STA 141B Assignment 2

Due **Februrary 9, 2024** by **11:59pm**. Submit your work by uploading it to Gradescope through Canvas.

Instructions:

- Provide your solutions in new cells following each exercise description. Create as many new cells as necessary. Use code cells for your Python scripts and Markdown cells for explanatory text or answers to non-coding questions. Answer all textual questions in complete sentences.
- 2. The use of assistive tools is permitted, but must be indicated. You will be graded on you proficiency in coding. Produce high quality code by adhering to proper programming principles.
- 3. Export the .jpynb as .pdf and submit it on Gradescope in time. To facilitate grading, indicate the area of the solution on the submission. Submissions without indication will be marked down. No late submissions accepted.
- 4. If test cases are given, your solution must be in the same format.
- 5. The total number of points is 10.

Exercise 1

We will use the lichess API to retrieve some information about the current state of chess in the world. In order to answer below questions, make precise and economical requests. You may use:

```
import requests
import json
import pandas

from datetime import datetime
import requests
import json
import pandas
from datetime import datetime
```

(a) What is the real name of the player muisback?

```
###Access API Token
def read_key(keyfile):
    with open(keyfile) as f:
        return f.readline().strip("\n")
key = read_key("../hw2/lichessAPItoken.txt")

response = requests.get("https://lichess.org/api/user/muisback",
params={"profile":True}, headers= {
    'Authorization': f'Bearer {key}',
```

```
})
account_data = response.json()
full_name = f'{account_data["profile"]["firstName"]},
{account_data["profile"]["lastName"]}'
full_name
'Rauf, Mamedov'
```

Rauf, Mamedov

(b, i) Get the username of the last player that played a rapid game against user athenapallada in 2023. **(ii)** In all games against this user, what is the win-to-loss ratio of athenapallada?

```
response = requests.get("https://lichess.org/api/games/user/athena-
pallada",
    params={'perfType' : "rapid", 'max' : 5, 'until' : 17040096000000},
#1704009600000 is 2023 in milliseconds since epoch
    headers= {'Authorization' : f'Bearer {key}'})
response = response.text.split('\n')
response[4]
'[Black "Bacio129"]'
response = requests.get("https://lichess.org/api/games/user/athena-
pallada",
    params = {
       'vs' : 'Bacio129'
    headers = {
        'Authorization' : f'Bearer {key}'
    })
response = response.text.split('\n')
for line in response:
    if '[Result' in line:
        print(line)
[Result "1-0"]
[Result "1-0"]
```

The user name of the last player athena-pallada has played against is Bacio129. As can be seen in the output, in all the games against this player, which is two games, Athena-Pallada has won both games, so they have a win ratio of 2:0. (We know Athena won because the score for both games is 1-0)

(c) Consider the top ten players in the bullet leaderboard. (i) Which player has the most bullet games overall? (ii) Which player has played the most bullet games relative to account age in days? (iii) Which player has the worst win-to-loss ratio over all formats?

```
response =
requests.get('https://lichess.org/api/player/top/10/bullet',
    params = {
        },
    headers = {
        'Authorization' : f'Bearer {key}'
top bullet players = response.json()
bullet player user = []
for i in range (10):
    bullet player user.append(top bullet players['users'][i]
['username'])
bullet player user
['Ediz_Gurel',
 'anhghOst24',
 'V M',
 'Yulkaaa',
 'Italianchessstar',
 'HowardXue',
 'aaryan varshney',
 'klari64',
 'TheGreenCloud',
 'iamstraw'l
total bullet games = []
for player in bullet player user:
    link = f'https://lichess.org/api/user/{player}/perf/bullet'
    indiv player = requests.get(link,
        params = {
        headers = {
            'Authorization' : f'Bearer {key}'
    total bullet games.append([player, indiv player.json()['stat']
```

```
['count']['all']])
total_bullet_games

[['Ediz_Gurel', 5560],
    ['anhghOst24', 3429],
    ['V_M', 2541],
    ['Yulkaaa', 785],
    ['Italianchessstar', 2797],
    ['HowardXue', 5418],
    ['aaryan_varshney', 7806],
    ['klari64', 2825],
    ['TheGreenCloud', 1206],
    ['iamstraw', 6877]]
```

```
max player = \max(total bullet games, key=lambda x: x[1])
max player
['aaryan varshney', 7806]
player counter = 0
for player in bullet player user:
    link = f'https://lichess.org/api/user/{player}'
    indiv player = requests.get(link,
        params = {
        },
        headers = {
            'Authorization' : f'Bearer {key}'
    account_creation = indiv_player.json()["createdAt"]
    date created = datetime.utcfromtimestamp(account creation /
1000.0)
    curr_date = datetime.strptime('2024-02-05', '%Y-%m-%d')
    days since = (curr date - date created).days
    total bullet games[player counter].append(days since)
    total wins = indiv player.json()["count"]["win"]
    total loss = indiv player.json()["count"]["loss"]
    total bullet games[player counter].append(total wins/total loss)
    player counter += 1
total bullet games
[['Ediz Gurel', 5560, 326, 2.5202774813233724],
 ['anhghOst24', 3429, 683, 2.429595640952108],
 ['V_M', 2541, 2861, 1.9039623908663532],
 ['Yulkaaa', 785, 394, 2.1130434782608694],
```

```
['Italianchessstar', 2797, 752, 2.035742035742036],

['HowardXue', 5418, 2206, 1.8037122969837587],

['aaryan_varshney', 7806, 1750, 2.4489672544080605],

['klari64', 2825, 1872, 1.4618991793669402],

['TheGreenCloud', 1206, 2655, 2.1775067750677506],

['iamstraw', 6877, 1338, 1.6606470053267506]]
```

```
bullet_games_to_days = max(total_bullet_games, key=lambda x:
x[1]/x[2])
bullet_games_to_days
['Ediz_Gurel', 5560, 326, 2.5202774813233724]
```

SOLUTION

```
worst_winloss_ratio = min(total_bullet_games, key=lambda x: x[3])
worst_winloss_ratio
['klari64', 2825, 1872, 1.4618991793669402]
```

- i) Considering the top 10 players in bullet, the player Zhigalko_Sergei has the most bullet games with 74408 bullet games
- ii) Similarly, Zhigalko_Sergei has the most bullet games played relative to account age in days with 74408 games played in an account age of 1963 days.
- iii) Across the top 10 players in bullet the played HowardXue has the worst win loss ratio with a win loss ratio of 1.7906.
- (d) Get all games from user manwithavan. Group them by opening and print the ten most popular.

```
link = f'https://lichess.org/api/games/user/manwithavan'
indiv_player = requests.get(link,
    params = {
        "opening" : True,
    },
    headers = {
        'Authorization' : f'Bearer {key}',
        'Accept' : 'application/x-ndjson'
    })

openings = []
for line in indiv_player.iter_lines():
```

```
openings = pd.Series(openings).value counts().head(10)
openings
Van't Kruijs Opening
                                                       7
Nimzo-Larsen Attack: Modern Variation
                                                       7
Pirc Defense
                                                       6
Mieses Opening
                                                       6
                                                       5
Caro-Kann Defense: Breyer Variation
                                                       5
Modern Defense
Queen's Pawn Game
                                                       5
                                                       5
Nimzo-Larsen Attack
                                                       5
Zukertort Opening: Queenside Fianchetto Variation
                                                       5
Zukertort Opening: Kingside Fianchetto
Name: count, dtype: int64
```

Exercise 2

As a public organization, the compensations of employees of all institutions of the University of California are freely accessible. These reports cover UC's career faculty and staff employees, as well as part-time, temporary and student employees. See here. Internally, the data requested by the search mask is gueried using an undocumented API. For this exercise, you may use:

```
import requests
import pandas
from json import loads
```

Hint: If you encounter an error when parsing the data, try to use string methods (e.g., str.replace) to deal with them.

(a) Get the compensation information of all UC Davis employees that received a gross pay that exceeded 300000 USD per year for the years 2019 to 2020. Sort the resulting table by year and last name, and print the first six entries.

```
import requests
import pandas as pd
from json import loads

url = 'https://ucannualwage.ucop.edu/wage/search.action'
result = requests.post(url, params = {
    '_search': 'false',
```

```
'nd': 1707338411241,
    'rows': 1000,
    'page': 1,
    'sidx': "EAW LST NAM",
    'sord': 'asc',
    'year': 2019,
    'location': "Davis",
    'startSal': 300000,
    'endSal': 9999999,
})
result.raise_for_status()
result = result.text
result = result.replace("\'", '\"')
result = loads(result)
columns=['id','year', 'location', 'firstname', 'lastname', 'title',
'gross', 'regular', 'overtime', 'other']
table = pd.DataFrame(columns=columns)
#table for 2019
for i in range(len(result['rows'])):
    table.loc[i] = pd.Series(result['rows'][i]['cell'], index=columns)
table
      id year location firstname
                                           lastname
title \
       1 2019
                  Davis LEONARD
                                           ABBEDUT0
PROF-HCOMP
                                                           PROF OF
      2 2019
                  Davis
                          MEHRDAD
                                              ABEDI
CLIN-HCOMP
                             ALAA
                                                           PROF OF
       3 2019
                  Davis
                                              AFIFY
CLIN-HCOMP
   4 2019
                  Davis
                              AMO
                                              AGBAI
                                                      HS ASST CLIN
PROF-HCOMP
       5 2019
                  Davis
                           SERGIO AGUILAR-GAXIOLA
                                                           PROF OF
CLIN-HCOMP
507 508 2019
                                                                   ASC
                  Davis
                            MANNY
                                              ZEWDU
PHYSCN
                                                                   ASC
508 509 2019
                  Davis
                            YUNLI
                                              ZHENG
PHYSCN
                                                      HS ASST CLIN
509 510 2019
                  Davis
                              JON
                                               ZH0U
PROF-HCOMP
510 511 2019
                  Davis
                           JORDAN
                                            ZIEGLER
                                                           HS CLIN
PROF-HCOMP
511 512 2019
                  Davis
                           MARIKE
                                        ZWIENENBERG HS ASSOC CLIN
PROF-HCOMP
```

```
regular overtime
                                         other
         gross
0
     374157.00
                315450.00
                               0.00
                                      58707.00
1
     310945.00
                173831.00
                               0.00
                                     137114.00
2
     305852.00
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                198489.00
                                     107363.00
3
     347554.00
                117700.00
                               0.00
                                     229854.00
4
     303159.00
                297935.00
                                       5224.00
                               0.00
                                . . .
     436745.00
                273006.00
                                     163739.00
507
                               0.00
508
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                275000.00
                               0.00
                                     128416.00
509
     394174.00
                141392.00
                               0.00
                                     252782.00
     510902.00
                177172.00
                               0.00
                                     333730.00
510
511
     462515.00
                186040.00
                               0.00
                                     276475.00
[512 rows x 10 columns]
int columns = ['gross', 'regular', 'overtime', 'other']
table[int columns] = table[int columns].astype('float')
table = table.drop(columns=['id'])
table
     year location firstname
                                      lastname
title \
     2019
             Davis
                     LEONARD
                                      ABBEDUT0
                                                               PROF-
HCOMP
                                                       PROF OF CLIN-
1
             Davis
                     MEHRDAD
                                         ABEDI
     2019
HCOMP
                         ALAA
                                                       PROF OF CLIN-
     2019
             Davis
                                         AFIFY
HCOMP
3
             Davis
                          AMO
                                         AGBAI
                                                  HS ASST CLIN PROF-
     2019
HCOMP
     2019
             Davis
                       SERGIO AGUILAR-GAXIOLA
                                                       PROF OF CLIN-
HCOMP
507 2019
                                                               ASC
             Davis
                        MANNY
                                         ZEWDU
PHYSCN
508 2019
             Davis
                        YUNLI
                                         ZHENG
                                                               ASC
PHYSCN
                                                  HS ASST CLIN PROF-
509 2019
                          JON
                                          ZH0U
             Davis
HCOMP
510 2019
             Davis
                      JORDAN
                                       ZIEGLER
                                                       HS CLIN PROF-
HCOMP
511 2019
             Davis
                      MARIKE
                                   ZWIENENBERG HS ASSOC CLIN PROF-
HCOMP
        gross
                regular
                          overtime
                                       other
0
     374157.0
               315450.0
                               0.0
                                     58707.0
1
     310945.0
               173831.0
                               0.0
                                    137114.0
2
     305852.0
               198489.0
                                    107363.0
                               0.0
```

```
3
     347554.0 117700.0
                               0.0 229854.0
4
     303159.0 297935.0
                               0.0
                                      5224.0
                               . . .
     436745.0 273006.0
507
                               0.0 163739.0
508 403416.0 275000.0
                               0.0 128416.0
509 394174.0 141392.0
                               0.0 252782.0
510 510902.0 177172.0
                               0.0 333730.0
511 462515.0 186040.0
                               0.0 276475.0
[512 rows x 9 columns]
#table for 2020
url = 'https://ucannualwage.ucop.edu/wage/search.action'
result = requests.post(url, params = {
    ' search': 'false',
    'nd': 1707338411241,
    'rows': 1000,
    'page': 1,
    'sidx': "EAW LST NAM",
    'sord': 'asc<sup>-</sup>,
    'year': 2020,
    'location': "Davis",
    'startSal': 300000,
    'endSal': 9999999,
})
result.raise for status()
result = result.text
result = result.replace("\'", '\"')
result = loads(result)
columns=['id','year', 'location', 'firstname', 'lastname', 'title',
'gross', 'regular', 'overtime', 'other']
table2 = pd.DataFrame(columns=columns)
for i in range(len(result['rows'])):
    table2.loc[i] = pd.Series(result['rows'][i]['cell'],
index=columns)
table2
      id year location firstname
                                       lastname
title \
       1 2020
                                                                PR0F-
                  Davis
                          LEONARD
                                       ABBEDUTO
HCOMP
       2 2020
                  Davis
                          MEHRDAD
                                                        PROF OF CLIN-
1
                                          ABEDI
HCOMP
                                                  ASST PROF OF CLIN-
2
       3 2020
                  Davis MARIANNE
                                      ABOUYARED 
HCOMP
                                                  ASST PROF OF CLIN-
       4 2020
                  Davis
                             JASON
                                          ADAMS
HCOMP
```

```
5 2020
                             ALAA
                                         AFIFY
                                                      PROF OF CLIN-
                  Davis
HCOMP
541 542
         2020
                  Davis
                             XIA0
                                          ZHA0
                                                 HS ASST CLIN PROF-
HCOMP
542 543 2020
                            YUNLI
                                         ZHENG
                                                              ASC
                  Davis
PHYSCN
                              JON
                                                 HS ASST CLIN PROF-
543 544 2020
                  Davis
                                          ZH0U
HCOMP
544 545 2020
                  Davis
                             LARA
                                    ZIMMERMANN ASST PROF OF CLIN-
HCOMP
                           MARIKE ZWIENENBERG HS ASSOC CLIN PROF-
545 546 2020
                  Davis
HCOMP
                  regular overtime
         gross
                                        other
                354193.00
                              0.00
                                     43307.00
0
     397500.00
                                    204340.00
1
     392816.00
                188476.00
                              0.00
2
     373400.00
                150714.00
                              0.00
                                    222686.00
3
     388210.00
                              0.00
                                    238056.00
                150154.00
4
     307000.00
                212959.00
                              0.00
                                     94041.00
     409767.00
541
                134659.00
                              0.00
                                    275108.00
     387954.00
542
                275000.00
                              0.00
                                    112954.00
543
     340028.00
                128634.00
                              0.00
                                    211394.00
     302334.00
                144071.00
544
                              0.00
                                    158263.00
545 513500.00
                217762.00
                              0.00
                                    295738.00
[546 rows x 10 columns]
int columns = ['gross', 'regular', 'overtime', 'other']
table2[int columns] = table2[int columns].astype('float')
table2 = table2.drop(columns=['id'])
table2
     year location firstname
                                 lastname
                                                              title
gross \
     2020
             Davis LEONARD
                                 ABBEDUT0
                                                         PROF-HCOMP
397500.0
                                                 PROF OF CLIN-HCOMP
             Davis
1
     2020
                     MEHRDAD
                                    ABEDI
392816.0
     2020
             Davis
                    MARIANNE
                                ABOUYARED 
                                            ASST PROF OF CLIN-HCOMP
373400.0
     2020
             Davis
                       JASON
                                    ADAMS
                                            ASST PROF OF CLIN-HCOMP
388210.0
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     2020
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```

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340028								
	2020	Davis	LARA	ZIMMERMANN	ASST F	PROF OF	CLIN-	HC0MP
302334		Davida	MADTICE	ZUTENENDEDC	LIC ACCO	C CLTN	DDOE	LICOMD
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212200	9.0							
	regular	overt	ime o	ther				
0 3	354193.0		0.0 4330					
	188476.0)	0.0 20434	40.0				
	150714.0		0.0 22268					
	150154.0		0.0 2380					
4 2	212959.0)	0.0 9404	41.0				
 E41 1	124650 0		0.0 2751	 no n				
	134659.0 275000.0		0.0 27510 0.0 11295					
_	273000.0 128634.0		0.0 21139					
	144071.0		0.0 15826	-				
			0.0 29573					
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545 2 [546 r table table title 0 HCOMP 1 HCOMP	rows x 9 = pd.co year lo \ 2019	ocation Davis Davis	firstname LEONARD MEHRDAD	le2], ignore_ last ABBE	name DUTO BEDI	PRO		CLIN-
[546 r table table title 0 HCOMP	rows x 9 = pd.co year lo \ 2019	columr oncat([tocation Davis	ns] cable, tab firstname LEONARD	le2], ignore_ last ABBE	name DUTO	PRO		
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545 2 [546 r table table title 0 HCOMP 1 HCOMP 2 HCOMP 3 HCOMP 4	rows x 9 = pd.co year lo 2019 2019	ocation Davis Davis Davis	firstname LEONARD MEHRDAD ALAA	le2], ignore_ last ABBE A	name DUTO BEDI FIFY GBAI F	PRO PRO HS ASST	OF OF	CLIN-
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545 2 [546 r table table title 0 HCOMP 1 HCOMP 3 HCOMP 4 HCOMP	rows x 9 = pd.co year lo 2019 2019 2019 2019 2019	Davis Davis Davis Davis Davis Davis Davis	firstname LEONARD MEHRDAD ALAA OMA SERGIO	le2], ignore_ last ABBE A A A	name DUTO BEDI FIFY GBAI +	PRO PRO HS ASST PRO	OF OF CLIN	CLIN- CLIN- PROF- CLIN-
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545 2 [546 r table table title 0 HCOMP 1 HCOMP 3 HCOMP 4 HCOMP 1053 HCOMP	rows x 9 = pd.co year lo 2019 2019 2019 2019 2020	Davis Davis Davis Davis Davis Davis Davis Davis	firstname LEONARD MEHRDAD ALAA OMA SERGIO	le2], ignore_ last ABBE A A A	name DUTO BEDI FIFY GBAI H IOLA	PRO PRO HS ASST PRO	OF OF CLIN	CLIN- PROF- CLIN-
545 2 [546 r table table title 0 HCOMP 1 HCOMP 2 HCOMP 3 HCOMP 4 HCOMP 1053 HCOMP 1054	rows x 9 = pd.co year lo 2019 2019 2019 2019 2019 2019 2020	Davis Davis Davis Davis Davis Davis Davis	firstname LEONARD MEHRDAD ALAA OMA SERGIO	le2], ignore_ last ABBE A A A	name DUTO BEDI FIFY GBAI +	PRO PRO HS ASST PRO	OF OF CLIN	CLIN- CLIN- PROF- CLIN-
545 2 [546 r table table title 0 HCOMP 1 HCOMP 3 HCOMP 4 HCOMP 1053 HCOMP 1054 PHYSCN	rows x 9 = pd.co year lo 2019 2019 2019 2019 2019 2019 2020	Davis Davis Davis Davis Davis Davis Davis Davis Davis	firstname LEONARD MEHRDAD ALAA OMA SERGIO XIAO	le2], ignore_ last ABBE A A A AGUILAR-GAX	name DUTO BEDI FIFY GBAI H IOLA ZHAO H HENG	PRO PRO HS ASST PRO	OF OF CLIN CLIN	CLIN- PROF- CLIN- PROF- ASC
545 2 [546 r table table title 0 HCOMP 1 HCOMP 2 HCOMP 3 HCOMP 4 HCOMP 1053 HCOMP 1054	rows x 9 = pd.co year lo 2019 2019 2019 2019 2019 2019 2020	Davis Davis Davis Davis Davis Davis Davis Davis	firstname LEONARD MEHRDAD ALAA OMA SERGIO	le2], ignore_ last ABBE A A A AGUILAR-GAX	name DUTO BEDI FIFY GBAI H IOLA ZHAO H HENG	PRO PRO HS ASST PRO	OF OF CLIN CLIN	CLIN- PROF- CLIN- PROF- ASC
545 2 [546 r table table title 0 HCOMP 1 HCOMP 3 HCOMP 4 HCOMP 1053 HCOMP 1054 PHYSCN 1055	rows x 9 = pd.co year lo 2019 2019 2019 2019 2019 2019 2020	Davis Davis Davis Davis Davis Davis Davis Davis Davis	firstname LEONARD MEHRDAD ALAA OMA SERGIO XIAO	le2], ignore_ last ABBE A A A AGUILAR-GAX	name DUTO BEDI FIFY GBAI H IOLA ZHAO H HENG ZHOU H	PRO PRO HS ASST PRO	OF OF CLIN CLIN	CLIN- PROF- CLIN- PROF- ASC PROF-

```
1057
      2020
               Davis
                         MARIKE
                                      ZWIENENBERG HS ASSOC CLIN PROF-
HCOMP
                            overtime
                   regular
                                           other
          gross
0
      374157.0
                 315450.0
                                  0.0
                                         58707.0
1
      310945.0
                 173831.0
                                  0.0
                                       137114.0
2
      305852.0
                 198489.0
                                  0.0
                                       107363.0
3
      347554.0
                 117700.0
                                  0.0
                                       229854.0
4
      303159.0
                 297935.0
                                          5224.0
                                  0.0
      409767.0
1053
                 134659.0
                                  0.0
                                       275108.0
1054
      387954.0
                 275000.0
                                  0.0
                                       112954.0
1055
      340028.0
                 128634.0
                                  0.0
                                       211394.0
1056
      302334.0
                 144071.0
                                  0.0
                                       158263.0
1057
      513500.0
                 217762.0
                                  0.0
                                       295738.0
[1058 \text{ rows } \times 9 \text{ columns}]
```

```
table = table.sort values(by=['year', 'lastname'])
table.head(6)
   year location firstname
                                                                  title
                                    lastname
/
  2019
           Davis
                                    ABBEDUTO
                                                             PROF-HCOMP
                   LEONARD
1 2019
                                                     PROF OF CLIN-HCOMP
           Davis
                   MEHRDAD
                                       ABEDI
2 2019
                      ALAA
                                                     PROF OF CLIN-HCOMP
           Davis
                                       AFIFY
  2019
           Davis
                       OMA
                                       AGBAI
                                               HS ASST CLIN PROF-HCOMP
3
                    SERGIO AGUILAR-GAXIOLA
4 2019
           Davis
                                                     PROF OF CLIN-HCOMP
                                              HS ASSOC CLIN PROF-HCOMP
5 2019
           Davis
                    DEBBIE
                                   AIZENBERG
              regular
                       overtime
                                     other
      gross
   374157.0
             315450.0
                             0.0
                                   58707.0
  310945.0
                             0.0
1
             173831.0
                                  137114.0
2
   305852.0
             198489.0
                             0.0
                                  107363.0
3
             117700.0
  347554.0
                             0.0
                                  229854.0
             297935.0
                                    5224.0
4
   303159.0
                             0.0
5
   315975.0
             209652.0
                             0.0
                                  106323.0
```

(b) Report the mean compensation for each title type: For gross pay, other pay and overtime pay, report the top six titles together with the number of counts.

```
unique titles = table['title'].unique()
unique titles
array(['PROF-HCOMP', 'PROF OF CLIN-HCOMP', 'HS ASST CLIN PROF-HCOMP',
        'HS ASSOC CLIN PROF-HCOMP', 'HS CLIN PROF-HCOMP', 'ASSOC PROF OF CLIN-HCOMP', 'PROF-AY-B/E/E', 'ASC PHYSCN', 'ASST PROF OF CLIN-HCOMP', 'VIS ASST PROF-HCOMP',
        'NURSE SVC MGR 4', 'PROF IN RES-HCOMP', 'MGD CARE MGR 3',
'DEAN',
        'PROF-AY', 'ASST PROF IN RES-HCOMP', 'PHYSCN SR',
        'CLIN APPLICATIONS MGR 4', 'PROF-SFT-VM',
        'AMBUL CARE ADMSTN MGR 4', 'AGRON AES-SFT-VM', 'CIO MED CTR',
        'ADMIN MGR 4', 'RECALL HCOMP', 'INFO SYS MGR 4', 'AGRON AES',
        'PERFUSIONIST SR NEX', 'EXEC VC AND PROVOST', 'PROF-AY-LAW',
                                'CMO MED CTR', 'PROF-FY',
        'VC DEV AND UNIV REL',
        'LECT-AY-CONTINUING', 'ASC PHYSCN DIPLOMATE', 'VC AND DEAN
SOM',
        'CHF NURSE OFCR', 'CFO MED CTR', 'CHAN', 'VC RSCH',
        'ASSOC PROF IN RES-HCOMP', 'PERFUSION SUPV 2', 'ASSOC PROF-
HCOMP',
        'VC IT', 'REVENUE CYCLE HC MGR 4', 'MGN COUNSEL 3',
        'FUNDRAISING MGR 4', 'REGL AND CMPLNC HC MGR 3', 'VC BUS
ADMSTN'
        'AST PHYSCN', 'AGRON AES-AY', 'NURSE ANESTHETIST MGR 1',
        'CLIN LAB SCI', 'CLIN PROFL SVC MGR 4', 'COO MED CTR',
        'DECISION SUPP MGR 4', 'DIRECTOR', 'CHF CAMPUS COUNSEL', 'FAC PROJECT MGR 3', 'MGD CARE MGR 4', 'PROF-FY-B/E/E', 'ATH MGR 4', 'ASSOC PROF-AY-B/E/E', 'CLIN NURSE 2',
        'FINANCIAL SVC MGR 4', 'HR MGR 4', 'NURSE PD'], dtype=object)
grouped_table = table.groupby('title').agg({'gross': 'mean',
'regular': 'mean', 'overtime': 'mean', 'other': 'mean'}).reset index()
grouped table
                        title
                                     gross
                                               regular
                                                         overtime
                                                                        other
0
                  ADMIN MGR 4
                                315212.00
                                             315212.00
                                                               0.0
                                                                          0.0
1
                    AGRON AES 339860.00 339860.00
                                                               0.0
                                                                          0.0
2
                 AGRON AES-AY
                                353895.00
                                            231213.00
                                                               0.0
                                                                    122682.0
3
            AGRON AES-SFT-VM
                                311520.50 291520.50
                                                               0.0
                                                                     20000.0
4
    AMBUL CARE ADMSTN MGR 4
                                362160.00 309783.00
                                                               0.0
                                                                      52377.0
61
               VC BUS ADMSTN 358360.50 358343.00
                                                               0.0
                                                                         17.5
        VC DEV AND UNIV REL
62
                                431460.50
                                            422544.50
                                                               0.0
                                                                       8916.0
63
                        VC IT
                                365548.00 365548.00
                                                               0.0
                                                                          0.0
                      VC RSCH
                                347230.50
                                             347230.50
64
                                                               0.0
                                                                          0.0
        VIS ASST PROF-HCOMP 314808.75 280025.75
                                                                     34783.0
                                                               0.0
[66 rows x 5 columns]
```

```
grouped table['count'] =
table.groupby('title').size().reset index(name='count')['count']
grouped table
                       title
                                            regular
                                                     overtime
                                                                  other
                                  gross
count
                ADMIN MGR 4 315212.00
                                         315212.00
                                                          0.0
                                                                    0.0
0
5
1
                                                          0.0
                                                                    0.0
                  AGRON AES
                              339860.00
                                         339860.00
2
2
               AGRON AES-AY
                                                          0.0
                                                               122682.0
                              353895.00 231213.00
1
3
           AGRON AES-SFT-VM 311520.50 291520.50
                                                          0.0
                                                                20000.0
2
    AMBUL CARE ADMSTN MGR 4
4
                              362160.00
                                         309783.00
                                                          0.0
                                                                52377.0
2
. .
              VC BUS ADMSTN
                              358360.50
                                         358343.00
                                                          0.0
                                                                   17.5
61
2
        VC DEV AND UNIV REL
                                                          0.0
62
                             431460.50 422544.50
                                                                 8916.0
2
63
                      VC IT
                              365548.00 365548.00
                                                          0.0
                                                                    0.0
2
64
                    VC RSCH 347230.50 347230.50
                                                          0.0
                                                                    0.0
2
        VIS ASST PROF-HCOMP 314808.75 280025.75
                                                          0.0
                                                                34783.0
65
4
[66 rows x 6 columns]
grouped table = grouped table.sort values(by='gross', ascending=False)
grouped table
                 title
                            gross
                                    regular
                                              overtime
                                                           other
                                                                  count
60
       VC AND DEAN SOM
                         960075.0
                                   759375.0
                                                   0.0
                                                        200700.0
                                                                       1
25
           COO MED CTR
                         877439.5
                                   622980.5
                                                   0.0
                                                                       2
                                                        254459.0
24
           CMO MED CTR
                         683718.0
                                   575187.5
                                                   0.0
                                                        108530.5
                                                                       2
                                                                      2
15
           CFO MED CTR
                         647717.5
                                   553678.0
                                                   0.0
                                                         94039.5
                                                                       2
16
                   CHAN
                         519136.0
                                   510220.0
                                                   0.0
                                                          8916.0
                                                                      . .
                         305646.5
17
    CHF CAMPUS COUNSEL
                                   305646.5
                                                                      2
                                                   0.0
                                                             0.0
33
              HR MGR 4
                         302000.0
                                   302000.0
                                                   0.0
                                                             0.0
                                                                       1
32
     FUNDRAISING MGR 4
                         301577.0
                                   293041.0
                                                                       2
                                                   0.0
                                                          8536.0
43
              NURSE PD
                         300754.0
                                   170057.0
                                              110187.0
                                                         20510.0
                                                                       1
     FAC PROJECT MGR 3
                         300134.0
                                   217356.0
                                                         82778.0
                                                                       1
                                                   0.0
[66 rows x 6 columns]
grouped table = grouped table.reset index(drop=True)
```

<pre>grouped_table.head(6)</pre>			
title	gross	regular	overtime
other \			
0 VC AND DEAN SOM 200700.000000	960075.00000	759375.000000	0.0
1 COO MED CTR	877439.50000	622980.500000	0.0
254459.000000			
2 CMO MED CTR	683718.00000	575187.500000	0.0
108530.500000			
	647717.50000	553678.000000	0.0
94039.500000			
	519136.00000	510220.000000	0.0
8916.000000	400007 76070	251241 400215	0.0
5 PROF OF CLIN-HCOMP	488237.76378	251241.480315	0.0
236996.283465			
count			
0 1			
2 2			
3 2			
4 2			
5 127			