladensburg Rd & Benning Rd NE
                                                   W20614
                                                           Registered
18
                               2nd & G St NE
                                                   W22068
                                                           Registered
19
    Smithsonian / Jefferson Dr & 12th St SW
                                                   W01458
                                                                Casual
                                                    log_dur
                                                             hour_of_day
                  start
                                               dur
                                         end
                                                         5.7
0
   2016-03-31 23:59:00 2016-04-01 00:04:00
                                               301
                                                                     23.9
                                                         6.3
                                                                     23.9
   2016-03-31 23:59:00 2016-04-01 00:08:00
                                               557
   2016-03-31 23:59:00 2016-04-01 00:08:00
                                               555
                                                        6.3
                                                                     23.9
3 2016-03-31 23:57:00 2016-04-01 00:09:00
                                               766
                                                        6.6
                                                                     23.9
4 2016-03-31 23:57:00 2016-03-31 23:59:00
                                               139
                                                        4.9
                                                                     23.9
5 2016-03-31 23:57:00 2016-04-01 00:13:00
                                               967
                                                        6.9
                                                                     23.9
6 2016-03-31 23:57:00 2016-04-01 00:06:00
                                               534
                                                        6.3
                                                                     23.9
7 2016-03-31 23:56:00 2016-04-01 00:00:00
                                               243
                                                                     23.9
                                                        5.5
8 2016-03-31 23:55:00 2016-04-01 00:01:00
                                               372
                                                        5.9
                                                                     23.9
   2016-03-31 23:55:00 2016-03-31 23:59:00
                                               215
                                                        5.4
                                                                     23.9
10 2016-03-31 23:55:00 2016-04-01 00:03:00
                                               498
                                                        6.2
                                                                     23.9
11 2016-03-31 23:54:00 2016-04-01 00:01:00
                                               389
                                                        6.0
                                                                     23.9
12 2016-03-31 23:54:00 2016-04-01 00:22:00
                                              1680
                                                        7.4
                                                                     23.9
13 2016-03-31 23:54:00 2016-04-01 00:23:00
                                              1687
                                                        7.4
                                                                     23.9
14 2016-03-31 23:53:00 2016-04-01 00:02:00
                                               544
                                                        6.3
                                                                     23.8
15 2016-03-31 23:51:00 2016-04-01 00:08:00
                                              1001
                                                        6.9
                                                                     23.8
16 2016-03-31 23:51:00 2016-04-01 00:12:00
                                              1262
                                                        7.1
                                                                     23.8
17 2016-03-31 23:51:00 2016-03-31 23:59:00
                                               451
                                                        6.1
                                                                     23.8
18 2016-03-31 23:50:00 2016-03-31 23:55:00
                                               305
                                                        5.7
                                                                     23.8
19 2016-03-31 23:50:00 2016-04-01 01:17:00
                                              5230
                                                                     23.8
                                                        8.6
    roundhour_of_day
0
                   23
1
                   23
2
                   23
3
                   23
4
                   23
5
                   23
6
                   23
7
                   23
8
                   23
9
                   23
```

```
23
10
                     23
11
12
                     23
                     23
13
14
                     23
15
                     23
16
                     23
17
                     23
                     23
18
19
                     23
```

1.1.3 Aggregate to get a count per hour/minute of the day across all trips

[37]: [<matplotlib.lines.Line2D at 0x7fe597c90160>]

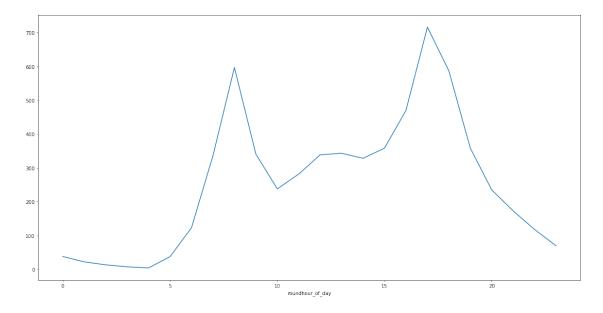


```
[27]: day_hour_count
[27]: start
                      0
                            1
                                  2
                                         3
                                                 4
                                                        5
                                                               6
      hour_of_day
      0.0
                   21.0
                         34.0
                              43.0
                                      47.0
                                             51.0
                                                     89.0
                                                           106.0
                   39.0
      0.1
                         22.0
                              27.0
                                      37.0
                                             56.0
                                                     87.0
                                                           100.0
      0.2
                   31.0
                         24.0 26.0
                                      42.0
                                             50.0
                                                     98.0
                                                            77.0
      0.3
                   26.0
                         27.0 25.0
                                      29.0
                                             52.0
                                                     99.0
                                                            87.0
      0.4
                        24.0 29.0
                                                     98.0
                                                            69.0
                   19.0
                                      29.0
                                             50.0
                               60.0
      23.5
                   36.0
                         65.0
                                      94.0
                                             80.0
                                                            28.0
                                                     93.0
      23.6
                   37.0
                        61.0
                              66.0
                                     100.0
                                             81.0
                                                     95.0
                                                            28.0
      23.7
                   30.0
                        42.0
                              49.0
                                      80.0
                                            101.0
                                                   105.0
                                                            27.0
      23.8
                         52.0
                   33.0
                              47.0
                                      79.0
                                             91.0
                                                     93.0
                                                            24.0
      23.9
                   34.0 33.0 48.0
                                      65.0 105.0 111.0
                                                            23.0
```

[240 rows x 7 columns]

```
[38]: hoursn = bikes.groupby('roundhour_of_day').agg('count')
hoursn['hour'] = hoursn.index
(hoursn.start/90).plot() # 90 days in a quarter
```

[38]: <AxesSubplot:xlabel='roundhour_of_day'>

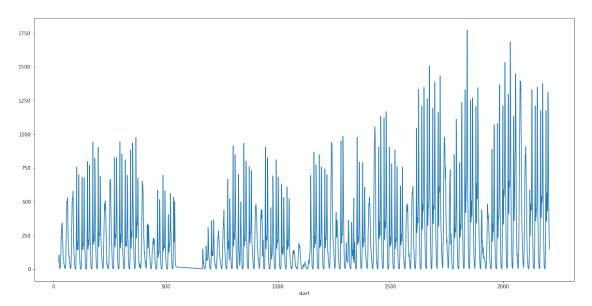


```
[29]: hour_count = bikes.groupby(bikes.start.dt.dayofyear*24 + bikes.start.dt.hour).

→count()
```

```
[30]: plt.figure(figsize=(20,10))
hour_count.start.plot()
```

[30]: <AxesSubplot:xlabel='start'>



[31]: day_count = bikes.groupby(bikes.start.dt.dayofyear).count()

[32]: day_hour = bikes.groupby([bikes.start.dt.dayofyear, bikes.start.dt.hour]).

→count()

[33]: day_hour.start.unstack()

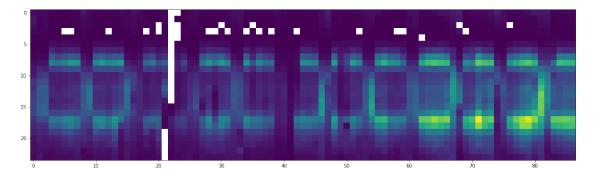
[33]:	start	0	1	2	3	4	5	6	7	8	9	\
	start											•••
	1	56.0	105.0	74.0	32.0	13.0	5.0	10.0	14.0	54.0	101.0	•••
	2	37.0	31.0	17.0	23.0	4.0	7.0	10.0	34.0	80.0	203.0	•••
	3	59.0	42.0	39.0	15.0	6.0	9.0	5.0	33.0	87.0	168.0	•••
	4	20.0	6.0	2.0	1.0	3.0	58.0	192.0	468.0	759.0	321.0	•••
	5	5.0	5.0	3.0	1.0	2.0	42.0	131.0	363.0	683.0	329.0	•••
	•••		•••		•••	•••	•••		•••			
	87	113.0	82.0	50.0	34.0	12.0	24.0	94.0	166.0	297.0	509.0	•••
	88	15.0	7.0	2.0	3.0	8.0	42.0	81.0	197.0	587.0	464.0	•••
	89	31.0	11.0	9.0	3.0	8.0	79.0	240.0	727.0	1211.0	564.0	•••
	90	31.0	18.0	4.0	6.0	7.0	79.0	215.0	703.0	1176.0	593.0	•••
	91	28.0	16.0	10.0	2.0	8.0	80.0	240.0	750.0	1175.0	589.0	•••
	start	14	15	16		17	18	19	20	21	22	23
	start											

```
324.0 338.0
                     342.0
                                     185.0
                                            160.0
                                                     90.0
                                                            75.0
                                                                   70.0
                                                                          39.0
1
                             247.0
2
       495.0 525.0
                     529.0
                             392.0
                                     232.0
                                            188.0 150.0
                                                           114.0
                                                                   91.0
                                                                          96.0
3
       524.0
             546.0
                     579.0
                                     237.0
                                            172.0
                                                    115.0
                                                            96.0
                                                                          28.0
                             398.0
                                                                   64.0
4
       145.0 206.0
                     365.0
                             700.0
                                     547.0
                                            293.0
                                                   146.0
                                                            96.0
                                                                   62.0
                                                                          44.0
       175.0 208.0
5
                     365.0
                             676.0
                                     519.0
                                            279.0 178.0
                                                           122.0
                                                                   86.0
                                                                          45.0
                     667.0
                                     475.0
                                                           101.0
                                                                   62.0
                                                                          51.0
87
       910.0 761.0
                             611.0
                                            243.0 158.0
       481.0 437.0
                     696.0
                            1332.0
                                    1113.0
                                            620.0
                                                    324.0
                                                           226.0
                                                                  148.0
                                                                          45.0
88
                                                           279.0
                                                                          82.0
89
       433.0 473.0
                     700.0
                            1350.0
                                    1159.0
                                            700.0 400.0
                                                                  178.0
90
       493.0 545.0
                     749.0
                            1376.0
                                    1215.0
                                            722.0
                                                    468.0
                                                           312.0
                                                                  231.0
                                                                         108.0
91
       431.0 504.0
                     746.0
                            1312.0
                                    1241.0 806.0 536.0
                                                           345.0
                                                                  240.0
                                                                         150.0
```

[87 rows x 24 columns]

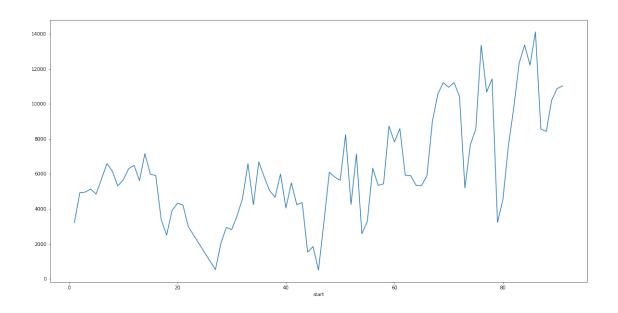
```
[34]: plt.figure(figsize=(20,10))
plt.imshow(day_hour.start.unstack().T)
```

[34]: <matplotlib.image.AxesImage at 0x13e55b430>



[35]: day_count.start.plot()

[35]: <AxesSubplot:xlabel='start'>



```
[36]: bikes.start.dt.dayofyear
[36]: 0
                91
                91
      1
      2
                91
      3
                91
                91
      552394
                 1
      552395
                  1
      552396
                  1
      552397
                  1
      552398
      Name: start, Length: 552399, dtype: int64
 []: bikes[bikes.start=="2016-01-10"].shape
```

2 Assignment 4

Explain the results in a paragraph + charts of to describe which model you'd recommend. This means show the data and the model's line on the same chart. The paragraph is a simple justification and comparison of the several models you tried.

3 1. Using the day_hour_count dataframe create two dataframes monday and saturday that represent the data for those days. (hint: Monday is day=0)

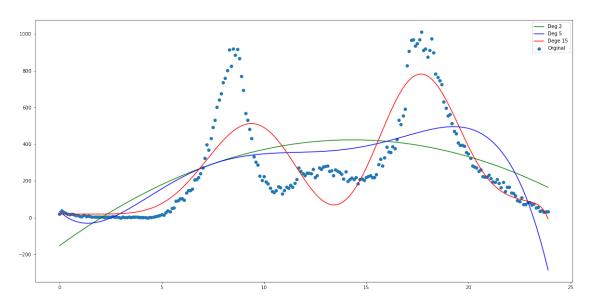
```
[116]: #Monday
monday = day_hour_count[[0]].copy()
monday["hour"] = monday.index

#Saturaday
saturday = day_hour_count[[5]].copy()
saturday["hour"] = saturday.index
[101]:
```

- 3.1 2a. Create 3 models fit to monday.hour_of_day with varying polynomial degrees (choose from n=1,2,3,5,10,15). (Repeat for saturday below)
- 3.2 Plot all the results for each polynomial.

```
[212]: from sklearn.preprocessing import PolynomialFeatures
       from sklearn.linear model import LinearRegression
       X = day hour count.index
       y = monday[0].fillna(0)
       ln model = LinearRegression()
       # Monday Degree 2
       X = np.array(day_hour_count.index)
       y = monday[0].fillna(0)
       poly_2 = PolynomialFeatures(degree=2)
       X_2 = poly_2.fit_transform(X.reshape(-1, 1))
       ln_model.fit(X_2, y)
       (linear_model.coef_, linear_model.intercept_)
       linear_coef_2, linear_intercept_2 = ln_model.coef_, ln_model.intercept_
       #Monday Degree 5
       poly_5 = PolynomialFeatures(degree=5)
       X_5 = poly_5.fit_transform(X.reshape(-1, 1))
       ln_model.fit(X_5, y)
       (linear_model.coef_, linear_model.intercept_)
       linear_coef_5, linear_intercept_5 = ln_model.coef_, ln_model.intercept_
```

[212]: <matplotlib.legend.Legend at 0x7fe57ec44e80>



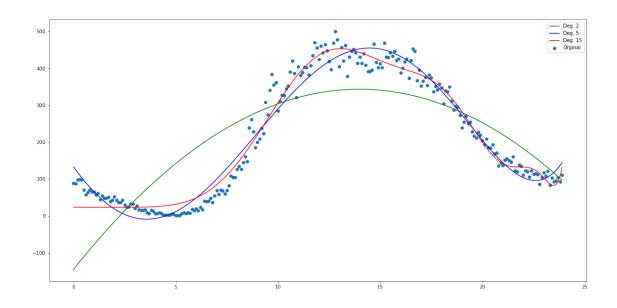
Saturday Ploynomial Degree 15 gives the fitting. It's the most recommended model althought might cause overfitting.

3.3 2b. Repeat 2a for saturday.hour_of_day

```
[208]: # Saturday Degree 2
from sklearn.preprocessing import PolynomialFeatures
from sklearn.linear_model import LinearRegression
```

```
linear_model = LinearRegression()
X = np.array(day_hour_count.index)
y = saturday[5].fillna(0)
poly_2 = PolynomialFeatures(degree=2)
X_2 = poly_2.fit_transform(X.reshape(-1, 1))
linear_model.fit(X_2, y)
linear_coef_2, linear_intercept_2 = linear_model.coef_, linear_model.intercept_
#Saturday Degree 5
poly_5 = PolynomialFeatures(degree=5)
X_5 = poly_5.fit_transform(X.reshape(-1, 1))
linear_model.fit(X_5, y)
linear_coef_5, linear_intercept_5 = linear_model.coef_, linear_model.intercept_
#Saturday Degree 15
poly_15 = PolynomialFeatures(degree=15)
X_15 = poly_15.fit_transform(X.reshape(-1, 1))
linear_model.fit(X_15, y)
linear_coef_15, linear_intercept_15 = linear_model.coef_, linear_model.
→intercept_
plt.scatter(X,y, label = 'Orginal')
plt.plot(X, np.dot(X_2, linear_coef_2) + linear_intercept_2, c='g', label =_
plt.plot(X, np.dot(X_5, linear_coef_5) + linear_intercept_5, c='b', label =
plt.plot(X, np.dot(X_15, linear_coef_15) + linear_intercept_15, c='r', label =__
→'Deg. 15')
#plt.legend(handles = ['Degree 2', 'Degree 5', 'Degree 15'])
plt.legend()
```

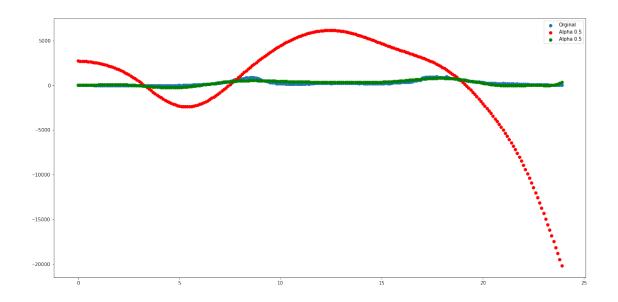
[208]: <matplotlib.legend.Legend at 0x7fe57c623580>



Saturday Ploynomial Degree 5 and Degree 15 give relatively better fitting. As we can see from the chart above, Degree 5 is the best model. however, both dgree 5 and 15, might cause overfitting.

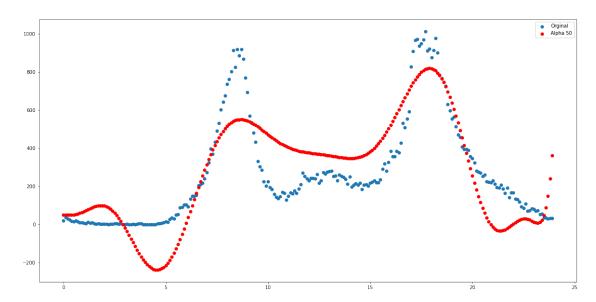
3.4 3. create 3 new models fit to hour_of_day with different Ridge Regression α (alpha) Ridge Coefficient values using the monday and saturday datasets.

[216]: <matplotlib.legend.Legend at 0x7fe57f7e87c0>



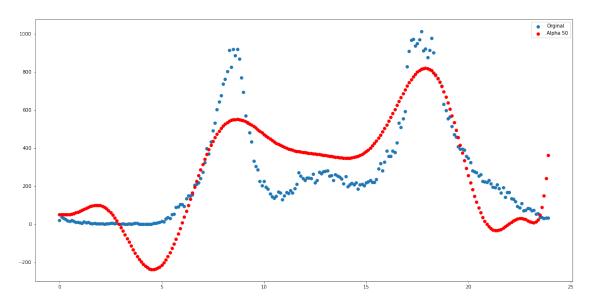
```
[218]: #Alpha = 50
    ridge_50 = linear_model.Ridge(alpha = 50)
    ridge_50 = ridge_50.fit(X_15, y)
    plt.scatter(X, y, label = 'Orginal')
    plt.scatter(X, ridge_50.predict(X_15), c='r', label = 'Alpha 50')
    plt.legend()
```

[218]: <matplotlib.legend.Legend at 0x7fe58011ffd0>



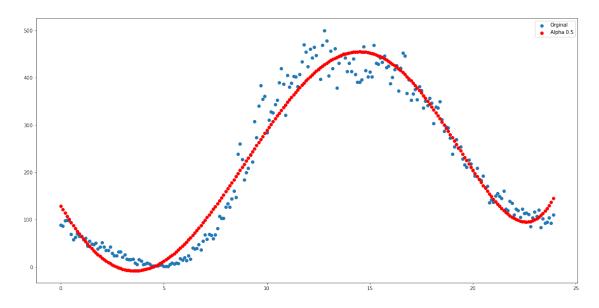
```
[219]: #Alpha = 1000
ridge_1000 = linear_model.Ridge(alpha = 50)
ridge_1000 = ridge_1000.fit(X_15, y)
plt.scatter(X, y, label = 'Orginal')
plt.scatter(X, ridge_1000.predict(X_15), c='r', label = 'Alpha 50')
plt.legend()
```

[219]: <matplotlib.legend.Legend at 0x7fe580443e20>



Monday Ridge Using Ploynomial degree 15, low alpha values tend to overshot. Higher alpha values (alpha $> \sim 50$) give much better fitting as we can see in the charts above.

[220]: <matplotlib.legend.Legend at 0x7fe580758c10>

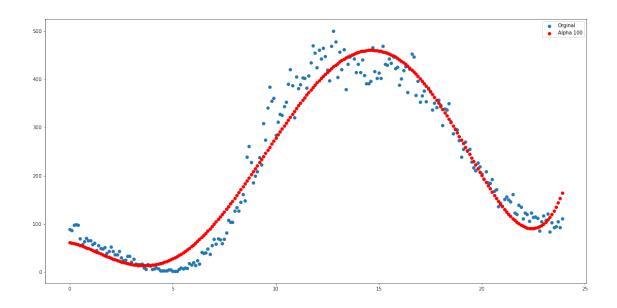


```
[222]: #Alpha = 100
X = np.array(day_hour_count.index)
y = saturday[5].fillna(0)
poly_5 = PolynomialFeatures(degree=5)
X_5 = poly_5.fit_transform(X.reshape(-1, 1))

ridge = linear_model.Ridge(alpha = 100)
ridge_5 = ridge.fit(X_5, y)
plt.scatter(X, y, label = 'Orginal')
plt.scatter(X, ridge_5.predict(X_5), c='r', label = 'Alpha 100')

plt.legend()
```

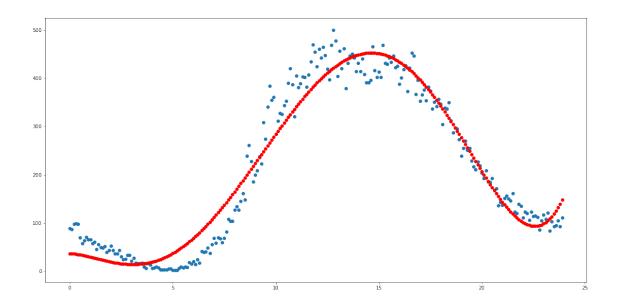
[222]: <matplotlib.legend.Legend at 0x7fe580addd60>



```
[223]: #Alpha = 100
X = np.array(day_hour_count.index)
y = saturday[5].fillna(0)
poly_5 = PolynomialFeatures(degree=5)
X_5 = poly_5.fit_transform(X.reshape(-1, 1))

ridge = linear_model.Ridge(alpha = 1000)
ridge_5 = ridge.fit(X_5, y)
plt.scatter(X, y, label = 'Orginal')
plt.scatter(X, ridge_5.predict(X_5), c='r', label = 'Alpha 1000')
```

[223]: <matplotlib.collections.PathCollection at 0x7fe580deeaf0>



Monday Ridge Using Ploynomial degree 5, changing alpha values hasn't changed our model's prediction significantly.

[]: