CVE_Analysis_2

December 6, 2020

```
[362]: import os
       import json
       from neo4j import GraphDatabase
       import codecs
       import pandas as pd
       import matplotlib.pyplot as plt
       import seaborn as sns
       sns.set_theme(style="whitegrid")
       import glob
       from matplotlib.colors import ListedColormap
       import numpy as np
[363]: base_dir = '/Users/janamian/Documents/workstation/ucsd_dse_program/fall_2019/
        →docker_vol/saba-ja/workstation/dse_203_2020/project/
        →dse_203_final_project_fall_2020/data'
[364]: nvdcve_files = sorted(glob.glob(os.path.join(base_dir, 'nvd_data', 'nvdcve-1.1*.
        →json')), reverse=True)
[365]: for val in nvdcve_files:
           print(val.split('/')[-1])
      nvdcve-1.1-2020.json
      nvdcve-1.1-2019.json
      nvdcve-1.1-2018.json
      nvdcve-1.1-2017.json
      nvdcve-1.1-2016.json
      nvdcve-1.1-2015.json
      nvdcve-1.1-2014.json
      nvdcve-1.1-2013.json
      nvdcve-1.1-2012.json
      nvdcve-1.1-2011.json
      nvdcve-1.1-2010.json
      nvdcve-1.1-2009.json
      nvdcve-1.1-2008.json
      nvdcve-1.1-2007.json
      nvdcve-1.1-2006.json
      nvdcve-1.1-2005.json
```

```
nvdcve-1.1-2004.json
      nvdcve-1.1-2003.json
      nvdcve-1.1-2002.json
# Read all CWE data
      # Read all NVD CVE Json files
      # ############
      with open(os.path.join(base_dir, 'cwe_data', 'cwec_v4.2.json')) as f:
          cwe = json.load(f)
      nvd_list = []
      for file_addr in nvdcve_files:
          with open(file_addr) as f:
              nvd_list.append(json.load(f))
[367]: | def trendline(xd, yd, order=1, c='r', alpha=1, Rval=False):
           """Make a line of best fit"""
          #Calculate trendline
          coeffs = np.polyfit(xd, yd, order)
          intercept = coeffs[-1]
          slope = coeffs[-2]
          power = coeffs[0] if order == 2 else 0
          minxd = np.min(xd)
          maxxd = np.max(xd)
          xl = np.array([minxd, maxxd])
          yl = power * xl ** 2 + slope * xl + intercept
          #Plot trendline
          plt.plot(x1, y1, c, alpha=alpha, linestyle='--')
          #Calculate R Squared
          p = np.poly1d(coeffs)
          ybar = np.sum(yd) / len(yd)
          ssreg = np.sum((p(xd) - ybar) ** 2)
          sstot = np.sum((yd - ybar) ** 2)
          Rsqr = ssreg / sstot
          if not Rval:
               #Plot R^2 value
              plt.text(0.8 * maxxd + 0.2 * minxd, 0.65 * np.max(yd) + 0.4 * np.
```

 \rightarrow min(yd),

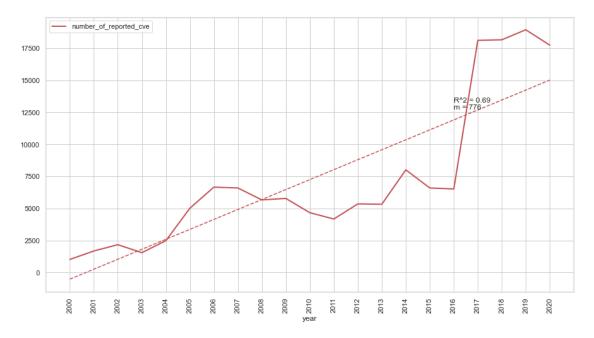
```
f'R^2 = {Rsqr:0.2f}\nm = {slope:0.0f}')
else:
    #Return the R^2 value:
    return Rsqr
```

```
[368]: def get_related_cwe(data_list):
           # CVE object
           resultw = []
           if not isinstance(data_list['problemtype']['problemtype_data'], list):
               print(data_list['problemtype']['problemtype_data'])
               raise ValueError
           if len(data_list['problemtype']['problemtype_data']) != 1:
               print(data_list['problemtype']['problemtype_data'])
               raise ValueError
           for val in data_list['problemtype']['problemtype_data'][0]['description']:
               resultw.append(val['value'])
           return resultw
       def get_reference_url(data_list):
           result = []
           for val in data_list['references']['reference_data']:
               result.append(val['url'])
           return result
       def get_tags(data_list):
           result = []
           for val in data_list['references']['reference_data']:
               for val2 in val['tags']:
                   result.append(val2)
           return result
       def get_description_data(data_list):
           result = []
           for val in data_list['description']['description_data']:
               if val['lang'] == 'en':
                   result.append(val['value'])
           return result
       def get_cpe_match(cpe_match_list):
           result = []
           try:
               for val in cpe_match_list['cpe_match']:
                   result.append(val['cpe23Uri'])
           except KeyError:
```

```
pass
   return result
def get_impacted_configuration(data_list):
   result = []
   for val in data_list['nodes']:
       result.extend(get_cpe_match(val))
       if 'children' in val.keys():
          for val2 in val['children']:
              result.extend(get_cpe_match(val2))
   return result
cve_clean_result = []
total_cwes = 0
total_cves = 0
for nvd_obj in nvd_list:
   for cve_obj in nvd_obj['CVE_Items']:
       published_date = cve_obj['publishedDate']
       yy = published_date.split('-')[0]
       if int(yy) < 2000:</pre>
          continue
       modified_date = cve_obj['lastModifiedDate']
       cve_id = cve_obj['cve']['CVE_data_meta']['ID']
       total_cves += 1
       related_cwe_list = get_related_cwe(cve_obj['cve'])
       if len(related_cwe_list) == 0:
          related_cwe_list = ['NVD-no-analysis']
          total\_cwes += 1
            print(cve_id)
       else:
          total_cwes += len(related_cwe_list)
       description = get_description_data(cve_obj['cve'])
       reference_url = get_reference_url(cve_obj['cve'])
       tags = get_tags(cve_obj['cve'])
       try:
          cvss_base_score =
cvss_base_severity =_
```

```
except KeyError:
                   cvss_base_score = 'unknown'
                   cvss_base_severity = 'unknown'
               impacted_config = get_impacted_configuration(cve_obj['configurations'])
               cve_clean_result.append({
                   'cve_id': cve_id,
                   'related_cwe_list':related_cwe_list,
                   'description': description,
                   'reference_url':reference_url,
                   'tags':tags,
                   'cvss_base_score': cvss_base_score,
                   'cvss_base_severity':cvss_base_severity,
                   'impacted_config': impacted_config,
                   'published_date': published_date,
                   'modified_date': modified_date
                })
[369]: counter = {}
       for val in cve_clean_result:
           year = val['published_date'].split('-')[0]
           c = counter.get(year, 0)
           c += 1
           counter[year] = c
       data = {'year':[], 'count':[]}
       for key, value in counter.items():
           data['year'].append(int(key))
           data['count'].append(value)
       cve count df = pd.DataFrame(data)
       cve_count_df.sort_values(by=['year'], ascending=True, inplace=True)
       cve_count_df.rename(columns={'count':'number_of_reported_cve'}, inplace=True)
       cve_count_df.set_index('year', drop=True, inplace=True)
[370]: cve_count_df
[370]:
             number_of_reported_cve
       year
       2000
                               1020
       2001
                               1679
       2002
                               2170
       2003
                               1548
       2004
                               2479
       2005
                               5010
       2006
                               6659
```

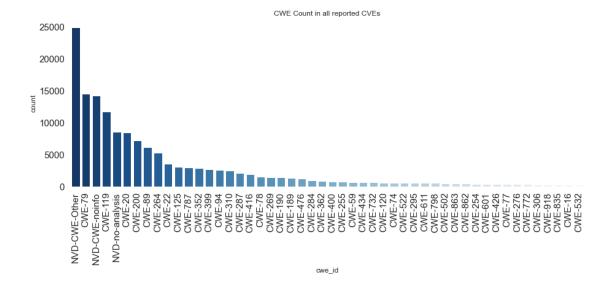
```
2007
                          6596
2008
                          5664
2009
                          5778
2010
                          4667
2011
                          4172
2012
                          5351
2013
                          5324
2014
                          8008
2015
                          6595
2016
                          6517
2017
                         18113
2018
                         18154
2019
                         18938
2020
                         17736
```

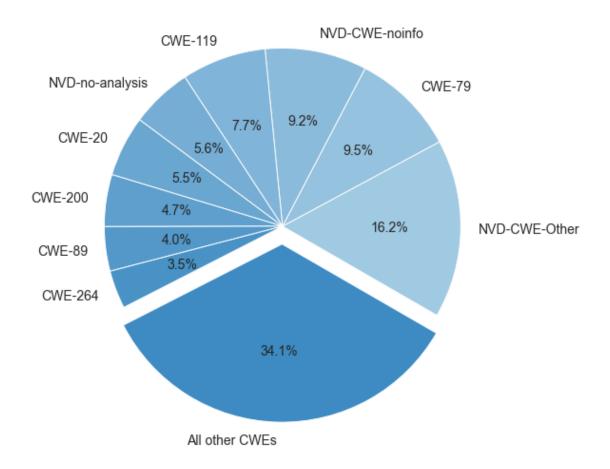
```
[372]: cve_count_df.index
```

```
[372]: Int64Index([2000, 2001, 2002, 2003, 2004, 2005, 2006, 2007, 2008, 2009, 2010,
                   2011, 2012, 2013, 2014, 2015, 2016, 2017, 2018, 2019, 2020],
                  dtype='int64', name='year')
[373]: print('Total CVEs: ', len(cve_clean_result))
       print('Total CWEs in CVEs: ', total_cwes)
      Total CVEs: 152178
      Total CWEs in CVEs: 154169
[374]: # #############
       # Count CWEs causing CVE
       # ############
       cwe count = {}
       for val in cve_clean_result:
           for cwe in val['related_cwe_list']:
               cwe_c = cwe_count.get(cwe, 0)
               cwe_c += 1
               cwe_count[cwe] = cwe_c
[375]: data = {'cwe id':[], 'count':[]}
       for key, value in cwe count.items():
           data['cwe_id'].append(f'{key}')
           data['count'].append(value)
       cwe_count_df = pd.DataFrame(data)
       cwe_count_df.sort_values(by=['count'], ascending=False, inplace=True)
       cwe_count_df.reset_index(drop=True, inplace=True)
       cwe_count_filtered_gt_n = cwe_count_df[cwe_count_df['count'] >= 250]
[376]: fig = plt.figure(figsize=(15,5))
       ax = sns.barplot(x="cwe_id", y="count", palette="Blues_r", __

→data=cwe_count_filtered_gt_n, ci=None);
       plt.title('CWE Count in all reported CVEs')
       plt.setp(ax.get_xticklabels(), rotation=90);
       plt.rc('xtick', labelsize=15)
       plt.rc('ytick', labelsize=15)
       plt.rc('figure', titlesize=15)
       plt.grid(False)
       plt.box(on=None)
```



```
less_than_n_cwe = cwe_count_df[cwe_count_df['count'] < 5000]['count'].sum()</pre>
[378]: labels = list(cwe_count_df[cwe_count_df['count'] >= 5000]['cwe_id'])
       labels.append('All other CWEs')
       sizes = list(cwe_count_df[cwe_count_df['count'] >= 5000]['count'])
       sizes.append(less_than_n_cwe)
       fig1, ax1 = plt.subplots(figsize=(8,8))
       ax1.pie(sizes,
               explode=(0, 0, 0, 0, 0, 0, 0, 0, 0.1),
               labels=labels,
               autopct='%1.1f%%',
               shadow=False,
               startangle=-30,
               textprops={'fontsize': 14},
               colors=sns.color_palette("Blues_d", 20))
       ax1.axis('equal')
       plt.show()
```



```
[379]: sum(sizes)
```

[379]: 154169

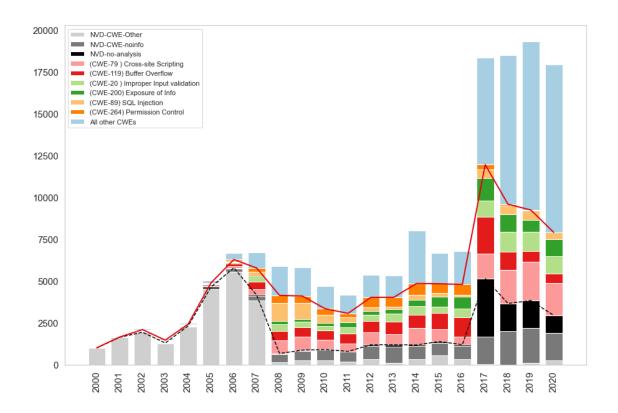
```
cve_to_cwe_per_year_df.rename(columns={
       'CWE-79' : '(CWE-79 ) Cross-site Scripting',
       'CWE-119': '(CWE-119) Buffer Overflow',
       'CWE-20' : '(CWE-20 ) Improper Input validation',
       'CWE-200': '(CWE-200) Exposure of Info',
       'CWE-89' : '(CWE-89 ) SQL Injection',
       'CWE-264': '(CWE-264) Permission Control'}, inplace=True)
[381]: df_temp1 = cve_to_cwe_per_year_df[cve_to_cwe_per_year_df.index >=_u
       →2000][['NVD-CWE-Other', 'NVD-CWE-noinfo', 'NVD-no-analysis']]
      line_data = df_temp1.sum(axis=1)
      line_data_df_1 = line_data.to_frame().reset_index(drop=False)
      line_data_df_1.rename(columns={'index':'year', 0:'NVD-CWE-Other'}, inplace=True)
      line_data_df_1.astype(int)
      line_data_df_1.set_index('year', drop=True, inplace=True)
      NVD_CWE_Other_only = line_data_df_1
[382]: df_temp2 = cve_to_cwe_per_year_df[cve_to_cwe_per_year_df.index >= 2000].

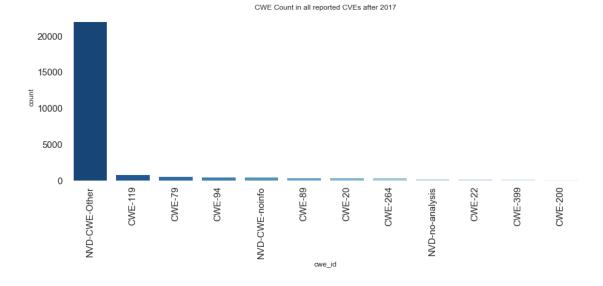
→drop(['All other CWEs'], axis=1)
      line_data = df_temp2.sum(axis=1)
      line_data_df_2 = line_data.to_frame().reset_index(drop=False)
      line_data_df_2.rename(columns={'index':'year', 0:'cwe_count'}, inplace=True)
      line_data_df_2.astype(int)
      line_data_df_2.set_index('year', drop=True, inplace=True)
      majro_cwe_each_year = line_data_df_2
[383]: width=0.75
      filtered_years = cve_to_cwe_per_year_df[cve_to_cwe_per_year_df.index >= 2000]
      fig, ax = plt.subplots(figsize=(15,10))
      years = list(filtered_years.index)
      nvd_1 = filtered_years['NVD-CWE-Other']
      nvd_2 = filtered_years['NVD-CWE-noinfo']
      nvd_3 = filtered_years['NVD-no-analysis']
      cwe_79 = filtered_years['(CWE-79 ) Cross-site Scripting']
      cwe_119 = filtered_years['(CWE-119) Buffer Overflow']
      cwe_20 = filtered_years['(CWE-20) Improper Input validation']
      cwe 200 = filtered years['(CWE-200) Exposure of Info']
      cwe_89 = filtered_years['(CWE-89 ) SQL Injection']
      cwe 264 = filtered years['(CWE-264) Permission Control']
      all_other_cwe = filtered_years['All other CWEs']
      ax.bar(years, nvd_1, width, label='NVD-CWE-Other', color='#CFCFCF') # '#B4D47B'
      ax.bar(years, nvd_2, width, bottom=sum([nvd_1]), label='NVD-CWE-noinfo', __
```

```
ax.bar(years, nvd_3, width, bottom=sum([nvd_1, nvd_2]),__
→label='NVD-no-analysis', color='#000000')
ax.bar(years, cwe_79, width, bottom=sum([nvd_1, nvd_2, nvd_3]), label='(CWE-79_
→) Cross-site Scripting', color='#FB9A99')
ax.bar(years, cwe_119, width, bottom=sum([nvd_1, nvd_2, nvd_3, cwe_79]),__
→label='(CWE-119) Buffer Overflow', color='#E31B1B')
ax.bar(years, cwe 20, width, bottom=sum([nvd 1, nvd 2, nvd 3, cwe 79,
ax.bar(years, cwe_200, width, bottom=sum([nvd_1, nvd_2, nvd_3, cwe_79, cwe_119,_
ax.bar(years, cwe 89, width, bottom=sum([nvd 1, nvd 2, nvd 3, cwe 79, cwe 119,
⇒cwe_20, cwe_200]), label='(CWE-89) SQL Injection', color='#FCC06F')
ax.bar(years, cwe_264, width, bottom=sum([nvd_1, nvd_2, nvd_3, cwe_79, cwe_119,_
⇒cwe 20, cwe 200, cwe 89]), label='(CWE-264) Permission Control', ⊔

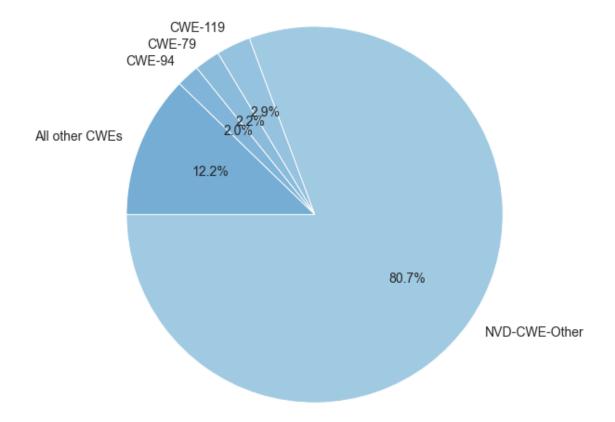
color='#FF7F01')

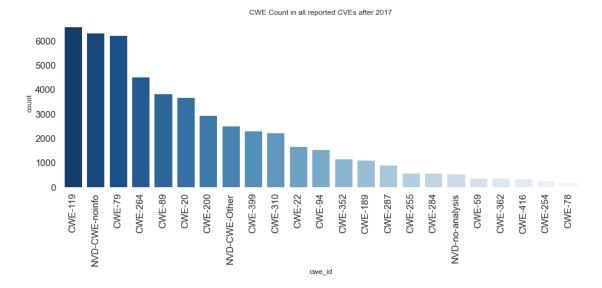
ax.bar(years, all_other_cwe, width, bottom=sum([nvd_1, nvd_2, nvd_3, cwe_79,__
→cwe_119, cwe_20, cwe_200, cwe_89, cwe_264]), label='All other CWEs', __
ax.plot(years, NVD_CWE_Other_only, color='#000000', linestyle='--')
ax.plot(years, majro_cwe_each_year, color='#E8000B', linewidth=2)
ax.legend()
plt.xticks(years,rotation=90);
plt.grid(False)
# plt.box(on=None)
```



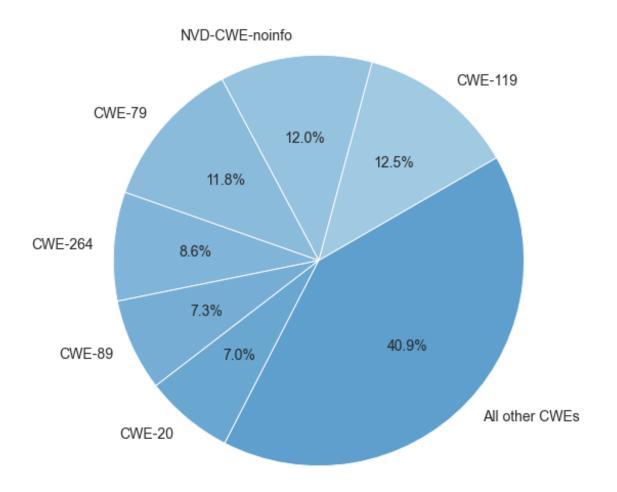


[390]: graph_cwe_count_chart(500, -180)





```
[393]: graph_cwe_count_chart(3000, 30)
```

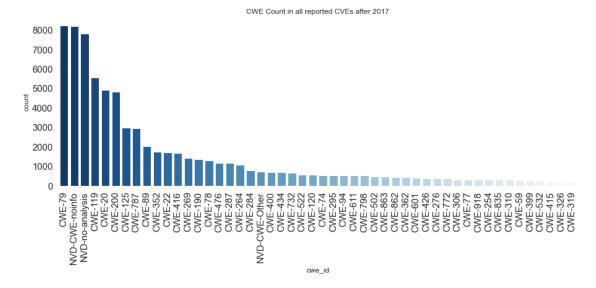


plt.title('CWE Count in all reported CVEs after 2017')

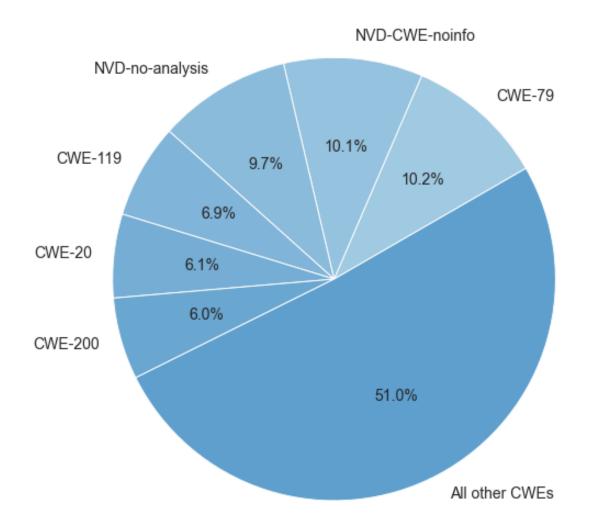
plt.setp(ax.get_xticklabels(), rotation=90);

plt.rc('xtick', labelsize=15)
plt.rc('ytick', labelsize=15)

```
plt.rc('figure', titlesize=15)
plt.grid(False)
plt.box(on=None)
```

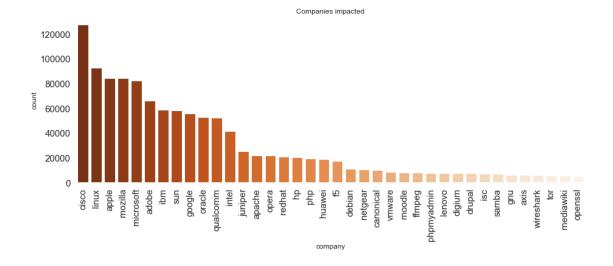


```
[396]: graph_cwe_count_chart(3000, 30)
```

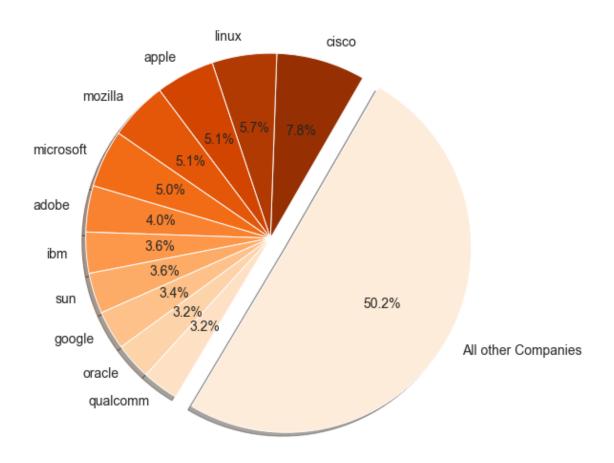


```
c = company_counter.get(company, 0)
               c += 1
               company_counter[company] = c
               c = product_counter.get(product, 0)
               c += 1
               product_counter[product] = c
               c = company_product_counter.get(company_product, 0)
               c += 1
               company_product_counter[company_product] = c
               c_obj = company_impact_severity.get(company, {'LOW':0, 'MEDIUM':0, _
        →'HIGH':0, 'CRITICAL':0, 'unknown':0})
               c_obj[impact_severity] = c_obj[impact_severity] + 1
               company_impact_severity[company] = c_obj
[398]: data = {'company':[], 'count':[]}
       for key, value in company_counter.items():
           data['company'].append(f'{key}')
           data['count'].append(value)
       company_count_df = pd.DataFrame(data)
       company_count_df.sort_values(by=['count'], ascending=False, inplace=True)
       company_count_df.reset_index(drop=True, inplace=True)
       company_count_filtered_gt_n = company_count_df[company_count_df['count'] >= ___
        →5000]
[399]: print('Total impacted products: ', sum(company_count_df['count']))
      Total impacted products:
                                1636445
[400]: company_count_filtered_gt_n
[400]:
              company
                        count
       0
                cisco 127417
       1
                linux
                      92648
       2
                        84128
                apple
             mozilla
       3
                        84066
       4
            microsoft
                        82450
       5
                        66114
                adobe
                        58708
       6
                  ibm
       7
                        58173
                  sun
                        55781
       8
               google
               oracle
                        52521
       10
             qualcomm
                        52218
       11
                intel
                        41546
```

```
25022
       12
              juniper
       13
               apache
                        21794
       14
                        21704
                opera
       15
               redhat
                        20702
       16
                        20434
                   hp
       17
                        19284
                  php
       18
               huawei
                        18894
       19
                   f5
                        17081
       20
               debian
                        10733
       21
              netgear
                        10460
       22
            canonical
                         9757
       23
               vmware
                         8563
       24
               moodle
                         7845
       25
                         7815
               ffmpeg
       26
          phpmyadmin
                         7641
       27
               lenovo
                         7529
       28
               digium
                         7442
       29
               drupal
                         7208
       30
                         6868
                  isc
       31
                samba
                         6829
       32
                         5908
                  gnu
       33
                 axis
                         5808
       34
            wireshark
                         5754
       35
                  tor
                         5411
       36
            mediawiki
                         5390
       37
              openssl
                         5013
[401]: fig = plt.figure(figsize=(15,5))
       ax = sns.barplot(x="company", y="count", palette="Oranges_r", __
       →data=company_count_filtered_gt_n, ci=None);
       # plt.yscale('log')
       plt.title('Companies impacted')
       plt.setp(ax.get_xticklabels(), rotation=90);
       plt.rc('xtick', labelsize=15)
       plt.rc('ytick', labelsize=15)
       plt.rc('figure', titlesize=15)
       plt.grid(False)
       plt.box(on=None)
```

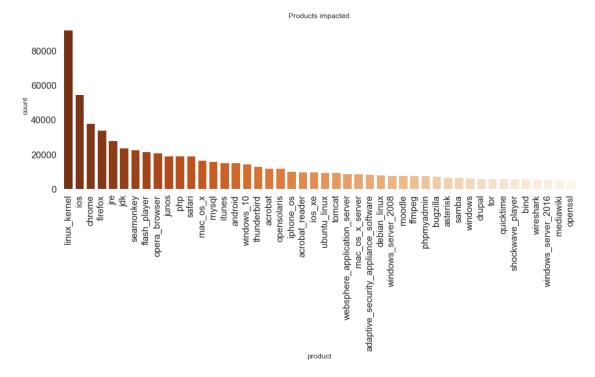


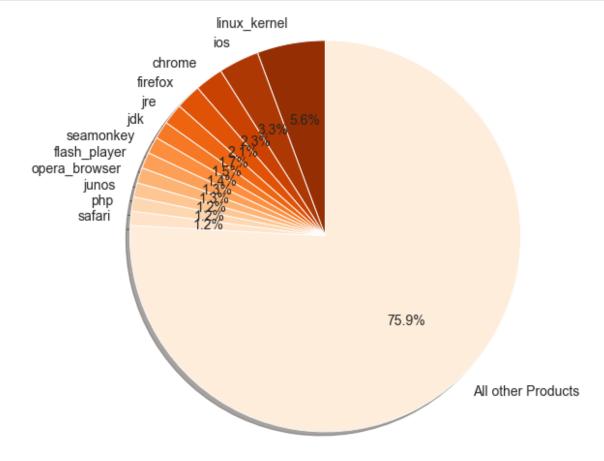
```
[402]: less_than_n_cwe = company_count_df[company_count_df['count'] < 50000]['count'].
       ⇒sum()
      labels = list(company_count_df[company_count_df['count'] >= 50000]['company'])
      labels.append('All other Companies')
      sizes = list(company_count_df[company_count_df['count'] >= 50000]['count'])
      sizes.append(less than n cwe)
      # pie chart color list=["#53AACO", "#53AACC", "#69C5EO", "#8DDBEB", "#D1F5FA"]
      # pie_chart_color_list=["#69C5EE", "#69C5EO", "#8DDBEB", "#D1F5FA", "#69C5EE", "
       → "#69C5E0", "#8DDBEB", '#BFBFBD']
      # pie_chart_color_list=["#53AACC",'#ffcc99','#66b3ff','#99ff99','#ff9999']
      fig1, ax1 = plt.subplots(figsize=(8,8))
      # colors=pie_chart_color_list,
      ax1.pie(sizes, labels=labels, autopct='%1.1f%%', colors=sns.
       shadow=True, startangle=60, textprops={'fontsize': 14},
       ⇔explode=explode)
      ax1.axis('equal') # Equal aspect ratio ensures that pie is drawn as a circle.
      plt.show()
      print(sum(sizes))
      print(labels)
```



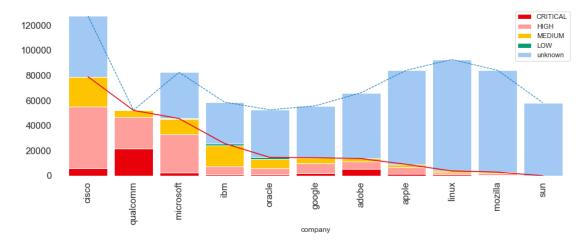
```
1636445
      ['cisco', 'linux', 'apple', 'mozilla', 'microsoft', 'adobe', 'ibm', 'sun',
      'google', 'oracle', 'qualcomm', 'All other Companies']
[403]: data = {'product':[], 'count':[]}
       for key, value in product_counter.items():
           data['product'].append(f'{key}')
           data['count'].append(value)
       product_count_df = pd.DataFrame(data)
       product_count_df.sort_values(by=['count'], ascending=False, inplace=True)
       product_count_df.reset_index(drop=True, inplace=True)
       product_count_filtered_gt_n = product_count_df[product_count_df['count'] >=__
        →5000]
[404]: product_count_filtered_gt_n
[404]:
                                        product count
       0
                                   linux_kernel 92410
       1
                                            ios 54799
```

```
2
                                                   38318
                                           chrome
       3
                                                   34344
                                          firefox
       4
                                                    28192
                                               jre
       5
                                                    23900
                                               jdk
       6
                                        seamonkey
                                                    22808
       7
                                     flash_player
                                                    21707
       8
                                    opera_browser
                                                    20975
       9
                                            junos
                                                    19218
       10
                                                    19180
                                              php
       11
                                           safari
                                                    19176
       12
                                         mac_os_x
                                                   16568
       13
                                            mysql
                                                    16174
                                                   15485
       14
                                           itunes
       15
                                                   15414
                                          android
       16
                                       windows_10
                                                    14651
       17
                                                    13259
                                      thunderbird
       18
                                                    12209
                                          acrobat
       19
                                      opensolaris
                                                    11929
       20
                                                    10352
                                        iphone_os
       21
                                                    10025
                                  acrobat_reader
       22
                                                     9958
                                           ios_xe
       23
                                                     9604
                                     ubuntu_linux
       24
                                           tomcat
                                                     9587
       25
                                                     9059
                    websphere_application_server
       26
                                  mac_os_x_server
                                                     8977
       27
                                                     8360
           adaptive_security_appliance_software
       28
                                     debian_linux
                                                     8081
       29
                             windows_server_2008
                                                     7869
       30
                                                     7845
                                           moodle
                                                     7810
       31
                                           ffmpeg
       32
                                       phpmyadmin
                                                     7644
       33
                                                     7316
                                         bugzilla
       34
                                                     6785
                                         asterisk
       35
                                                     6750
                                            samba
       36
                                                     6289
                                          windows
       37
                                           drupal
                                                     6188
       38
                                                     6174
                                              tor
       39
                                        quicktime
                                                     6174
       40
                                                     6124
                                shockwave_player
       41
                                             bind
                                                     5878
       42
                                        wireshark
                                                     5754
                             windows_server_2016
       43
                                                     5644
       44
                                                     5365
                                        mediawiki
       45
                                          openssl
                                                     5294
[405]: fig = plt.figure(figsize=(15,5))
```



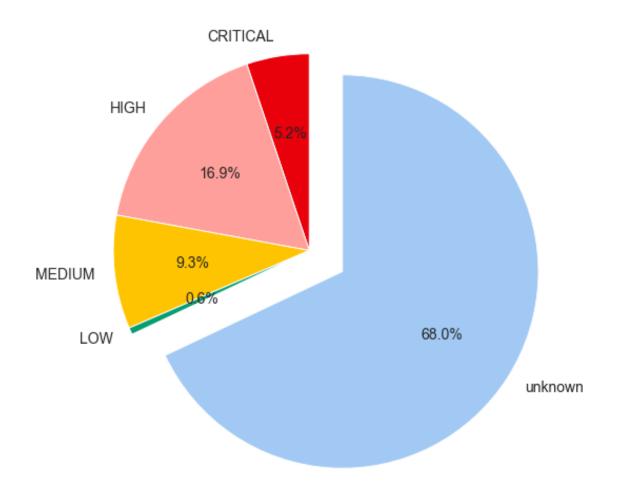



```
'HIGH': [],
               'MEDIUM': [],
               'LOW':[],
               'unknown': [],
               'Total_impacts_only': [],
               'Total_all': []}
       for comp_name in company_impact_severity:
           if comp name in most impacted comp:
               data['company'].append(comp_name)
               data['unknown'].append(company impact severity[comp name]['unknown'])
               data['CRITICAL'].append(company_impact_severity[comp_name]['CRITICAL'])
               data['HIGH'].append(company_impact_severity[comp_name]['HIGH'])
               data['MEDIUM'].append(company_impact_severity[comp_name]['MEDIUM'])
               data['LOW'].append(company_impact_severity[comp_name]['LOW'])
               s1 = sum([company_impact_severity[comp_name]['LOW'],
                                        company_impact_severity[comp_name]['MEDIUM'],
                                        company_impact_severity[comp_name]['HIGH'],
        →company_impact_severity[comp_name]['CRITICAL']])
               s2 = company impact severity[comp name]['unknown'] + s1
               data['Total impacts only'].append(s1)
               data['Total_all'].append(s2)
[515]:
      company_impact_df = pd.DataFrame(data)
[517]: company_impact_df.sort_values(by=['Total_impacts_only'], inplace=True,
                                     ascending=False)
       total_impacts_only = company_impact_df['Total_impacts_only']
       total_all = company_impact_df['Total_all']
       company_impact_df.drop(['Total_impacts_only', 'Total_all'], axis=1,__
        →inplace=True)
[518]: company_impact_df.set_index('company', drop=True, inplace=True)
[535]: ax = company_impact_df.plot(
           kind='bar', stacked=True,
           colormap=ListedColormap(
               ['#E8000B',
                '#FF9F9B',
                '#FFC401',
                '#059E73'.
               '#A2C9F4'
               ]), width=0.85, figsize=(15,5));
```



```
[540]: sizes = [company_impact_df['CRITICAL'].sum(),
               company_impact_df['HIGH'].sum(),
               company_impact_df['MEDIUM'].sum(),
               company_impact_df['LOW'].sum(),
               company_impact_df['unknown'].sum()]
       labels = ['CRITICAL', 'HIGH', 'MEDIUM', 'LOW', 'unknown']
       fig1, ax1 = plt.subplots(figsize=(8,8))
       ax1.pie(sizes, labels=labels, autopct='%1.1f%%', colors=['#E8000B',
                '#FF9F9B',
                '#FFC401',
                '#059E73',
               '#A2C9F4'
               ],
               explode=(0,0,0,0,0.2),
               shadow=False, startangle=90, textprops={'fontsize': 14}) #__
        \rightarrow explode=explode
       ax1.axis('equal');
       print(sum(sizes))
```

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[528]: sizes

[528]: [42092, 137972, 75962, 4586, 553612]