```
In [45]:
         import pandas as pd
          import matplotlib.pyplot as plt
In [46]:
         data = pd.read_json('data/world_bank_projects.json')
         data[ ['countryname', 'countryshortname'] ].head(3)
Out[46]:
                              countryname countryshortname
          O Federal Democratic Republic of Ethiopia
                                                 Ethiopia
                                                  Tunisia
                           Republic of Tunisia
          1
          2
                                   Tuvalu
                                                  Tuvalu
In [47]: type(data), len(data)
Out[47]: (pandas.core.frame.DataFrame, 500)
In [48]: data.columns
Out[48]: Index(['_id', 'approvalfy', 'board_approval_month', 'boardapprovaldate',
                 'borrower', 'closingdate', 'country_namecode', 'countrycode',
                 'countryname', 'countryshortname', 'docty', 'envassesmentcategoryc
         ode',
                 'grantamt', 'ibrdcommamt', 'id', 'idacommamt', 'impagency',
                 'lendinginstr', 'lendinginstrtype', 'lendprojectcost',
                 'majorsector_percent', 'mjsector_namecode', 'mjtheme',
                 'mjtheme namecode', 'mjthemecode', 'prodline', 'prodlinetext',
                 'productlinetype', 'project abstract', 'project name', 'projectdoc
         s',
                 'projectfinancialtype', 'projectstatusdisplay', 'regionname', 'sec
         tor',
                 'sector1', 'sector2', 'sector3', 'sector4', 'sector namecode',
                 'sectorcode', 'source', 'status', 'supplementprojectflg', 'theme
         1',
                 'theme namecode', 'themecode', 'totalamt', 'totalcommamt', 'url'],
                dtype='object')
```

```
In [49]: data.head()
```

### Out[49]:

| borrowe                                      | boardapprovaldate        | board_approval_month | approvalfy | _id                                      |   |
|--|--------------------------|----------------------|------------|--|---|
| FEDERA<br>DEMOCRATI<br>REPUBLIC C<br>ETHIOPI | 2013-11-<br>12T00:00:00Z | November             | 1999       | {'\$oid':<br>'52b213b38594d8a2be17c780'} | 0 |
| GOVERNMEN<br>OF TUNISI                       | 2013-11-<br>04T00:00:00Z | November             | 2015       | {'\$oid': '52b213b38594d8a2be17c781'}    | 1 |
| MINISTRY O<br>FINANCE AN<br>ECONOMI<br>DEVE  | 2013-11-<br>01T00:00:00Z | November             | 2014       | {'\$oid':<br>'52b213b38594d8a2be17c782'} | 2 |
| MIN. C<br>PLANNIN<br>AND INT'<br>COOPERATIO  | 2013-10-<br>31T00:00:00Z | October              | 2014       | {'\$oid': '52b213b38594d8a2be17c783'}    | 3 |
| MINISTRY O<br>FINANC                         | 2013-10-<br>31T00:00:00Z | October              | 2014       | {'\$oid':<br>'52b213b38594d8a2be17c784'} | 4 |

5 rows × 50 columns

```
In [50]: data.to_csv("./DATA/world_bank_projects.csv", header=True)
```

# Top 10 countries with most projects:

```
We are mainly interested with ['countryname', 'countryshortname']
```

```
sql script:
```

select col1, count(distinct col1) from table group by col1 order by col1
limit 5;

```
In [51]: #data1 = data.loc[:, ['countryname', 'countryshortname']].groupby('countryshortname']].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].groupby('countryshortname')].gr
```

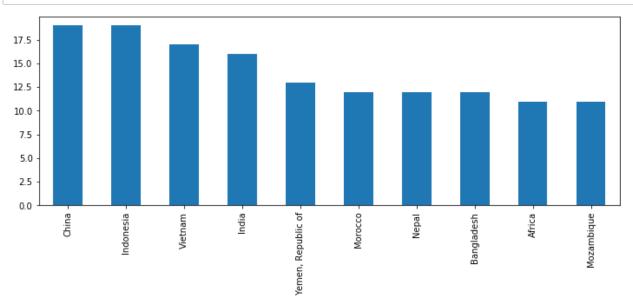
#### Out[51]:

#### countryname

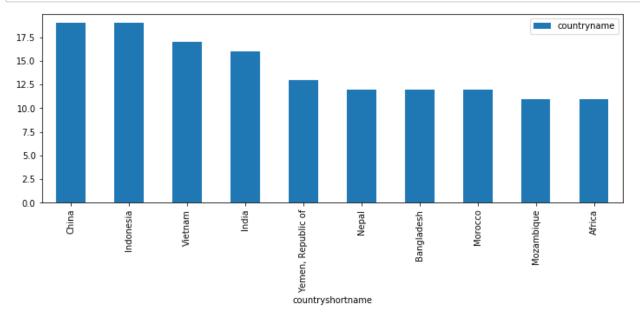
| countryshortname |    |
|------------------|----|
| China            | 19 |
| Indonesia        | 19 |
| Vietnam          | 17 |

# **Data Cleaning**

```
In [52]: data['countryshortname'].value_counts()[0:10]
Out[52]: China
                                 19
         Indonesia
                                 19
         Vietnam
                                 17
         India
                                 16
         Yemen, Republic of
                                 13
         Morocco
                                 12
         Nepal
                                 12
         Bangladesh
                                 12
         Africa
                                 11
                                 11
         Mozambique
         Name: countryshortname, dtype: int64
```



```
In [54]: data1[0:10].plot(kind='bar', figsize=(12,4))
    plt.show()
```



# Top 10 major project themes for column 'mjtheme\_namecode'

```
In [55]: data2 = data.loc[:, ['theme_namecode','mjthemecode']]
    data2.head()
```

#### Out[55]:

|   | theme_namecode                                 | mjthemecode |
|---|--|-------------|
| 0 | [{'code': '65', 'name': 'Education for all'}]  | 8,11        |
| 1 | [{'code': '24', 'name': 'Other economic manage | 1,6         |
| 2 | [{'code': '47', 'name': 'Regional integration' | 5,2,11,6    |
| 3 | [{'code': '57', 'name': 'Participation and civ | 7,7         |
| 4 | [{'code': '45', 'name': 'Export development an | 5,4         |

```
In [56]: data2.dropna(inplace=True)
    data2.head(15)
```

theme\_namecode mjthemecode

### Out[56]:

|    |  | ,         |
|----|--|-----------|
| 0  | [{'code': '65', 'name': 'Education for all'}]  | 8,11      |
| 1  | [{'code': '24', 'name': 'Other economic manage | 1,6       |
| 2  | [{'code': '47', 'name': 'Regional integration' | 5,2,11,6  |
| 3  | [{'code': '57', 'name': 'Participation and civ | 7,7       |
| 4  | [{'code': '45', 'name': 'Export development an | 5,4       |
| 5  | [{'code': '54', 'name': 'Social safety nets'}] | 6,6       |
| 6  | [{'code': '25', 'name': 'Administrative and ci | 2,4       |
| 7  | [{'code': '81', 'name': 'Climate change'}]     | 11,8      |
| 8  | [{'code': '79', 'name': 'Other rural developme | 10,7      |
| 9  | [{'code': '29', 'name': 'Other accountability/ | 2,2,2     |
| 10 | [{'code': '91', 'name': 'Global food crisis re | 10,2      |
| 11 | [{'code': '78', 'name': 'Rural services and in | 10,6,6,11 |
| 13 | [{'code': '47', 'name': 'Regional integration' | 5,11,10   |
| 14 | [{'code': '54', 'name': 'Social safety nets'}, | 6,6,6     |
| 15 | [{'code': '78', 'name': 'Rural services and in | 10,11,5   |
|    |  |           |

```
In [57]: #for n in range(len(data2)):
    data2.loc[0,:]["theme_namecode"][0]['name']

Out[57]: 'Education for all'

In [59]: import json

In [60]: with open('data/world_bank_projects.json') as fh:
    data = json.load(fh)
```

```
In [69]: type(data), len(data[0]), data[40]
Out[69]: (list,
          50,
          {'sector': [{'Name': 'General water, sanitation and flood protection sec
            {'Name': 'Public administration- Water, sanitation and flood protectio
         n'},
            {'Name': 'Information technology'}],
            'supplementprojectflg': 'N',
            'projectfinancialtype': 'IBRD',
            'prodline': 'PE',
            'mjtheme': ['Environment and natural resources management',
             'Social protection and risk management',
            'Environment and natural resources management',
             'Environment and natural resources management'],
            'idacommamt': 0,
            'impagency': 'RUSSIA HYROMETEOROLOGICAL SERVICE',
            'project name': 'RUSSIA HYDROMETEOROLOGICAL SERVICES MODERNIZATION',
            'mjthemecode': '11,6,11,11',
            'closingdate': '2018-12-31T00:00:00Z',
In [77]:
         from pandas.io.json import json_normalize
In [79]:
         df = json_normalize(data, 'mjtheme_namecode')
         df.head()
Out[79]:
            code
                                        name
          0
               8
                              Human development
          1
              11
          2
               1
                            Economic management
```

3

4

5

6 Social protection and risk management

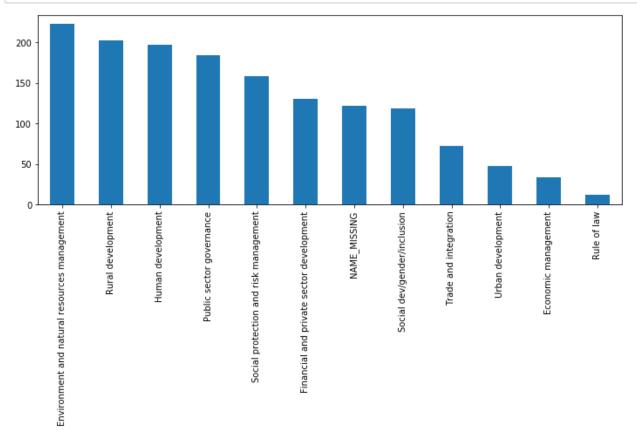
Trade and integration

```
In [82]: df.name.replace(' ', 'NAME_MISSING', inplace=True)
    df.head(15)
```

### Out[82]:

|    | code | name   |
|----|------|--|
| 0  | 8    | Human development                            |
| 1  | 11   | NAME_MISSING                                 |
| 2  | 1    | Economic management                          |
| 3  | 6    | Social protection and risk management        |
| 4  | 5    | Trade and integration                        |
| 5  | 2    | Public sector governance                     |
| 6  | 11   | Environment and natural resources management |
| 7  | 6    | Social protection and risk management        |
| 8  | 7    | Social dev/gender/inclusion                  |
| 9  | 7    | Social dev/gender/inclusion                  |
| 10 | 5    | Trade and integration                        |
| 11 | 4    | Financial and private sector development     |
| 12 | 6    | Social protection and risk management        |
| 13 | 6    | NAME_MISSING                                 |
| 14 | . 2  | Public sector governance                     |

```
In [111]: df['name'].value_counts().plot(kind='bar', figsize=(12,4))
    plt.show()
```



| In [ | ]: |  |
|------|----|--|
|      |    |  |
| In [ | ]: |  |