COMPETITOR_DIGITIAL_ADVERTISING_INTELLIGENCE_ANALYSI

April 4, 2025

```
[1]: from google.colab import drive
    drive.mount('/content/drive')

Mounted at /content/drive

[2]: import pandas as pd
    import numpy as np
    import matplotlib.pyplot as plt
    import seaborn as sns
```

0.0.1 DATA EXTRACTION

```
[]: import requests
     API_KEY = 'a73e9612bb5cdd0625570da6ce7bea8f5518e98bd47e5f237ac8ea638fb699e5'
     query = "zoho.com"
     region = '2566'
     params = {
         "engine": "google_ads_transparency_center",
         "api_key": API_KEY,
         "text": query,
         "region": region # Nigeria's code in this example
     }
     def fetch_all_ads(params):
         url = "https://serpapi.com/search"
         all ads = []
         while True:
             response = requests.get(url, params=params)
             if response.status_code != 200:
                 print("Error:", response.text)
                 break
             data = response.json()
```

```
if "ad_creatives" in data:
                 all_ads.extend(data["ad_creatives"])
             # Check if there's a next_page_token for more results
             pagination = data.get("serpapi_pagination", {})
             next_token = pagination.get("next_page_token")
             if next token:
                 params["next_page_token"] = next_token
             else:
                 break
        return all ads
     ads_data = fetch_all_ads(params)
     print("Total ads fetched:", len(ads_data))
    Total ads fetched: 352
[]: # Create a DataFrame using only the ad creatives data
     zoho_df = pd.DataFrame(ads_data)
     # first 5 rows of the dataframe
     zoho_df.head()
[]:
                 advertiser_id
                                                                    ad_creative_id \
                                                advertiser
                                Zoho Corporation Pvt. Ltd.
     O AR07034216898162065409
                                                            CR05256056336893870081
                                Zoho Corporation Pvt. Ltd.
     1 AR07034216898162065409
                                                            CR10240843776322961409
                                Zoho Corporation Pvt. Ltd.
     2 AR07034216898162065409
                                                            CR03269618964468072449
     3 AR07034216898162065409
                                Zoho Corporation Pvt. Ltd.
                                                            CR02979166578395840513
     4 AR07034216898162065409
                               Zoho Corporation Pvt. Ltd.
                                                            CR08183638897775869953
       format target domain
                                                                         image \
        text
                   zoho.com
                            https://tpc.googlesyndication.com/archive/simg...
     0
                            https://tpc.googlesyndication.com/archive/simg...
        text
     1
                   zoho.com
                   zoho.com https://tpc.googlesyndication.com/archive/simg...
        text
                            https://tpc.googlesyndication.com/archive/simg...
     3 image
                   zoho.com
                   zoho.com https://tpc.googlesyndication.com/archive/simg...
     4 image
       width height total_days_shown first_shown last_shown \
     0 380.0
               199.0
                                          1739782436 1743673892
                                     46
     1 380.0
               199.0
                                    536
                                          1697522348 1743673613
     2 380.0
               132.0
                                   1194
                                          1635145200 1743673523
     3 320.0
               480.0
                                    320
                                          1716185667
                                                      1743673303
     4 300.0
               250.0
                                    320
                                          1716185418 1743672150
                                             details_link link
     0 https://adstransparency.google.com/advertiser/... NaN
     1 https://adstransparency.google.com/advertiser/... NaN
```

```
3 https://adstransparency.google.com/advertiser/...
     4 https://adstransparency.google.com/advertiser/...
[]: zoho_df.info()
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 352 entries, 0 to 351
    Data columns (total 13 columns):
         Column
                            Non-Null Count
                                            Dtype
         _____
                            _____
     0
         advertiser_id
                            352 non-null
                                            object
     1
         advertiser
                            352 non-null
                                            object
     2
         ad_creative_id
                            352 non-null
                                            object
     3
         format
                            352 non-null
                                            object
     4
                                            object
         target_domain
                            352 non-null
     5
         image
                            327 non-null
                                            object
     6
         width
                            327 non-null
                                            float64
     7
         height
                            327 non-null
                                            float64
         total_days_shown
                           352 non-null
                                            int64
         first shown
                            352 non-null
                                            int64
         last_shown
                            352 non-null
                                            int64
     11
         details_link
                            352 non-null
                                            object
     12
         link
                            25 non-null
                                            object
    dtypes: float64(2), int64(3), object(8)
    memory usage: 35.9+ KB
[]: cond = (zoho_df.width.isna())
     check = zoho_df[cond]
[]:|
     check
[]:
                   advertiser_id
                                                     advertiser \
     8
          AR07034216898162065409
                                     Zoho Corporation Pvt. Ltd.
     41
          AR07034216898162065409
                                     Zoho Corporation Pvt. Ltd.
          AR07034216898162065409
     51
                                     Zoho Corporation Pvt. Ltd.
     55
          AR07034216898162065409
                                     Zoho Corporation Pvt. Ltd.
     68
                                     Zoho Corporation Pvt. Ltd.
          AR07034216898162065409
     73
          AR07034216898162065409
                                     Zoho Corporation Pvt. Ltd.
     181
         AR07034216898162065409
                                     Zoho Corporation Pvt. Ltd.
     182
         AR07034216898162065409
                                     Zoho Corporation Pvt. Ltd.
     184
          AR07034216898162065409
                                     Zoho Corporation Pvt. Ltd.
     185
         AR07034216898162065409
                                     Zoho Corporation Pvt. Ltd.
     186 AR07034216898162065409
                                     Zoho Corporation Pvt. Ltd.
     187
         AR07034216898162065409
                                     Zoho Corporation Pvt. Ltd.
                                     Zoho Corporation Pvt. Ltd.
     188 AR07034216898162065409
     195 AR07034216898162065409
                                     Zoho Corporation Pvt. Ltd.
```

2 https://adstransparency.google.com/advertiser/...

```
196
     AR07034216898162065409
                                 Zoho Corporation Pvt. Ltd.
209
                                 Zoho Corporation Pvt. Ltd.
     AR07034216898162065409
250
     AR07034216898162065409
                                 Zoho Corporation Pvt. Ltd.
261
     AR07758168442317832193
                              Grey Couch Conversations LLC
                                 Zoho Corporation Pvt. Ltd.
262
     AR07034216898162065409
270
     AR07034216898162065409
                                 Zoho Corporation Pvt. Ltd.
                                 Zoho Corporation Pvt. Ltd.
271
     AR07034216898162065409
272
     AR07034216898162065409
                                 Zoho Corporation Pvt. Ltd.
273
                                 Zoho Corporation Pvt. Ltd.
     AR07034216898162065409
278
                                 Zoho Corporation Pvt. Ltd.
     AR07034216898162065409
                                 Zoho Corporation Pvt. Ltd.
309
     AR07034216898162065409
             ad_creative_id format target_domain image
                                                           width
                                                                   height
8
     CR13202282344628617217
                              video
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
41
     CR15158580213551464449
                              video
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
51
     CR11415666710741516289
                              video
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
55
                              video
     CR15090753883854602241
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
68
     CR01600023425412235265
                              video
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
73
     CR17736434909053976577
                              video
                                                      NaN
                                                              NaN
                                                                      NaN
                                          zoho.com
181
                              video
     CR14250198066421301249
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
182
     CR14151737624787681281
                              video
                                          zoho.com
                                                      NaN
                                                             NaN
                                                                      NaN
184
     CR04743064206109048833
                              video
                                          zoho.com
                                                      NaN
                                                             NaN
                                                                      NaN
185
     CR14666869130322247681
                              video
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
186
     CR08919722264253956097
                              video
                                          zoho.com
                                                      NaN
                                                             NaN
                                                                      NaN
187
                              video
     CR01838884973562560513
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
188
     CR07248834025941368833
                              video
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
195
     CR03227499250988351489
                              video
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
196
     CR01138272676830248961
                              video
                                          zoho.com
                                                      NaN
                                                             NaN
                                                                      NaN
209
     CR04917321079531241473
                              video
                                          zoho.com
                                                      NaN
                                                             NaN
                                                                      NaN
250
     CR09141607782368149505
                              video
                                                      NaN
                                                              NaN
                                          zoho.com
                                                                      NaN
261
     CR17770527895593156609
                              video
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
262
     CR13344450984806449153
                              video
                                                      NaN
                                          zoho.com
                                                              NaN
                                                                      NaN
270
     CR15502844811810963457
                              video
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
271
     CR04755549590139174913
                              video
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
272
     CR03271182504362508289
                              video
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
273
     CR17768606705182048257
                              video
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
278
     CR18430381794500018177
                               image
                                          zoho.com
                                                      NaN
                                                              NaN
                                                                      NaN
309
     CR02035235433633284097
                               image
                                          zoho.com
                                                      NaN
                                                             NaN
                                                                      NaN
     total_days_shown
                        first_shown
                                      last_shown
8
                    12
                         1715584622
                                      1743671040
41
                    55
                         1738941430
                                      1743653299
51
                    55
                         1738945763
                                      1743645912
55
                    28
                         1741107610
                                      1743644331
68
                    30
                         1741107894
                                      1743633614
73
                    29
                         1741108124
                                      1743632259
181
                    30
                         1738699965
                                      1741199495
```

```
182
                    30
                         1738698681
                                      1741196243
184
                    56
                         1734074595
                                      1738823712
185
                    56
                         1734074665
                                      1738823625
186
                    56
                         1734074820
                                      1738823594
187
                    56
                         1734074325
                                      1738823043
188
                    56
                         1734074663
                                      1738821967
195
                   150
                         1721113200
                                      1734014071
196
                   150
                         1721130089
                                      1734014016
209
                         1722257130
                   136
                                      1733980828
250
                     9
                         1715584622
                                      1724867702
261
                     4
                         1723329329
                                      1723589178
262
                    12
                         1722264031
                                      1723199873
270
                    29
                         1700738855
                                      1719915708
271
                   223
                         1700739154
                                      1719915705
272
                   223
                         1700737758
                                      1719915665
273
                   223
                         1700739577
                                      1719915586
278
                   76
                         1710839466
                                      1717413565
309
                     7
                         1715666105
                                      1716181737
                                            details_link \
8
     https://adstransparency.google.com/advertiser/...
41
     https://adstransparency.google.com/advertiser/...
51
     https://adstransparency.google.com/advertiser/...
55
     https://adstransparency.google.com/advertiser/...
68
     https://adstransparency.google.com/advertiser/...
73
     https://adstransparency.google.com/advertiser/...
     https://adstransparency.google.com/advertiser/...
181
182
     https://adstransparency.google.com/advertiser/...
184
     https://adstransparency.google.com/advertiser/...
    https://adstransparency.google.com/advertiser/...
185
186
     https://adstransparency.google.com/advertiser/...
187
     https://adstransparency.google.com/advertiser/...
     https://adstransparency.google.com/advertiser/...
188
     https://adstransparency.google.com/advertiser/...
195
196
     https://adstransparency.google.com/advertiser/...
209
     https://adstransparency.google.com/advertiser/...
250
     https://adstransparency.google.com/advertiser/...
261
     https://adstransparency.google.com/advertiser/...
     https://adstransparency.google.com/advertiser/...
262
270
     https://adstransparency.google.com/advertiser/...
271
     https://adstransparency.google.com/advertiser/...
272
     https://adstransparency.google.com/advertiser/...
273
     https://adstransparency.google.com/advertiser/...
278
     https://adstransparency.google.com/advertiser/...
309
     https://adstransparency.google.com/advertiser/...
```

link

```
8
          https://displayads-formats.googleusercontent.c...
     41
          https://displayads-formats.googleusercontent.c...
     51
          https://displayads-formats.googleusercontent.c...
     55
          https://displayads-formats.googleusercontent.c...
     68
          https://displayads-formats.googleusercontent.c...
          https://displayads-formats.googleusercontent.c...
     73
         https://displayads-formats.googleusercontent.c...
     181
         https://displayads-formats.googleusercontent.c...
     182
     184
         https://displayads-formats.googleusercontent.c...
         https://displayads-formats.googleusercontent.c...
         https://displayads-formats.googleusercontent.c...
     186
         https://displayads-formats.googleusercontent.c...
     188
         https://displayads-formats.googleusercontent.c...
     195
         https://displayads-formats.googleusercontent.c...
     196 https://displayads-formats.googleusercontent.c...
     209
         https://displayads-formats.googleusercontent.c...
     250 https://displayads-formats.googleusercontent.c...
     261
         https://displayads-formats.googleusercontent.c...
     262 https://displayads-formats.googleusercontent.c...
     270 https://displayads-formats.googleusercontent.c...
     271 https://displayads-formats.googleusercontent.c...
     272 https://displayads-formats.googleusercontent.c...
     273 https://displayads-formats.googleusercontent.c...
     278 https://displayads-formats.googleusercontent.c...
     309
         https://displayads-formats.googleusercontent.c...
[]: # filling missing values
     zoho df.fillna({"link": "not available", "image": "not available", "width": 0,,,
      →"height": 0}, inplace=True)
[]: zoho_df.info()
    <class 'pandas.core.frame.DataFrame'>
```

RangeIndex: 352 entries, 0 to 351 Data columns (total 13 columns):

	• • • • • • • • • • • • • • • • • • • •		
#	Column	Non-Null Count	Dtype
0	advertiser_id	352 non-null	object
1	advertiser	352 non-null	object
2	ad_creative_id	352 non-null	object
3	format	352 non-null	object
4	target_domain	352 non-null	object
5	image	352 non-null	object
6	width	352 non-null	float64
7	height	352 non-null	float64
8	total_days_shown	352 non-null	int64
9	first shown	352 non-null	int64

```
10 last_shown 352 non-null int64
11 details_link 352 non-null object
12 link 352 non-null object
dtypes: float64(2), int64(3), object(8)
memory usage: 35.9+ KB
```

0.0.2 Vend(Lightspeed)

```
[]: import requests
     API KEY = 'a73e9612bb5cdd0625570da6ce7bea8f5518e98bd47e5f237ac8ea638fb699e5'
     query = "lightspeedhq.com"
     region = '2566'
     params = {
         "engine": "google_ads_transparency_center",
         "api_key": API_KEY,
         "text": query,
         "region": region # Nigeria's code in this example
     }
     def fetch_all_ads(params):
         url = "https://serpapi.com/search"
         all_ads = []
         while True:
             response = requests.get(url, params=params)
             if response.status_code != 200:
                 print("Error:", response.text)
                 break
             data = response.json()
             if "ad_creatives" in data:
                 all_ads.extend(data["ad_creatives"])
             # Check if there's a next_page_token for more results
             pagination = data.get("serpapi_pagination", {})
             next_token = pagination.get("next_page_token")
             if next_token:
                 params["next_page_token"] = next_token
             else:
                 break
         return all_ads
     ads_data = fetch_all_ads(params)
     print("Total ads fetched:", len(ads_data))
```

Total ads fetched: 1

```
[]: # Create a DataFrame using only the ad creatives data
    vend_df = pd.DataFrame(ads_data)
     # first 5 rows of the dataframe
    vend_df.head()
[]:
                advertiser_id
                                             advertiser
                                                                 ad_creative_id \
    O AR10603491951300837377 Lightspeed Commerce Inc.
                                                         CR06543312581589729281
      format
                 target_domain
                                                                            image \
        text lightspeedhq.com https://tpc.googlesyndication.com/archive/simg...
       width height total_days_shown first_shown last_shown \
         380
                                         1660374000 1743617603
    0
                 199
                                   843
                                            details_link
    0 https://adstransparency.google.com/advertiser/...
[ ]: vend_df.info()
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 1 entries, 0 to 0
    Data columns (total 12 columns):
                          Non-Null Count
         Column
                                          Dtype
    --- ----
                           _____
         advertiser id
                          1 non-null
                                           object
     1
         advertiser
                          1 non-null
                                           object
     2
        ad_creative_id
                          1 non-null
                                           object
     3
        format
                          1 non-null
                                           object
     4
        target_domain
                          1 non-null
                                           object
     5
        image
                           1 non-null
                                           object
     6
        width
                           1 non-null
                                           int64
     7
                          1 non-null
        height
                                           int64
        total_days_shown 1 non-null
                                           int64
         first_shown
                           1 non-null
                                           int.64
     10 last_shown
                           1 non-null
                                           int64
     11 details_link
                           1 non-null
                                          object
    dtypes: int64(5), object(7)
    memory usage: 228.0+ bytes
    0.0.3 Square Pos
[]: import requests
    API_KEY = 'a73e9612bb5cdd0625570da6ce7bea8f5518e98bd47e5f237ac8ea638fb699e5'
    query = "squareup.com"
    region = '2566'
```

```
params = {
    "engine": "google_ads_transparency_center",
    "api_key": API_KEY,
    "text": query,
    "region": region # Nigeria's code in this example
}
def fetch_all_ads(params):
    url = "https://serpapi.com/search"
    all_ads = []
    while True:
        response = requests.get(url, params=params)
        if response.status_code != 200:
             print("Error:", response.text)
             break
        data = response.json()
        if "ad_creatives" in data:
             all_ads.extend(data["ad_creatives"])
        # Check if there's a next_page_token for more results
        pagination = data.get("serpapi_pagination", {})
        next_token = pagination.get("next_page_token")
        if next token:
             params["next_page_token"] = next_token
        else:
             break
    return all_ads
ads_data = fetch_all_ads(params)
print("Total ads fetched:", len(ads_data))
Total ads fetched: 86
```

```
[]: # Create a DataFrame using only the ad_creatives data
square_df = pd.DataFrame(ads_data)

# first 5 rows of the dataframe
square_df.head()
```

```
[]:
                advertiser_id
                                      advertiser
                                                          ad_creative_id format \
    0 AR04722834171410513921
                                MightyHive, INC.
                                                  CR06611493727124848641 video
    1 AR14896030700992987137
                                          Square CR07106127312260694017
                                                                         image
    2 AR14896030700992987137
                                          Square CR17054888556264161281
                                                                          text
    3 AR05698947849719382017 Rocketgenius, Inc.
                                                  CR05922805754254852097
                                                                          text
```

4 AR14896030700992987137

Square CR07355796578675720193 image

```
target_domain
                                                             image width \
0 squareup.com https://tpc.googlesyndication.com/archive/simg... 648.0
                https://s0.2mdn.net/9598779/RST_USEN_Programma...
1 squareup.com
                https://tpc.googlesyndication.com/archive/simg...
2 squareup.com
3 squareup.com https://tpc.googlesyndication.com/archive/simg...
4 squareup.com
                                                               NaN
                                                                      NaN
          total_days_shown first_shown last_shown
  height
   478.0
0
                              1725895800 1743663600
                        207
1
   250.0
                         92
                              1735858800 1743663600
2
   199.0
                        546
                              1696563220 1743659906
3
   239.0
                         17
                              1742221830 1743654920
                        204
                              1725946200 1743647400
     NaN
                                        details_link \
0 https://adstransparency.google.com/advertiser/...
1 https://adstransparency.google.com/advertiser/...
2 https://adstransparency.google.com/advertiser/...
3 https://adstransparency.google.com/advertiser/...
4 https://adstransparency.google.com/advertiser/...
                                                link
0
                                                 NaN
1
                                                 NaN
2
                                                 NaN
3
                                                 NaN
 https://displayads-formats.googleusercontent.c...
```

[]: square_df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 86 entries, 0 to 85
Data columns (total 13 columns):

#	Column	Non-Null Count	Dtype
0	advertiser_id	86 non-null	object
1	advertiser	86 non-null	object
2	ad_creative_id	86 non-null	object
3	format	86 non-null	object
4	target_domain	86 non-null	object
5	image	14 non-null	object
6	width	14 non-null	float64
7	height	14 non-null	float64
8	total_days_shown	86 non-null	int64
9	first shown	86 non-null	int64

```
10
         last_shown
                            86 non-null
                                              int64
     11
         details_link
                            86 non-null
                                             object
     12
         link
                            72 non-null
                                              object
    dtypes: float64(2), int64(3), object(8)
    memory usage: 8.9+ KB
[]: cond = (square_df.link.isna())
     check = square_df[cond]
[]:
     check
[]:
                   advertiser_id
                                              advertiser
                                                                   ad_creative_id
     0
         AR04722834171410513921
                                        MightyHive, INC.
                                                           CR06611493727124848641
         AR14896030700992987137
     1
                                                  Square
                                                           CR07106127312260694017
     2
         AR14896030700992987137
                                                  Square
                                                           CR17054888556264161281
     3
         AR05698947849719382017
                                      Rocketgenius, Inc.
                                                           CR05922805754254852097
     12
                                                  Square
         AR14896030700992987137
                                                           CR13803824383090753537
     13
         AR14896030700992987137
                                                  Square
                                                           CR13820994356670103553
     20
         AR13692503641141805057
                                  Mr Carpet Cleaner Ltd
                                                           CR13973191642404880385
     68
         AR14896030700992987137
                                                  Square
                                                           CR02645102682083164161
     80
         AR14896030700992987137
                                                  Square
                                                           CR10191278891654447105
                                            Brad A Paige
     81
         AR13353888419525165057
                                                           CR13382379583299387393
     82
         AR16951853287265533953
                                        Brad Allen Paige
                                                           CR04455288220317384705
         AR16951853287265533953
                                        Brad Allen Paige
                                                           CR00861195506112528385
     83
     84
         AR16951853287265533953
                                        Brad Allen Paige
                                                           CR06172561899268341761
         AR16951853287265533953
                                        Brad Allen Paige
                                                           CR17913500278770892801
        format target_domain
                                                                              image
     0
         video
                squareup.com
                               https://tpc.googlesyndication.com/archive/simg...
     1
                               https://s0.2mdn.net/9598779/RST_USEN_Programma...
         image
                squareup.com
     2
                               https://tpc.googlesyndication.com/archive/simg...
          text
                squareup.com
                               https://tpc.googlesyndication.com/archive/simg...
     3
          text
                squareup.com
                               https://s0.2mdn.net/9598779/RST_USEN_Programma...
     12
         image
                squareup.com
     13
                squareup.com
                               https://s0.2mdn.net/9598779/RST_USEN_Programma...
         image
     20
                               https://tpc.googlesyndication.com/archive/simg...
          text
                squareup.com
                               https://tpc.googlesyndication.com/archive/simg...
     68
                squareup.com
          text
                               https://s0.2mdn.net//8701942/87da3f9c-9b8e-4fb...
     80
         image
                squareup.com
                               https://tpc.googlesyndication.com/archive/simg...
     81
          text
                 squareup.com
                               https://tpc.googlesyndication.com/archive/simg...
     82
                squareup.com
          text
     83
                               https://tpc.googlesyndication.com/archive/simg...
          text
                 squareup.com
                               https://tpc.googlesyndication.com/archive/simg...
     84
         image
                squareup.com
     85
         image
                squareup.com
                               https://tpc.googlesyndication.com/archive/simg...
         width
                height
                         total_days_shown
                                            first_shown
                                                          last_shown
     0
         648.0
                 478.0
                                       207
                                             1725895800
                                                          1743663600
     1
         300.0
                  250.0
                                        92
                                             1735858800
                                                          1743663600
```

1696563220

1743659906

546

2

380.0

199.0

```
3
         380.0
                 239.0
                                      17
                                           1742221830
                                                       1743654920
     12 300.0
                 250.0
                                      91
                                           1735858800
                                                       1743593400
     13
        300.0
                 250.0
                                      91
                                           1735858800
                                                       1743589800
         380.0
     20
                 147.0
                                      67
                                           1733089418
                                                       1739090826
     68
        380.0
                 167.0
                                     812
                                           1654905026
                                                       1727782795
        333.0
     80
                 333.0
                                     238
                                           1699309800
                                                       1719813600
     81
        380.0
                 147.0
                                           1713279244 1713652615
                                       5
        380.0
     82
                 147.0
                                      75
                                           1689974767
                                                       1713221336
        380.0
                                     281
     83
                 153.0
                                           1635145200 1713055440
     84
        300.0
                 600.0
                                       3
                                           1712263031
                                                       1712430972
     85
        300.0
                 600.0
                                       5
                                           1711053193 1712263771
                                              details link link
     0
        https://adstransparency.google.com/advertiser/...
        https://adstransparency.google.com/advertiser/...
     1
         https://adstransparency.google.com/advertiser/...
     2
                                                          {\tt NaN}
         https://adstransparency.google.com/advertiser/...
     3
                                                          {\tt NaN}
     12
        https://adstransparency.google.com/advertiser/...
                                                          {\tt NaN}
        https://adstransparency.google.com/advertiser/... NaN
     20
        https://adstransparency.google.com/advertiser/...
        https://adstransparency.google.com/advertiser/...
     68
                                                          {\tt NaN}
        https://adstransparency.google.com/advertiser/... NaN
     80
     81
        https://adstransparency.google.com/advertiser/... NaN
        https://adstransparency.google.com/advertiser/... NaN
     82
     83
        https://adstransparency.google.com/advertiser/...
        https://adstransparency.google.com/advertiser/... NaN
        https://adstransparency.google.com/advertiser/... NaN
[]: # filling missing values
     square_df.fillna({"link": "not_available", "image": "not_available", "width": ___
      []: square_df.info()
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 86 entries, 0 to 85
    Data columns (total 13 columns):
```

Data	COLUMNIS (COURT 13	Columns (Cotal 15 Columns).				
#	Column	Non-Null Count	Dtype			
0	advertiser_id	86 non-null	object			
1	advertiser	86 non-null	object			
2	ad_creative_id	86 non-null	object			
3	format	86 non-null	object			
4	target_domain	86 non-null	object			
5	image	86 non-null	object			
6	width	86 non-null	float64			
7	height	86 non-null	float64			

```
total_days_shown 86 non-null
     9
                          86 non-null
                                           int64
         first_shown
     10 last_shown
                           86 non-null
                                           int64
     11 details_link
                          86 non-null
                                           object
     12 link
                           86 non-null
                                           object
    dtypes: float64(2), int64(3), object(8)
    memory usage: 8.9+ KB
[]:
```

int64

0.0.4 INFLOW

8

```
[]: import requests
     API_KEY = 'a73e9612bb5cdd0625570da6ce7bea8f5518e98bd47e5f237ac8ea638fb699e5'
     query = "inflowinventory.com"
     region = '2566'
     params = {
         "engine": "google_ads_transparency_center",
         "api_key": API_KEY,
         "text": query,
         "region": region # Nigeria's code in this example
     }
     def fetch_all_ads(params):
         url = "https://serpapi.com/search"
         all_ads = []
         while True:
             response = requests.get(url, params=params)
             if response.status_code != 200:
                 print("Error:", response.text)
                 break
             data = response.json()
             if "ad_creatives" in data:
                 all_ads.extend(data["ad_creatives"])
             # Check if there's a next_page_token for more results
             pagination = data.get("serpapi_pagination", {})
             next_token = pagination.get("next_page_token")
             if next_token:
                 params["next_page_token"] = next_token
             else:
                 break
         return all ads
```

```
ads_data = fetch_all_ads(params)
     print("Total ads fetched:", len(ads_data))
    Total ads fetched: 2
[]: # Create a DataFrame using only the ad_creatives data
     inflow_df = pd.DataFrame(ads_data)
     # first 5 rows of the dataframe
     inflow_df.head()
[]:
                 advertiser_id
                                        advertiser
                                                            ad_creative_id format
     O AR00936138356100694017
                                Archon Systems Inc
                                                    CR15129661666171551745
                                                                              text
     1 AR00188580400375791617 Archon Systems Inc
                                                    CR10089892340341669889
                                                                            image
              target_domain
                                                                          image \
      inflowinventory.com https://tpc.googlesyndication.com/archive/simg...
     1 inflowinventory.com https://tpc.googlesyndication.com/archive/simg...
       width height total_days_shown first_shown last_shown \
     0
          380
                  239
                                    856
                                          1660460400
                                                      1743620350
          300
                  600
     1
                                    461
                                          1660374000 1738593541
                                             details_link
     0 https://adstransparency.google.com/advertiser/...
     1 https://adstransparency.google.com/advertiser/...
[]: inflow_df.info()
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 2 entries, 0 to 1
    Data columns (total 12 columns):
     #
         Column
                           Non-Null Count
                                           Dtype
     0
         advertiser_id
                           2 non-null
                                            object
                           2 non-null
     1
         advertiser
                                            object
         ad_creative_id
                           2 non-null
                                           object
     3
         format
                           2 non-null
                                            object
     4
        target_domain
                           2 non-null
                                            object
     5
                           2 non-null
         image
                                           object
     6
         width
                           2 non-null
                                            int64
     7
         height
                           2 non-null
                                            int64
         total_days_shown 2 non-null
                                            int64
         first_shown
                           2 non-null
                                            int64
     10 last shown
                           2 non-null
                                            int64
     11 details_link
                           2 non-null
                                           object
    dtypes: int64(5), object(7)
```

```
memory usage: 324.0+ bytes
```

[]:

0.0.5 odoo

```
[]: import requests
     API KEY = 'a73e9612bb5cdd0625570da6ce7bea8f5518e98bd47e5f237ac8ea638fb699e5'
     query = "odoo.com"
     region = '2566'
     params = {
         "engine": "google_ads_transparency_center",
         "api_key": API_KEY,
         "text": query,
         "region": region # Nigeria's code in this example
     }
     def fetch_all_ads(params):
         url = "https://serpapi.com/search"
         all_ads = []
         while True:
             response = requests.get(url, params=params)
             if response.status_code != 200:
                 print("Error:", response.text)
                 break
             data = response.json()
             if "ad_creatives" in data:
                 all_ads.extend(data["ad_creatives"])
             # Check if there's a next_page_token for more results
             pagination = data.get("serpapi_pagination", {})
             next_token = pagination.get("next_page_token")
             if next_token:
                 params["next_page_token"] = next_token
             else:
                 break
         return all_ads
     ads_data = fetch_all_ads(params)
     print("Total ads fetched:", len(ads_data))
```

Total ads fetched: 145

```
[]: # Create a DataFrame using only the ad_creatives data
     odoo_df = pd.DataFrame(ads_data)
     # first 5 rows of the dataframe
     odoo_df.head()
[]:
                                                        ad_creative_id format \
                 advertiser_id
                                    advertiser
        AR13734029429363965953
                                    OpenERP SA
                                                CR04640816221795647489
                                                                          text
       AR13734029429363965953
                                    OpenERP SA
                                                CR01233947969611366401
     1
                                                                          text
     2 AR13734029429363965953
                                    OpenERP SA
                                                CR01402260230338772993
                                                                          text
     3 AR13353130495236374529
                                e-atlete bvba
                                                CR04728542286026113025
                                                                         image
     4 AR13734029429363965953
                                    OpenERP SA
                                                CR17412179670073344001
                                                                          text
       target_domain
                                                                    image width \
     0
            odoo.com https://tpc.googlesyndication.com/archive/simg...
                                                                         380.0
            odoo.com https://tpc.googlesyndication.com/archive/simg...
     1
                                                                         380.0
     2
            odoo.com https://tpc.googlesyndication.com/archive/simg...
                                                                         380.0
     3
            odoo.com https://tpc.googlesyndication.com/archive/simg...
                                                                         300.0
     4
            odoo.com https://tpc.googlesyndication.com/archive/simg...
                                                                         380.0
        height
                total_days_shown first_shown last_shown
                                    1733415312
     0
         173.0
                                                1743674085
                             119
     1
         265.0
                             119
                                    1733415465
                                               1743673956
     2
         173.0
                             1256
                                    1635145200
                                                1743673929
     3
         600.0
                             478
                                                1743673228
                                    1697791711
         199.0
                             500
                                    1700517813
                                               1743672408
                                              details_link link
     0 https://adstransparency.google.com/advertiser/... NaN
     1 https://adstransparency.google.com/advertiser/...
     2 https://adstransparency.google.com/advertiser/...
     3 https://adstransparency.google.com/advertiser/...
     4 https://adstransparency.google.com/advertiser/...
[]: odoo_df.info()
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 145 entries, 0 to 144
    Data columns (total 13 columns):
         Column
                            Non-Null Count
                                            Dtype
     0
         advertiser_id
                            145 non-null
                                            object
     1
         advertiser
                            145 non-null
                                            object
     2
         ad_creative_id
                            145 non-null
                                            object
     3
         format
                            145 non-null
                                            object
     4
         target_domain
                            145 non-null
                                            object
         image
                            128 non-null
                                            object
```

```
width
                           128 non-null
                                            float64
     6
     7
                                            float64
         height
                           128 non-null
         total_days_shown 145 non-null
                                            int64
         first_shown
                           145 non-null
                                            int64
         last shown
     10
                           145 non-null
                                            int64
     11
         details link
                           145 non-null
                                            object
     12 link
                           17 non-null
                                            object
    dtypes: float64(2), int64(3), object(8)
    memory usage: 14.9+ KB
[]: # filling missing values
     odoo_df.fillna({"link": "not_available", "image": "not_available", "width": 0, u
      →"height": 0}, inplace=True)
[]: odoo_df.info()
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 145 entries, 0 to 144
    Data columns (total 13 columns):
         Column
                           Non-Null Count
                                           Dtype
                           _____
         ____
     0
         advertiser_id
                           145 non-null
                                            object
         advertiser
     1
                           145 non-null
                                            object
     2
         ad_creative_id
                           145 non-null
                                            object
     3
         format
                           145 non-null
                                            object
     4
         target_domain
                           145 non-null
                                            object
     5
         image
                           145 non-null
                                            object
     6
         width
                                            float64
                           145 non-null
     7
         height
                           145 non-null
                                            float64
         total_days_shown 145 non-null
                                            int64
         first_shown
                           145 non-null
                                            int64
     10
        last shown
                           145 non-null
                                            int64
     11
         details_link
                           145 non-null
                                            object
     12 link
                           145 non-null
                                            object
    dtypes: float64(2), int64(3), object(8)
    memory usage: 14.9+ KB
    0.0.6 saving to csv files
[]: odoo_df.to_csv("odoo.csv")
     inflow df.to csv("inflow.csv")
     square df.to csv("square.csv")
     vend_df.to_csv("vend.csv")
     zoho_df.to_csv("zoho.csv")
```

0.0.7 INITIAL DATA EXPLORATION

```
[]: import pandas as pd
     # Assuming these DataFrames already exist
     dfs = [odoo_df, inflow_df, square_df, vend_df, zoho_df]
     # Concatenating all DataFrames
     combined_df = pd.concat(dfs, ignore_index=True)
     # Save to CSV if needed
     combined_df.to_csv("combined_data.csv", index=False)
     # Display first few rows to confirm
     combined_df.head()
[]:
                 advertiser_id
                                   advertiser
                                                       ad_creative_id format
      AR13734029429363965953
                                   OpenERP SA CR04640816221795647489
                                                                         text
     1 AR13734029429363965953
                                   OpenERP SA CR01233947969611366401
                                                                        text
     2 AR13734029429363965953
                                   OpenERP SA CR01402260230338772993
                                                                        text
     3 AR13353130495236374529
                                e-atlete bvba CR04728542286026113025
                                                                       image
     4 AR13734029429363965953
                                   OpenERP SA CR17412179670073344001
                                                                        text
       target_domain
                                                                  image width \
            odoo.com https://tpc.googlesyndication.com/archive/simg...
     0
                                                                       380.0
            odoo.com https://tpc.googlesyndication.com/archive/simg...
     1
                                                                       380.0
     2
            odoo.com https://tpc.googlesyndication.com/archive/simg...
                                                                       380.0
     3
            odoo.com https://tpc.googlesyndication.com/archive/simg...
                                                                       300.0
            odoo.com https://tpc.googlesyndication.com/archive/simg...
                                                                       380.0
       height
               total_days_shown first_shown last_shown
         173.0
     0
                             119
                                   1733415312 1743674085
         265.0
     1
                             119
                                   1733415465 1743673956
     2
         173.0
                            1256
                                   1635145200 1743673929
     3
         600.0
                             478
                                   1697791711 1743673228
         199.0
                             500
                                   1700517813 1743672408
                                             details_link
                                                                    link
     0 https://adstransparency.google.com/advertiser/... not_available
     1 https://adstransparency.google.com/advertiser/... not_available
     2 https://adstransparency.google.com/advertiser/... not_available
     3 https://adstransparency.google.com/advertiser/... not_available
     4 https://adstransparency.google.com/advertiser/... not_available
[]: combined_df.info()
```

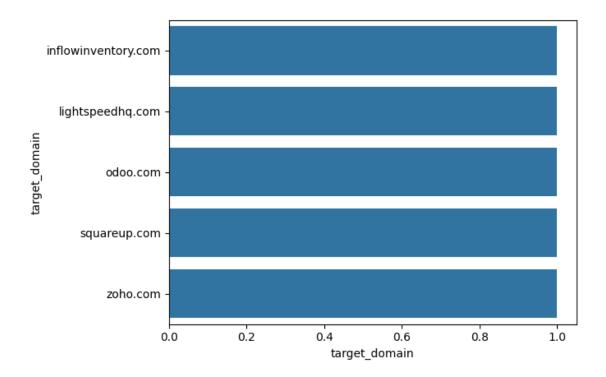
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 586 entries, 0 to 585

```
Data columns (total 13 columns):
     #
         Column
                           Non-Null Count
                                           Dtype
                           _____
     0
         advertiser_id
                           586 non-null
                                            object
     1
         advertiser
                           586 non-null
                                            object
     2
         ad_creative_id
                           586 non-null
                                            object
     3
         format
                           586 non-null
                                            object
     4
         target_domain
                           586 non-null
                                           object
     5
         image
                           586 non-null
                                            object
     6
         width
                           586 non-null
                                           float64
     7
                                           float64
         height
                           586 non-null
     8
         total_days_shown 586 non-null
                                            int64
         first_shown
                           586 non-null
                                            int64
        last_shown
                           586 non-null
                                            int64
     11
         details_link
                           586 non-null
                                            object
     12 link
                           583 non-null
                                            object
    dtypes: float64(2), int64(3), object(8)
    memory usage: 59.6+ KB
[]: # filling missing values
     combined_df.fillna({"link": "not_available"}, inplace=True)
[]: # Convert Unix epoch to datetime for first_shown and last_shown
     combined_df['first_shown'] = pd.to_datetime(combined_df['first_shown'],__

ounit='s')
     combined_df['last_shown'] = pd.to_datetime(combined_df['last_shown'], unit='s')
[]: combined_df.info()
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 586 entries, 0 to 585
    Data columns (total 13 columns):
     #
         Column
                           Non-Null Count
                                           Dtype
         ----
                           -----
     0
         advertiser_id
                           586 non-null
                                            object
     1
         advertiser
                           586 non-null
                                            object
     2
         ad_creative_id
                           586 non-null
                                            object
     3
         format
                           586 non-null
                                            object
     4
         target_domain
                           586 non-null
                                            object
     5
         image
                           586 non-null
                                           object
     6
                           586 non-null
         width
                                           float64
     7
         height
                           586 non-null
                                           float64
     8
         total_days_shown 586 non-null
                                           int64
     9
                                           datetime64[ns]
         first_shown
                           586 non-null
     10
        last_shown
                                            datetime64[ns]
                           586 non-null
     11
         details_link
                           586 non-null
                                            object
     12
         link
                           586 non-null
                                            object
    dtypes: datetime64[ns](2), float64(2), int64(1), object(8)
```

memory usage: 59.6+ KB

```
[]: combined_df.describe()
[]:
                  width
                                       total_days_shown \
                               height
             586.000000
                          586.000000
                                             586.000000
     count
    mean
             352.216724
                          222.354949
                                             411.061433
               0.000000
                            0.000000
    min
                                               3.000000
     25%
             300.000000
                            92.500000
                                              77.000000
     50%
             380.000000
                           173.000000
                                             223.000000
     75%
             380.000000
                           250.000000
                                             711.750000
    max
            1940.000000
                         1200.000000
                                            1256.000000
             280.394769
                           201.881374
                                             409.830792
     std
                               first_shown
                                                                last_shown
                                       586
                                                                       586
     count
            2023-10-10 17:53:40.645051136
                                            2024-12-26 03:22:40.752559616
     mean
     min
                      2021-10-25 07:00:00
                                                       2024-04-04 20:49:31
     25%
            2022-10-15 07:02:02.750000128
                                                       2024-10-04 00:00:00
     50%
               2024-03-19 09:10:04.500000
                                                       2025-03-27 13:05:47
     75%
                                               2025-04-02 18:43:26.500000
            2024-06-03 08:57:57.750000128
                      2025-03-17 14:30:30
                                                      2025-04-03 09:54:45
     max
     std
                                       NaN
                                                                       NaN
[]:
     combined_df.shape
[]: (586, 13)
    0.0.8 target_domain
[]: domain_counts = combined_df.groupby('target_domain')['target_domain'].nunique()
[]: domain_counts
[]: target_domain
     inflowinventory.com
                             1
     lightspeedhq.com
                             1
     odoo.com
                             1
     squareup.com
                             1
     zoho.com
                             1
     Name: target_domain, dtype: int64
[]: sns.barplot(domain_counts, orient="h")
[]: <Axes: xlabel='target_domain', ylabel='target_domain'>
```



0.0.9 AD CREATIVES

Unique Ad Creatives per Competitor:

```
target_domain unique_creatives
   inflowinventory.com
0
                                         2
1
      lightspeedhq.com
                                         1
2
              odoo.com
                                       145
3
          squareup.com
                                        86
4
              zoho.com
                                       352
```

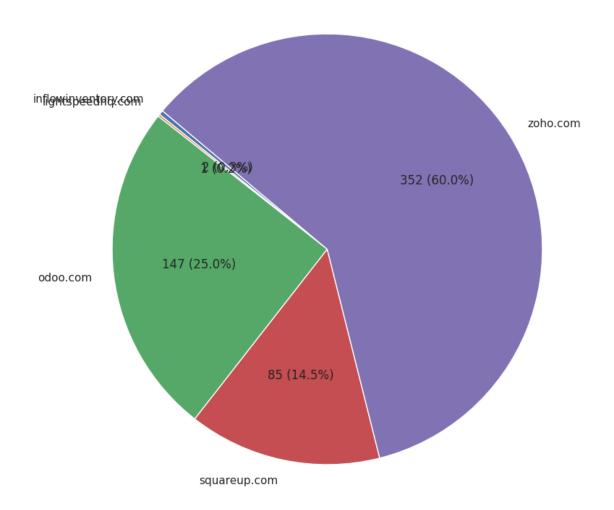
[]:

```
[]: import matplotlib.pyplot as plt

# Data from the unique creatives count
```

```
labels = creative_counts['target_domain']
sizes = creative_counts['unique_creatives']
# Create the pie chart
fig, ax = plt.subplots(figsize=(8, 8))
# Function to format the autopet with both percentage and exact figure
def func(pct, allsizes):
   absolute = int(pct/100.*sum(allsizes)) # calculate absolute number
   return f"{absolute} ({pct:.1f}%)"
# Create pie chart with proper autopct formatting
ax.pie(sizes, labels=labels, autopct=lambda pct: func(pct, sizes),
⇔startangle=140)
# Equal aspect ratio ensures that pie is drawn as a circle
ax.axis('equal')
# Title for the pie chart
plt.title("Unique Ad Creatives per Competitor")
# Show the plot
plt.tight_layout()
plt.show()
```

Unique Ad Creatives per Competitor



0.0.10 TOTAL EXPOSURE

```
df_comp = combined_df[combined_df['target_domain'] == comp]
    # Aggregate distribution metrics for both width and height by ad format
   dist_data = df_comp.groupby('format').agg(
        count=('total_days_shown', 'count'),
        days_shown_avg=('total_days_shown',lambda x: x[x != 0].mean() if not__
 \rightarrow x[x != 0].empty else np.nan),
        days shown min=('total days shown', lambda x: x[x != 0].min() if not__
 \rightarrow x[x != 0].empty else np.nan),
        days_shown_q1=('total_days_shown', lambda x: x[x != 0].quantile(0.25)__
 \rightarrow if not x[x != 0].empty else np.nan),
        days_shown_median=('total_days_shown', lambda x: x[x != 0].median() if
 \rightarrownot x[x != 0].empty else np.nan),
        days shown q3=('total_days_shown', lambda x: x[x != 0].quantile(0.75)_{\sqcup}
 \rightarrowif not x[x != 0].empty else np.nan),
        days_shown_max=('total_days_shown', lambda x: x[x != 0].max() if notu
 \rightarrow x[x != 0].empty else np.nan),
        days_shown_total=('total_days_shown', lambda x: x[x != 0].sum() if not__
 \rightarrow x[x != 0].empty else np.nan)
   ).reset index()
    # Add the target_domain column to the aggregated data
   dist_data['target_domain'] = comp
    # Append the results for this competitor to the list
   distribution_results.append(dist_data)
# Concatenate all competitors' distribution data into a single DataFrame
distribution_days_df = pd.concat(distribution_results, ignore_index=True)
# Reorder columns (if needed)
distribution_days_df = distribution_days_df[['target_domain', 'format',_
 'days_shown_min', 'days_shown_q1',_
 ]]
# Display the resulting DataFrame
distribution_days_df.head()
# (Optional) Save the aggregated distribution metrics to CSV
distribution_days_df.to_csv("ad_creatives_distribution_by_format.csv",_
 →index=False)
```

[]: distribution_days_df

```
[]:
                target_domain format
                                        count
                                                days_shown_avg
                                                                  days_shown_total \
                      odoo.com
                                            9
                                                     138.888889
                                                                               1250
     0
                                image
                                           137
                                                                             111118
     1
                      odoo.com
                                 text
                                                    811.080292
     2
                     odoo.com video
                                             1
                                                     26.000000
                                                                                 26
         inflowinventory.com
     3
                                image
                                             1
                                                    461.000000
                                                                                461
     4
         inflowinventory.com
                                 text
                                             1
                                                    855.000000
                                                                                855
     5
                 squareup.com
                                 image
                                            77
                                                     195.987013
                                                                              15091
     6
                                             7
                                                                               1801
                 squareup.com
                                  text
                                                    257.285714
     7
                                video
                                             1
                                                    205.000000
                                                                                205
                 squareup.com
                                             1
     8
             lightspeedhq.com
                                 text
                                                    843.000000
                                                                                843
     9
                                           190
                                                     136.200000
                                                                              25878
                      zoho.com
                                image
     10
                     zoho.com
                                  text
                                           137
                                                     605.335766
                                                                              82931
                                            25
     11
                                                     71.040000
                                                                               1776
                      zoho.com
                                video
         days_shown_min
                           days_shown_q1
                                           days_shown_median
                                                                days_shown_q3 \
                                     15.0
                                                          19.0
                                                                         165.0
     0
     1
                      22
                                    457.0
                                                         953.0
                                                                        1243.0
     2
                                     26.0
                                                                          26.0
                      26
                                                          26.0
     3
                     461
                                    461.0
                                                         461.0
                                                                         461.0
     4
                     855
                                                                         855.0
                                    855.0
                                                         855.0
     5
                        3
                                    151.0
                                                         203.0
                                                                         241.0
     6
                        5
                                     41.5
                                                          75.0
                                                                         413.0
     7
                      205
                                    205.0
                                                                         205.0
                                                         205.0
     8
                      843
                                    843.0
                                                         843.0
                                                                         843.0
     9
                        7
                                     12.0
                                                         100.0
                                                                         192.0
     10
                       45
                                    389.0
                                                         525.0
                                                                         900.0
                        4
                                     29.0
                                                          54.0
                                                                          56.0
     11
         days_shown_max
     0
                     519
                    1255
     1
     2
                      26
     3
                     461
     4
                     855
     5
                     451
     6
                     812
     7
                     205
     8
                     843
     9
                     645
     10
                    1193
     11
                      223
```

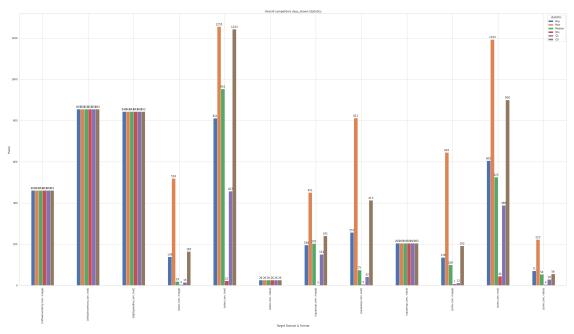
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 84 entries, 0 to 83
Data columns (total 6 columns):

[]: df_pivot.info()

```
Non-Null Count Dtype
        Column
     #
                       -----
        target_domain 84 non-null
     0
                                      object
     1
        format
                      84 non-null
                                      object
     2
        count
                      84 non-null
                                      int64
     3
        statistic
                      84 non-null
                                      object
        value
                      84 non-null
                                      float64
        metric
                      84 non-null
                                      object
    dtypes: float64(1), int64(1), object(4)
    memory usage: 4.1+ KB
[]: df_pivot.head()
[]:
             target_domain format count statistic
                                                      value metric
    0
                 odoo.com
                           image
                                     9
                                             Avg 138.888889 Height
    1
                 odoo.com
                            text
                                    137
                                             Avg 811.080292 Height
    2
                 odoo.com
                                                  26.000000 Height
                           video
                                             Avg
    3 inflowinventory.com
                           image
                                     1
                                             Avg 461.000000 Height
    4 inflowinventory.com
                                     1
                                             Avg 855.000000 Height
                            text
[]: # Pivoting the DataFrame
    df_pivot = distribution_days_df.melt(id_vars=["target_domain", "format",__
     value_vars=['days_shown_avg', 'days_shown_min',_
     var_name="statistic", value_name="value")
    # Extracting metric type (width or height)
    df_pivot["metric"] = "days_shown"
    df_pivot["statistic"] = df_pivot["statistic"].apply(lambda x: x.split("_")[-1].
     ⇔capitalize())
    # Plotting
    fig, axes = plt.subplots(1, 1, figsize=(35, 20), sharey=False)
    sns.set(style="whitegrid")
    for i, metric in enumerate(["days_shown"]):
        pivot_subset = df_pivot[df_pivot["metric"] == metric]
        ax = axes
        plot_data = pivot_subset.pivot(index=["target_domain", "format"],__
     ⇔columns="statistic", values="value")
        plot_data.plot(kind="bar", ax=ax)
        ax.set title(f"Overall competitors {metric} Statistics")
        ax.set_xlabel("Target Domain & Format")
        ax.set_ylabel("Pixels")
```

```
# Annotate bars with values
for container in ax.containers:
    ax.bar_label(container, fmt='%.0f', padding=3)

plt.xticks(rotation=90)
plt.tight_layout()
plt.show()
```

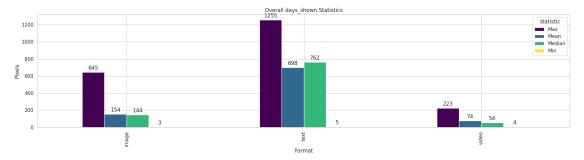


```
[]: # Group the distribution of by 'format', but ignore zero values in the
      \rightarrowaggregation
     grouped_summary = combined_df.groupby('format').agg(
         count=('format', 'count'),
         overall_days_shown_mean = ('total_days_shown', lambda x: x[x != 0].mean()_u
      \rightarrowif not x[x != 0].empty else np.nan),
         overall_days_shown_min = ('total_days_shown', lambda x: x[x != 0].min() if__
      \rightarrownot x[x != 0].empty else np.nan),
         overall_days_shown_median = ('total_days_shown', lambda x: x[x != 0].
      →median() if not x[x != 0].empty else np.nan),
         overall_days_shown_max = ('total_days_shown', lambda x: x[x != 0].max() if__
      \rightarrownot x[x != 0].empty else np.nan),
         overall_days_shown_total = ('total_days_shown', lambda x: x[x != 0].sum()__
      \rightarrowif not x[x != 0].empty else np.nan)
     ).reset_index()
     # (Optional) Save the summary to a CSV file
```

```
grouped_summary.to_csv("grouped_ad_dimension_summary_nonzero_3.csv", __
      →index=False)
[]: grouped summary
[]: format count overall_days_shown_mean overall_days_shown_min \
                277
                                  154.079422
    0 image
                283
                                                                   5
    1
       text
                                  698.049470
                 27
    2 video
                                   74.333333
                                                                   4
       overall_days_shown_median overall_days_shown_max overall_days_shown_total
    0
                           144.0
                                                     645
                                                                             42680
    1
                           762.0
                                                    1255
                                                                            197548
    2
                            54.0
                                                     223
                                                                              2007
[]: # @title Pivoting the DataFrame Visualization
    df_pivot = grouped_summary.melt(id_vars=["format", "count"],
                        value_vars=["overall_days_shown_min",__

¬"overall_days_shown_mean", "overall_days_shown_median",
□
      var name="statistic", value name="value")
     # Extracting metric type (width or height)
    df_pivot["metric"] = "days_shown"
    df_pivot["statistic"] = df_pivot["statistic"].apply(lambda x: x.split("_")[-1].
     ⇔capitalize())
    # Plotting
    fig, axes = plt.subplots(1, 1, figsize=(18, 5), sharey=False)
    sns.set(style="whitegrid")
    for i, metric in enumerate(["days_shown"]):
        pivot subset = df pivot[df pivot["metric"] == metric]
        ax = axes
        plot_data = pivot_subset.pivot(index="format", columns="statistic",__
      ⇔values="value")
        plot_data.plot(kind="bar", ax=ax, cmap="viridis")
        ax.set_title(f"Overall {metric} Statistics")
        ax.set_xlabel("Format")
        ax.set ylabel("Pixels")
        # Annotate bars with values
        for container in ax.containers:
            ax.bar_label(container, fmt='%.0f', padding=3)
```

```
plt.tight_layout()
plt.show()
```



0.0.11 FORMAT; WIDTH; HEIGHT

```
[]: # Create an empty list to collect distribution results for each competitor.
     \hookrightarrow (target_domain)
     distribution results = []
     # Get list of unique competitors based on target domain
     competitors = combined_df['target_domain'].unique()
     # Loop through each competitor for individual analysis and store aggregated_
      \hookrightarrow distribution metrics
     for comp in competitors:
         df_comp = combined_df[combined_df['target_domain'] == comp]
         # Aggregate distribution metrics for both width and height by ad format
         dist_data = df_comp.groupby('format').agg(
             count=('width', 'count'),
             avg_width = (width', lambda x: x[x != 0].mean() if not x[x != 0].empty_l
      ⇔else np.nan),
             width min=('width', lambda x: x[x != 0].min() if not x[x != 0].empty_
      ⇔else np.nan),
             width_q1=('width', lambda x: x[x != 0].quantile(0.25) if not x[x != 0].
      →empty else np.nan),
             width median=('width', lambda x: x[x != 0].median() if not x[x != 0].
      ⇔empty else np.nan),
             width_q3=('width', lambda x: x[x != 0].quantile(0.75) if not x[x != 0].
      ⇔empty else np.nan),
             width_max=('width', lambda x: x[x != 0].max() if not x[x != 0].empty_{\sqcup}
      ⇔else np.nan),
             avg height=('height',lambda x: x[x != 0].mean() if not x[x != 0].empty__
      ⇔else np.nan),
```

```
height_min=('height', lambda x: x[x != 0].min() if not x[x != 0].empty__
  ⇔else np.nan),
        height_q1=('height', lambda x: x[x != 0].quantile(0.25) if not x[x != 0]
 ⇒0].empty else np.nan),
        height_median=('height', lambda x: x[x != 0].median() if not x[x != 0].
  ⇔empty else np.nan),
        height_q3=('height', lambda x: x[x != 0].quantile(0.75) if not x[x != 0]
  →0].empty else np.nan),
        height_max=('height', lambda x: x[x != 0].max() if not x[x != 0].empty__
  ⇔else np.nan)
    ).reset index()
    # Add the target_domain column to the aggregated data
    dist_data['target_domain'] = comp
    # Append the results for this competitor to the list
    distribution_results.append(dist_data)
# Concatenate all competitors' distribution data into a single DataFrame
distribution_df = pd.concat(distribution_results, ignore_index=True)
# Reorder columns (if needed)
distribution_df = distribution_df[['target_domain', 'format', 'count',

 'width_min', 'width_q1', 'width_median', u
 'height_min', 'height_q1', 'height_median', u
 ⇔'height_q3', 'height_max']]
# Display the resulting DataFrame
print(distribution_df.head())
# (Optional) Save the aggregated distribution metrics to CSV
distribution_df.to_csv("ad_dimension_distribution_by_format.csv", index=False)
         target_domain format count avg_width avg_height width_min \
                                                 414.00000
                                                                300.0
0
             odoo.com image
                                  9
                                         300.0
                                         380.0
1
             odoo.com
                        text
                                137
                                                 189.22314
                                                                380.0
2
             odoo.com video
                                                                  NaN
                                  1
                                           {\tt NaN}
                                                       NaN
3 inflowinventory.com image
                                  1
                                         300.0
                                                 600.00000
                                                                300.0
                                         380.0
                                                 239.00000
                                                                380.0
4 inflowinventory.com
                                  1
                        text
  width_q1 width_median width_q3 width_max height_min height_q1 \
0
      300.0
                   300.0
                             300.0
                                         300.0
                                                    250.0
                                                                269.0
1
      380.0
                   380.0
                             380.0
                                        380.0
                                                    147.0
                                                                173.0
2
       NaN
                     {\tt NaN}
                               {\tt NaN}
                                          {\tt NaN}
                                                      NaN
                                                                 NaN
      300.0
                                                    600.0
                                                               600.0
3
                   300.0
                             300.0
                                        300.0
```

```
4
          380.0
                        380.0
                                  380.0
                                             380.0
                                                         239.0
                                                                    239.0
       height_median height_q3 height_max
    0
               269.0
                          600.0
                                      600.0
                                      464.0
                          199.0
    1
               173.0
    2
                 {\tt NaN}
                            {\tt NaN}
                                        NaN
    3
               600.0
                          600.0
                                      600.0
    4
               239.0
                          239.0
                                      239.0
[]: # Pivoting the DataFrame
    df_pivot = distribution_df.melt(id_vars=["target_domain", "format", "count"],
                         value_vars=["avg_width", "width_q1", "width_median", 
      "avg_height", "height_q1", "height_median", u

¬"height_q3", "height_max"],
                         var_name="statistic", value_name="value")
     # Extracting metric type (width or height)
    df_pivot["metric"] = df_pivot["statistic"].apply(lambda x: "Width" if "width"
      →in x else "Height")
    df_pivot["statistic"] = df_pivot["statistic"].apply(lambda x: x.split("_")[-1].
      ⇔capitalize())
     # Plotting
    fig, axes = plt.subplots(3, 1, figsize=(35, 20), sharey=False)
    sns.set(style="whitegrid")
    for i, metric in enumerate(["Width", "Height"]):
        pivot_subset = df_pivot[df_pivot["metric"] == metric]
        ax = axes[i]
        plot_data = pivot_subset.pivot(index=["target_domain", "format"],_
      ⇔columns="statistic", values="value")
        plot_data.plot(kind="bar", ax=ax, cmap="viridis")
        ax.set_title(f"Overall competitors {metric} Statistics")
        ax.set_xlabel("Target Domain & Format")
        ax.set_ylabel("Pixels")
        # Annotate bars with values
        for container in ax.containers:
             ax.bar_label(container, fmt='%.0f', padding=3)
    # Plot count separately
    ax = axes[2]
    sns.barplot(x=distribution_df["target_domain"] + " - " +__

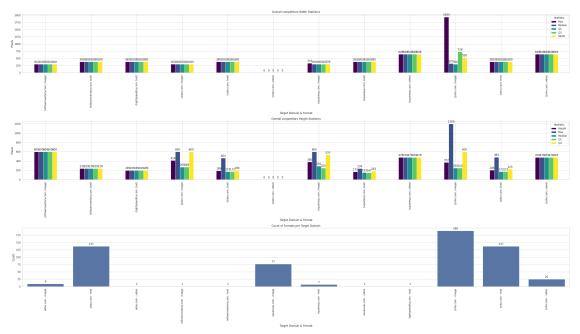
distribution_df["format"], y=distribution_df["count"], ax=ax)

    ax.set_title("Count of Formats per Target Domain")
```

```
ax.set_xlabel("Target Domain & Format")
ax.set_ylabel("Count")

# Annotate count bars
for container in ax.containers:
    ax.bar_label(container, fmt='%.0f', padding=3)

plt.xticks(rotation=90)
plt.tight_layout()
plt.show()
```



[]: distribution_df

[]:	target_domain	format	count	avg_width	avg_height	width_min	\
0	odoo.com	image	9	300.000000	414.000000	300.0	
1	odoo.com	text	137	380.000000	189.223140	380.0	
2	odoo.com	video	1	NaN	NaN	NaN	
3	inflowinventory.com	image	1	300.000000	600.000000	300.0	
4	inflowinventory.com	text	1	380.000000	239.000000	380.0	
5	squareup.com	image	77	305.500000	380.500000	300.0	
6	squareup.com	text	7	380.000000	171.285714	380.0	
7	squareup.com	video	1	648.000000	478.000000	648.0	
8	lightspeedhq.com	text	1	380.000000	199.000000	380.0	
9	zoho.com	image	190	526.180851	371.787234	160.0	
10	zoho.com	text	137	380.000000	205.510949	380.0	
11	zoho.com	video	25	648.000000	478.000000	648.0	

```
0
        300.0
                      300.0
                                 300.0
                                            300.0
                                                         250.0
                                                                     269.0
                                 380.0
                                                                     173.0
1
        380.0
                      380.0
                                            380.0
                                                         147.0
2
          NaN
                        NaN
                                   {\tt NaN}
                                              {\tt NaN}
                                                           NaN
                                                                       NaN
3
        300.0
                      300.0
                                 300.0
                                            300.0
                                                         600.0
                                                                    600.0
4
        380.0
                      380.0
                                 380.0
                                            380.0
                                                         239.0
                                                                    239.0
5
        300.0
                      300.0
                                 300.0
                                            333.0
                                                         250.0
                                                                    250.0
6
                      380.0
                                 380.0
                                                         147.0
        380.0
                                            380.0
                                                                    147.0
7
        648.0
                      648.0
                                 648.0
                                            648.0
                                                         478.0
                                                                    478.0
8
        380.0
                      380.0
                                 380.0
                                            380.0
                                                         199.0
                                                                    199.0
9
        300.0
                      320.0
                                 728.0
                                           1940.0
                                                          50.0
                                                                    250.0
10
        380.0
                      380.0
                                 380.0
                                            380.0
                                                         131.0
                                                                    173.0
11
       648.0
                      648.0
                                 648.0
                                            648.0
                                                         478.0
                                                                    478.0
    height_median height_q3 height_max
0
             269.0
                       600.00
                                     600.0
             173.0
                       199.00
                                     464.0
1
2
               NaN
                          {\tt NaN}
                                       NaN
3
             600.0
                       600.00
                                     600.0
4
             239.0
                       239.00
                                     239.0
5
             291.5
                       533.25
                                     600.0
6
             153.0
                       183.00
                                     239.0
7
             478.0
                       478.00
                                     478.0
8
             199.0
                       199.00
                                     199.0
9
             250.0
                       600.00
                                    1200.0
10
             173.0
                       225.00
                                     484.0
11
             478.0
                       478.00
                                     478.0
<google.colab._quickchart_helpers.SectionTitle at 0x785724059ed0>
from matplotlib import pyplot as plt
distribution_df['count'].plot(kind='hist', bins=20, title='count')
plt.gca().spines[['top', 'right',]].set_visible(False)
from matplotlib import pyplot as plt
distribution_df['avg_width'].plot(kind='hist', bins=20, title='avg_width')
plt.gca().spines[['top', 'right',]].set_visible(False)
from matplotlib import pyplot as plt
distribution_df['avg_height'].plot(kind='hist', bins=20, title='avg_height')
plt.gca().spines[['top', 'right',]].set_visible(False)
from matplotlib import pyplot as plt
distribution_df['width_min'].plot(kind='hist', bins=20, title='width_min')
plt.gca().spines[['top', 'right',]].set_visible(False)
<google.colab._quickchart_helpers.SectionTitle at 0x785723fef950>
from matplotlib import pyplot as plt
```

width_max height_min

height_q1 \

width_median width_q3

width_q1

```
import seaborn as sns
distribution_df.groupby('target_domain').size().plot(kind='barh', color=sns.
 →palettes.mpl_palette('Dark2'))
plt.gca().spines[['top', 'right',]].set_visible(False)
from matplotlib import pyplot as plt
import seaborn as sns
distribution df.groupby('format').size().plot(kind='barh', color=sns.palettes.
 →mpl_palette('Dark2'))
plt.gca().spines[['top', 'right',]].set_visible(False)
<google.colab._quickchart_helpers.SectionTitle at 0x785724175fd0>
from matplotlib import pyplot as plt
distribution_df.plot(kind='scatter', x='count', y='avg_width', s=32, alpha=.8)
plt.gca().spines[['top', 'right',]].set_visible(False)
from matplotlib import pyplot as plt
distribution_df.plot(kind='scatter', x='avg_width', y='avg_height', s=32, alpha=.
plt.gca().spines[['top', 'right',]].set_visible(False)
from matplotlib import pyplot as plt
distribution_df.plot(kind='scatter', x='avg_height', y='width_min', s=32, alpha=.
plt.gca().spines[['top', 'right',]].set_visible(False)
from matplotlib import pyplot as plt
distribution_df.plot(kind='scatter', x='width_min', y='width_q1', s=32, alpha=.8)
plt.gca().spines[['top', 'right',]].set_visible(False)
<google.colab._quickchart_helpers.SectionTitle at 0x78572400ca90>
from matplotlib import pyplot as plt
distribution_df['count'].plot(kind='line', figsize=(8, 4), title='count')
plt.gca().spines[['top', 'right']].set_visible(False)
from matplotlib import pyplot as plt
distribution_df['avg_width'].plot(kind='line', figsize=(8, 4), title='avg_width')
plt.gca().spines[['top', 'right']].set visible(False)
from matplotlib import pyplot as plt
distribution_df['avg_height'].plot(kind='line', figsize=(8, 4),_
 →title='avg_height')
plt.gca().spines[['top', 'right']].set_visible(False)
from matplotlib import pyplot as plt
distribution_df['width_min'].plot(kind='line', figsize=(8, 4), title='width_min')
plt.gca().spines[['top', 'right']].set_visible(False)
<google.colab._quickchart_helpers.SectionTitle at 0x785724193e90>
from matplotlib import pyplot as plt
import seaborn as sns
```

```
import pandas as pd
plt.subplots(figsize=(8, 8))
df_2dhist = pd.DataFrame({
   x_label: grp['format'].value_counts()
   for x_label, grp in distribution_df.groupby('target_domain')
})
sns.heatmap(df 2dhist, cmap='viridis')
plt.xlabel('target_domain')
_ = plt.ylabel('format')
<google.colab._quickchart_helpers.SectionTitle at 0x785724193490>
<string>:5: FutureWarning:
Passing `palette` without assigning `hue` is deprecated and will be removed in
v0.14.0. Assign the `y` variable to `hue` and set `legend=False` for the same
effect.
from matplotlib import pyplot as plt
import seaborn as sns
figsize = (12, 1.2 * len(distribution_df['target_domain'].unique()))
plt.figure(figsize=figsize)
sns.violinplot(distribution_df, x='count', y='target_domain', inner='stick',__
 →palette='Dark2')
sns.despine(top=True, right=True, bottom=True, left=True)
<string>:5: FutureWarning:
Passing `palette` without assigning `hue` is deprecated and will be removed in
v0.14.0. Assign the `y` variable to `hue` and set `legend=False` for the same
effect.
from matplotlib import pyplot as plt
import seaborn as sns
figsize = (12, 1.2 * len(distribution df['format'].unique()))
plt.figure(figsize=figsize)
sns.violinplot(distribution_df, x='count', y='format', inner='stick',
 →palette='Dark2')
sns.despine(top=True, right=True, bottom=True, left=True)
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```

```
figsize = (12, 1.2 * len(distribution_df['target_domain'].unique()))
    plt.figure(figsize=figsize)
    sns.violinplot(distribution_df, x='avg_width', y='target_domain', inner='stick',_
     →palette='Dark2')
    sns.despine(top=True, right=True, bottom=True, left=True)
    <string>:5: FutureWarning:
    Passing `palette` without assigning `hue` is deprecated and will be removed in
    v0.14.0. Assign the `y` variable to `hue` and set `legend=False` for the same
    effect.
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    figsize = (12, 1.2 * len(distribution df['format'].unique()))
    plt.figure(figsize=figsize)
    sns.violinplot(distribution_df, x='avg_width', y='format', inner='stick',
     →palette='Dark2')
    sns.despine(top=True, right=True, bottom=True, left=True)
    WARNING: Runtime no longer has a reference to this dataframe, please re-run this
    cell and try again.
[]: distribution df.describe()
[]:
                                                              width_q1
                         avg_width avg_height
                                                 width_min
                 count
     count
             12.000000
                         11.000000
                                     11.000000
                                                 11.000000
                                                             11.000000
            48.916667
                       420.698259
                                   338.755185
                                                386.909091
                                                            399.636364
    mean
     std
            68.498783 128.509634 146.001750 145.162981
                                                            128.454874
    min
             1.000000
                       300.000000 171.285714 160.000000
                                                            300.000000
     25%
             1.000000
                       342.750000
                                   202.255474
                                               300.000000
                                                            300.000000
     50%
             8.000000
                       380.000000
                                   371.787234
                                                380.000000
                                                            380.000000
                                                380.000000
     75%
            92.000000
                       453.090426
                                   446.000000
                                                            380.000000
    max
            190.000000 648.000000
                                   600.000000
                                                648.000000
                                                            648.000000
           width_median
                                        width_max height_min
                                                               height_q1
                            width_q3
     count
               11.000000
                           11.000000
                                        11.000000
                                                    11.000000
                                                                11.00000
                                       551.727273 269.909091
                                                               296.00000
     mean
             401.454545
                          438.545455
     std
              127.037289
                          156.923143
                                       476.220976
                                                   173.265377
                                                               151.24219
    min
             300.000000
                          300.000000
                                       300.000000
                                                    50.000000
                                                               147.00000
     25%
             310.000000
                          340.000000
                                       356.500000
                                                   147.000000
                                                               186.00000
     50%
             380.000000
                          380.000000
                                       380.000000
                                                   239.000000
                                                               250.00000
     75%
             380.000000
                          514.000000
                                       514.000000
                                                   364.000000
                                                               373.50000
             648.000000
                         728.000000
                                     1940.000000 600.000000
    max
                                                               600.00000
           height median
                            height_q3
                                        height_max
                11.000000
                            11.000000
                                         11.000000
     count
     mean
               300.318182 394.022727
                                        507.363636
```

```
25%
               186.000000 212.000000
                                        351.500000
     50%
               250.000000 478.000000
                                        478.000000
     75%
               384.750000 566.625000
                                        600.000000
               600.000000 600.000000 1200.000000
    max
[]: # Group the distribution of by 'format', but ignore zero values in the
      \rightarrowaggregation
     grouped_summary = combined_df.groupby('format').agg(
         count=('format', 'count'),
         overall_width_mean = ('width', lambda x: x[x != 0].mean() if not x[x != 0].
      →empty else np.nan),
         overall_width_min = ('width', lambda x: x[x != 0].min() if not x[x != 0].
      ⇔empty else np.nan),
         overall width median = ('width', lambda x: x[x != 0].median() if not x[x !=_|
      →0].empty else np.nan),
         overall_width_max = ('width', lambda x: x[x != 0].max() if not x[x != 0].
      ⇔empty else np.nan),
         overall height mean = ('height', lambda x: x[x != 0].mean() if not x[x !=||
      →0].empty else np.nan),
         overall_height_min = ('height', lambda x: x[x != 0].min() if not x[x != 0].
      ⇔empty else np.nan),
         overall_height_median = ('height', lambda x: x[x != 0].median() if not x[x !
      ⇒= 0].empty else np.nan),
         overall_height_max = ('height', lambda x: x[x != 0].max() if not x[x != 0].
      ⇔empty else np.nan)
     ).reset_index()
     # (Optional) Save the summary to a CSV file
     grouped_summary.to_csv("grouped_ad_dimension_summary_nonzero_2.csv", __
      →index=False)
[]: grouped_summary
[]: format
                      overall_width_mean overall_width_min overall_width_median \
               count
                 277
                              508.602941
                                                                             300.0
     0 image
                                                       160.0
                              380.000000
                                                                             380.0
     1
        text
                 283
                                                      380.0
     2 video
                  27
                              648,000000
                                                      648.0
                                                                             648.0
        overall_width_max overall_height_mean overall_height_min \
    0
                   1940.0
                                    375.024510
                                                               50.0
                    380.0
                                    197.333333
     1
                                                              131.0
     2
                    648.0
                                    478.000000
                                                              478.0
```

273.635989

199.000000

std

min

149.896343 182.747793

153.000000 183.000000

```
overall_height_median overall_height_max
    0
                                          1200.0
                       250.0
                                           484.0
    1
                       173.0
                       478.0
                                           478.0
[]: # @title Pivoting the DataFrame Visualization
    df_pivot = grouped_summary.melt(id_vars=["format", "count"],
                        value_vars=["overall_width_mean", "overall_width_median", "
      "overall_height_mean", "overall_height_median", "

¬"overall_height_max"],
                        var_name="statistic", value_name="value")
     # Extracting metric type (width or height)
    df_pivot["metric"] = df_pivot["statistic"].apply(lambda x: "Width" if "width"
     →in x else "Height")
    df pivot["statistic"] = df pivot["statistic"].apply(lambda x: x.split(" ")[-1].
      ⇔capitalize())
    # Plotting
    fig, axes = plt.subplots(1, 3, figsize=(18, 5), sharey=False)
    sns.set(style="whitegrid")
    for i, metric in enumerate(["Width", "Height"]):
        pivot_subset = df_pivot[df_pivot["metric"] == metric]
        ax = axes[i]
        plot_data = pivot_subset.pivot(index="format", columns="statistic",__
      ⇔values="value")
        plot_data.plot(kind="bar", ax=ax, cmap="viridis")
        ax.set_title(f"Overall {metric} Statistics")
        ax.set_xlabel("Format")
        ax.set_ylabel("Pixels")
        # Annotate bars with values
```

sns.barplot(x=grouped_summary["format"], y=grouped_summary["count"], ax=ax)

for container in ax.containers:

Plot count separately

ax.set_xlabel("Format")
ax.set_ylabel("Count")

Annotate count bars

ax.set_title("Count of Formats")

for container in ax.containers:

ax = axes[2]

ax.bar_label(container, fmt='%.0f', padding=3)

```
ax.bar_label(container, fmt='%.0f', padding=3)
plt.tight_layout()
plt.show()
```

