NLP Classification Models and Reddit

Derya Gumustel

Project goals

- Train and compare two predictive models that can identify which subreddit a post came from
- Requires text-rich subreddits, not images and videos
- Initial ideas: oceanography, politics → rejected
- Final choices: r/DMAcademy, r/truezelda, r/PoliticalDiscussion

	Posted by u/AreTooDeeTo 10 hours ago		Posted by u/dosfosforos 1 day ago 🔊	8	thek826 2 days ago
251	Need Advice How do I handle a player who prepared too mu	379			Did you read the article you linked?
+	44000 10 10 10 10 10 10 10 10 10 10 10 10	+	Open Discussion Zelda doesn't work as a multiplayer exp		Black, Indigenous and other people of color, also known as BIPOC
	This require a little bit of context I think. Gonna do the best I can to sum leaving a book of text. Minor TOA spoilers ahead. Running TOA with som mixed in. My group had multiple backstory plot line hooks in Jahaka Ancl		Well, maybe it has worked in past titles, but it scares me when I see Botw 2 to be a 2 player (or worse, online multiplayer) game. I really		↑ 26 ♣ ■ Reply Give Award Share Report Save
	were going there to fake as slave buyers, buy one of my characters moth		be a good idea. I know this could be just me, but I feel like Zelda is game series out there (excluding FS and TH), you just get in Links sl		SpiffShientz 2 days ago
	slavery, and then allow my other player to renounce his pirate backgrour port to the ground. He has been working as a double agent, feeding the		hero of Hyrule inside this little giant world in which you make your to depend on a partner to play through would ruin that experience		They definitely didn't read it, or they'd know it's a private group funding a small numb of families and not a "tangible law"
	and Liara have given him back into Port Nyanzaru, working against his of friend turned pirate captain.		probably would need to make it possible to play alone as well, whic badly designed puzzles or making one of the players essentially us		↑ 30 ♣ ■ Reply Give Award Share Report Save
	They get to the port and everything is basically empty. I've laid a trap wit		imagine the bad controls (like bowser jr in Bowsers fury), an awkwa		magus678 2 days ago
	character from the module who was with the party for a few sessions bu		Ai for those who choose single player. And don't even get me starte just a bunch of Links running around and lagging like hell on the page.		It not being a law would not stop an outcry were it to specifically exclude black peo
	kicked out for being shady. She went and betrayed the group to the piral the group was coming. My group splits themselves, one player to talk wi		Nice abund of Links fulfilling around and lagging like lien of the prospect of this happening k Lineally don't want this to happen what do you guys think? Would be		↑ 4 ♣ ■ Reply Give Award Share Report Save
	■ 74 Comments 🛍 Award 🅕 Share 📮 Save …		97 Comments 🖺 Award 🥕 Share 🖫 Save …		11 more replies
-	Posted by u/Shandrith 4 hours ago				Shut-up-and-party 2 days ago
77	Need Advice DMing with absolutely zero visual imagination?	+	Posted by u/Brynmaer 23 hours ago		Nah, they just wanted to rant. It's ironic that in a time where Asian people are dealing
+		11	Open Discussion Why BOTW 2 could be a spiritual succes		a wave of discrimination that I'm hearing a lot of Asian men ranting against other per of color.
	I have aphantasia. For those who don't know about it, it means I have no imagination. If I asked you to picture a table with a ball on it, you'd proba		the Past		of color.
	answer some simple questions, right? What color is the ball, what shape		With the trailer and and a few words in interviews we have a fairly $\underline{\varsigma}$		The original questions to posed by OP is rife with fodder for feeding racist rhetoric
	that sort of thing. I can't. I don't see the ball, so when you ask I have to d		BOTW 2 will have a "darker" tone. Because of the darker tone and it		anyway, so I would be surprised if there wasn't any of this kind of BS in the thread. It's
	the spot. Or, you know when someone tells you to close your eyes and vi		a lot of comparisons have been made with Majora's Mask. I believe Nintendo may find more inspiration for BOTW 2 from a different ga		funny to me as a BIPOC to pose white identity politics as anything other than your rul the mill everyday racism.
	and you can mentally see it? Or the "movie" you see as you read? I don't at all. When I close my eyes, the only thing I see is the inside of my eyelid		Past.		250 35
	acus, with radoc my cycs, are only amy race is are inside of my cyclic				Is there any room left in this country for racism?
			We know that BOTW was partially designed as a spiritual return to 1 of Zelda. It was designed with freedom, a large emphasis on explor		2. If no, how do we end racism?
	So, now that we've got that out of the way, I'm curious to know if there a		and limited direction which allowed the player to discover the work		3. If yes, how do we perpetuate racism?
	aphantasic DMs in here? Any advice for someone who is relatively new to		and in almost any order they want.		Hmm. Academic trolling much?
			There is a heavy implication that BOTW 2 will have more of a focus		↑ 25 ↓ ■ Reply Give Award Share Report Save
	■ 125 Comments 🛍 Award 🎤 Share 📮 Save …		centered around Ganondorf. The gameplay tradeoff with a focus or		
					MessiSahib 2 days ago - edited 2 days ago
+	Posted by u/ChattanoogaGuy 1 day ago 🚳 😘 🚳 3		■ 8 Comments 🛍 Award 🥕 Share 📮 Save …		Nah, they just wanted to rant. It's ironic that in a time where Asian people are
2.2k	Resource Worlds Without Number changed my DMing game	1	Posted by u/darklordoftech 19 hours ago		dealing with a wave of discrimination that I'm hearing a lot of Asian men rantin against other people of color.
	I've been playing 5e for a couple years here and there, and last year I de a group of friends. I took up the mantle because I wanted DnD, and no o		Game Design/Gameplay Did you have trouble figuring out he		So you want asians to complain about only some form of discrimination (which car
	group of friends. I took up the mantie because I wanted DDD, and no o gumption to do it. So after having only played about 5 actual sessions, I o		the Blind The Thief boss fight in A Link To The Past?		attributed to right) but ignore other forms of discrimination (which can be attribu
	first and started a homebrew world. I watched a lot of CR, MCDM videos,		Did you walk into the boss room without the "maiden" and/or without		to the left).
	players manual and DM's guide cover to cover, and scoured the internet		above it and find yourself wondering where the boss is?		♠ 11 ♣ ■ Reply Give Award Share Report Save
	things to look out for, etc. I learned a TON, and fast. I was a sponge!		■ 5 Comments		
	I adopted the Lazy DM's method, and would only plan what what right in		- a commence Manage La Sudice Manage		4 more replies

Text cleaning

- Dropped rows that contained removed, deleted, and null posts
- Used regular expression to remove hyperlinks, digits, and punctuation
- Also removed odd strings like '&'

	text	title	removed_by_category	
47	[removed]	Who is the Queen of Air and Darkness? What hap	moderator	
89	[removed]	A helpful video about how to design a balanced	moderator	
224	[removed]	Character backstory assist.	moderator	
227	[removed]	New player to Dnd/ build help pls	moderator	
244			100 m 100 graden garan	

Examples of Set-pieces: [Shark vs Rowboat](https://www.youtube.com/watch?v=c-xQej68BfI), [Goblin Bridge](https://www.youtube.com/watch?v=r9rhPAS3r1U), [Zombie Shark and Drow Esca pe](https://www.youtube.com/watch?v=goyXZOPW1qI)

Text cleaning

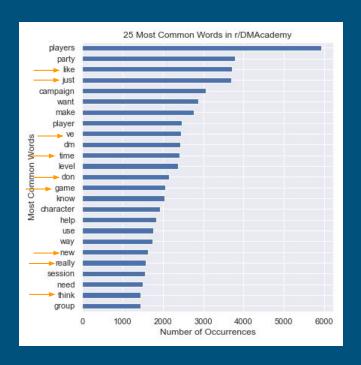
- Identified two forms of bot messages
- There are probably others!
- Removed these posts

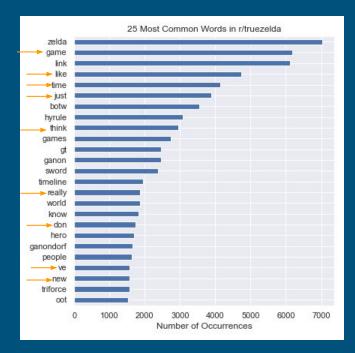
 Final dataset size: 4887 posts from r/DMAcademy, 4112 posts from r/truezelda

```
poli dis 2020 df
        Hello, /u/PMmeURsprintPROGRAMS. Thanks for con...
38
        Hello, /u/pleasedontbullyme . Thanks for contr...
        Hello, /u/chickenman86. Thanks for contributin...
        Hello, /u/dumbirds. Thanks for contributing! U...
40
67
        Hello, /u/Theduder89. Thanks for contributing!...
4987
        Hello, /u/cc hk. Thanks for contributing! Unfo...
        Hello, /u/Realtalkdo3. Thanks for contributing...
4994
        Hello, /u/Gransanto102. Thanks for contributin...
4995
4996
        Hello, /u/SocialObserver3802. Thanks for contr...
4997
        Hello, /u/SthenicFreeze. Thanks for contributi...
Name: text, Length: 182, dtype: object
```

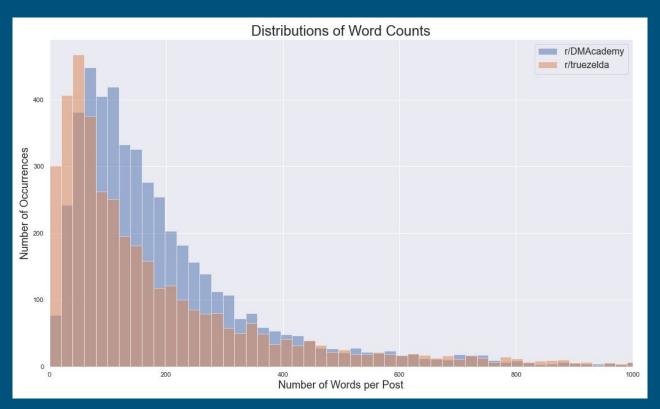
```
poli dis 2020 df
        [A reminder for everyone](https://www.reddit.c...
        [A reminder for everyone](https://www.reddit.c...
        [A reminder for everyone](https://www.reddit.c...
19
        [A reminder for everyone](https://www.reddit.c...
42
45
        [A reminder for everyone](https://www.reddit.c...
        Your submission was automatically removed.\n\n...
4909
4947
        [A reminder for everyone](https://www.reddit.c...
        [A reminder for everyone](https://www.reddit.c...
4962
        [A reminder for everyone](https://www.reddit.c...
4989
        [A reminder for everyone](https://www.reddit.c...
4990
     text, Length: 271, dtype: object
```

Stop words

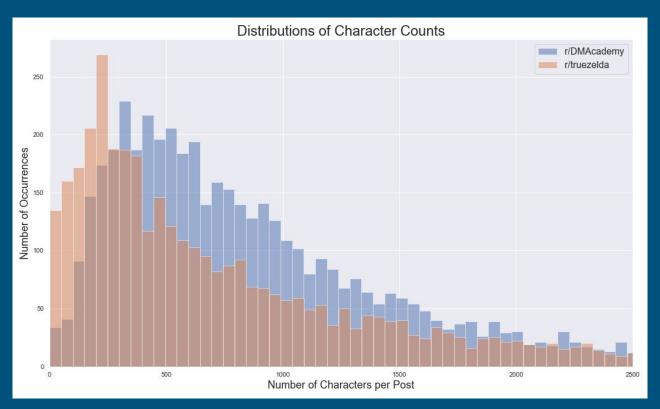




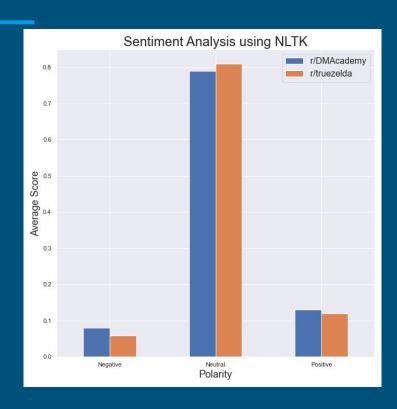
Text analysis



Text analysis



Sentiment analysis

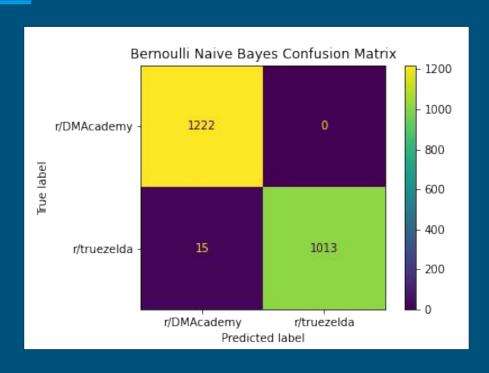


- Used NLTK
 SentimentIntensityAnalyzer,
 trained on vader lexicon
- r/DMAcademy was more negative and more positive than r/truezelda
- Both subreddits had more positive posts than negative posts

Model selection and baseline accuracy

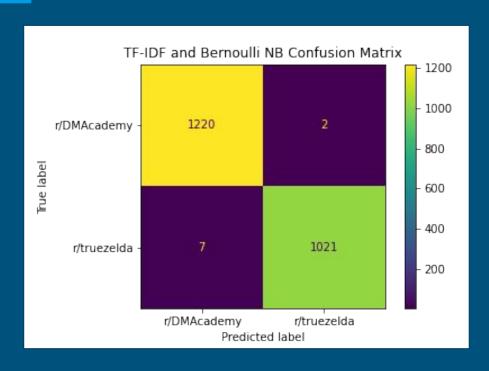
- r/DMAcademy 54.3%
- r/truezelda 45.7%
- Bernoulli Naive Bayes designed for binary classification
 - With Count Vectorizer
 - And with TF-IDF Vectorizer
- Support Vector Machines
 - With TF-IDF Vectorizer

CVec and Bernoulli Naive Bayes predictions



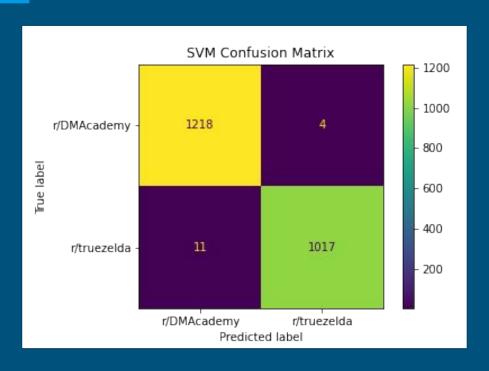
- Started with Count Vectorizer
- Minimal hyperparameter tuning required
- Optimal alpha value of 0.0069519279617756054

TF-IDF and Bernoulli Naive Bayes predictions



- TF-IDF Vectorizer reduced errors
- Minimal hyperparameter tuning required
- Optimal alpha value of 0.0069519279617756054

SVM predictions



- Used TF-IDF Vectorizer
- Minimal hyperparameter tuning required
- Optimal alpha value of 6.2105263157894735

Model evaluation

- Each of these models performed much better than our baseline!
- Accurately predicted which subreddit a post came from 98-99% of the time
- High precision and recall means models predicted true positives accurately (positive was r/truezelda)
- High f1 due to good balance between precision and recall scores

CVec and Ber	noulli NB	Classifi	cation R
	precision	recall	f1-score
r/DMAcademy	0.987874	1.000000	0.993900
r/truezelda	1.000000	0.985409	0.992651
accuracy	0.993333	0.993333	0.993333

TF-IDF and Be	rnoulli ≀	NB Classi	fication	Report
	precision	recall	f1-score	
r/DMAcademy	0.994295	0.998363	0.996325	
r/truezelda	0.998045	0.993191	0.995612	
accuracy	0.996000	0.996000	0.996000	

CVec and SVM	M Classification Report		
	precision	recall	f1-score
r/DMAcademy	0.991050	0.996727	0.993880
r/truezelda	0.996082	0.989300	0.992679
accuracy	0.993333	0.993333	0.993333

Possible next steps

- Print out misclassified posts to investigate potential sources of error
- Explore documentation to understand why SVM makes more mistakes than Bernoulli Naive Bayes
- Apply the same workflow to predict what year a post came from
 - Under development, look forward to seeing it in my Jupyter notebooks!

Notes to self

```
Precision = tp / (tp + fp)

Recall = tp / (tp + fn)

F1 = precision * recall / (precision + recall)
```