
Popularity of content leads to its duplication on Reddit

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Abstract

On social network sites like Reddit, users submit links or share textual content. The community upvotes (for) and downvotes (against) and reddit uses community sourcing as a means to order content. The contributed are scored that is number of upvotes minus downvotes. The popularity of a user is represented by his/her karma. In this project, we have tried to judge how the popularity of contents leads to its duplication on Reddit. Users can re-post the popular posts on various other subreddits in order to receive more upvotes, and thus increasing their karma. Here, we are looking users in two ways, one being the initial person broadcasting the link trying to obtain the critical mass and second one being people reposting content. The results from this project will depict how the users satisfy their Reddit Karma and the design implications of this in online communities.

1 Objectives

In this project, we have looked at the following interesting phenomenon:

$$Karma \text{ in one reddit} \propto \text{repost}$$

Thus, we have mainly focusing on to depict how the users satisfy their Reddit Karma and the design implications of this in online communities. We have correlated a post's score with its diffusion into other subreddits. We have tried to answer the questions such as – How often do links get reposted?, How many times does a user try to broadcast a link initially? We are trying to see whether there is a relationship between karma and repost frequency.

2 Background Study

As social networks and the user-generated content that populates them continue to grow in prevalence, size, and influence, understanding how users interact and produce this content becomes increasingly important. Insight into these community dynamics could prove valuable for measuring content trust, providing role-based group recommendations, or evaluating group stability and growth. For the related work, we have done readings of three papers, namely, Eric Gilbert's - "Widespread Under Provision on reddit", Cody Buntain's - "Identifying social roles in reddit using network structure" and Donn Morrison's - "Here, have an upvote: communication behaviour and karma on Reddit".

Online communities rely on their members to do work for the good of everyone on the site. The links with the most up-votes bubble up to the main page, pointing everyone toward the best content. However, when too many people rely on others to contribute without doing so themselves results in underprovision. Gilbert observed that Reddit overlooked 52% of the most popular links the first time they were submitted [1]. This suggests that many potentially popular links get ignored, thus jeopardizing the site's core purpose of showing the best voted content.

Cody Buntain has identified well-known behavioral patterns and social roles in the multi-community environments. In his paper, he has demonstrated the presence and identifiability of the answer-person role in reddit and showed that only a very small number of users participate across community boundaries [2].

Donn Morrison has tried to cluster the users of Reddit.com into behavioural roles using features derived from their egocentric reply-graphs. He has tried to explore the link between the distribution of karma (i.e. popularity measured by the number of up- and downvotes) and the behavioural role to which that user belongs. He observed that users with Contributor behaviour proved to be more popular, however the variance in karma in this role was high [3]. Thus, this indicates that the contributor role encompasses both popular and unpopular users. By predicting high-karma users, community owners or moderators, or even the users themselves, could more efficiently manage and maintain behaviour in the forums such as Reddit.com under analysis.

All three papers have tried to examine the users and the data posted by them on Reddit.com. They demonstrated that most of the popular links are overlooked in the first time, only a small number of users participate across community boundaries and the behavioural role of the user is directly linked to the distribution of karma.

In this project, we are also trying to examine the users and their activity. We are trying to demonstrate that popularity of content leads to its duplication on Reddit. In order to achieve this, we have used the Reddit API to collect the data across various subreddits at various times of the day.

3 Data Collection

3.1 Identification of Subreddits

So far, We chose subreddits related to photography. This was done as all reddit posts on such subreddits use image sharing services like imgur.com. These sharing services usually generate a unique url for each gallery that can be used to share on reddit. Hence, by searching for posts with same image urls, we were able to identify duplicate posts.

Reddit has an inbuilt subreddit recommendation system which lists down relevant subreddits for every search query. These subreddits have a varying frequency of user posts, thus giving a uniform result instead of results being biased to only few with the maximum activity. We choose 10 subreddits to get a preliminary idea about the posts and users in a subreddit.

The subreddits chosen for this study were:

- /pics
- /gifs
- /picrequests
- /photography
- /Images
- /itookapicture
- /postprocessing
- /photocritique
- /HDR
- /shittyHDR

For the project rest of the semester, we plan to re-choose subreddits after a meeting with the professor. Since search allows us to search throughout reddit, we don't have to pick subreddits close to each other.

3.2 Fetching and Storing

We then used Reddit API to retrieve the content (link submissions on hot page) from these subreddits by using an API wrapper (PRAW - python reddit api wrapper) provided for Python language. The

Number of Posts	42992
Number of Unique Authors	33044
Number of links reposted at least once	7541

Table 1: Contributions

script was executed for one hour each on four different times in the same day, to add the dimension of time in our content analysis. A MySQL database was used to store and update the tables of the content which was fetched. While data collection of top and news posts is running, in parallel, we also run a bot that looks at posts that has been collected more than 5 days in the past and we look up where have these links diffused in reddit and stores the tuple (link, sub_reddit, poster, time_created) into the db.

4 Data Analysis

The statistics of the data collected can be seen in Table1.

4.1 Chains

Once we have obtained all the posts, we search each of the posts on reddit in order to get their diffusion across the various sub-reddits since their inception. Thus, we thinking of the search results like a diffusion chain. We have sorted the results by time and we call the first person to post the link as the original author. How many times the original author posts initially is how much effort he puts into broadcasting the link. After this, we have found the search result with max score so that we can know when a particular reached its maximum popularity. All results to the left of the max post form the left chain and after wards form the right chain.

An example of chains can be seen in the following figure:

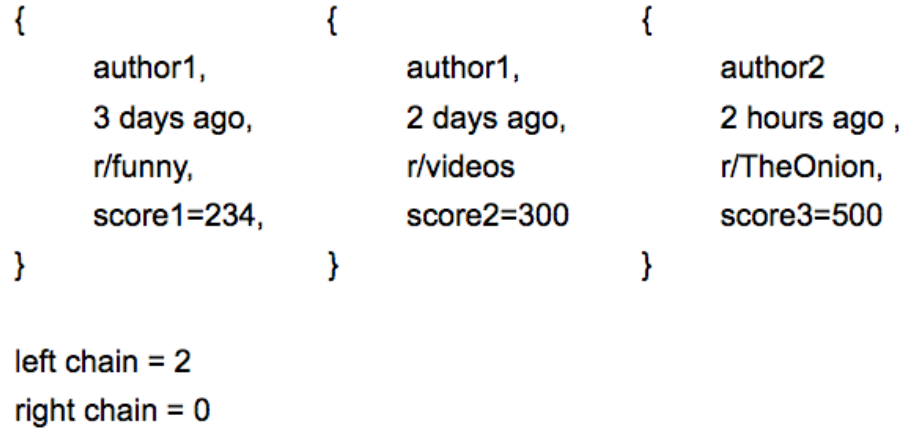


Figure 1: Description of Chain

In this example, we have three results, the last result has the max score, so our left chain length is 2 and right chain length is 0. Note that we don't do normalization with respect to how many subscribers are in the subreddit.

4.2 Distribution of Chain Length

Figure 2 shows a distribution of the chain length of the posts i.e. distribution of how far links go. It can be observed that most chain lengths are less than 50. There is a decreasing trend in the

distribution. Thus, posts with longer chains are less in number. However, there is one anomaly. We notice a tiny growth at the end near the 230-240 bucket with like nothing in between. We looked at it, that post has 235 shares. We checked it manually and found that it turned out to be a spam link where every-time a randomly generated unique author posted in /r/funny.

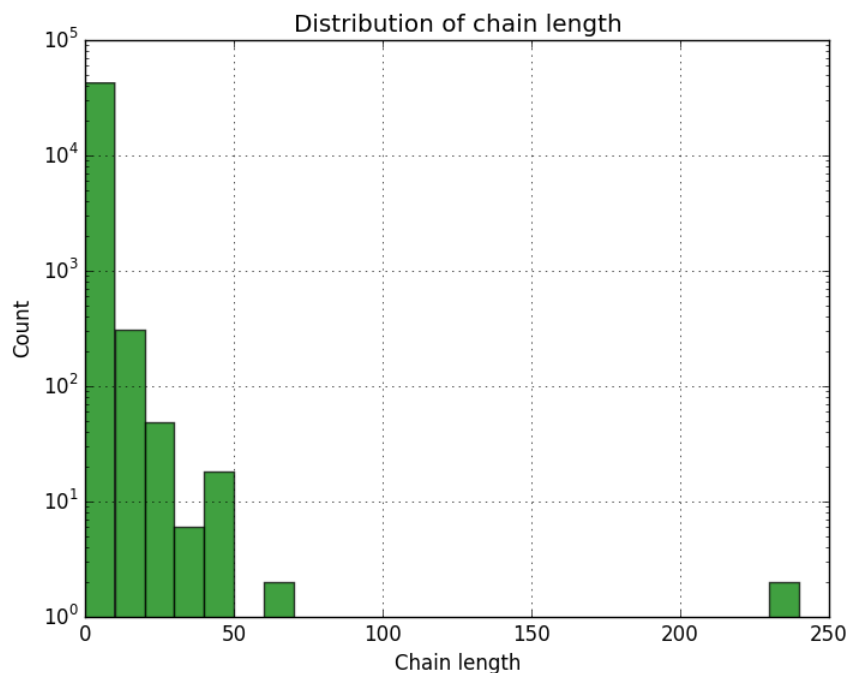


Figure 2: Distribution of Chain Length

4.3 Distribution of Original Author Re-posting

Figure 3 shows that distribution of posts by the original author. So, it basically shows the the number of times the original author is reposting his/her own link in order to broadcast it so that it becomes more popular which eventually leads to a higher karma for him/her. We observed that the maximum number of times author has reposted has gone to 12 in our dataset.

4.4 Distribution of Re-posts by each Subreddit

Figure 4 shows the distribution of posts and re-posts by each subreddit. Thus, here we are looking how much repost happens in each subreddit. We were expecting a lot of reposts from subreddits adviceanimals or funny because most of them are meme based subreddits but the onion and radioreddit came out on the top.

4.5 Distribution of Different Authors Re-posting

Figure 5 shows the distribution of different authors re-posting. So basically it calculates a ratio of unique authors by the chain length. If this ratio is 1, this means that all the authors in the chain for that particular post are unique. From the distribution, we observed that that ratio is 1 in most of the cases. Thus, the chain of most of the posts on Reddit consist of unique authors i.e. most of the time it's only unique people who are reposting.

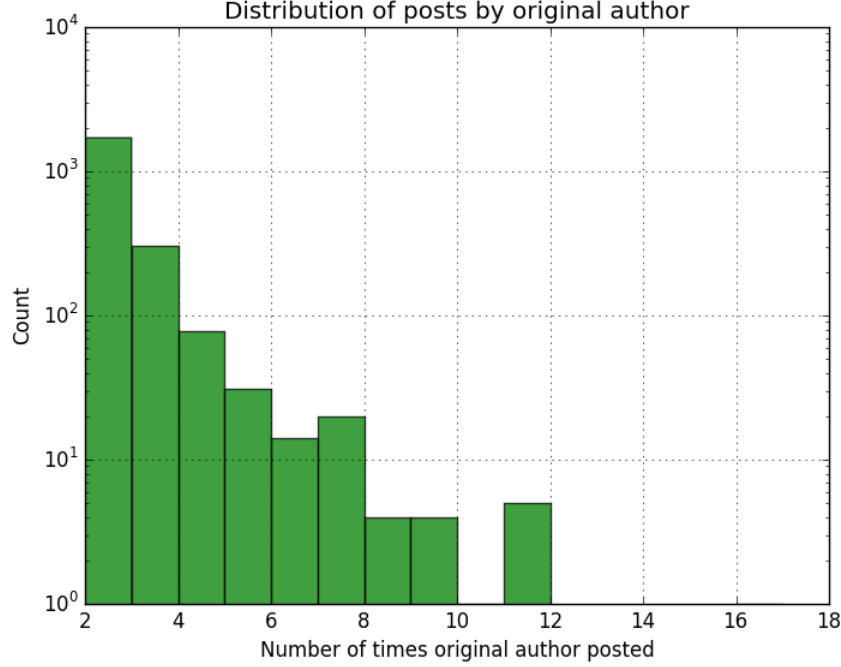


Figure 3: Distribution of Original Author Re-posting

4.6 Distribution of Left Chain Length

Figure 6 shows the distribution of the left chain length. This distribution basically shows us people try to make a particular post happening and popular. Also, it tells us the factors that led to the post's maximum popularity in the entire chain. It is observed that the left chain for most posts is less than 30. Also, a decreasing behavior is observed as expected. However, again there is an anomaly in the graph. We notice a tiny growth at the end near the 225-230 bucket with like nothing in between. We looked at it, that post has a left chain length of 229. We checked it manually and found that it turned out to be a spam link where every-time a randomly generated unique author posted in /r/funny.

4.7 Distribution of Right Chain Length

This plot shows how far diffusion of a link can go. No link made it more than 50 shares.

4.8 Distribution of Max Score by the Right Chain Length

this is my favorite plot, it shows that for each post's maximum karma, how many reposts can you expect? We were surprised to see most of the diffusion after the highest point in is mostly upto 20.

4.9 Distribution of Maximum Score of the chains

This plot shows the distribution of scores for all posts we had collected. We had expected the figure to be at highest around the low scores, and have a decreasing nature with a long tail. However, we noticed a surge in posts with scores around 3000.

From the data we have collected, we have done some basic analysis and made some visualizations.

We wanted to look at the trend of how often do users contribute. Our hypothesis was the very very few users contribute worth content. Figure 1 refers to the graph between number of users and number of posts. As you can see very few users have good amount of posts. On the x-axis, it shows

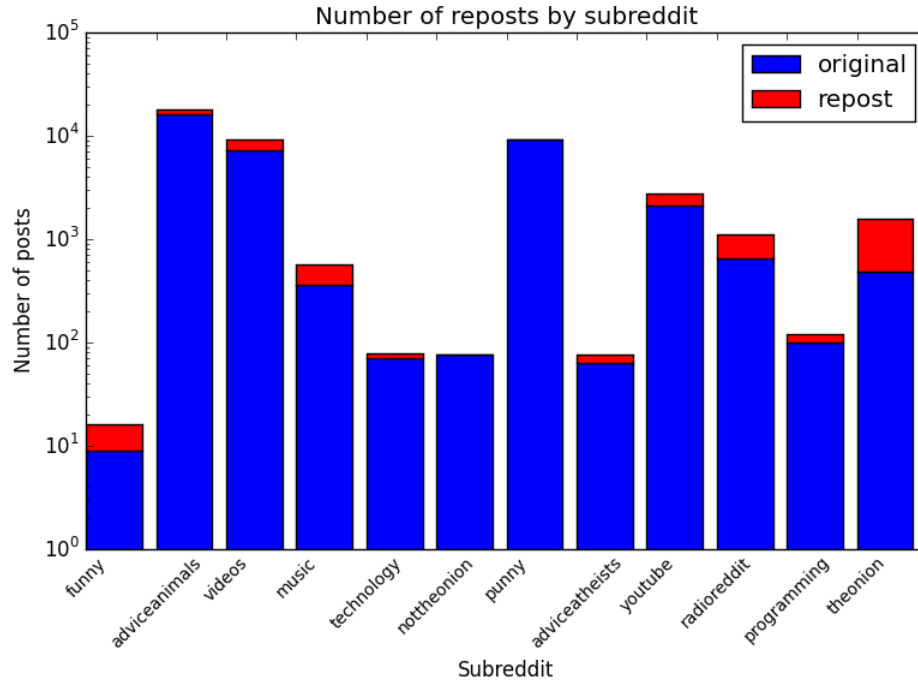


Figure 4: Distribution of Re-posts by each Subreddit

the counts of the posts, and on the y-axis, the corresponding number of users who have made that many posts. In the collection, we noticed that 633 users had posted single time, and this number decreased drastically as the count got number of posts increased. Figure 2 refers to the graph of number of submissions per subreddits. Figure 3 refers to the graph of mean link karma of users who have posted. Figure 4 refers to the means scores of submissions. Figure 5 refers to the number of search results and score of submission.

5 Comparison with Eric Gilbert’s Paper on Widespread Under-provision on Reddit

We compared our results with a related study done by Eric Gilbert who found that only around half of the popular links were noticed in the initial submission. Gilbert’s dataset was popular links from /r/pics subreddit. We found similar results when we evaluated the same figures for our dataset of 12 sub-reddits.

6 Anomalies with the Data

6.1 Forbidden Links

We found some posts that reddit has banned directly on API level. An online search of the given link redirected to a 403 Forbidden Error page. Interestingly, the link has a politically sensitive article. Moreover, it is no where mentioned in their API documentation to get an error of this nature. One of such pages can be seen in the following image:

6.2 Posts having chain length of 235

Post having a chain length of 235 was too good to be true. So, we checked it manually and found that it turned out to be a spam link where every-time a randomly generated unique author posted in

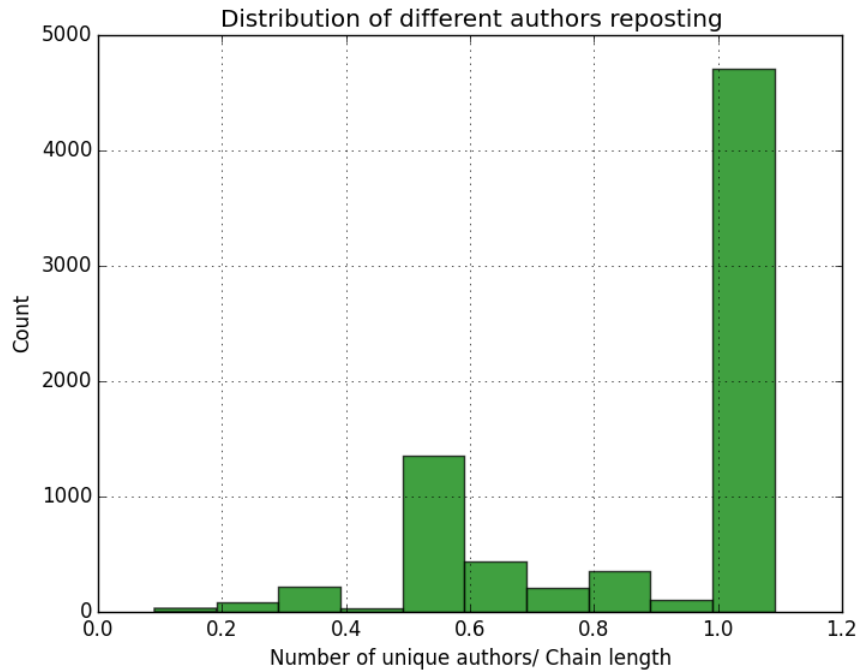


Figure 5: Distribution of Different Authors Re-posting

/r/funny. It's pretty creepy to see that someone is using the API to growth hack their website. We even checked the website. The domain name is expired. It doesn't make sense. A screenshot of that page is shown below:

6.3 Exception Handling and Issues with PRAW

We just wanted to point out the difficulties that we faced in data collection. A lot of exception handling had to be done to take care of various issues to collect a dataset with a decent number of records. We had email alerts set up to notify whenever our bot found a new error. Also, the python wrapper we used to collect data had its own issues which forced us to recollect data in Phase 2.

7 Future Work

- Study user's reposting behavior
- Voting rings
- detect spam attempts

8 Work Ahead

For the second part of the term, we plan to collect data for 15 days from subreddits in different areas of interest and of smaller size with the new and top queue. We are planning to look at the following subreddits as shown in Table 1:

Thanks to <http://redditlist.com/> we were able to look at subreddits ordered by highest subscribers. The rationale for choosing these subreddits is now changed to be orthogonal in terms of topic of the subreddit because we discovered that we no longer have to do search ourselves and reddit offers searching in all the subreddits with its API. We wanted to see if there is a trend across different types of content. Reddit has two types of submissions, namely links and self posts. Self posts are

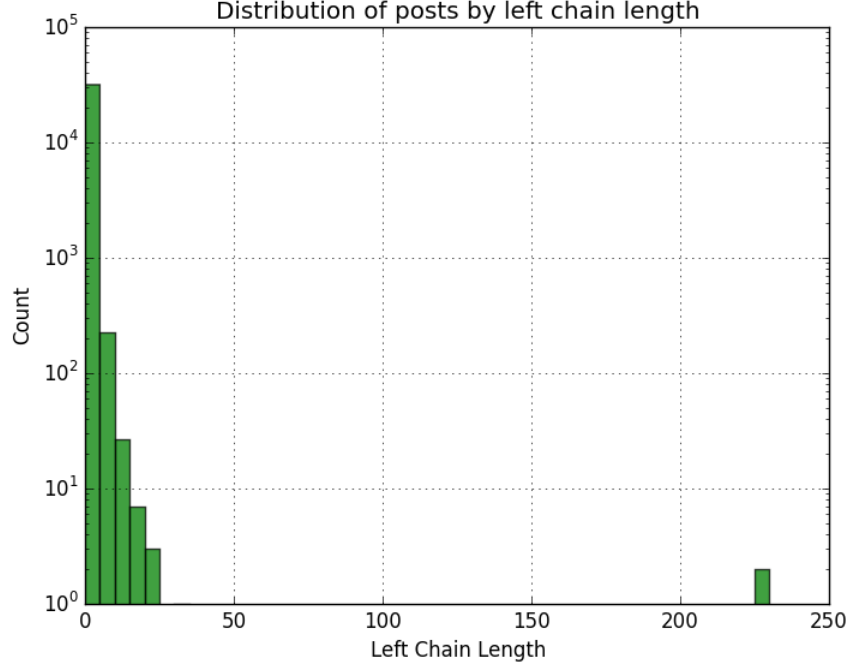


Figure 6: Distribution of Left Chain Length

Famous Subreddits	Similar smaller subreddits
funny (6,988,603)	punny (54,491)
AdviceAnimals (4,252,660)	AdviceAtheists (13,460)
videos (6,192,963)	YouTube (21,611)
Music (5,526,808)	RadioReddit (13,356)
technology (5,066,423)	programming (559,631)
nottheonion (1,435,635)	TheOnion (6,610)

Table 2: Subreddits we plan to monitor and number of subscribers

textual submissions. We decided to only look at links because links are binary in the sense that either link leads to the same content or it doesn't. Textual posts might have similar meaning but text might be different. For the purposes of this study, we are only looking at links.

While we'll collect the hot and new stories for each subreddit, we will also run a parallel bot that looks at links that were posted more than four days ago and see what subreddits the link got duplicated to. Now there are three possible scenarios for reposting. One is broadcaster where the user is trying to post the same link with multiple topics in multiple subreddits. We will see if the first link's occurrence has happened within relatively short amount of time in different subreddits by the same author. Another use case is cross posting link where the user is part of one community, while browsing that community, he/she comes across the link and shares in another community. We can use the reddit api to figure out where the links came from by sorting the links by time and then seeing if the original poster of the link is part of any of the subreddits the links in the past were posted in. It's highly probably that the user saw it in another subreddit then. The last one being the user came across the link outside reddit. We are considering if we can maybe survey them and hope users respond with right format of response like SMS voting schemes work these days. There also might be cases where the user doesn't know that the link was being duplicated.

We plan to identify to see how often does reposting of content happen. Is there is a triggering score at which reposts occur? Which subreddits are the first places of the posting? Is it that less common

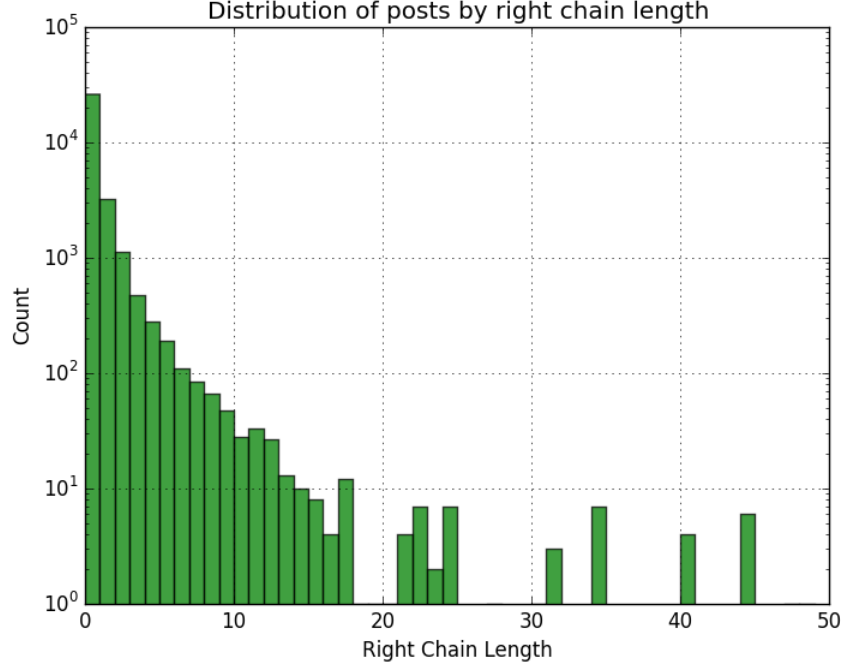


Figure 7: Distribution of Right Chain Length

Team member	Contributions
Ashwini	Data collection
Prajwal	Data visualization and scripting
Revant	Data analysis
Suren	Development of the bot

Table 3: Contributions

subreddits get content first because it's easier to reach the front page? How often do links do well in one subreddit and in other ones? We'll consider doing a visualization of how the content diverges.

9 Contributions

We have been contributing about equally in this project. However we have distributed responsibilities based upon areas of interest as shown in Table 2.

10 References

- Eric Gilbert. 2013. Widespread underprovision on Reddit. In Proceedings of the 2013 conference on Computer supported cooperative work (CSCW '13). ACM, New York, NY, USA, 803-808
- Cody Buntain and Jennifer Golbeck. 2014 Identifying social roles in reddit using network structure. In Proceedings of the companion publication of the 23rd international conference on World wide web companion (WWW Companion '14) International World Wide Web Conferences Steering Committee, Republic and Canton of Geneva, Switzerland, 615-620
- Morrison, Donn, and Conor Hayes. 2013. Here, have an upvote: communication behaviour and karma on Reddit. GI-Jahrestagung

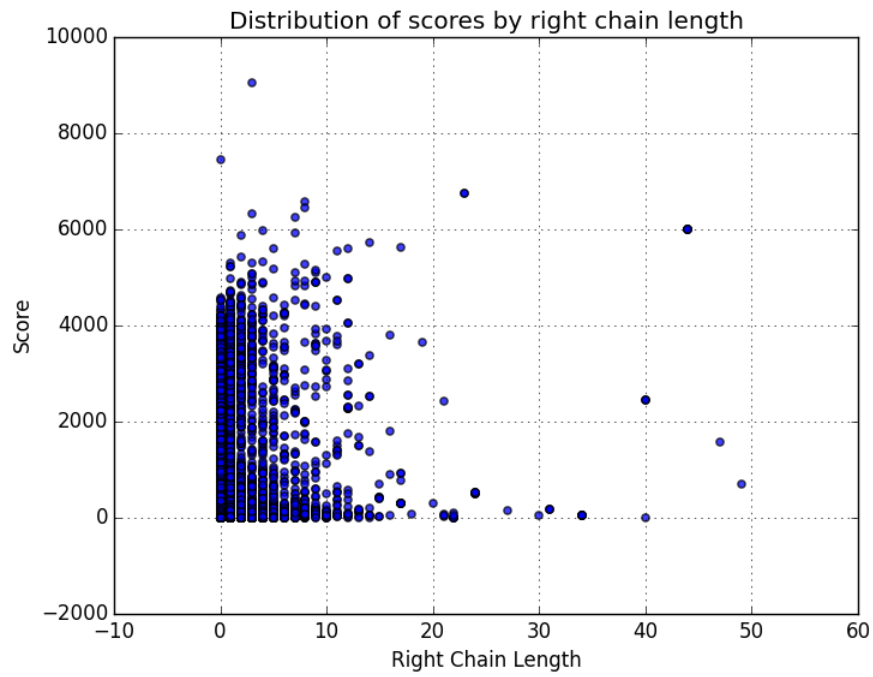


Figure 8: Distribution of Max Score by the Right Chain Length

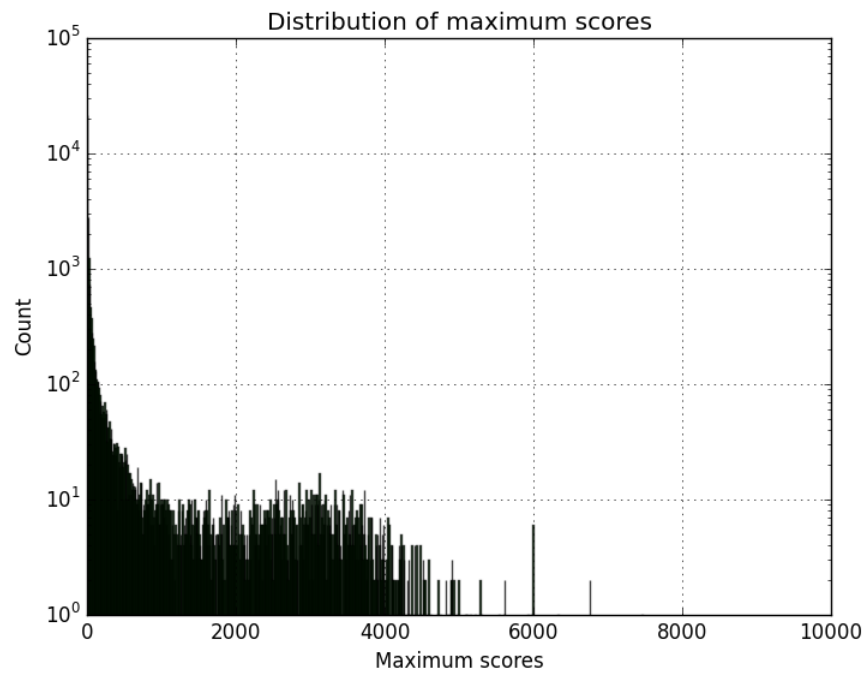


Figure 9: Distribution of Maximum Score of the chains

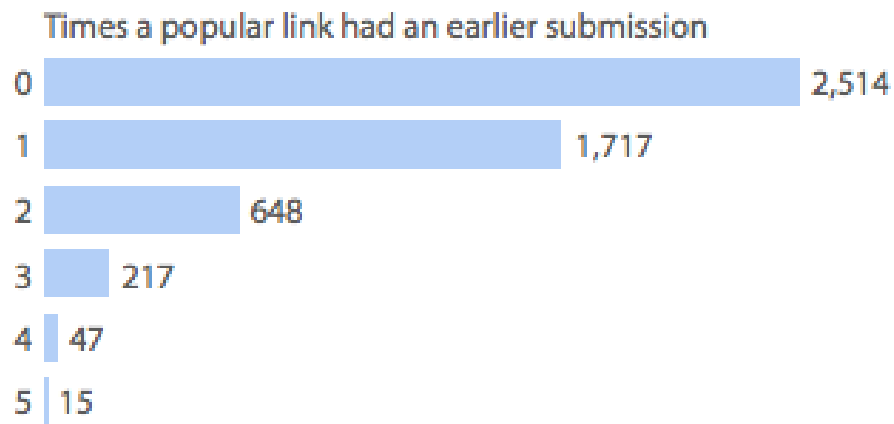


Figure 10: Times a popular link has an earlier submission

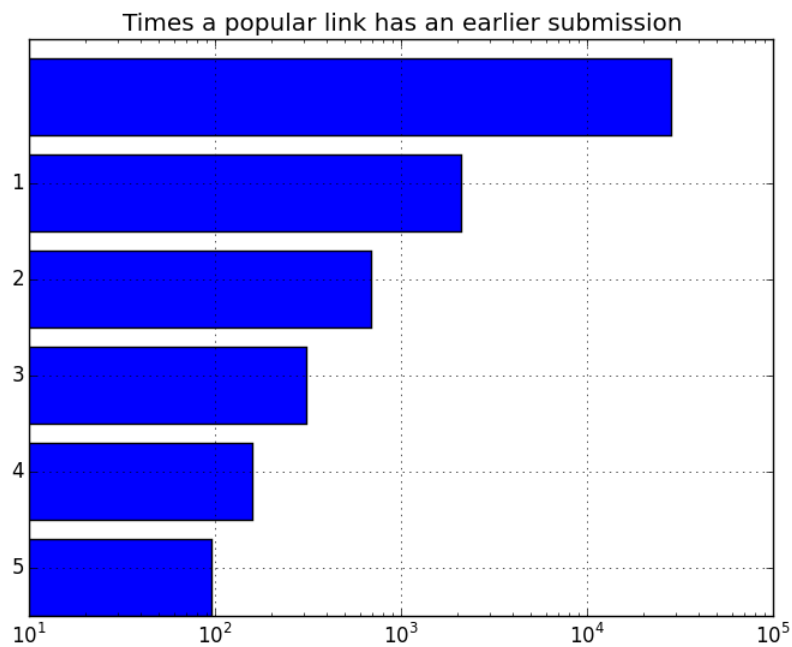


Figure 11: Times a popular link has an earlier submission

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POLITICS

Charlie Rangel: I Called Tea Party 'White Crackers' As 'Term Of Endearment' [VIDEO]

Alex Griswold 5:10 PM 11/19/2014

4373
 297

New York Democratic Congressman Charlie Rangel sat down for a wide-ranging interview with Huffington Post Live, during which he defended his earlier use of the term 'white crackers' as a "term of endearment."

426,808 people like The Daily Caller.

403 Forbidden

Request forbidden by administrative rules.

Error	Cause	Resolution
User sees 403 error in browser	client_id is missing or invalid	Verify that client_id is set and correct for your app
User sees 403 error in browser	redirect_uri is invalid	Verify that redirect_uri is set and matches what is set for your app

Figure 12: Link which is forbidden on Reddit

MY SUBREDDITS
FRONT
ALL
RANDOM
FUNNY
PICS
AWW
VIDEOS
TODAYILEARNED
GIFS
GAMING
ASKREDDIT
WORLDNEWS
NEWS
MILDLYINTERESTING
SHOWERTHOUGHTS

SEEN IT

that link has been submitted to multiple subreddits. you can try to [submit it again](#).

↑ 1
↓

? MOST FUNNY PICTURES AND QUOTES FOR BOYS (funnylad.com)
submitted 14 days ago by hwjwgvem to /r/funny
comment share save hide report

↑ 1
↓

? FUNNY PICTURES AND QUOTES FOR LADS (funnylad.com)
submitted 14 days ago by gwkwfwcj to /r/funny
comment share save hide report

↑ 0
↓

? FUNNY PICTURES AND QUOTES FOR LADS (funnylad.com)
submitted 14 days ago by vsdgvasfgsr to /r/funny
comment share save hide report

↑ 1
↓

? FUNNY PICTURES AND QUOTES FOR LADS (funnylad.com)
submitted 14 days ago by vsfBVSDBG to /r/funny
comment share save hide report

↑ 1
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? TOO MUCH HILARIOUS PICTURES AND QUOTES FOR LADS (funnylad.com)
submitted 14 days ago by gdfhzdsh to /r/funny
comment share save hide report

↑ 2
↓

? TOO MUCH HILARIOUS PICTURES AND QUOTES FOR LADS (funnylad.com)
submitted 15 days ago by galagacj to /r/funny
comment share save hide report

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submitted 16 days ago by kalwgowj to /r/funny
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Figure 13: Post with a chain length of 235