

Rating Charities w/ Data Science

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What is Charity Navigator



- ☐ **Charity Navigator** is the “largest and most-utilized charity evaluator in America.” Charity Navigator helps guide intelligent giving by evaluating the Financial Health, Accountability and Transparency of over 9,000 charities.
- ☐ Charity Navigator accepts no advertising or donations from the organizations it evaluates.
- Charity Navigator is a non-profit 501 (c) (3) public charity itself, which depends on support from individuals, corporations and foundations that believe it provides a much-needed service to America's charitable givers.

A look at the data available

[Sign up or view our technical documentation here](#)

Rating Tier

- Search 1.6 million nonprofits by keyword(s) and other criteria
- Verify a charity's IRS standing and deductibility status
- Browse by cause areas*
- Display overall star ratings*
- Display mission statement*

Pricing and Usage Limits

- Free
- 1,000 hits/day

Data Fields Included

- Employee Identification Number (EIN)
- Charity Name
- Mission*
- Tag Line*
- IRS Classification
- IRS Subsection
- Foundation Status
- Deductibility
- Charity Navigator URL*
- Category*
- Cause*
- Street Address
- City
- State
- Zip
- Active Advisories
- Removed Advisories
- Current Rating (star image)*

Content Tier

- **All the features included in the Rating Tier, plus**
- Browse premium content (Hot Topics, Top Ten Lists)
- Display detailed ratings for individual charities*
- Display accountability metrics for individual charities*
- Access historical ratings for individual charities*

Pricing and Usage Limits

For Content Tier pricing and usage limits, please email us at api@charitynavigator.org.

Data Fields Included

- **All the fields included in the Rating Tier, plus**
- Numeric ratings and scores*
- Form 990 data
- Financial performance metrics*
- Accountability tests*
- Representatives (CEO, chairman, etc.)*
- Lists (Top Ten Lists, Hot Topics)*

**Applies to rated organizations only.*



How Is the Overall Score and Star Rating Calculated?

In our two-dimensional rating system, the overall score is not a sum but rather a measurement of the distance of two component scores from a perfect score of 100 and 100. The smaller the distance to the perfect score, the better the overall score:

$$100 - \sqrt{\frac{(100 - \text{Financial})^2 + (100 - \text{A\&T})^2}{2}}$$

Although the calculation for Overall Score differs from the calculation for Financial Health and Accountability & Transparency, the Overall Rating has the same rating table.

Overall Rating:	★★★★	★★★★☆	★★★☆☆	★★☆☆☆	★☆☆☆☆	0 Stars	Donor Advisory
Overall Score:	≥ 90	80 - 90	70 - 80	55 - 70	< 55	N/A	

Questions we asked of this data

- Do charities with higher contributions have higher ratings?
- Do charities in certain categories have higher/lower ratings? (Arts, Humanitarian causes, Medical Research, etc.)
- Are some states more charitable than others?

Hypothesis

Charitable Organizations that receive higher contributions have higher Ratings when compared to smaller sized charities.

Pulling from the API itself

```
In [47]: def createOrganizationSearchURL(size_search_params=default_search_params):
        query_params = [f"{param}={value}" for (param, value) in size_search_params.items()]
        query_string = "&".join(query_params)
        url = f"{base_organization_url}?{query_string}"
        return url
```

```
search_params = default_search_params

for page_num in range(1, 20):
    print(page_num)
    search_params["pageNum"] = page_num
    print(search_params)
    organizations_url = createOrganizationSearchURL(search_params)
    response = requests.get(organizations_url)
    if (response.status_code != 200):
        break;
    else:
        result_df = pd.DataFrame(response.json())
        results.append(result_df)

total_results = pd.concat(results)
total_results.to_csv("All_Organizations.csv")
```

Issues With the Raw Data

- Irrelevant Data
- Raw JSON was stored so relevant data were embedded in dict strings
- Data was repeated
- Other run-of-the-mill issues such as renaming and reindexing the columns.

Cleaning our data

Unnamed: 0	advisories	category	cause	charityName	charityNavigatorURL	currentRating	donationAddress	ein	irsClassifica
0	{'severity': None, 'active': {'_rapid_links': ...}}	{'categoryName': 'Research and Public Policy', ...}	{'causeID': 35, 'causeName': 'Non-Medical Scie...	Mount Desert Island Biological Laboratory	https://www.charitynavigator.org/?bay=search.s...	{'score': 92.61, 'ratingID': 131800, 'publicat...	{'country': None, 'stateOrProvince': 'ME', 'ci...	10202467	{'deductib': 'Contribut are deduct
1	{'severity': None, 'active': {'_rapid_links': ...}}	{'categoryName': 'Community Development', 'cat...	{'causeID': 42, 'causeName': 'United Ways', 'c...	United Way of Eastern Maine	https://www.charitynavigator.org/?bay=search.s...	{'score': 81.84, 'ratingID': 138738, 'publicat...	NaN	10211478	{'deductib': 'Contribut are deduct
2	{'severity': None, 'active': {'_rapid_links': ...}}	{'categoryName': 'Health', 'categoryID': 5, 'c...	{'causeID': 14, 'causeName': 'Medical Research...	The Jackson Laboratory	https://www.charitynavigator.org/?bay=search.s...	{'score': 93.16, 'ratingID': 131608, 'publicat...	{'country': None, 'stateOrProvince': 'ME', 'ci...	10211513	{'deductib': 'Contribut are deduct
3	{'severity': None, 'active': {'_rapid_links': ...}}	{'categoryName': 'Arts, Culture, Humanities', ...}	{'causeID': 6, 'causeName': 'Libraries, Histor...	Maine Historical Society	https://www.charitynavigator.org/?bay=search.s...	{'score': 80.31, 'ratingID': 124121, 'publicat...	NaN	10211530	{'deductib': 'Contribut are deduct
4	{'severity': None, 'active': {'_rapid_links': ...}}	{'categoryName': 'Human Services', 'categoryID...	{'causeID': 16, 'causeName': 'Youth Developmen...	Boys & Girls Clubs of Southern Maine	https://www.charitynavigator.org/?bay=search.s...	{'score': 91.54, 'ratingID': 135033, 'publicat...	NaN	10211543	{'deductib': 'Contribut are deduct

Cleaning Process

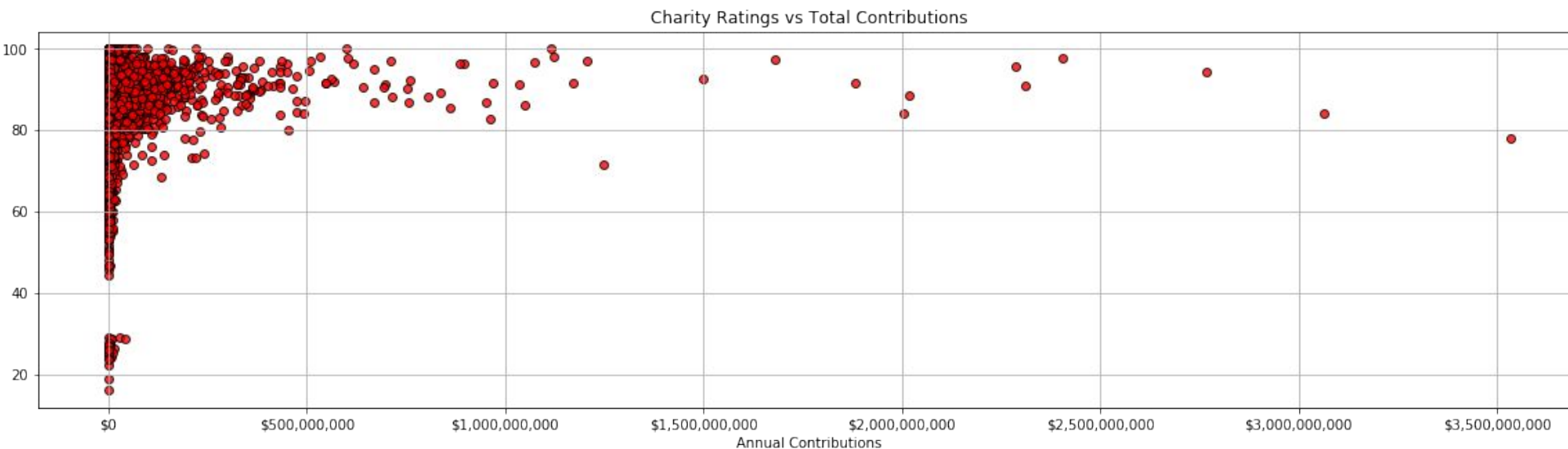
- Trimmed the columns down from 16 to 8, only including the information relevant to our data as well as the charities' missions and causes.
- Created our own functions which utilized the `ast.literal_eval` function from the abstract syntax tree library to pull out the data from the dictionary strings.
- We determined that the EIN column was the one we would use as a *'Primary Key'* and dropped any repeated values (excluding the first).
- Renamed and reindexed the columns in a way that is much easier to understand.

Cleaning our data (part two)

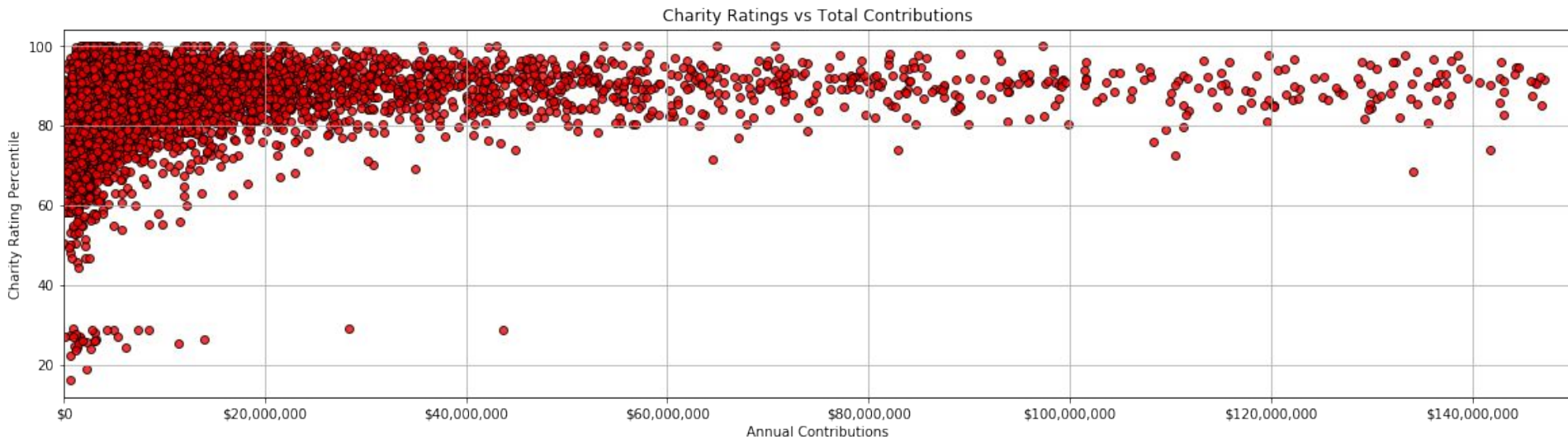
Cleaned Data

	Charity	ein	Mission	Cause	Category Name	Rating	State	Contributions
0	Mount Desert Island Biological Laboratory	10202467	The MDI Biological Laboratory is a rapidly gro...	{'causeID': 35, 'causeName': 'Non-Medical Scie...	Research and Public Policy	92.61	ME	12924245.0
1	United Way of Eastern Maine	10211478	Working with the communities we serve, the Uni...	{'causeID': 42, 'causeName': 'United Ways', 'c...	Community Development	81.84	ME	2438155.0
2	The Jackson Laboratory	10211513	The Jackson Laboratory, founded in 1929, is an...	{'causeID': 14, 'causeName': 'Medical Research...	Health	93.16	ME	331241336.0
3	Maine Historical Society	10211530	Founded in 1822, the Maine Historical Society ...	{'causeID': 6, 'causeName': 'Libraries, Histor...	Arts, Culture, Humanities	80.31	ME	2219692.0
4	Boys & Girls Clubs of Southern Maine	10211543	For more than 100 years, Boys & Girls Clubs of...	{'causeID': 16, 'causeName': 'Youth Developmen...	Human Services	91.54	ME	3859985.0

Initial Scatter Plot



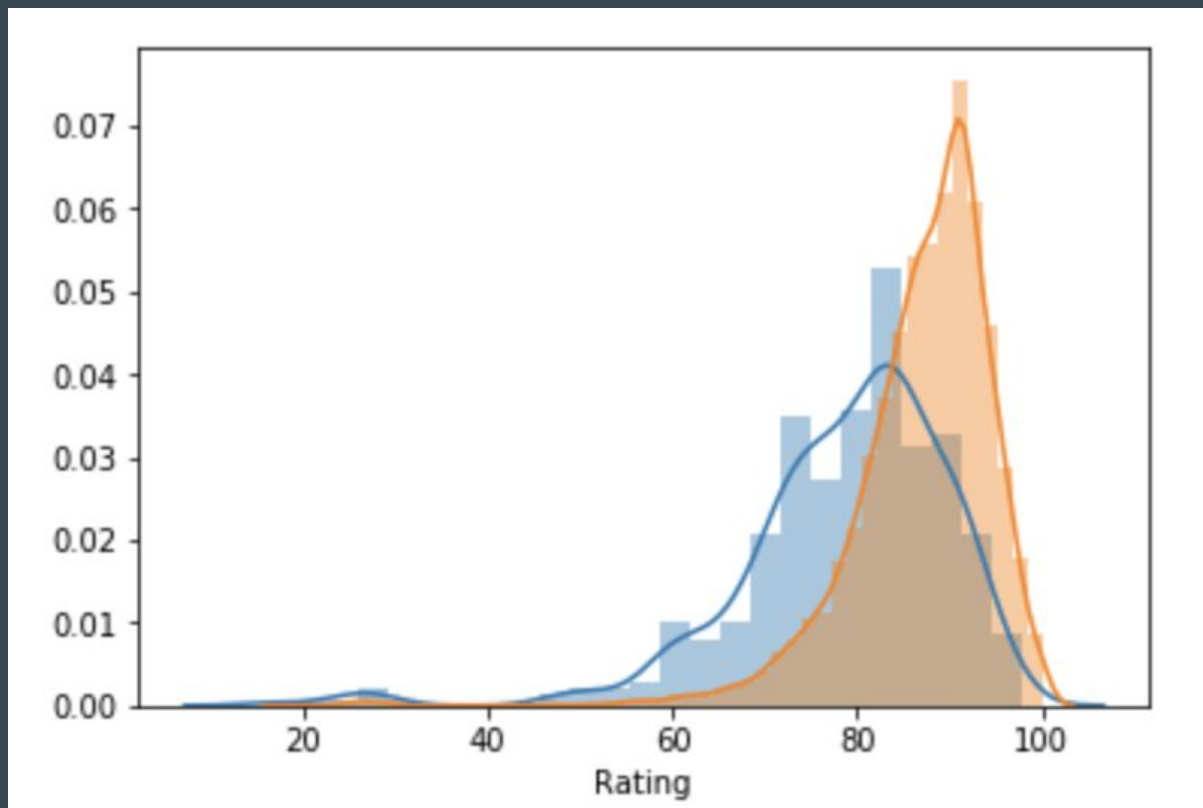
Reformatted Scatter Plot



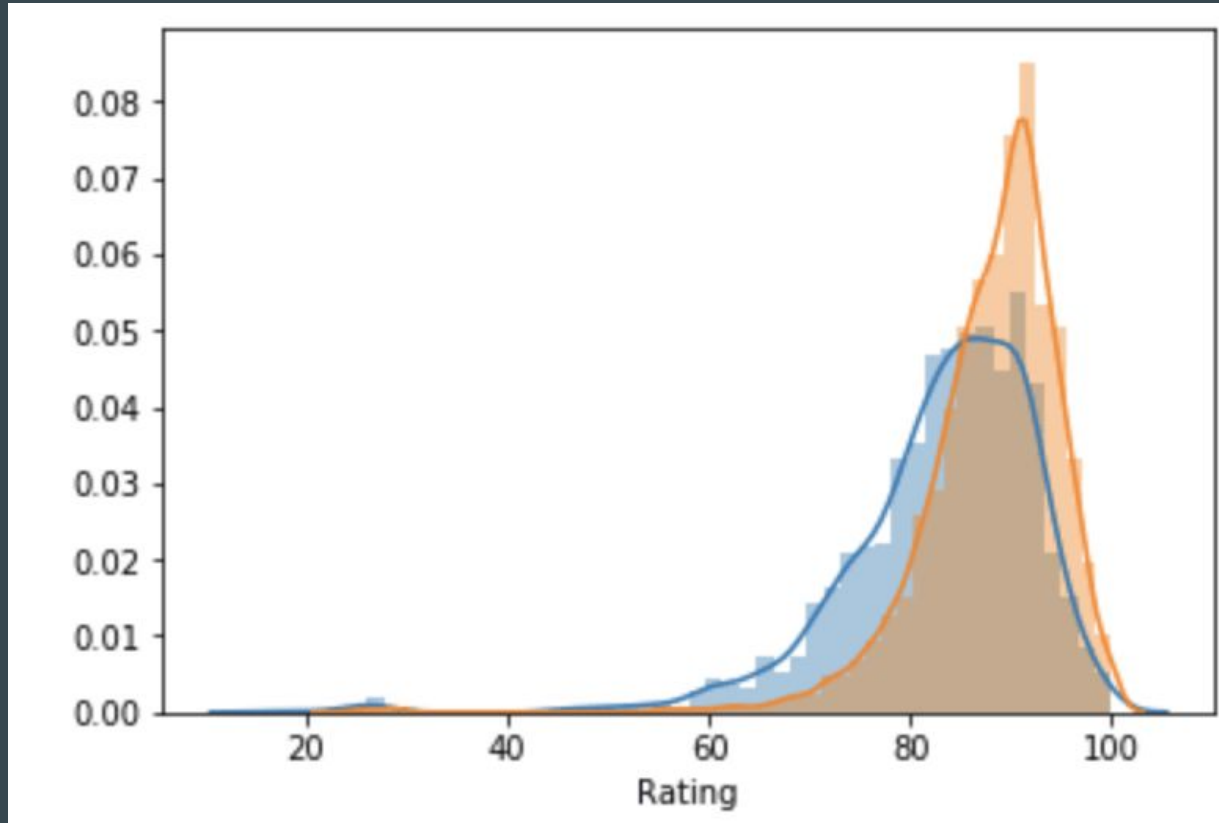
Results

- Upon visualizing the contributions against rating, we saw that there was no positive linear correlation between them. The distribution of data points did not follow a line.
- There was however a significant difference ($p\text{value}=4.84e-96$ comparing below a million) between lower percentiles and upper percentiles of contributions when performing anovas and ttests on their ratings.
- The best cutoff point (Done with t-tests comparing edges at percentiles in a range of 0 to 95 by 5) was the 30th percentile at \$2.6 million with a p-value of $3.32e-149$.
 - Average Rating below \$2.6 Million was 83.1 compared to 88.1 above \$2.6 Million

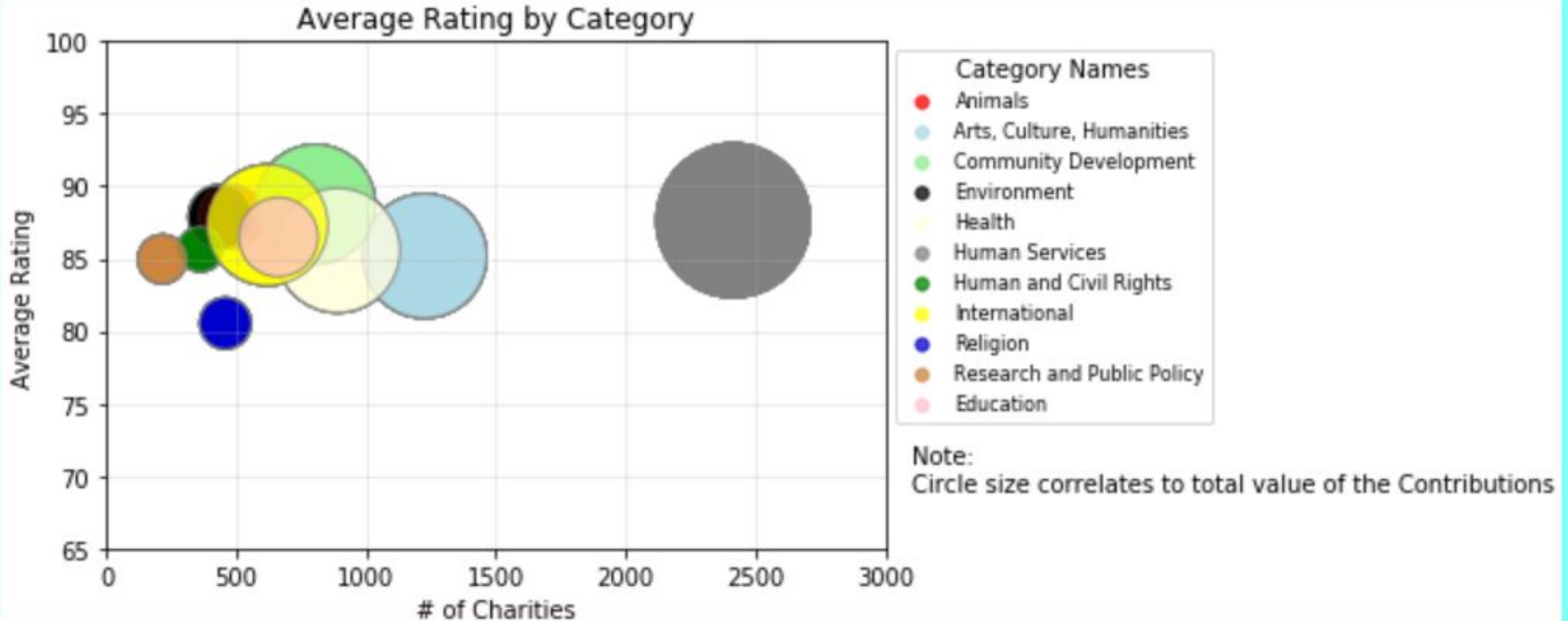
Ratings below \$1,000,000 vs Ratings above



Distributions of Rating above and below \$2.6 million

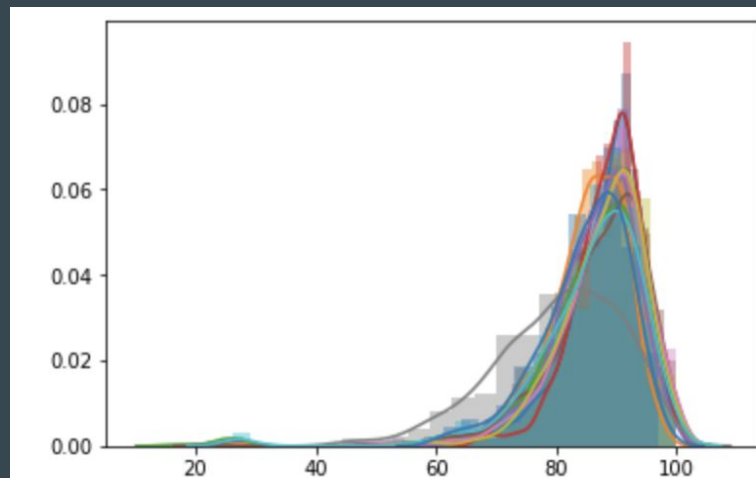


A deeper dive into our data:



Category relationship with Ratings

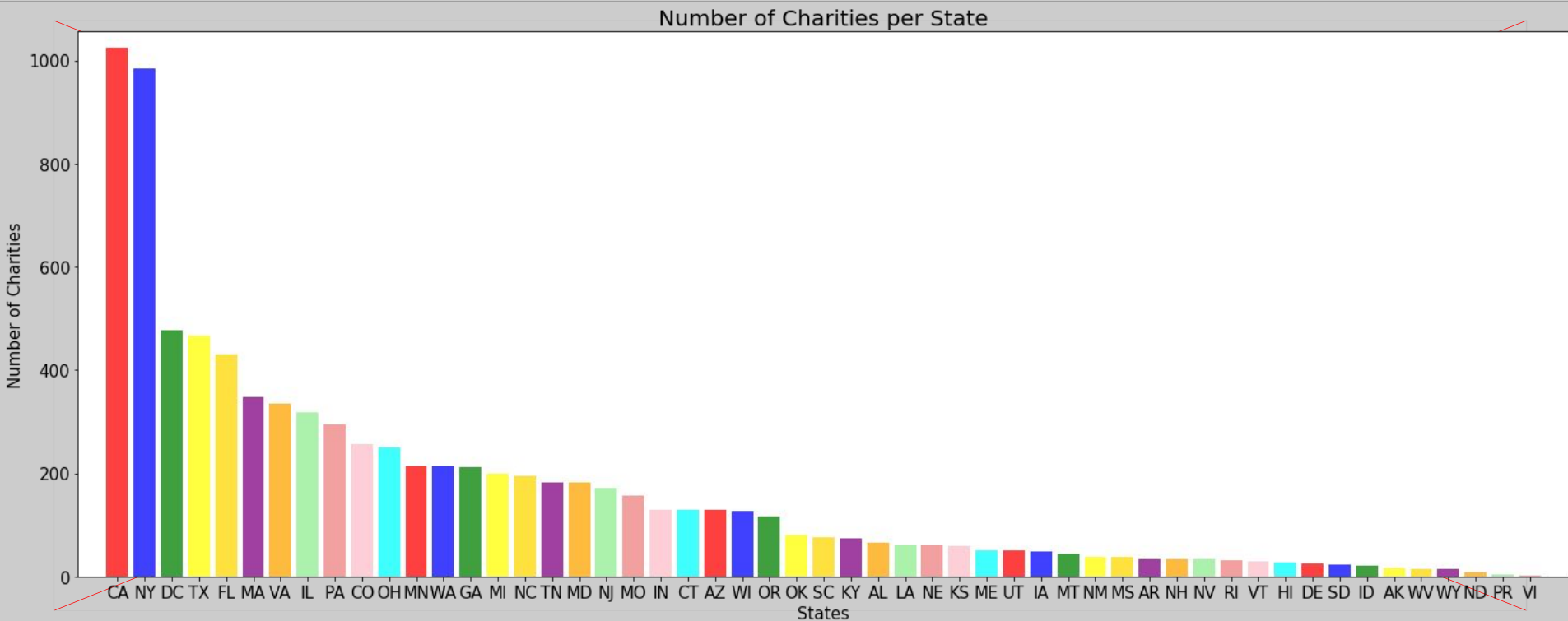
- We saw a noticeably lower rating on charities belonging to the religious category and running an ANOVA, we were able to confirm that there were significant differences between categories.
- We also saw that removing Religion had the largest impact to p-value compared to any other category. From $1.5e-86$ to $3.13e-34$
- The average rating for Religion was 80.5
 - This is compared to 86.6 generally



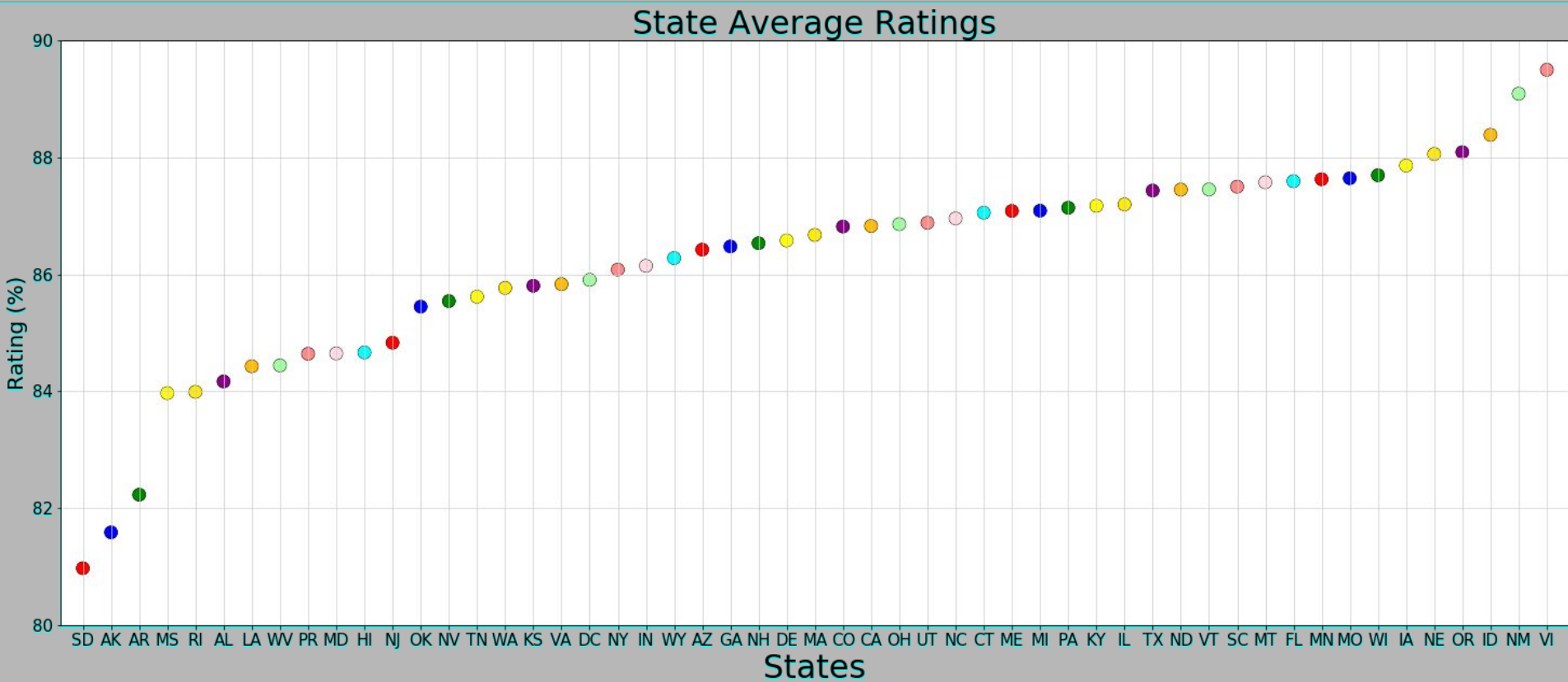
Questions about the data we saw:

- 1) Which states/territories/districts have the most charities as their domicile?
- 2) Did more populous states such as Texas, New York, Florida, or California have higher rated charities on average versus less populated states?

The Fab Five: CA, NY, DC, TX, & FL



Conclusion: No relationship between populous states and ratings



Questions?