```
In [1]: pip install geopandas
        Collecting geopandas
          Downloading https://files.pythonhosted.org/packages/f7/a4/e66aafbefcb
        b717813bf3a355c8c4fc3ed04ea1dd7feb2920f2f4f868921/geopandas-0.8.1-py2.p
        y3-none-any.whl (962kB)
                                                972kB 2.8MB/s
        Collecting fiona
          Downloading https://files.pythonhosted.org/packages/ec/20/4e63bc5c6e6
        2df889297b382c3ccd4a7a488b00946aaaf81a118158c6f09/Fiona-1.8.13.post1-cp
        36-cp36m-manylinux1 x86 64.whl (14.7MB)
                                               || 14.7MB 313kB/s
        Requirement already satisfied: pandas>=0.23.0 in /usr/local/lib/python
        3.6/dist-packages (from geopandas) (1.0.5)
        Requirement already satisfied: shapely in /usr/local/lib/python3.6/dist
        -packages (from geopandas) (1.7.0)
        Collecting pyproj>=2.2.0
          Downloading https://files.pythonhosted.org/packages/e5/c3/071e080230a
        c4b6c64f1a2e2f9161c9737a2bc7b683d2c90b024825000c0/pyproj-2.6.1.post1-cp
        36-cp36m-manylinux2010 x86 64.whl (10.9MB)
                                               | 10.9MB 47.8MB/s
        Collecting munch
          Downloading https://files.pythonhosted.org/packages/cc/ab/85d8da5c9a4
        5e072301beb37ad7f833cd344e04c817d97e0cc75681d248f/munch-2.5.0-py2.py3-n
        one-anv.whl
        Requirement already satisfied: attrs>=17 in /usr/local/lib/python3.6/di
        st-packages (from fiona->geopandas) (19.3.0)
        Requirement already satisfied: six>=1.7 in /usr/local/lib/python3.6/dis
        t-packages (from fiona->geopandas) (1.12.0)
        Collecting cligi>=0.5
          Downloading https://files.pythonhosted.org/packages/e4/be/30a58b4b073
        3850280d01f8bd132591b4668ed5c7046761098d665ac2174/cliqj-0.5.0-py3-none-
        any.whl
        Collecting click-plugins>=1.0
          Downloading https://files.pythonhosted.org/packages/e9/da/824b92d9942
        f4e472702488857914bdd50f73021efea15b4cad9aca8ecef/click plugins-1.1.1-p
```

```
v2.pv3-none-anv.whl
        Requirement already satisfied: click<8,>=4.0 in /usr/local/lib/python3.
        6/dist-packages (from fiona->geopandas) (7.1.2)
        Reguirement already satisfied: python-dateutil>=2.6.1 in /usr/local/li
        b/python3.6/dist-packages (from pandas>=0.23.0->geopandas) (2.8.1)
        Requirement already satisfied: numpy>=1.13.3 in /usr/local/lib/python3.
        6/dist-packages (from pandas>=0.23.0->geopandas) (1.18.5)
        Requirement already satisfied: pytz>=2017.2 in /usr/local/lib/python3.
        6/dist-packages (from pandas>=0.23.0->geopandas) (2018.9)
        Installing collected packages: munch, cliqj, click-plugins, fiona, pypr
        oj, geopandas
        Successfully installed click-plugins-1.1.1 cligj-0.5.0 fiona-1.8.13.pos
        tl geopandas-0.8.1 munch-2.5.0 pyproj-2.6.1.postl
In [2]: import pandas as pd
         import geopandas as gpd
         from shapely.geometry import Point,Polygon
         %matplotlib inline
         import matplotlib.pyplot as plt
In [3]: bglr=gpd.read file('/content/MODIFIED BANGALORE WARDS.csv')
         bglr.head()
Out[3]:
                    type features_type features_properties_WARD_NO features_properties_WARD_
         0 FeatureCollection
                                                             2
                               Feature
                                                                             Chowdeswar
         1 FeatureCollection
                               Feature
                                                             2
                                                                             Chowdeswar
         2 FeatureCollection
                               Feature
                                                                             Chowdeswar
                                                             2
         3 FeatureCollection
                               Feature
                                                                             Chowdeswar
         4 FeatureCollection
                               Feature
                                                             2
                                                                             Chowdeswar
        ##balr.plot()
In [4]:
In [5]:
        print(bglr.info())
```

```
<class 'geopandas.geodataframe.GeoDataFrame'>
RangeIndex: 35126 entries, 0 to 35125
Data columns (total 10 columns):
```

#	Column	Non-Null Count	Dtype
0	type	35126 non-null	object
1	featurestype	35126 non-null	object
2	<pre>featurespropertiesWARD_NO</pre>	35126 non-null	object
3	<pre>featurespropertiesWARD_NAME</pre>	35126 non-null	object
4	<pre>featurespropertiesMOVEMENT_ID</pre>	35126 non-null	object
5	<pre>featurespropertiesDISPLAY_NAME</pre>	35126 non-null	object
6	<pre>featuresgeometrytype</pre>	35125 non-null	object
7	<pre>featuresgeometrycoordinates001</pre>	35125 non-null	object
8	<pre>featuresgeometrycoordinates002</pre>	35125 non-null	object
9	geometry	0 non-null	geometry

dtypes: geometry(1), object(9)

memory usage: 2.7+ MB

None

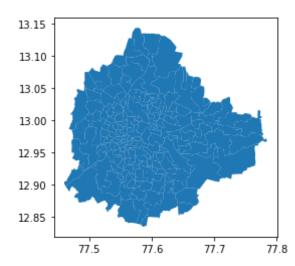
Out[6]:

	WARD_NO	WARD_NAME	MOVEMENT_ID	DISPLAY_NAME	geometry
0	2	Chowdeswari Ward	1	Unnamed Road, Bengaluru	MULTIPOLYGON (((77.59229 13.09720, 77.59094 13
1	3	Atturu	2	9th Cross Bhel Layout, Adityanagar, Vidyaranya	MULTIPOLYGON (((77.56862 13.12705, 77.57064 13
2	4	Yelahanka Satellite Town	3	15th A Cross Road, Yelahanka Satellite Town, Y	MULTIPOLYGON (((77.59094 13.09842, 77.59229 13
3	51	Vijnanapura	4	SP Naidu Layout 4th Cross Street, SP Naidu Lay	MULTIPOLYGON (((77.67683 13.01147, 77.67695 13

	WARD_NO	WARD_NAME	MOVEMENT_ID	DISPLAY_NAME	geometry
4	53	Basavanapura	5	Medahalli Kadugodi Road, Bharathi Nagar, Krish	MULTIPOLYGON (((77.72899 13.02061, 77.72994 13

In [7]: bglr2.plot()

Out[7]: <matplotlib.axes._subplots.AxesSubplot at 0x7fb20b8270f0>



In [8]: print(bglr2.info())

```
<class 'geopandas.geodataframe.GeoDataFrame'>
RangeIndex: 198 entries, 0 to 197
Data columns (total 5 columns):
### Columns (Non North Data Columns)
```

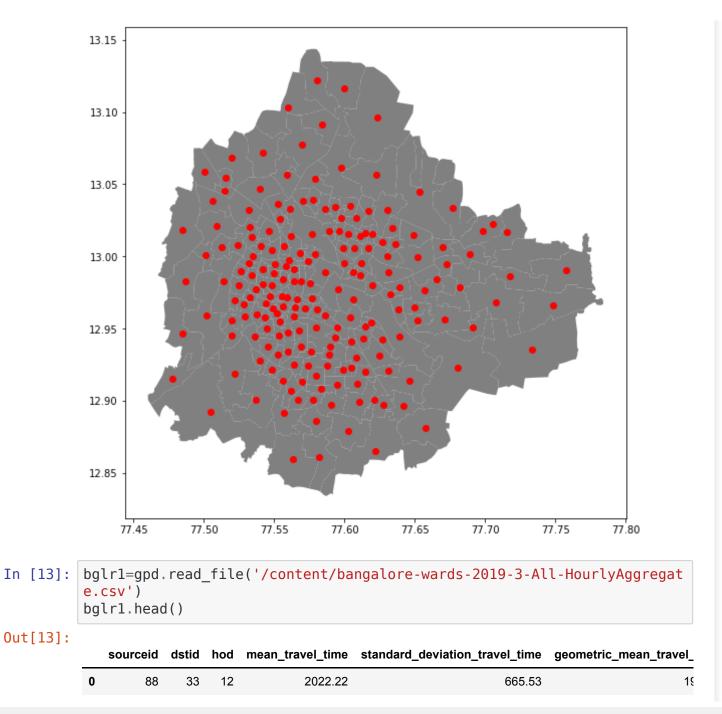
#	Column	Non-Null Count	Dtype
0	WARD_NO	198 non-null	object
1	WARD_NAME	198 non-null	object
2	MOVEMENT_ID	198 non-null	object
3	DISPLAY_NAME	198 non-null	object
4	geometry	198 non-null	geometry
dtvn	es: geometry(1). object(4)	

```
memory usage: 7.9+ KB
          None
 In [9]:
         print(bglr2.geometry)
                 MULTIPOLYGON (((77.59229 13.09720, 77.59094 13...
          0
          1
                 MULTIPOLYGON (((77.56862 13.12705, 77.57064 13...
          2
                 MULTIPOLYGON (((77.59094 13.09842, 77.59229 13...
          3
                 MULTIPOLYGON (((77.67683 13.01147, 77.67695 13...
                 MULTIPOLYGON (((77.72899 13.02061, 77.72994 13...
                 MULTIPOLYGON (((77.61399 12.92347, 77.61419 12...
          193
          194
                 MULTIPOLYGON (((77.68336 13.05192, 77.68384 13...
                 MULTIPOLYGON (((77.64931 13.07853, 77.64993 13...
          195
                 MULTIPOLYGON (((77.68549 12.94121, 77.68539 12...
          196
          197
                 MULTIPOLYGON (((77.49854 12.92574, 77.49854 12...
          Name: geometry, Length: 198, dtype: geometry
          bglr c=bglr2.copy()
In [10]:
         bglr c.geometry= bglr c['geometry'].centroid
In [11]:
          bglr c.head()
          /usr/local/lib/python3.6/dist-packages/ipykernel launcher.py:1: UserW
          arning: Geometry is in a geographic CRS. Results from 'centroid' are
          likely incorrect. Use 'GeoSeries.to crs()' to re-project geometries t
          o a projected CRS before this operation.
            """Entry point for launching an IPython kernel.
Out[11]:
             WARD_NO
                        WARD NAME MOVEMENT ID
                                                          DISPLAY NAME
                                                                             geometry
                         Chowdeswari
                                                                        POINT (77.58042
                    2
                                              1
                                                    Unnamed Road, Bengaluru
                              Ward
                                                                             13.12171)
                                                                        POINT (77.56004
                                                       9th Cross Bhel Layout,
          1
                    3
                              Atturu
                                              2
                                                    Adityanagar, Vidyaranya...
                                                                             13.10280)
                                                  15th A Cross Road, Yelahanka POINT (77.58393
                           Yelahanka
          2
                         Satellite Town
                                                          Satellite Town, Y...
                                                                             13.09099)
```

	WARD_NO	WARD_NAME	MOVEMENT_ID	DISPLAY_NAME	geometry
3	51	Vijnanapura	4	SP Naidu Layout 4th Cross Street, SP Naidu Lay	POINT (77.66957 13.00606)
4	53	Basavanapura	5	Medahalli Kadugodi Road, Bharathi Nagar, Krish	POINT (77.71546 13.01685)

```
In [12]: fig, ax = plt.subplots(figsize=(9,9))
bglr2.plot(color='grey',ax=ax)
bglr_c.plot(color='red',ax=ax)
```

Out[12]: <matplotlib.axes._subplots.AxesSubplot at 0x7fb20b44f9b0>



	so	ourceid	dstid	hod	mean_travel_time	standard_deviation_travel_time	geometric_mean_travel_		
	1	163	16	14	3159.21	680.03	309		
	2	160	46	14	3943.34	581.21	36		
	3	162	26	14	3193.64	615.47	314		
	4	84	73	12	801.05	324.42	76		
	4						>		
In [14]:	bglr	1.dtyp	oes						
Out[14]:	sourceid object dstid object hod object mean_travel_time object standard_deviation_travel_time object geometric_mean_travel_time object geometric_standard_deviation_travel_time object geometry geometry dtype: object								
In [36]:	e(fl prin	oat) t(bglı	_		-	l["mean_travel_time"].a	stype(str).astyp		
	stand geome geome geome	d _trave dard_c etric_ etric_	deviat _mean_ _stand	tion_ _tra\	_travel_time vel_time _deviation_tra	float64 float64 float64 float64 float64 object object vel_time geometry			
In [51]:	_	_			deviation_trav e(str).astype(el_time"] = bglr1["stan float)	dard_deviation_t		

```
import os, sys
         from scipy import stats
         import numpy as np
         ##bglr1['standard deviation travel time'] = bglr1['standard deviation t
         ravel time'l.astvpe(float)
         ##print(bglr1.dtypes)
         ##bglr1['standard deviation travel time'] = bglr1.standard deviation tr
         avel time.str.replace('$', '').astype(float)
         bglr1['geometric mean travel time'].replace("None", np.nan, inplace=Tru
In [55]:
         bglr1['standard deviation travel time'].replace("None", np.nan, inplace
         =True)
         bglr1['geometric standard deviation travel time'].replace("None", np.na
         n, inplace=True)
         ##bglr1['geometric mean travel time'].replace("None", np.nan, inplace=T
          rue)
         ##bqlr1["qeometric mean travel time"] = bqlr1["qeometric mean travel ti
         me"].astype(str).astype(float)
         ##print(bglr1.dtvpes)
In [56]: bglr1['geometric mean travel time'] = bglr1['geometric mean travel time']
         e'].replace(np.nan, 0)
         bglr1['standard deviation travel time'] = bglr1['standard deviation tra
         vel time'].replace(np.nan, 0)
         bglr1['geometric standard deviation travel time'] = bglr1['geometric st
         andard deviation travel time'].replace(np.nan, 0)
         bglr1
Out[56]:
                 sourceid dstid hod mean_travel_time standard_deviation_travel_time geometric_mean_
              0
                    88.0
                         33.0 12.0
                                          2022.22
                                                                   665.53
              1
                                          3159.21
                   163.0
                         16.0 14.0
                                                                   680.03
                   160.0
                         46.0 14.0
                                          3943.34
                                                                   581.21
              3
                   162.0
                         26.0 14.0
                                          3193.64
                                                                   615.47
                         73.0 12.0
                    84.0
                                           801.05
                                                                   324.42
```

```
sourceid dstid hod mean_travel_time standard_deviation_travel_time geometric_mean_
           398337
                     55.0
                          51.0 14.0
                                           1351.52
                                                                     388.79
           398338
                     59.0
                          11.0 14.0
                                           1334.32
                                                                     411.91
           398339
                     46.0 159.0 17.0
                                           4468.16
                                                                     822.11
           398340
                     58.0 175.0 16.0
                                           3637.46
                                                                      786.0
           398341
                     56.0 195.0 16.0
                                           2310.67
          398342 rows × 8 columns
 In [ ]:
In [57]:
          bglr1["geometric standard deviation travel time"] = bglr1["geometric st
          andard deviation travel time"].astype(str).astype(float)
          print(bqlr1.dtypes)
                                                           float64
          sourceid
          dstid
                                                           float64
          hod
                                                           float64
          mean travel time
                                                           float64
          standard deviation travel time
                                                            object
          geometric mean travel time
                                                            object
          geometric standard deviation travel time
                                                           float64
          geometry
                                                          geometry
          dtype: object
          ##bglr1["standard deviation travel time"] = bglr1["standard deviation t
In [60]:
          ravel time"].astype(str).astype(float)
          ##print(bglr1.dtypes)
          bglr1["geometric mean travel time"] = bglr1["geometric mean travel tim
In [59]:
          e"].astype(str).astype(float)
          print(bglr1.dtypes)
```

```
float64
          sourceid
          dstid
                                                        float64
                                                        float64
          hod
          mean travel time
                                                        float64
          standard deviation travel time
                                                         object
          geometric mean travel time
                                                        float64
          geometric standard deviation travel time
                                                        float64
                                                       geometry
          geometry
          dtype: object
In [62]: bglr1.dtypes
Out[62]: sourceid
                                                        float64
          dstid
                                                        float64
                                                        float64
          hod
                                                        float64
          mean travel time
          standard deviation travel time
                                                         object
          geometric mean travel time
                                                        float64
          geometric standard deviation travel time
                                                        float64
          geometry
                                                       geometry
          dtype: object
In [97]: ##bglr1["geometric standard deviation travel time"].plot()
In [98]: ##bglr1["mean travel time"].plot()
In [99]: ##bglr1["standard deviation travel time"].plot()
In [100]: ##bglr1["geometric mean travel time"].plot()
In [71]: bglr1['hod']=pd.cut(bglr1.hod,
                              bins=[0,4,8,12,16,24],
                              labels=['Latenight','Early morning','morning','afte
          rnoon','evening'])
          TypoError
                                                     Tracaback (mact recent call 1
```

```
rypermon
                                                       Traceback (most recent call t
          ast)
         <ipython-input-71-5552655b6b89> in <module>()
                1 bqlr1['hod']=pd.cut(bglr1.hod,
                2
                                       bins=[0,4,8,12,16,24],
                                       labels=['Latenight','Early morning','mornin
          ---> 3
         g','afternoon','evening'])
         /usr/local/lib/python3.6/dist-packages/pandas/core/reshape/tile.py in c
         ut(x, bins, right, labels, retbins, precision, include lowest, duplicat
          es)
                           include lowest=include lowest,
              263
                           dtype=dtype,
              264
                           duplicates=duplicates,
          --> 265
              266
              267
         /usr/local/lib/python3.6/dist-packages/pandas/core/reshape/tile.py in
         bins to cuts(x, bins, right, labels, precision, include lowest, dtype,
           duplicates)
              386
              387
                      side = "left" if right else "right"
          --> 388
                      ids = ensure int64(bins.searchsorted(x, side=side))
              389
              390
                      if include lowest:
         TypeError: '<' not supported between instances of 'int' and 'str'
In [69]:
         bglr1
Out[69]:
                 sourceid dstid
                                  hod mean_travel_time standard_deviation_travel_time geometric_m
               0
                     88.0
                          33.0
                               morning
                                              2022.22
                                                                       665.53
                    163.0
                          16.0 afternoon
                                              3159.21
                                                                       680.03
                    160.0
                          46.0 afternoon
                                              3943.34
                                                                       581.21
               3
                    162.0
                          26.0 afternoon
                                              3193.64
                                                                       615.47
```

	sourceid	dstid	hod	mean_travel_time	standard_deviation_travel_time	geometric_m
4	84.0	73.0	morning	801.05	324.42	
398337	55.0	51.0	afternoon	1351.52	388.79	
398338	59.0	11.0	afternoon	1334.32	411.91	
398339	46.0	159.0	evening	4468.16	822.11	
398340	58.0	175.0	afternoon	3637.46	786.0	
398341	56.0	195.0	afternoon	2310.67		

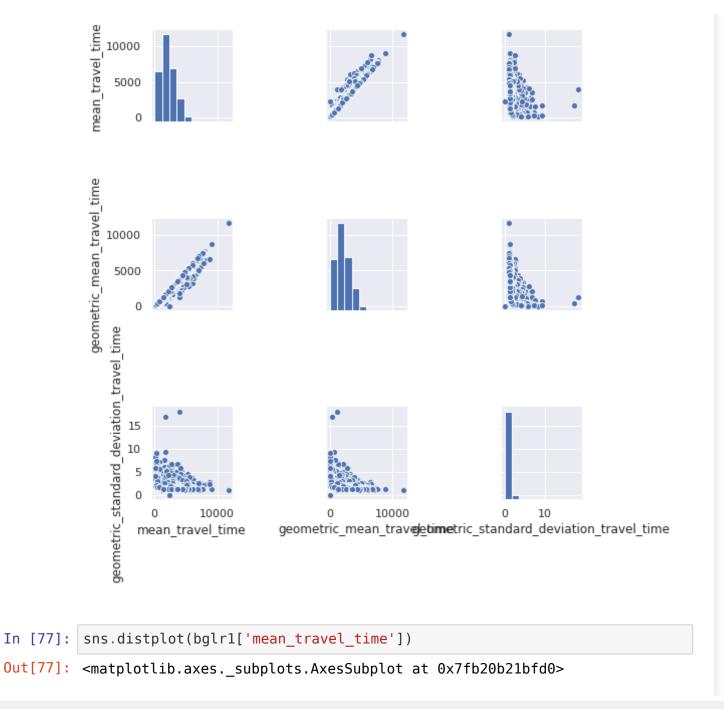
398342 rows × 8 columns

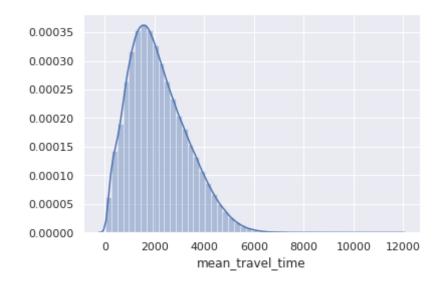
In [72]: bglr1

Out[72]:

	sourceid	dstid	hod	mean_travel_time	standard_deviation_travel_time	geometric_m	
0	88.0	33.0	morning	2022.22	665.53		
1	163.0	16.0	afternoon	3159.21	680.03		
2	160.0	46.0	afternoon	3943.34	581.21		
3	162.0	26.0	afternoon	3193.64	615.47		
4	84.0	73.0	morning	801.05	324.42		
398337	55.0	51.0	afternoon	1351.52	388.79		
398338	59.0	11.0	afternoon	1334.32	411.91		
398339	46.0	159.0	evening	4468.16	822.11		
398340	58.0	175.0	afternoon	3637.46	786.0		
398341	56.0	195.0	afternoon	2310.67			
398342 rows × 8 columns							

```
In [73]: corr = bglr1.corr() #plot with actual values
          corr.style.background gradient(cmap='coolwarm').set precision(2)
Out[73]:
                                           sourceid dstid mean_travel_time geometric_mean_trave
                                   sourceid
                                              1.00
                                                   0.02
                                                                  0.04
                                      dstid
                                              0.02
                                                   1.00
                                                                  0.06
                             mean travel time
                                              0.04 0.06
                                                                  1.00
                    geometric mean travel time
                                              0.04 0.06
                                                                  1.00
          geometric standard deviation travel time
                                              -0.00 0.01
                                                                  -0.36
In [75]: import seaborn as sns
         /usr/local/lib/python3.6/dist-packages/statsmodels/tools/ testing.py:1
         9: FutureWarning: pandas.util.testing is deprecated. Use the functions
         in the public API at pandas.testing instead.
            import pandas.util.testing as tm
In [76]: sns.set()
          cols = ['mean travel time','standard deviation travel time','geometric
         mean travel time', 'geometric standard deviation travel time']
          sns.pairplot(bglr1[cols], size = 2.5)
          plt.show()
         /usr/local/lib/python3.6/dist-packages/seaborn/axisgrid.py:2071: UserWa
         rning: The `size` parameter has been renamed to `height`; please update
         your code.
           warnings.warn(msg, UserWarning)
```

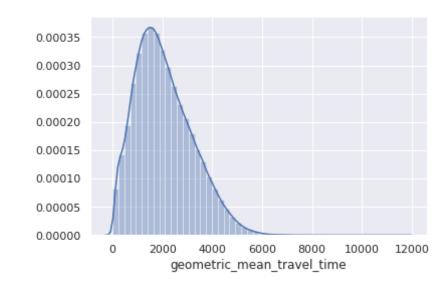




```
In [79]: ##sns.distplot(bglr1['standard_deviation_travel_time'])
```

In [80]: sns.distplot(bglr1['geometric_mean_travel_time'])

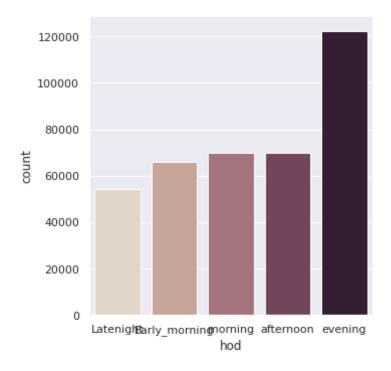
Out[80]: <matplotlib.axes._subplots.AxesSubplot at 0x7fb209b5d160>

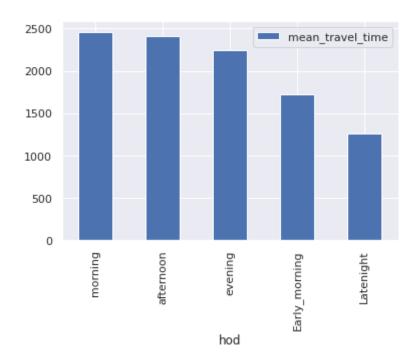


```
In [81]: sns.distplot(bglr1['geometric_standard_deviation_travel_time'])
Out[81]: <matplotlib.axes._subplots.AxesSubplot at 0x7fb20a688400>
            4
            3
            2
            1
                     2.5
                                7.5
                                      10.0
                                                       17.5
               0.0
                                            12.5
                                                  15.0
                   geometric_standard_deviation_travel_time
In [85]:
            box1= sns.boxplot(x='hod' , y='mean_travel_time' ,data=bglr1)
              12000
              10000
            mean travel time
               8000
               6000
               4000
               2000
                  0
                     Latenight Early_morning morning
                                                 afternoon
                                                           evening
                                          hod
```

```
In [86]: sns.catplot(x = "hod", kind = "count", palette = "ch: 0.25", data = bgl
r1)
```

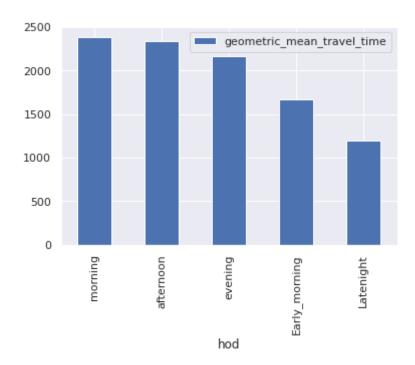
Out[86]: <seaborn.axisgrid.FacetGrid at 0x7fb20a9fc828>





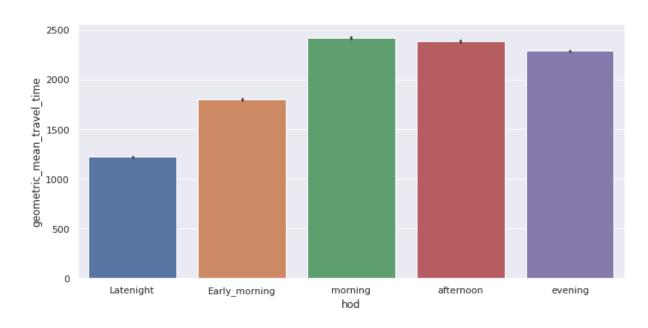
```
In [89]: bglr1[['geometric_mean_travel_time', 'hod']].groupby(['hod']).median().
    sort_values("geometric_mean_travel_time", ascending = False).plot.bar()

Out[89]: <matplotlib.axes._subplots.AxesSubplot at 0x7fb1f68899b0>
```



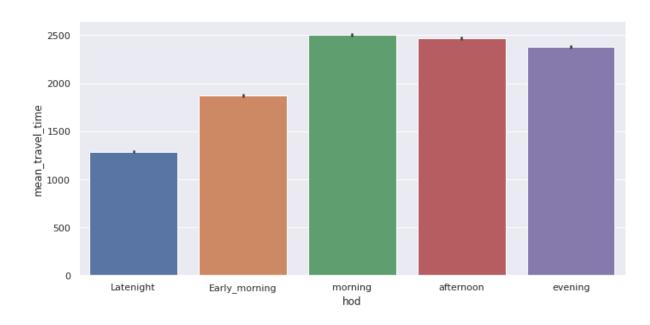
```
In [91]: sns.catplot(x='hod',y='geometric_mean_travel_time',kind='bar',data=bglr
1,aspect=2)
```

Out[91]: <seaborn.axisgrid.FacetGrid at 0x7fb1bd5d0048>



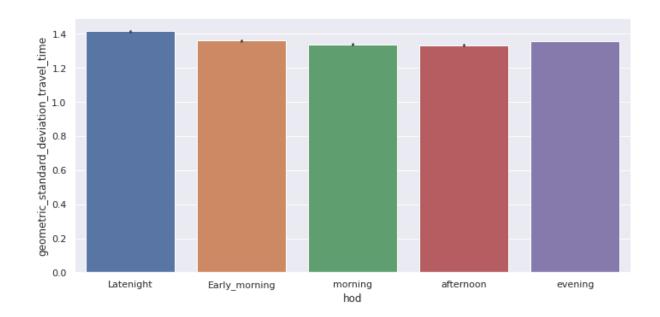
```
In [92]: sns.catplot(x='hod',y='mean_travel_time',kind='bar',data=bglr1,aspect=2
)
```

Out[92]: <seaborn.axisgrid.FacetGrid at 0x7fb1bd5d0438>



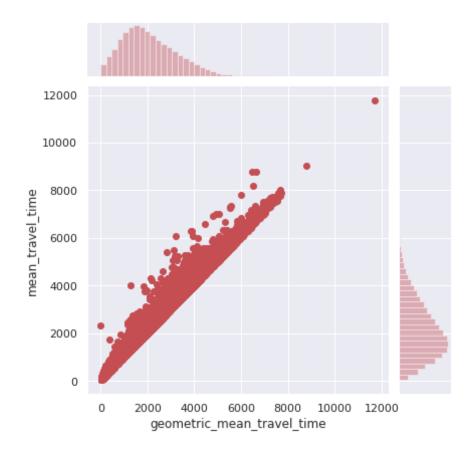
```
In [93]: sns.catplot(x='hod',y='geometric_standard_deviation_travel_time',kind=
    'bar',data=bglr1,aspect=2)
```

Out[93]: <seaborn.axisgrid.FacetGrid at 0x7fb1bd59fa90>



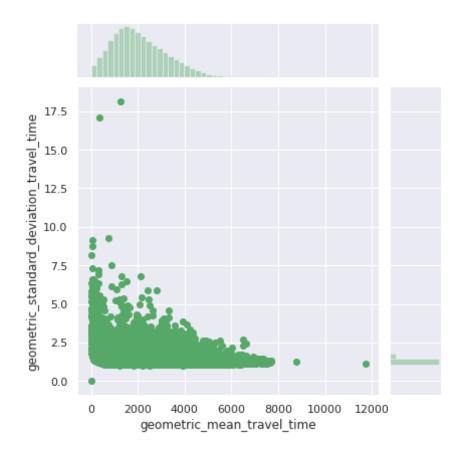
```
In [95]: sns.jointplot(x='geometric_mean_travel_time',y='mean_travel_time',data=
bglr1,kind='scatter',color='r')
```

Out[95]: <seaborn.axisgrid.JointGrid at 0x7fb1bd45ef60>



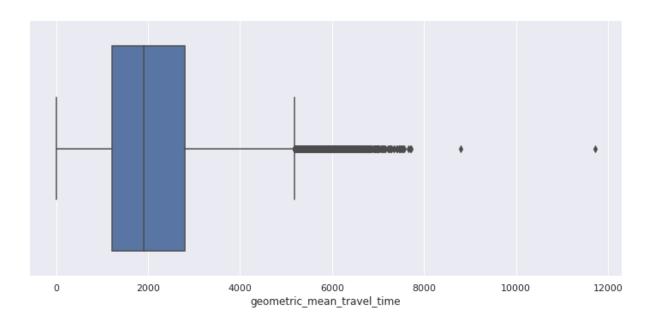
```
In [96]: sns.jointplot(x='geometric_mean_travel_time',y='geometric_standard_devi
ation_travel_time',data=bglr1,kind='scatter',color='g')
```

Out[96]: <seaborn.axisgrid.JointGrid at 0x7fb1bd2beb00>



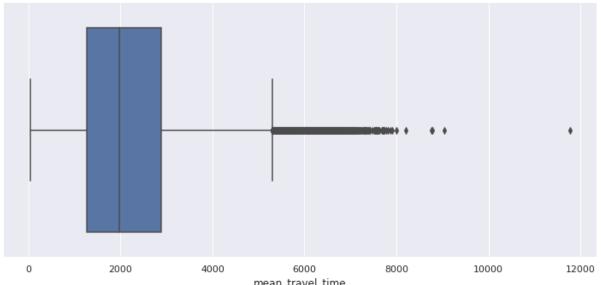
```
In [101]: sns.catplot(x='geometric_mean_travel_time', kind='box',data=bglr1, aspe
    ct=2)
```

Out[101]: <seaborn.axisgrid.FacetGrid at 0x7fb1bd159d30>



```
In [102]: sns.catplot(x='mean_travel_time', kind='box',data=bglr1, aspect=2)
```

Out[102]: <seaborn.axisgrid.FacetGrid at 0x7fb1bd387518>



```
mean_travel_time
In [104]: ##sns.catplot(x='hod', kind='box',data=bglr1, aspect=2)
 In [23]:
          bglr c.dtypes
 Out[23]: WARD NO
                           float64
          WARD NAME
                            object
          MOVEMENT ID
                           float64
          DISPLAY NAME
                            object
          geometry
                          geometry
          dtype: object
          bglr c["WARD NO"] = bglr c["WARD NO"].astype(str).astype(float)
 In [24]:
          bglr c['WARD NAME'] = bglr c['WARD NAME'].astype('|S')
          ##bglr c[""] = bglr c["WARD NAME"].astype(str).astype(float)
          ##bglr c['WARD NAME'].astype(str)
          bglr c["MOVEMENT ID"] = bglr_c["MOVEMENT_ID"].astype(str).astype(float)
          bglr c['DISPLAY NAME'].astype(str)
          ##bglr c["DISPLAY NAME"] = bglr c["DISPLAY NAME"].astype(str).astype(fl
          oat)
```

```
bglr_c['geometry'].astype(str)
         print(bglr_c.dtypes)
                          float64
         WARD NO
         WARD NAME
                           object
         MOVEMENT_ID
                          float64
         DISPLAY_NAME
                           object
         geometry
                         geometry
         dtype: object
In [25]: bglr c['geometry'].tail()
Out[25]: 193
                POINT (77.61442 12.92002)
         194
                POINT (77.67654 13.03361)
               POINT (77.65327 13.04456)
         195
         196
               POINT (77.69150 12.95074)
               POINT (77.50501 12.89190)
         197
         Name: geometry, dtype: geometry
In [ ]:
In [34]:
In [ ]:
```