```
import pandas as pd
In [1]:
           df = pd.read_csv('DA-Data-Analyst-interview-assignment-Data.csv')
In [2]:
           df.head()
In [3]:
Out[3]:
                                                                                            Job
                                                        Crawl
                                                                                Job
                                                                 Job Title
                                         Uniq Id
                                                                                      Experience
                                                                                                    Key Skills
                                                  Timestamp
                                                                              Salary
                                                                                       Required
                                                                                                        Media
                                                                                Not
                                                   2019-07-05
                                                                   Digital
                                                                           Disclosed
                                                                                                     Planning|
               9be62c49a0b7ebe982a4af1edaa7bc5f
                                                      01:46:07
                                                                   Media
                                                                                        5 - 10 yrs
                                                                                                       Digital
                                                                                 by
                                                       +0000
                                                                  Planner
                                                                            Recruiter
                                                                                                        Media
                                                                                                     pre sales
                                                                                Not
                                                   2019-07-06
                                                                   Online
                                                                                                      closing
                                                                           Disclosed
                                                                                         2 - 5 yrs
              3c52d436e39f596b22519da2612f6a56
                                                      08:04:50
                                                                  Bidding
                                                                                                      software
                                                                                 by
                                                       +0000
                                                                Executive
                                                                                                   knowledge
                                                                            Recruiter
                                                                                                        clien...
                                                                                                    Computer
                                                                  Trainee
                                                                                Not
                                                   2019-08-05
                                                                Research/
                                                                                                      science|
                                                                           Disclosed
          2
                ffad8a2396c60be2bf6d0e2ff47c58d4
                                                      15:50:44
                                                                 Research
                                                                                         0 - 1 yrs
                                                                                                   Fabrication|
                                                                                 by
                                                       +0000
                                                                Executive-
                                                                                                       Quality
                                                                            Recruiter
                                                                 Hi- Tec...
                                                                                                      check|...
                                                                            2,00,000
                                                   2019-08-05
                                                                 Technical
                                                                                                     Technical
          3
                                                                                         0 - 5 yrs
               7b921f51b5c2fb862b4a5f7a54c37f75
                                                      15:31:56
                                                                            4,00,000
                                                                 Support
                                                                                                      Support
                                                       +0000
                                                                                 PA.
                                                                 Software
                                                                                Not
                                                                                                       manual
                                                   2019-07-05
                                                                     Test
                                                                           Disclosed
                                                                                                   testing test
          4 2d8b7d44e138a54d5dc841163138de50
                                                      02:48:29
                                                                                         2 - 5 yrs
                                                                Engineer -
                                                                                 by
                                                                                                  engineering|
                                                       +0000
                                                               hyderabad
                                                                                                   test cases ....
                                                                           Recruiter
           df.columns.values.tolist()
In [4]:
          ['Uniq Id',
Out[4]:
           'Crawl Timestamp',
           'Job Title',
           'Job Salary',
           'Job Experience Required',
           'Key Skills',
           'Role Category',
           'Location',
           'Functional Area',
           'Industry',
           'Role']
           df.columns.values.tolist()
In [5]:
          ['Uniq Id',
Out[5]:
            'Crawl Timestamp',
           'Job Title',
           'Job Salary',
           'Job Experience Required',
           'Key Skills',
           'Role Category',
           'Location',
           'Functional Area',
```

```
'Industry',
'Role']
```

## What are the Job Opportunities in the Top 20 cities?

```
df['Job Title'].value_counts()[:20]
In [6]:
         Business Development Executive
                                            120
Out[6]:
         Sales Executive
                                            120
         PHP Developer
                                            117
         Business Development Manager
                                             99
         Graphic Designer
                                             84
         Software Engineer
                                             79
         Java Developer
                                             77
         Android Developer
                                             77
         Content Writer
                                             74
         Sales Manager
                                             72
         Business Analyst
                                             62
         Senior Software Engineer
                                             61
         Marketing Executive
                                             59
         Web Designer
                                             58
         Dot Net Developer
                                             57
        Job Description
                                             57
         Software Developer
                                             46
         Project Manager
                                             43
         HR Executive
                                             42
         Accounts Executive
        Name: Job Title, dtype: int64
In [7]: df['Location'].value_counts()[:20]
Out[7]: Bengaluru
                                    4986
        Mumbai
                                    3318
                                    2431
        Pune
        Hyderabad
                                    2144
        Gurgaon
                                    1715
        Chennai
                                    1564
        Kolkata
                                    1339
        Delhi
                                    1212
        Noida
                                    1141
        Ahmedabad
                                    1032
        Delhi NCR
                                     734
        Chandigarh
                                     304
                                     229
         Bengaluru
        Navi Mumbai
                                     167
        Delhi NCR, Gurgaon
                                     141
         Hyderabad
                                     137
        Faridabad
                                     121
        Delhi NCR, Gurgaon, Noida
                                     113
                                      93
        Mumbai, Mumbai Suburbs
                                      84
        Ghaziabad
        Name: Location, dtype: int64
In [8]:
        strip = lambda x: x.strip()
         top 20 city data = df[df['Location'].isin(df['Location'].value counts().keys().tolis
         top 20 city data['Location'] = top 20 city data['Location'].apply(strip)
        <ipython-input-8-15883b6dcd1a>:4: SettingWithCopyWarning:
        A value is trying to be set on a copy of a slice from a DataFrame.
        Try using .loc[row_indexer,col_indexer] = value instead
```

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/u

```
ser_guide/indexing.html#returning-a-view-versus-a-copy
top_20_city_data['Location'] = top_20_city_data['Location'].apply(strip)
```

```
df['Location'].value_counts()[:20]
 In [9]:
 Out[9]: Bengaluru
                                     4986
         Mumbai
                                     3318
         Pune
                                     2431
         Hyderabad
                                     2144
         Gurgaon
                                     1715
         Chennai
                                     1564
         Kolkata
                                     1339
         Delhi
                                     1212
         Noida
                                     1141
         Ahmedabad
                                     1032
         Delhi NCR
                                      734
         Chandigarh
                                      304
          Bengaluru
                                      229
         Navi Mumbai
                                      167
         Delhi NCR, Gurgaon
                                      141
          Hyderabad
                                      137
         Faridabad
                                      121
         Delhi NCR, Gurgaon, Noida
                                      113
         Mumbai, Mumbai Suburbs
                                       93
         Ghaziabad
                                       84
         Name: Location, dtype: int64
         from mpl_toolkits import basemap
In [10]:
          print(basemap.__version__)
         1.3.3
          import matplotlib.pyplot as plt
In [11]:
          from mpl_toolkits.basemap import Basemap
          import numpy as np
In [12]:
          fig = plt.figure(figsize=(12,6))
          m = Basemap(
           projection='mill',
           resolution='c',
           llcrnrlat=7.890072140756692,
           llcrnrlon=64.6128442670092,
           urcrnrlat=39.31741853835297,
           urcrnrlon=97.64121300133036
          m.drawcoastlines() # to draw continental coast lines
          m.drawcountries(color='r')
          m.drawmapboundary(color='orange',linewidth=5)
          top_20_city = ['Bengalore','Mumbai','Pune','Hyderabad','Gurgaon','Chennai','Kolkata'
          longitudes = [77.580643,72.877426,73.856255,78.491684,77.026344,80.237617,88.363892,
          latitudes = [12.972442,19.076090,18.516726,17.387140,28.457523,13.067439,22.572645,2
          x,y = m(longitudes, latitudes)
          plt.scatter(x,y,s=15,color='red')
          for i,label in enumerate(top_20_city):
              plt.text(x[i]+100000,y[i],label)
          plt.show()
```



#### What are the Job Opportunities in the Top 20 Industries?

```
df['Job Title'].value_counts()[:20]
In [13]:
          Business Development Executive
                                              120
Out[13]:
                                              120
          Sales Executive
          PHP Developer
                                              117
           Business Development Manager
                                               99
          Graphic Designer
                                               84
                                               79
           Software Engineer
                                               77
           Java Developer
                                               77
          Android Developer
           Content Writer
                                               74
                                               72
           Sales Manager
           Business Analyst
                                               62
           Senior Software Engineer
                                               61
          Marketing Executive
                                               59
          Web Designer
                                               58
          Dot Net Developer
                                               57
          Job Description
                                               57
           Software Developer
                                               46
           Project Manager
                                               43
          HR Executive
                                               42
          Accounts Executive
                                               40
          Name: Job Title, dtype: int64
          df['Location'].value_counts()[:20]
In [14]:
         Bengaluru
                                      4986
Out[14]:
         Mumbai
                                      3318
          Pune
                                      2431
          Hyderabad
                                      2144
          Gurgaon
                                      1715
          Chennai
                                      1564
          Kolkata
                                      1339
          Delhi
                                      1212
          Noida
                                      1141
          Ahmedabad
                                      1032
          Delhi NCR
                                       734
```

304

229

Chandigarh

Bengaluru

```
Navi Mumbai
                                      167
         Delhi NCR, Gurgaon
                                      141
          Hyderabad
                                      137
         Faridabad
                                      121
         Delhi NCR, Gurgaon, Noida
                                      113
         Mumbai,Mumbai Suburbs
                                       93
         Ghaziabad
                                       84
         Name: Location, dtype: int64
In [15]:
         strip = lambda x: x.strip()
          top_20_industry_data = df[df['Industry'].isin(df['Industry'].value_counts().keys().t
In [16]:
         top_20_industry_data['Industry'].value_counts()[:20]
Out[16]: IT-Software, Software Services
                                                                  10012
                                                                   2721
         Recruitment, Staffing
                                                                   1754
         BPO, Call Centre, ITeS
         Banking, Financial Services, Broking
                                                                   1685
         Education, Teaching, Training
                                                                   1364
         IT-Software / Software Services
                                                                    786
         Medical, Healthcare, Hospitals
                                                                    676
         Internet, Ecommerce
                                                                    585
         Construction, Engineering, Cement, Metals
                                                                    566
         Strategy, Management Consulting Firms
                                                                    532
         Travel , Hotels , Restaurants , Airlines , Railways
                                                                    510
         Automobile, Auto Anciliary, Auto Components
                                                                    498
         Pharma, Biotech, Clinical Research
                                                                    466
         Media, Entertainment, Internet
                                                                    459
         Industrial Products, Heavy Machinery
                                                                    459
                                                                    424
         Advertising, PR, MR, Event Management
                                                                    403
         Real Estate, Property
                                                                    393
         Insurance
                                                                    343
         Oil and Gas, Energy, Power, Infrastructure
                                                                    317
         Name: Industry, dtype: int64
 In [ ]:
```

#### What are the Top 20 Job Categories

```
In [17]: | df['Role Category'].value_counts()[:20]
Out[17]: Programming & Design
                                                         8551
                                                         2385
         Retail Sales
                                                         2359
         HR/ Recruitment / IR
                                                         1133
         Admin/Maintenance/Security/Datawarehousing
                                                          928
         Accounts
                                                          882
                                                          880
         Senior Management
         0ther
                                                          865
                                                          704
         Corporate Sales
         Production/Manufacturing/Maintenance
                                                          592
         System Design/Implementation/ERP/CRM
                                                          507
         Marketing
                                                          487
         Medical Professional
                                                          438
         Creative
                                                          396
         Engineering Design
                                                          368
         Finance/Audit
                                                          339
                                                          329
         Teachers
         Project Management
                                                          311
         University Level
                                                          305
         Back Office/Web/Transaction Processing
                                                          294
         Name: Role Category, dtype: int64
```

#### What are the Top 20 Job Roles?

```
In [18]: | df['Role'].value_counts()[:20]
Out[18]: Software Developer
                                                         6396
         Associate/Senior Associate - (NonTechnical)
                                                         1728
         Sales/Business Development Manager
                                                         1561
         Sales Executive/Officer
                                                         1168
         Other
                                                          896
         Team Lead/Technical Lead
                                                          847
         Associate/Senior Associate -(Technical)
                                                          513
         Accounts Executive/Accountant
                                                          511
         Recruitment Executive
                                                          427
         Testing Engineer
                                                          408
         Fresher
                                                          380
         Technical Architect
                                                          366
         System Administrator
                                                          318
         HR Executive
                                                          297
         Business Analyst
                                                          268
                                                          230
         Design Engineer
         Telecalling/Telemarketing Executive
                                                          227
         Head/VP/GM/National Manager -Sales
                                                          216
         Project Manager-IT/Software
                                                          215
                                                          207
         Marketing Manager
         Name: Role, dtype: int64
```

## What is the Top 5 Location for Top 20 Industries?

# What are the Skills required for various job categories?

```
In [20]: strip = lambda x: str(x).strip()
    col_preprocess = ['Key Skills', 'Role Category']
    for col in col_preprocess:
        df[col] = df[col].apply(strip)

In [21]: df.groupby(['Role Category'])['Key Skills'].transform(lambda x: ','.join(x)).tolist(
```

Out[21]: 'Media Planning| Digital Media,nan,Internship| Digital marketing| Social media| Rela tionship building| Animation| Creative| Indesign| Business Executive| Presentation s kills| Senior, event production| Client Servicing| event operation| mice| events| con ferences| event coordinator,Excel| Financial markets| corporate events| Public speak ing| Digital marketing| Powerpoint| Marketing communication| Marketing Executive| Event Executive| Marketing,Campaigns| Digital Marketing| Project Planning,Account Manager| Client Servicing| Key account manager| Account Management| Digital Strategy| brand solutions| brand management,Client Servicing| relationship management| business development,Market research| Digital marketing| Social media| SEM| Print media| Analytics| Monitoring| Display advertising| UX| Analytical skills,customer service| cust omer support| ms office| client servicing| relationship management| Client Relations hip Management| client relation| customer relation| customer care| cse,Marketing| Ev

ents | Sales | Presentation Skills | Exhibitions | Fund Raising | Communication Skills, di gital marketing|online marketing|sem|search engine marketing|pay per click|google ad words professional|media planning|social media marketing|programmatic|paid media|dig ital campaigns|campaign management|campaign planning|Google Analytics|DCB,Social Med ia Executive| Digital Marketing Executive| facebook marketing| Management,Mba Freshe r,Client Servicing | Project Mananger | Project Manager Event | Client s Executive | Man ager Client Servicing | Client Associate | Event Manager | Assistant Event Manager | Bra nd Activation | Activation Officer, Relationship management | Brand communication | Mana gement,Social media marketing | Customer support,Social media marketing | SEO | Digital marketing| Email marketing| Team management| Google Analytics| Monitoring| Campaign planning | marketing automation | digital strategy, Internet Advertising | Online Promot ion| Freelancer| Online Marketing| Digital Marketing| Fresher| Part Time, FMCG Market ing | Promotions | Events | Communications skills | Brand Promotion | Marketing Executive | Presentation skills | Ms office, Social media marketing | Display advertising | Web te chnologies | SMO | Analytical | Marketing campaigns | SEO | Digital marketing | Search eng ine optimization, seo | social media | marketing strategy | social media marketing | face book | twitter | analytics | social marketing | inbound | qualitative, English | Social mar keting | Bidding | Email | Email marketing | Campaign management | Analytical | Service | A dvertising| Data entry,Business Executive,Advertising,social media marketing| seo| c ampaigns | digital advertising | sem | website management | facebook | promotions | twitte r | campaign management | brand | atl | Marcom | branding | digital marketing | online mark eting, Credit Officers | Risk Management | Administration | Report Generation | Policies | Analysts| analytical skills,nan,Sales| Cold Calling| Business Development,Business A nalyst| English| Tracking| CV| Manager Client Servicing| Writing| Relationship| Agen cy| mass| Hons, Social media marketing| Linkedin| Content strategy| CV| Social media| consumer marketing | Campaigns | Digital marketing | Facebook | Business Executive, accou nts executive| Brand Manager| client servicing| client management| content strategy| accounts manager, Tracking | Online media | Negotiation skills | Media planning | Negotia tion| Support| Compliance| Budgeting| Writing| Agency,btl activation| Atl| marketing management| events| Marketing, Social media marketing| Web technologies| SMO| Web ana lytics | Networking | Corporate | content marketing | Management | Brand building | Monito ring, nan, sales account | digital marketing | social media | seo | client servicing | stra tegy| account management| digital strategy| presales,online promotion| seo executive | web development| work from | internet marketing | freelancer | online advertising | pa rt time,Market analysis| Backend| Client satisfaction| Brand activation| Tracking| C onceptualization| Strategic business planning| Cross selling| Business Executive| Pr oject execution, Social Media Manager | Social Media Marketing | Social Media Optimizat ion, marketing | international business | Business Development | client servicing | Inter national Marketing | international business development | Marketing Manager | Marketing Management| business development management,Digital Marketing| HR| Typing| Computer Operating | Human Resource Management | Hospitality | Facebook Marketing | Telecalling | telemarketing, English | advertising agency | SMM | Content | Writing | SEM | SEO | Business Executive, Media | Billing | Email | closure | Tracking | Internal communication | Reconcil iation | Cross selling | confirmation | Client Service Executive, Social media | Budgetin g, Public relations | Typing | Product service | Marketing campaigns | Distribution | spon sorship | Time | Research | Marketing Executive | Advertising, nan, nan, Profit head | Curri culum| Journalism| Trainee| Database| Research| Education| Publishing| Entry Level| Technology, Market research | Monitoring | Strategic thinking | National | SupportReport preparation | Target | Trainee | Regional Coordinator, Social media marketing | Analytica 1 skills | Lead generation | Usage | Management, operations | sound | setup | handling | btl activities | travel | events, Sales Coordinator | Marketing Consultant | Sales Supprot | S ales Advisor, Media research | Agency sales | Revenue generation | Radio | Station | Print ing, Sales | Telecalling | Back office | Marketing Coordinator | Vendor | Counselling, nan, analytics | algorithms | ppc | smm | adwords | smo | team lead | sem | company | seo, BPO | Soc ial media marketing | Digital media | Consulting | HTML | Customer relationship | ITES | M anagement | CRM, PPC | Copy writing | Internet marketing | SEM | Pay per click | Management | Merchandising | Facebook | international clients | Analytics, Sales | Social Media | Pro of Reading | Editing | Team Leading | Campaigns | Copy Writing, Analytics | HTML | SEM | Jav ascript | PPC | Event management | Digital marketing | Customer acquisition | Tools | Algo rithms,Trade| Event Executive,Digital media| Email marketing| Digital design| Social media | Production operations | Billing | CMS | digital strategy | SEO | Digital marketin g,Key Accounts Management | business growth | key accounts,Team Leader,Media Managemen t| Linkedin| Social Media| blogs| Youtube| Twitter| Facebook| content, Trade| Online media | Usage | Media strategy | Social media | Brand awareness | Research | Management | B usiness Executive | Analytics, Video Editing | Video, Digital Marketing | Advertising | De sign| Media Buying| Loyalty Programs| Brand Strategy| Mystery Shopping| 3D Rendering DTP Operating | Real Estate, social media | scheduling | facebook | twitter | coordinati ng | planning, Event Management | Marketing Collaterals | Marketing, Display advertising | Google Analytics| Social media| Javascript| Google AdWords| SEM| HTML| Omniture| SEO

| Digital marketing,digital marketing | client relationship management | new | manageme nt skills| team management skills| crisis management| events| quality,Online marketi ng| SEO| Analytical| Digital marketing| Social media| Analytics| HTML| Javascript| D isplay advertising | Marketing campaigns, Media Buying | Media Planning | Advertising, Le ad Generation| Customer Handling| Post Sales| Marketing| Material Receipt,marketing executive | distributors | customer profiling | Business Development | sales executive, m arket research | customer profiling | sales executive | marketing executive | distributo rs| Business Development,Digital Marketing Executive| Strategy making| Sound| Creati ve| Compensation| Usage, Executive| Excel| Research| Management| Fact| Media planning | Reporting tools| Monitoring, Social media| PCM| Marketing| Digital Marketing, softwa re development| online promotion| Fresher| work from| freelancer| online advertising | part time, bpo | digital marketing | online marketing | fresher | online branding | web marketing | business development | kpo | seo | internet marketing | freelancer | part tim e,customer marketing | Excel | Inventory management | UPS | MS Office | Powerpoint | Busin ess Executive | Sales support, Manager Client Servicing | Client Service Executive | Sil icon | Advertising, digital marketing | team handling, Branded Content | Video Editing | A dobe Premiere | Post Production | Motion Graphics | Social Media | Science | Final Cut Pr o | Color Correction | Script Writing, Digital media | Integrated marketing | Client mana gement| Analytics| Media planning| Marketing| Investment,PPC| Display advertising| E mail marketing | SMO | Online marketing | Internet marketing | SEM | SEO | Digital marketi ng,nan,Advertising| Media Relations| Internal Communication| Branding| Customer Supp ort | Customer Service | Twitter | Facebook | Social Media | Customer Satisfaction | Linke din| Content Writing,online promotion| seo executive| web development| work from| in ternet marketing | freelancer | online advertising | part time, open source | website | di gital media| charts| drafting| gap analysis| documentation| english| sdlc| process f low,Entry Level| Publishing| Trainee| Education| Technology| Database| Journalism| R esearch,assembly language | Six Sigma | JavaScript | .NET | HTML | Oracle | Python | SQL,Pr esales | Customer Satisfaction | Excel | Powerpoint, Ad Sales | B2B Sales | Corporate Sale s,SEM| Google AdWords| Web analytics| Analytical| digital marketing head| Search eng ine marketing | SEM Executive | Advertising | Research | Business Executive, blog writing copy writing | blogs | service marketing | content writing | seo writing | product serv ice| case studies| articles| social media,Social media| Email| Linkedin| Digital Mar keting Executive | Business Analyst | Project Coordinator | Client interaction | Spoken english | Technical | Business Executive, Client Onboarding | Customer Experience | Campa ign Management| Marketing| Customer Engagement,Customer Relationship| Customer Care| Relationship Management| Receptionist Activities,Digital Advertising| Sales,nan,seo| digital marketing dealing email marketing sem social media marketing digital me dia| affiliate marketing| google adwords| google analytics,operations| customer sati sfaction | leadership skills | complaints | microsoft excel | quality, Social media | Publ ishing| Email| Social media marketing| iPhone| Facebook| Photoshop| Tracking| Google Analytics | Content Editor, nan, development | operations | relationship management | stra tegy| brand ing| coordinating| conceptualization| ideation| team, Corporate Gifts| Pa ckaging | packaging development, digital marketing | Social Work | computer operating | o nline marketing office assistant social media marketing back office executive bu siness development | human resource management | online advertising, Branding | SEO | Pub lishing | Social media | SEM | Web designing | HTML | Photoshop | Facebook, brand manager | account manager | client servicing | advertising | account management, Social media mark eting | Marketing campaigns | Management | Marketing Executive, Social media marketing, S ocial Media Executive | Interpersonal skills | Typing speed | E-commerce | Troubleshooti ng | MIN, events | activation | event operations | event manager | vendor management | Even t Management | Operations Manager | Btl Activation | Btl,BPO | Online Branding | customer relationship | Digital Marketing | kpo | internet marketing | part time | Freelancer | Onl ine Marketing | Fresher | Web Marketing | Business Development | seo, Marketing Strategy | Twitter | Facebook | Brand Campaigns | Social Media | Customer Engagement | Buyer Activit ies | Customer Service, Online Promotion | BPO | online marketing | Freelancer | Internet Marketing | MBA Fresher | web marketing | Business Development | Part Time, Manager Quali ty Assurance | Sales process | Event Coordinator | Supervisor | Packaging | Room | Managem ent,Copy Writing | Content Writing | Proof Reading | Social Media | SEO | Digital Marketi ng | English Language | Customer Care | Content | content writer | content developer | con tent editor creative writer creative content, Business operations design studio A dvertising | Executive, photoshop | corel draw | 2d graphics | 3d graphics, Team Managemen t | Channel Partners | Customer Relationship | Project Sales | Client Relationship Manag ement | New Business Development | Strategy Formulation | Sales Management | Marketing | Client Handling, SEO | Social media | Content writing | Analytical skills | Customer mana gement| Head Business Development| Management| Basic| Relationship, marketing| bdm| c lient servicing client interaction sales coordination back office fresher opera tion| excel| mis| email| marketing executive| client onboarding,digital marketing| m arketing strategy| marketing communication| marketing analysis| client servicing| ma rketing initiatives, market research | customer profiling | sales executive | marketing

## What is the Average salary offered in the top 10 cities?

# What is the Average salary offered by the top 10 Industries in the top 5 locations?

```
In [24]: top_20_city_data['Industry'].value_counts()[:10].mean()
Out[24]: 1535.4
```