

Webscraping & Analytics of Practo Website

Objective:

```
In [ ]: To scrape Practo website (20 pages) and get details Doctor Name, Department, Experience, Hospital, Fees, Waiting time, Recommendation percent and Reviews. Conduct Exploratory Data Analysis and get meaningful insights.
```

Method

```
In [ ]: Practo is an Online website that hosts Doctor listings across all major cities in India. I have scraped the data of this website for 20 pages by filtering it with 'Best Doctors in 'Kukatpally', 'Hyderabad'. It is an infinite scroll website, I inspected the developer tools and see the data tr highest at a particular 'xhr' record. Fetched the URL, and it hosts the entire info I needed. I converted that webpage url to JSON object and grabbed the key-value pairs., Each page consists of 10 results and thus I analyzed results of 200 results. I extracted the data like Doctor Name, Department, Experience, Hospital, Fees, Wait time, Recommendation percent and Reviews. Extracted the data and loaded the data into a Pandas Dataframe and performed further analysis and visualization.
```

```
In [2]: baseurl = 'https://www.practo.com/hyderabad/doctors/kukatpally'
```

```
In [3]: import requests
import pandas as pd
import json
import seaborn as sns
import matplotlib.pyplot as plt
```

```
In [4]: url = 'https://www.practo.com/marketplace-api/mweb/provider-seo/v2?page=1&reach_ver=1&r=requests.get(url)
data=r.json()
#print(data)
info=data['doctors']['entities']
Doctors=[info[key]['doctor_name'] for key in info.keys()]
Exp=[info[key]['experience_years'] for key in info.keys()]
Hospital=[info[key]['practice']['name'] for key in info.keys()]
Department=[info[key].get('specialization_info', {}).get('specialization') for key in info.keys()]
Fees=[info[key]['consultation_fees'] for key in info.keys()]
wait_time=[info[key]['wait_time'] for key in info.keys()]
Recommend_percent=[info[key]['recommendation_percent'] for key in info.keys()]
Reviews=[info[key]['reviews_count'] for key in info.keys()]
#print(Doctors)
#print(Exp)
#print(Hospital)
#print(f'Department: ', Department)
#print(Fees)
#print(f'wait time is ', wait_time)
#print(Recommend_percent)
#print(Reviews)
```

```
In [5]: for page in range(2,21):
url = 'https://www.practo.com/marketplace-api/mweb/provider-seo/v2?page={}&reach_ver=1&r=requests.get(url)
data=r.json()
info=data['doctors']['entities']
Doctors.extend([info[key]['doctor_name'] for key in info.keys()])
Exp.extend([info[key]['experience_years'] for key in info.keys()])
Hospital.extend([info[key]['practice']['name'] for key in info.keys()])
Department.extend([info[key].get('specialization_info', {}).get('specialization') for key in info.keys()])
Fees.extend([info[key]['consultation_fees'] for key in info.keys()])
wait_time.extend([info[key]['wait_time'] for key in info.keys()])
Recommend_percent.extend([info[key]['recommendation_percent'] for key in info.keys()])
Reviews.extend([info[key]['reviews_count'] for key in info.keys()])
```

```
In [6]: print(len(wait_time))

200
```

```
In [7]: df=pd.DataFrame()
df['Doctors'] = Doctors
df['Experience'] = Exp
df['Hospital'] = Hospital
df['Department'] = Department
df['Fees'] = Fees
df['Waiting'] = wait_time
df['Recommend_percent'] = Recommend_percent
df['Reviews'] = Reviews
```

```
In [8]: df
```

```
Out[8]:
```

	Doctors	Experience	Hospital	Department	Fees	Waiting	Recommend_percent	Reviews
0	Dr. K. Suma	34	Prasad Infertility Solutions	Gynecologist/Obstetrician	500	15.0		93.0
1	Dr. Ajay Kumar Paruchuri	19	Ajay Orthopedic Clinic	Spine Surgeon	600	30.0		96.0
2	Dr. S. Bala Ram Babu	22	Dr. Bala's Sexology Clinic	Sexologist	600	30.0		87.0
3	Dr. Meka Satyanarayana	40	Aswini Clinic	General Physician	800	60.0		96.0
4	Dr. Ravinder Raju	24	Positive Homeopathy	Homoeopath	300	30.0		71.0
...
195	Dr. Arun Kumar	9	Arya Dental	Dentist	200	15.0		100.0
196	Dr. S.Ziauddin	10	Arya Dental	Dentist	200	NaN		NaN
197	Dr. Chandra Sheker M (Physiotherapist)	10	Nightingales Home Health Services	Physiotherapist	650	NaN		NaN
198	Dr. Divya Krupa N (Physiotherapist)	10	Nightingales Home Health Services	Physiotherapist	650	NaN		NaN
199	Dr. Sunil Reddy A	16	Idea Clinics	Psychiatrist	1250	NaN		NaN

200 rows x 8 columns

```
In [10]: df.dtypes
```

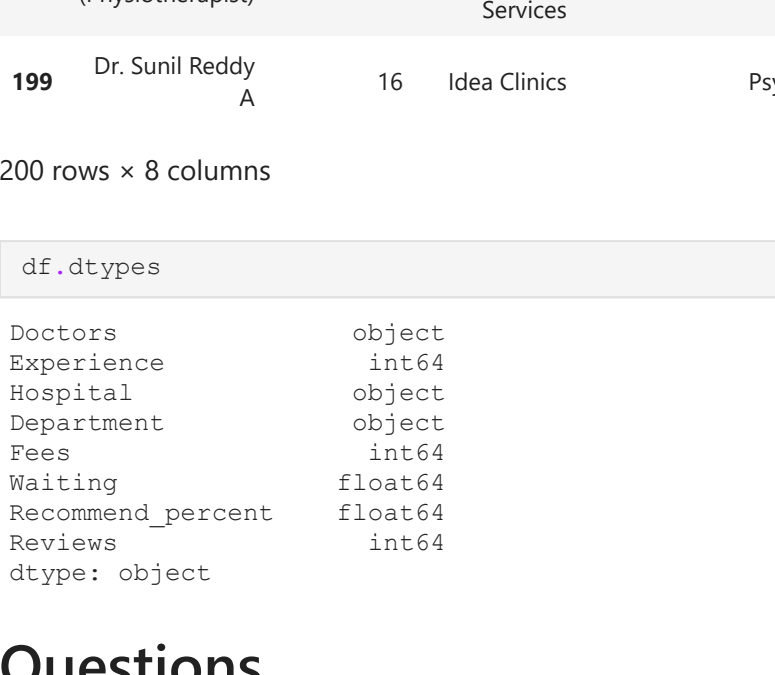
```
Out[10]:
```

Doctors	object
Experience	int64
Hospital	object
Department	object
Fees	int64
Waiting	float64
Recommend_percent	float64
Reviews	int64
dtype:	object

Questions

1. Does Fee vary with Experience? 2. What is the maximum fees and which department is having it? 3. What is the average fee? 4. Which Departments are hosted on Practo webpage? 5. Which Hospitals are hosted on Practo webpage? 6. What is the average fees by department? 7. Top 7 departments by average fees? 8. Plot count of doctors by department? 9. Count of Doctors by Experience?1. Does Fee vary with Experience?

```
In [13]: sns.scatterplot(x='Experience', y='Fees', data=df);
plt.title('Experience vs Fees');
```



From the above visualization, it is clear that the consultation fee remained almost same for Doctors between 10-20 years

3000 is an outlier. Hence we will exclude that data point in calculating average fees

```
In [14]: df['Fees'].max()
```

```
Out[14]: 3000
```

```
In [15]: #Filtering the dataframe without the row containing max fee as 3000
new_df=df[df['Fees']!=3000]
new_df
```

```
Out[15]:
```

	Doctors	Experience	Hospital	Department	Fees	Waiting	Recommend_percent	Reviews
0	Dr. K. Suma	34	Prasad Infertility Solutions	Gynecologist/Obstetrician	500	15.0		93.0
1	Dr. Ajay Kumar Paruchuri	19	Ajay Orthopedic Clinic	Spine Surgeon	600	30.0		96.0
2	Dr. S. Bala Ram Babu	22	Dr. Bala's Sexology Clinic	Sexologist	600	30.0		87.0
3	Dr. Meka Satyanarayana	40	Aswini Clinic	General Physician	800	60.0		96.0
4	Dr. Ravinder Raju	24	Positive Homeopathy	Homoeopath	300	30.0		71.0
...
195	Dr. Arun Kumar	9	Arya Dental	Dentist	200	15.0		100.0
196	Dr. S.Ziauddin	10	Arya Dental	Dentist	200	NaN		NaN
197	Dr. Chandra Sheker M (Physiotherapist)	10	Nightingales Home Health Services	Physiotherapist	650	NaN		NaN
198	Dr. Divya Krupa N (Physiotherapist)	10	Nightingales Home Health Services	Physiotherapist	650	NaN		NaN
199	Dr. Sunil Reddy A	16	Idea Clinics	Psychiatrist	1250	NaN		NaN

199 rows x 8 columns

2. What is the maximum fees and which department is having it?

```
In [16]: Max_Fees=new_df['Fees'].max()
print(f'The max fees is ', Max_Fees)
```

The max fees is 1250

```
In [17]: df.loc[df.Fees == 1250,'Department']
```

```
Out[17]:
187    Psychiatrist
199    Psychiatrist
Name: Department, dtype: object
```

3. What is the average fee?

```
In [18]: Average_fee=new_df['Fees'].mean()
print(f'The average fee of the Doctors in the given dataset is: ', Average_fee)
```

The average fee of the Doctors in the given dataset is: 503.00502512562815

4. Which Departments are hosted on Practo webpage?

```
In [19]: df['Department'].value_counts()
```

```
Out[19]:
```

Dentist	35
General Physician	17
Gynecologist/Obstetrician	16
Physiotherapist	13
Orthopedist	13
Homoeopath	12
Dermatologist	11
General Surgeon	11
Psychiatrist	6
Ear-Nose-Throat (ENT) Specialist	6
Pediatrician	5
Pulmonologist	4
Neurosurgeon	4
Endocrinologist	4
Cardiologist	4
Plastic Surgeon	3
Neurologist	3
Speech Therapist	3
Ayurveda	3
Gastroenterologist	2
Hair Transplant Surgeon	2
Nephrologist	2
Spine Surgeon	2
Sexologist	2
Oncologist	2
Radiologist	1
Endocrine Surgeon	1
Ophthalmologist	1
Hematologist	1
Bariatric Surgeon	1
Internal Medicine	1
Dietitian/Nutritionist	1
Diabetologist	1
Urologist	1

Name: Department, dtype: int64

5. Which Hospitals are hosted on Practo webpage?

```
In [20]: df['Hospital'].value_counts()[:10]
```

```
Out[20]:
```

Apollo Clinic	12
OMNI Hospitals	10
Amor Hospitals	9
Idea Clinics	9
Nightingales Home Health Services	9
Vitality Hospital	6
Sree Manju Hospitals	6
Solitaire Family Dentistry	6
Positive Homeopathy	4
IN Dental	4

Name: Hospital, dtype: int64

6. What is the average fees by department?

```
In [21]: df.groupby('Department')['Fees'].mean().sort_values(ascending=False)
```

```
Out[21]:
```

Department	2000.000000
Psychologist	1000.000000
Hematologist	950.000000
Psychiatrist	950.000000
Diabetologist	900.000000
Nephrologist	750.000000
Endocrinologist	725.000000
Sexologist	700.000000
Speech Therapist	650.000000
Ear-Nose-Throat (ENT) Specialist	608.333333
Radiologist	600.000000
Plastic Surgeon	600.000000
Hair Transplant Surgeon	600.000000
Dermatologist	563.636364
Cardiologist	550.000000
Endocrine Surgeon	550.000000
Spine Surgeon	550.000000
Gastroenterologist	550.000000
Pulmonologist	550.000000
Physiotherapist	538.461538
Neurologist	533.333333
Orthopedist	526.923077
Neurosurgeon	525.000000
General Physician	523.529412
Pediatrician	520.000000
General Surgeon	509.000000
Urologist	500.000000
Laparoscopic Surgeon	500.000000
Oncologist	500.000000
Dietitian/Nutritionist	500.000000
Gynecologist/Obstetrician	478.125000
Ayurveda	466.666667
Homoeopath	345.833333
Dentist	305.714286
Ophthalmologist	300.000000
Internal Medicine	290.000000
Bariatric Surgeon	100.000000

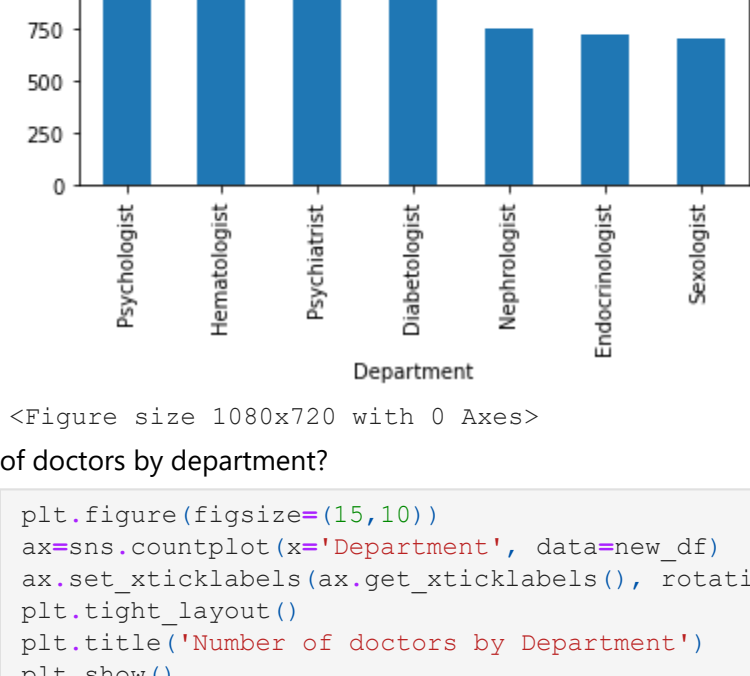
Name: Fees, dtype: float64

```
In [22]: type(df.groupby('Department')['Fees'].mean().sort_values(ascending=False))
```

```
Out[22]: pandas.core.series.Series
```

```
In [ ]: 7. Top 7 departments by average fees?
```

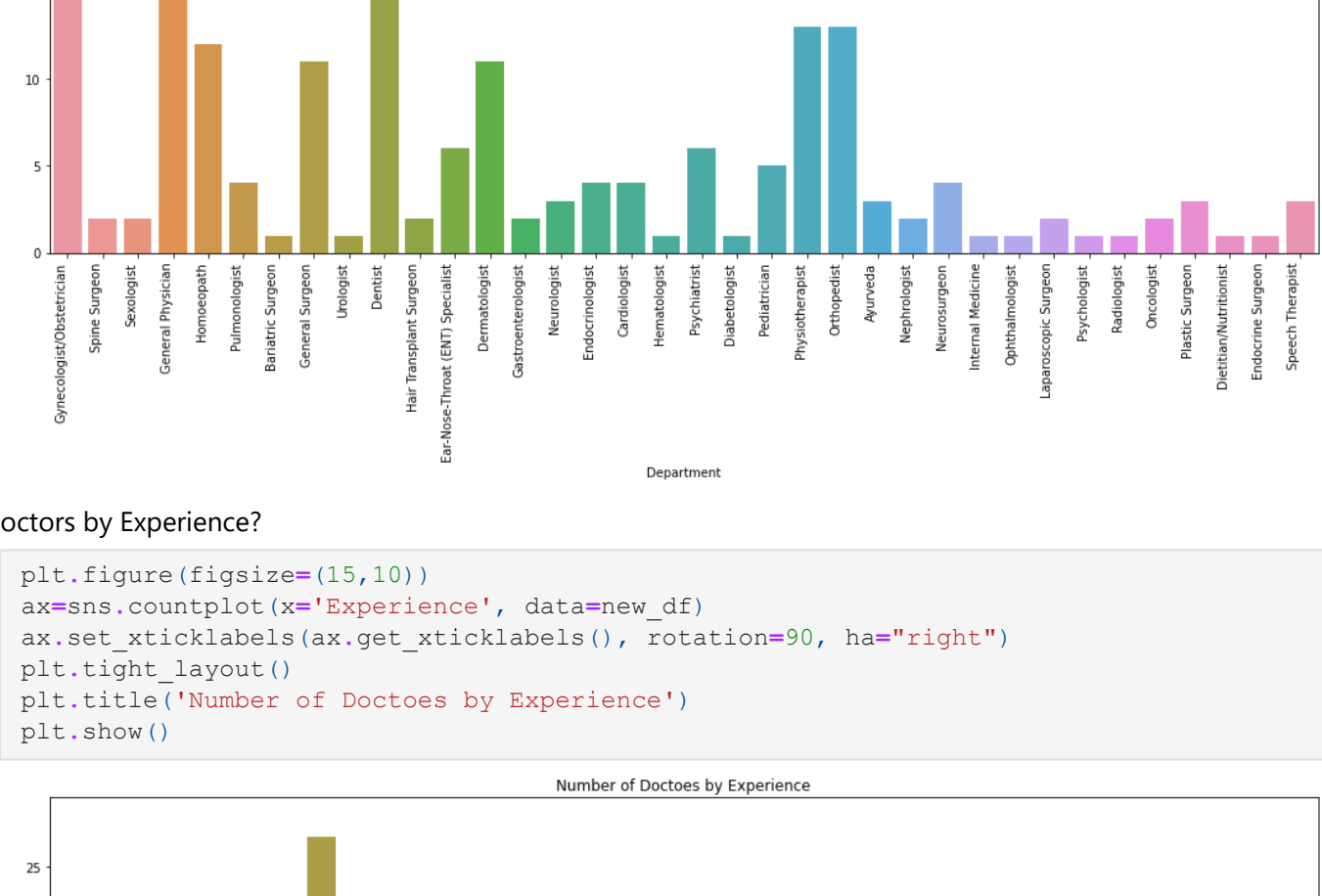
```
In [26]: (df.groupby('Department')['Fees'].mean().sort_values(ascending=False)[:7].plot(kind='bar',
plt.title('Top 7 Departments by average fees')
plt.figure(figsize=(15,10))
plt.show()
```



<Figure size 1080x720 with 0 Axes>

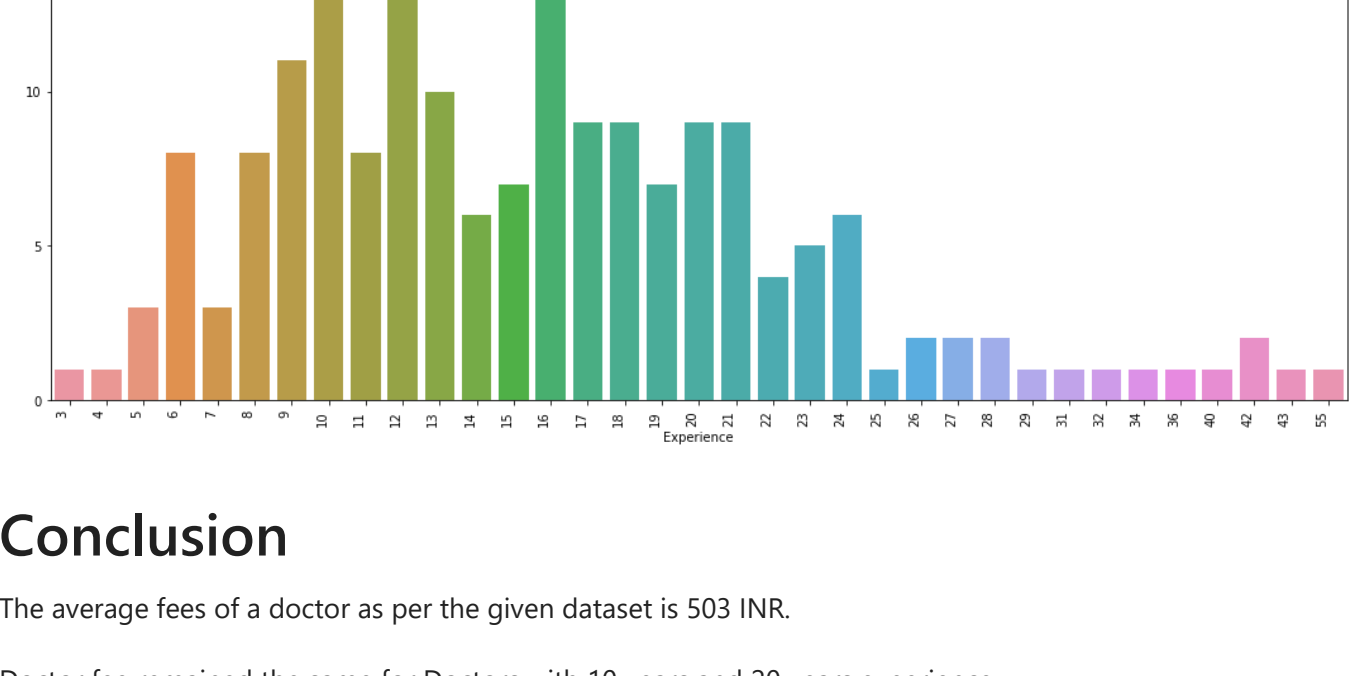
8. Plot count of doctors by department?

```
In [27]: plt.figure(figsize=(15,10))
ax=sns.countplot(x='Department', data=new_df)
ax.set_xticklabels(ax.get_xticklabels(), rotation=90, ha="right")
plt.tight_layout()
plt.title('Number of doctors by Department')
plt.show()
```



9. Count of Doctors by Experience?

```
In [28]: plt.figure(figsize=(15,10))
ax=sns.countplot(x='Experience', data=new_df)
ax.set_xticklabels(ax.get_xticklabels(), rotation=90, ha="right")
plt.tight_layout()
plt.title('Number of Doctors by Experience')
plt.show()
```



Conclusion

The average fees of a doctor as per the given dataset is 503 INR.

Doctor fee remained the same for Doctors with 10 years and 20 years experience

The Maximum fees as per the data is 1250 and Psychiatrist Department is charging that fees.

Top 7 departments by average fees are Psychologist, Hematologist, Psychiatrist, Diabetologist, Nephrologist, Endocrinologist, Sexologist

Hospitals hosted on Practo website are Apollo Clinic, OMNI Hospitals, Nightingales Home Health Services, Idea Clinics, Amor Hospitals etc.

Departments hosted on Practo Dentistry, General Physician, Gyneacologist, Physitherapist, Orthopedist, General Surgeon, Dermatologist, Homoeopath etc.