

```
In [1]: import pandas as pd
import numpy as np
import matplotlib.pyplot as py
import seaborn as sb
```

```
In [2]: # read in the csv file
data = pd.read_csv("/users/baylife/desktop/csv files/nfl_pass_rush_receive_raw_data.csv")
type(data)
```

```
Out[2]: pandas.core.frame.DataFrame
```

```
In [3]: # display the columns of the data
data.columns
```

```
Out[3]: Index(['game_id', 'player_id', 'pos', 'player', 'team', 'pass_cmp', 'pass_att',
'pass_yds', 'pass_td', 'pass_int', 'pass_sacked', 'pass_sacked_yds',
'pass_long', 'pass_rating', 'rush_att', 'rush_yds', 'rush_td',
'rush_long', 'targets', 'rec', 'rec_yds', 'rec_td', 'rec_long',
'fumbles_lost', 'rush_scrambles', 'designed_rush_att',
'comb_pass_rush_play', 'comb_pass_play', 'comb_rush_play',
'Team_abbrev', 'Opponent_abbrev', 'two_point_conv', 'total_ret_td',
'offensive_fumble_recovery_td', 'pass_yds_bonus', 'rush_yds_bonus',
'rec_yds_bonus', 'Total_DKP', 'Off_DKP', 'Total_FDP', 'Off_FDP',
'Total_SDP', 'Off_SDP', 'pass_target_yds', 'pass_poor_throws',
'pass_blitzed', 'pass_hurried', 'rush_yds_before_contact', 'rush_yac',
'rush_broken_tackles', 'rec_air_yds', 'rec_yac', 'rec_drops', 'offense',
'off_pct', 'vis_team', 'home_team', 'vis_score', 'home_score', 'OT',
'Roof', 'Surface', 'Temperature', 'Humidity', 'Wind_Speed',
'Vegas_Line', 'Vegas_Favorite', 'Over_Under', 'game_date'],
dtype='object')
```

```
In [4]: # rename the a few of the columns, then display the number of rows in the file
data.rename(columns={'pos': 'position', 'game_date': 'date'}, inplace=True)
print("number of row in the data set:", len(data))
```

```
number of row in the data set: 18481
```

```
In [5]: # sort the dataframe by position, then by name and lastly the date
data.sort_values(by=['position', 'player', 'date'], inplace = True)
```

In [6]:

```
#print data
data
```

:	game_id	player_id	position	player	team	pass_cmp	pass_att	pass_yds	pass_td	pass_int	...	OT	Roof	Surface	Temperature	Humidity	Wind_Speed	Vegas_I
10939	20201206oti	BrewAa01	C	Aaron Brewer	TEN	0	0	0	0	0	...	False	outdoors	grass	52	68	1	
4776	201912080min	BradGa00	C	Garrett Bradbury	MIN	0	0	0	0	0	...	False	dome	sportturf	72	45	0	-
6209	202001110sfo	BradGa00	C	Garrett Bradbury	MIN	0	0	0	0	0	...	False	outdoors	grass	56	67	11	
11721	202012200nyg	GateNi00	C	Nick Gates	NYG	0	0	0	0	0	...	False	outdoors	fieldturf	36	82	0	
9355	202011080clt	SkurMa01	C/G	Matt Skura	BAL	0	0	0	0	0	...	False	retractable roof (closed)	fieldturf	72	45	0	
...
9216	202011010rav	SneaWi00	WR/R	Willie Snead	BAL	0	0	0	0	0	...	False	outdoors	grass	52	97	7	
9352	202011080clt	SneaWi00	WR/R	Willie Snead	BAL	0	0	0	0	0	...	False	retractable roof (closed)	fieldturf	72	45	0	
9822	202011150nwe	SneaWi00	WR/R	Willie Snead	BAL	0	0	0	0	0	...	False	outdoors	grass	52	81	13	
10223	202011220rav	SneaWi00	WR/R	Willie Snead	BAL	0	0	0	0	0	...	True	outdoors	grass	53	67	6	
12799	202101160buf	SneaWi00	WR/R	Willie Snead	BAL	0	0	0	0	0	...	False	outdoors	astroturf	34	81	13	

18481 rows × 69 columns

In [7]:

```
#check if the column names were changed
data.columns
```

```
Out[7]: Index(['game_id', 'player_id', 'position', 'player', 'team', 'pass_cmp',
            'pass_att', 'pass_yds', 'pass_td', 'pass_int', 'pass_sacked',
            'pass_sacked_yds', 'pass_long', 'pass_rating', 'rush_att', 'rush_yds',
            'rush_td', 'rush_long', 'targets', 'rec', 'rec_yds', 'rec_td',
            'rec_long', 'fumbles_lost', 'rush_scrambles', 'designed_rush_att',
            'comb_pass_rush_play', 'comb_pass_play', 'comb_rush_play',
            'Team_abbrev', 'Opponent_abbrev', 'two_point_conv', 'total_ret_td',
            'offensive_fumble_recovery_td', 'pass_yds_bonus', 'rush_yds_bonus',
            'rec_yds_bonus', 'Total_DKP', 'Off_DKP', 'Total_FDP', 'Off_FDP',
            'Total_SDP', 'Off_SDP', 'pass_target_yds', 'pass_poor_throws',
            'pass_blitzed', 'pass_hurried', 'rush_yds_before_contact', 'rush_yac',
            'rush_broken_tackles', 'rec_air_yds', 'rec_yac', 'rec_drops', 'offense',
            'off_pct', 'vis_team', 'home_team', 'vis_score', 'home_score', 'OT',
            'Roof', 'Surface', 'Temperature', 'Humidity', 'Wind_Speed',
            'Vegas_Line', 'Vegas_Favorite', 'Over_Under', 'date'],
           dtype='object')
```

```
In [8]: # get the list of players who are QBs
df = data[data["position"]=="QB"]
```

```
In [9]: # sort the QB's by name
df.sort_values(by=['player'])
```

Out [9]:

	game_id	player_id	position	player	team	pass_cmp	pass_att	pass_yds	pass_td	pass_int	...	OT	Roof	Surface	Temperature	Humidity	Wind_Spee
3724	201911170rav	McCaA.00	QB	A.J. McCarron	HOU	0	1	0	0	0	...	False	outdoors	grass	44	56	1
5864	201912290htx	McCaA.00	QB	A.J. McCarron	HOU	21	36	225	0	1	...	False	retractable roof (closed)	grass	72	45	
11160	202012130chi	McCaA.00	QB	A.J. McCarron	HOU	0	0	0	0	0	...	False	outdoors	grass	34	70	
12474	202101030htx	McCaA.00	QB	A.J. McCarron	HOU	1	1	20	0	0	...	False	retractable roof (closed)	grass	72	45	
10045	202011220clt	RodgAa00	QB	Aaron Rodgers	GNB	27	38	311	3	1	...	True	retractable roof (closed)	fieldturf	72	45	
...
13825	202109260den	WilsZa00	QB	Zach Wilson	NYJ	19	35	160	0	2	...	False	outdoors	grass	82	13	
13032	202109120car	WilsZa00	QB	Zach Wilson	NYJ	20	37	258	2	1	...	False	outdoors	grass	81	51	
17958	202112120nyj	WilsZa00	QB	Zach Wilson	NYJ	19	42	202	0	0	...	False	outdoors	fieldturf	46	30	1
14418	202110030nyj	WilsZa00	QB	Zach Wilson	NYJ	21	34	297	2	1	...	True	outdoors	fieldturf	78	50	
18248	202112190mia	WilsZa00	QB	Zach Wilson	NYJ	13	23	170	0	0	...	False	outdoors	grass	82	70	

1849 rows × 69 columns

In [10]:

```
#sort by the number of touchdowns
touch_downs = df.sort_values(by=['pass_td'])
```

In [11]:

```
# save the columns of interest in an array, create new dataframe for the quaterbacks
interest = ['position', 'player', 'team', 'pass_cmp',
            'pass_att', 'pass_yds', 'pass_td', 'pass_int','pass_rating','Surface', 'Temperature', 'Humidity', 'Wind_Speed','date']
QB_data = df[interest]
```

```
In [12]: # get the QB who played in the most games: the frequency of the name that appears the most is analogous to the number of games they played in  
QB_data.loc[:, "player"].describe()
```

```
Out[12]: count          1849  
unique           114  
top      Tom Brady  
freq           51  
Name: player, dtype: object
```

```
In [13]: # get the collection of data for the QB who played in the most amount of games  
most_prominent = QB_data.loc[:, "player"].describe()  
brady = QB_data[QB_data['player'] == most_prominent[2]]  
brady
```

Out[13]:

	position	player	team	pass_cmp	pass_att	pass_yds	pass_td	pass_int	pass_rating	Surface	Temperature	Humidity	Wind_Speed	date
210	QB	Tom Brady	NWE	24	36	341	3	0	124.9	grass	66	62	2	2019-09-08
555	QB	Tom Brady	NWE	20	28	264	2	0	124.7	grass	87	67	4	2019-09-15
977	QB	Tom Brady	NWE	28	42	306	2	0	103.9	grass	81	49	10	2019-09-22
1202	QB	Tom Brady	NWE	18	39	150	0	1	45.9	astroturf	58	71	10	2019-09-29
1787	QB	Tom Brady	NWE	28	42	348	3	1	106.1	grass	70	66	8	2019-10-06
1846	QB	Tom Brady	NWE	31	41	334	0	1	88.9	grass	54	61	13	2019-10-10
2485	QB	Tom Brady	NWE	31	45	249	1	1	80.7	fieldturf	58	73	0	2019-10-21
2763	QB	Tom Brady	NWE	20	36	259	2	0	96.9	grass	49	91	11	2019-10-27
3100	QB	Tom Brady	NWE	30	46	285	1	1	80.4	grass	48	41	1	2019-11-03
3669	QB	Tom Brady	NWE	26	47	216	0	0	67.3	grass	42	57	13	2019-11-17
4017	QB	Tom Brady	NWE	17	37	190	1	0	70.8	grass	38	90	16	2019-11-24
4370	QB	Tom Brady	NWE	24	47	326	3	1	85.9	grass	72	45	0	2019-12-01
4809	QB	Tom Brady	NWE	19	36	169	1	1	63.3	grass	32	56	8	2019-12-08
4987	QB	Tom Brady	NWE	15	29	128	2	0	86.6	grass	36	58	6	2019-12-15
5324	QB	Tom Brady	NWE	26	33	271	1	0	111.0	grass	33	64	2	2019-12-21
5952	QB	Tom Brady	NWE	16	29	221	2	1	88.4	grass	43	41	2	2019-12-29
6115	QB	Tom Brady	NWE	20	37	209	0	1	59.4	grass	44	88	4	2020-01-04
6547	QB	Tom Brady	TAM	23	36	239	2	2	78.4	astroturf	72	45	0	2020-09-13
7087	QB	Tom Brady	TAM	23	35	217	1	1	80.3	grass	85	72	17	2020-09-20
7275	QB	Tom Brady	TAM	25	38	297	3	0	115.8	grass	55	39	7	2020-09-27
7809	QB	Tom Brady	TAM	30	46	369	5	1	117.0	grass	75	87	6	2020-10-04
7894	QB	Tom Brady	TAM	25	41	253	1	0	86.7	grass	57	74	7	2020-10-08
8520	QB	Tom Brady	TAM	17	27	166	2	0	104.9	grass	88	48	12	2020-10-18
8830	QB	Tom Brady	TAM	33	45	369	4	0	127.0	grass	72	45	0	2020-10-25
9249	QB	Tom Brady	TAM	28	40	279	2	0	106.1	fieldturf	39	46	8	2020-11-02
9561	QB	Tom Brady	TAM	22	38	209	0	3	40.4	grass	77	76	17	2020-11-08

	position	player	team	pass_cmp	pass_att	pass_yds	pass_td	pass_int	pass_rating	Surface	Temperature	Humidity	Wind_Speed	date
9657	QB	Tom Brady	TAM	28	39	341	3	0	124.0	grass	65	90	15	2020-11-15
10297	QB	Tom Brady	TAM	26	48	216	2	2	62.5	grass	69	65	5	2020-11-23
10632	QB	Tom Brady	TAM	27	41	345	3	2	96.1	grass	81	50	5	2020-11-29
11436	QB	Tom Brady	TAM	15	23	196	2	0	120.9	grass	78	63	5	2020-12-13
11545	QB	Tom Brady	TAM	31	45	390	2	0	110.4	fieldturf	72	45	0	2020-12-20
11926	QB	Tom Brady	TAM	22	27	348	4	0	158.3	fieldturf	72	45	0	2020-12-26
12638	QB	Tom Brady	TAM	26	41	399	4	1	117.8	grass	65	77	4	2021-01-03
12699	QB	Tom Brady	TAM	22	40	381	2	0	104.3	grass	40	47	10	2021-01-09
12883	QB	Tom Brady	TAM	18	33	199	2	0	92.9	astroturf	72	45	0	2021-01-17
12887	QB	Tom Brady	TAM	20	36	280	3	3	73.8	grass	29	75	10	2021-01-24
12953	QB	Tom Brady	TAM	21	29	201	3	0	125.8	grass	63	78	9	2021-02-07
12969	QB	Tom Brady	TAM	32	50	379	4	2	97.0	grass	82	85	9	2021-09-09
13710	QB	Tom Brady	TAM	24	36	276	5	0	129.2	grass	85	72	0	2021-09-19
14088	QB	Tom Brady	TAM	41	55	432	1	0	103.0	matrixturf	72	45	0	2021-09-26
14390	QB	Tom Brady	TAM	22	43	269	0	0	70.8	grass	62	84	4	2021-10-03
14858	QB	Tom Brady	TAM	30	41	411	5	0	144.4	grass	84	59	7	2021-10-10
14931	QB	Tom Brady	TAM	34	42	297	2	1	102.1	grass	74	56	8	2021-10-14
15559	QB	Tom Brady	TAM	20	36	211	4	0	109.8	grass	83	65	7	2021-10-24
15847	QB	Tom Brady	TAM	28	40	375	4	2	112.0	astroturf	72	45	0	2021-10-31
16626	QB	Tom Brady	TAM	23	34	220	2	2	80.5	grass	47	40	8	2021-11-14
17027	QB	Tom Brady	TAM	30	46	307	2	1	89.7	grass	68	61	6	2021-11-22
17150	QB	Tom Brady	TAM	25	34	226	1	1	88.6	fieldturf	72	45	0	2021-11-28
17440	QB	Tom Brady	TAM	38	51	368	4	1	112.2	fieldturf	72	45	0	2021-12-05
18034	QB	Tom Brady	TAM	31	46	363	2	0	105.6	grass	82	66	4	2021-12-12
18369	QB	Tom Brady	TAM	26	48	214	0	1	57.1	grass	75	99	0	2021-12-19

```
In [14]: # narrow down the columns of interest for Tom Brady
observation= ['player', 'team', 'pass_cmp',
              'pass_att', 'pass_yds', 'pass_td', 'pass_int', 'pass_rating']

# get the dates of each event for the Tom Brady
time_laps = brady.loc[:, 'date']
cluster = brady.loc[:, observation[2]:observation[7]]
cluster
```

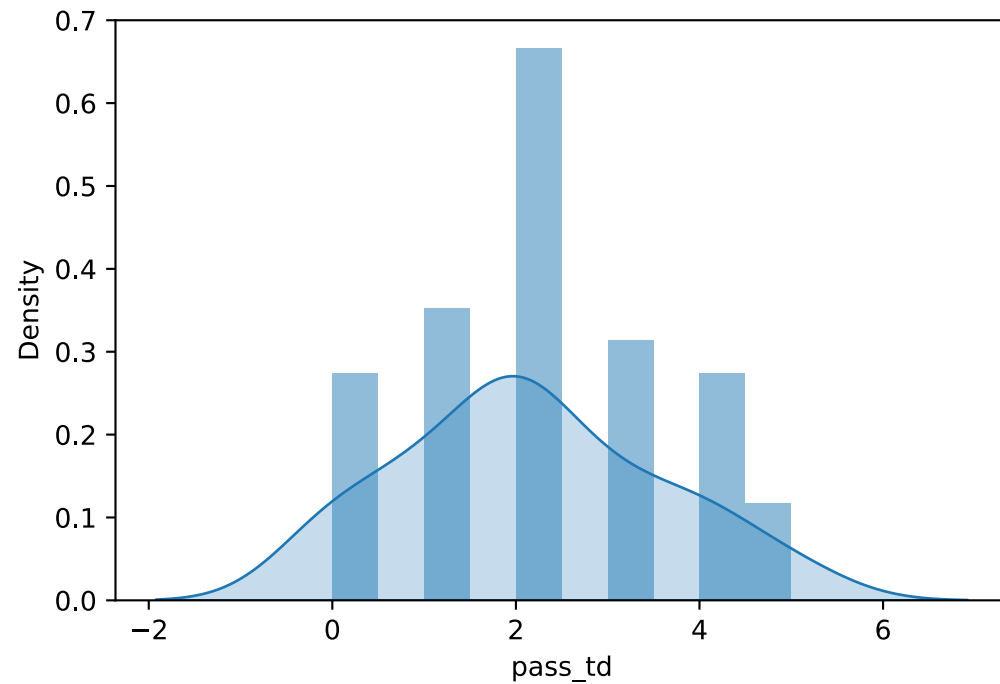

Out[14]:

	pass_cmp	pass_att	pass_yds	pass_td	pass_int	pass_rating
210	24	36	341	3	0	124.9
555	20	28	264	2	0	124.7
977	28	42	306	2	0	103.9
1202	18	39	150	0	1	45.9
1787	28	42	348	3	1	106.1
1846	31	41	334	0	1	88.9
2485	31	45	249	1	1	80.7
2763	20	36	259	2	0	96.9
3100	30	46	285	1	1	80.4
3669	26	47	216	0	0	67.3
4017	17	37	190	1	0	70.8
4370	24	47	326	3	1	85.9
4809	19	36	169	1	1	63.3
4987	15	29	128	2	0	86.6
5324	26	33	271	1	0	111.0
5952	16	29	221	2	1	88.4
6115	20	37	209	0	1	59.4
6547	23	36	239	2	2	78.4
7087	23	35	217	1	1	80.3
7275	25	38	297	3	0	115.8
7809	30	46	369	5	1	117.0
7894	25	41	253	1	0	86.7
8520	17	27	166	2	0	104.9
8830	33	45	369	4	0	127.0
9249	28	40	279	2	0	106.1
9561	22	38	209	0	3	40.4

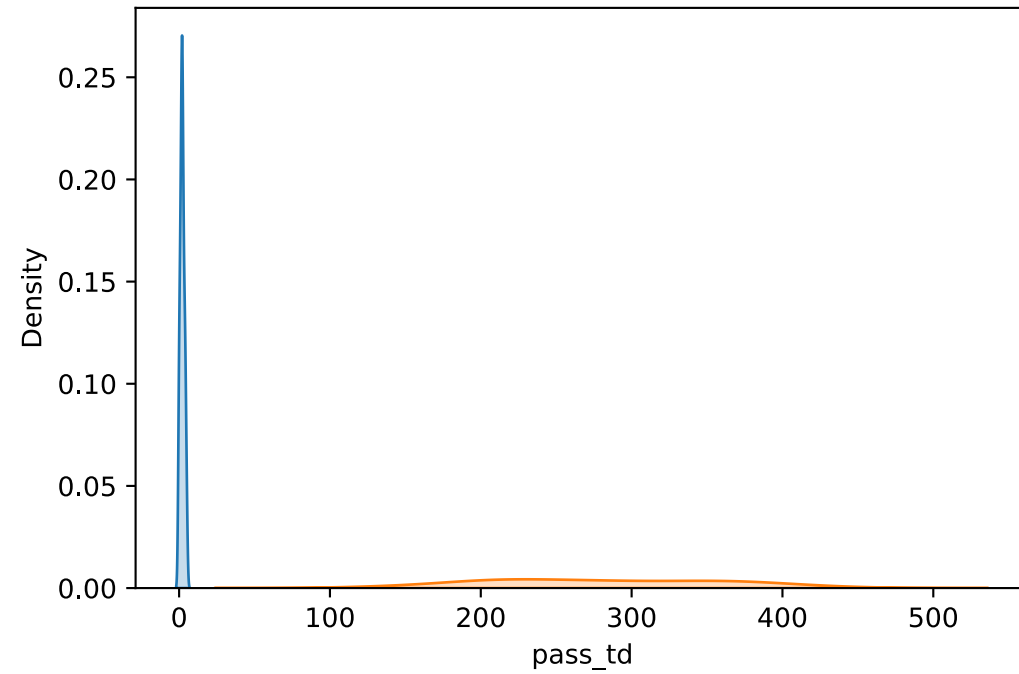
	pass_cmp	pass_att	pass_yds	pass_td	pass_int	pass_rating
9657	28	39	341	3	0	124.0
10297	26	48	216	2	2	62.5
10632	27	41	345	3	2	96.1
11436	15	23	196	2	0	120.9
11545	31	45	390	2	0	110.4
11926	22	27	348	4	0	158.3
12638	26	41	399	4	1	117.8
12699	22	40	381	2	0	104.3
12883	18	33	199	2	0	92.9
12887	20	36	280	3	3	73.8
12953	21	29	201	3	0	125.8
12969	32	50	379	4	2	97.0
13710	24	36	276	5	0	129.2
14088	41	55	432	1	0	103.0
14390	22	43	269	0	0	70.8
14858	30	41	411	5	0	144.4
14931	34	42	297	2	1	102.1
15559	20	36	211	4	0	109.8
15847	28	40	375	4	2	112.0
16626	23	34	220	2	2	80.5
17027	30	46	307	2	1	89.7
17150	25	34	226	1	1	88.6
17440	38	51	368	4	1	112.2
18034	31	46	363	2	0	105.6
18369	26	48	214	0	1	57.1

```
In [15]: # histogram of Tom Brady pass touchdowns, Kdeplot for touchdowns
#for col in temp2['pass_cmp']:
#    #density unitizes each histogram such that the area under the curver is 1
#    #alpha essential allows one to visibly see through each graph
#    #kdeplot kernal density plot
#sb.kdeplot(cluster['pass_td'],cluster['pass_yds'],shade=True)
sb.kdeplot(cluster['pass_td'],shade=True)
py.hist(cluster['pass_td'],density = True, alpha = 0.5)
#py.hist(cluster["pass_yds"],density = True, alpha = 0.5)
```

```
Out[15]: (array([0.2745098 , 0.          , 0.35294118, 0.          , 0.66666667,
        0.          , 0.31372549, 0.          , 0.2745098 , 0.11764706]),
array([0. , 0.5, 1. , 1.5, 2. , 2.5, 3. , 3.5, 4. , 4.5, 5. ]),
<BarContainer object of 10 artists>)
```



```
In [16]: # get the kedplot for the pass_td and the pass_yds
l = ['pass_td', 'pass_yds']
for col in l:
    sb.kdeplot(cluster[col],shade=True)
```



```
In [17]: # get the sum of all the rows for each column  
print(cluster.sum())
```

```
pass_cmp      1279.0  
pass_att      2000.0  
pass_yds     14308.0  
pass_td       110.0  
pass_int       35.0  
pass_rating   4930.5  
dtype: float64
```

```
In [18]: # get a general description of the data cluster from Tom Brady  
cluster.describe()
```

Out[18]:

	pass_cmp	pass_att	pass_yds	pass_td	pass_int	pass_rating
count	51.000000	51.000000	51.000000	51.000000	51.000000	51.000000
mean	25.078431	39.215686	280.549020	2.156863	0.686275	96.676471
std	5.747497	6.862401	76.536348	1.405312	0.836426	24.598484
min	15.000000	23.000000	128.000000	0.000000	0.000000	40.400000
25%	20.500000	36.000000	216.000000	1.000000	0.000000	80.450000
50%	25.000000	40.000000	276.000000	2.000000	0.000000	97.000000
75%	29.000000	45.000000	346.500000	3.000000	1.000000	112.100000
max	41.000000	55.000000	432.000000	5.000000	3.000000	158.300000

In [19]:

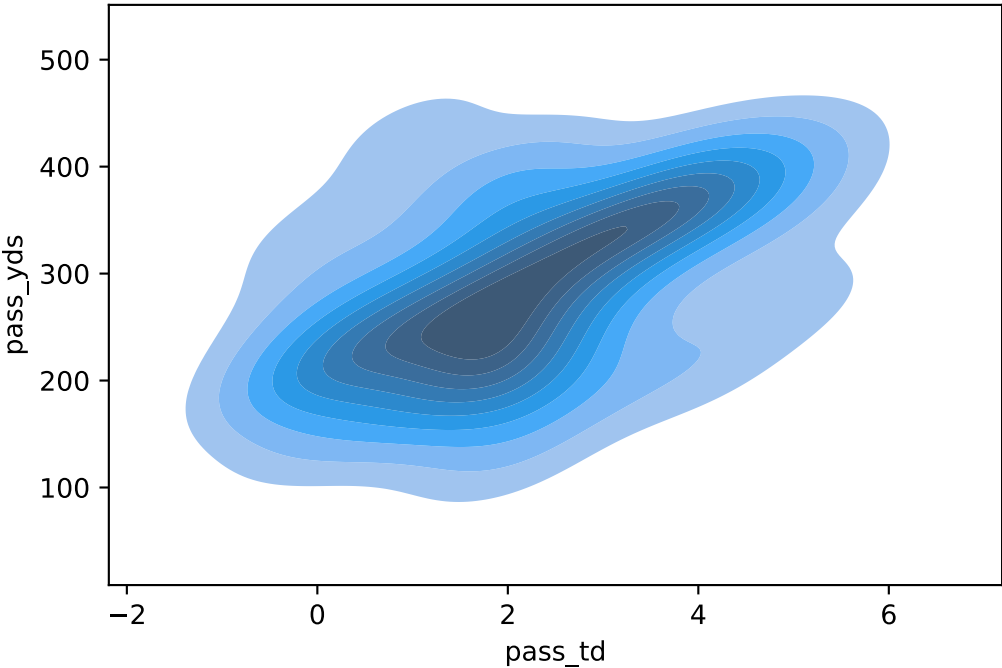
```
# the cluster shows the corrolation between the passing td and passing yds
sb.kdeplot(cluster[l[0]],cluster[l[1]],shade=True)
```

/Library/Frameworks/Python.framework/Versions/3.9/lib/python3.9/site-packages/seaborn/_decorators.py:36: FutureWarning: Pass the following variable as a keyword arg: y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

```
warnings.warn(
```

Out[19]:

<AxesSubplot:xlabel='pass_td', ylabel='pass_yds'>



```
In [20]: # We will determine the corrolation between each column for Tom Brady to determine how dependent each column is on another. by pass_cmp ----- pass  
analyze = cluster.corr()
```

```
In [21]: # after multiplying the cluster by the Transpose of the cluster we have a symmetric Matrix that will interm display the corrolations  
analyze
```

Out[21]:

	pass_cmp	pass_att	pass_yds	pass_td	pass_int	pass_rating
pass_cmp	1.000000	0.797197	0.741627	0.196539	0.063465	0.237020
pass_att	0.797197	1.000000	0.537903	-0.009800	0.182760	-0.206267
pass_yds	0.741627	0.537903	1.000000	0.521881	-0.036308	0.566525
pass_td	0.196539	-0.009800	0.521881	1.000000	-0.042370	0.748998
pass_int	0.063465	0.182760	-0.036308	-0.042370	1.000000	-0.509630
pass_rating	0.237020	-0.206267	0.566525	0.748998	-0.509630	1.000000

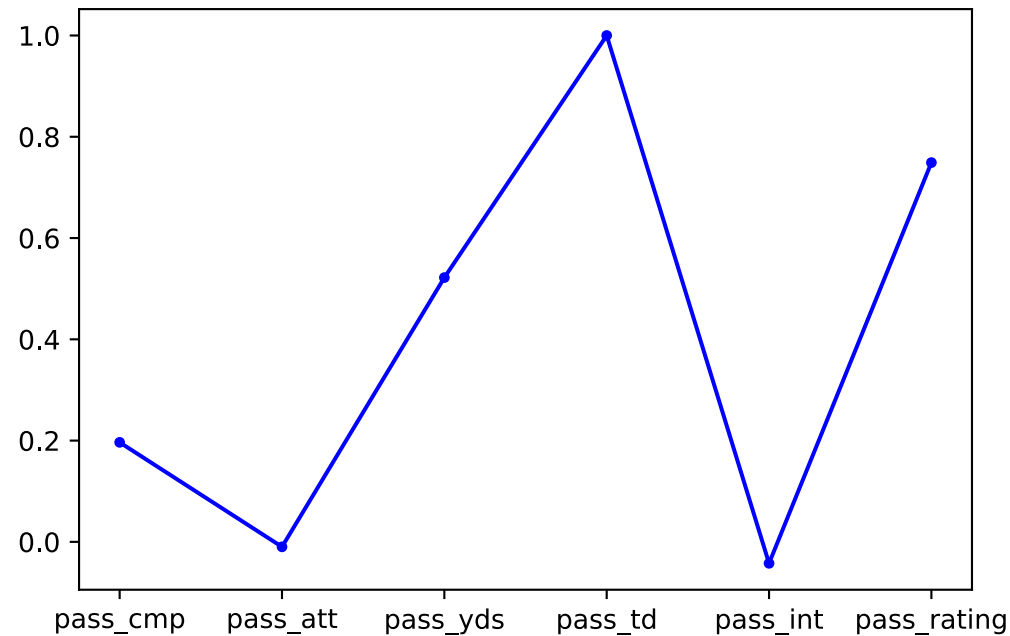
```
In [22]:
```

```
analyze.columns
```

```
Out[22]: Index(['pass_cmp', 'pass_att', 'pass_yds', 'pass_td', 'pass_int',  
            'pass_rating'],  
          dtype='object')
```

```
In [23]: # we find that the graph is consistant with the corralations, so we can surmise that for Tom Brady the corralation between Brady and the amount of  
#zone = brady.loc[:, 'date']  
py.plot(analyze["pass_td"],marker="." , color = "blue")
```

```
Out[23]: [<matplotlib.lines.Line2D at 0x12f3854c0>]
```



```
In [24]: # simple group by  
inser = ['player', 'pass_cmp',  
         'pass_att', 'pass_yds', 'pass_td', 'pass_int', 'pass_rating']  
  
test = brady.groupby(by=inser[0])[inser[1],inser[2],inser[3],inser[4],inser[5],inser[6]].sum()
```

```
In [25]: #cumulative stats for Tom Brady  
test.head()
```

Out[25]:

	pass_cmp	pass_att	pass_yds	pass_td	pass_int	pass_rating
player						
Tom Brady	1279	2000	14308	110	35	4930.5

In []: