PROJECT RAAM



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RESEARCH QUESTION

How did anxiety increase during the COVID-19 pandemic, and how did the increase vary across different groups?

AIM

Explore how the sentiments of users in the subreddits R/Teachers, R/Nurses, and R/HealthAnxiety compares to the global anxiety rates reported before, during, and after the pandemic.

DATA COLLECTION

Reddit: (Feb 2019-Dec 2022)

- r/Nursing
- r/Teachers
- r/HealthAnxiety

WHO: (Apr 2020-Apr 2022)

• 109 countries

CDC: (May 2020-September 2024)

State and nationwide



DATA CLEANING: Scraped Data

Handle unnecessary repetition:

- Posts to comments is one-to-many
- Separate the posts and comments to reduce clutter
- Link all comments to their corresponding post_id

Comments Table (Nursing)

	post_id	comment_id	comment_username	comment_body	comment_score	comment_timestamp
0	1	2	Anonymous	Aw that's just sad. Maybe try soaking them off	512 points	2021-09- 24T23:16:45+00:00
1	1	4	aroc91	Social work and instant APS call.	276 points	2021-09- 25T00:03:24+00:00
2	1	6	CatastropheWife	"I made my kids promise to never put me in a n	487 points	2021-09- 25T00:56:16+00:00
3	1	7	Anonymous	I used to work with many, many elderly people	229 points	2021-09- 25T03:08:33+00:00
4	1	10	Anonymous	elastic cooperative snobbish illegal impossibl	256 points	2021-09- 25T01:05:23+00:00

Raw CSV File (Nursing)

Timestamp, Username, Post Title, Post Body, Combined Text, Score, Comments Count, Post URL, Comment Username, Comment Body, Comment Combined Text, Comment Sc 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/worst vagina story?","Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/worst vagina story?", "Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/worst vagina story?","Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/worst vagina story?","Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/ """Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/ Col 10: Comment Body "Mine: An immobile and incontinent but otherwise functional morbid Yeah that might not be the great elder care outcome you're imagining it to be.","Nurses, what's your best/worst vagina story? "I made my kids prom Yeah that might not be the great elder care outcome you're imagining it to be.",487 points,2021-09-25T00:56:16+00:00 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/worst vagina story?", "Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/worst vagina story?", "Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/worst vagina story?","Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00, aroc91, "Nurses, what's your best/worst vagina story?", "Mine: An immobile and incontinent but otherwise functional morbid This post was mass deleted and anonymized with Redact", "Nurses, what's your best/worst vagina story? elastic cooperative snobbish illegal impossib This post was mass deleted and anonymized with Redact",256 points,2021-09-25T01:05:23+00:00 2021-09-24T21:54:20+00:00, aroc91, "Nurses, what's your best/worst vagina story?", "Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00.aroc91."Nurses, what's your best/worst vagina story?", "Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00, aroc91, "Nurses, what's your best/worst vagina story?", "Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/worst vagina story?","Mine: An immobile and incontinent but otherwise 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/worst vagina story?","Mine: An immobile and incontinent but 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/worst vagina story?", "Mine: An immobile and incontinent 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/worst vagina story?","Mine: An immobile and incontinent 2021-09-24T21:54:20+00:00,aroc91,"Nurses, what's your best/worst vagina story?","Mine: An immobile and incontinent but otherwise 2021-09-24T21:54:20+00:00, aroc91, "Nurses, what's your best/worst vagina story?", "Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00.aroc91."Nurses, what's your best/worst vagina story?"."Mine: An immobile and incontinent but otherwise functional morbid 2021-09-24T21:54:20+00:00 aroc91 "Nurses, what's your hest/worst vaning story?". "Mine: An immobile and incontinent but otherwise functional morbid

Post Table (Nursing)

	post_id	timestamp	username	post_title	post_body	score	comments_count	post_url
0	1	2021-09- 24T21:54:20+00:00	aroc91	Nurses, what's your best/worst vagina story?	Mine: An immobile and incontinent but otherwis	11.9k	458 comments	https://old.reddit.com/r/nursing/comments/putf
1	2	2022-01- 07T13:25:23+00:00	erinpdx7777xdpnire	Who is going to be the one to tell everyone el	I've read the threads, spoken with friends and	11.8k	458 comments	https://old.reddit.com/r/nursing/comments/ry7b
2	3	2021-10- 25T11:42:50+00:00	nomad_9988	Patient made me reconsider being an organ donor	Not really, but almost.\nl had an (unvaccinate	11.5k	458 comments	https://old.reddit.com/r/nursing/comments/qfev
3	4	2021-10- 02T11:26:57+00:00	igordogsockpuppet	To all you eat-your- young nurses out there, ju	Feeling understaffed and overworked? You've j	10.6k	458 comments	https://old.reddit.com/r/nursing/comments/pzte
4	5	2021-11- 23T19:16:50+00:00	Aloha_Snackbar357	Struggling to Not Care about my Antivax	On paper, it's not a problem. Fuck Around and	10.2k	458 comments	https://old.reddit.com/r/nursing/comments/r0kt

DATA CLEANING: Scraped Data

Delete empty posts:

- Many comments were empty, deleted, or from community bots
- Delete all records that do not reflect the sentiments of the communities

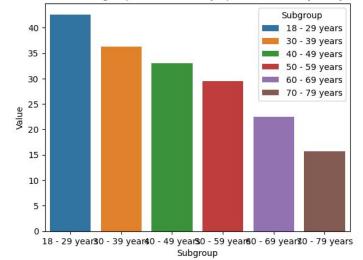
Raw Data Table (Teaching)

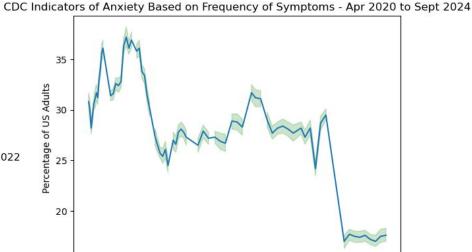
	post_title	comment_username	comment_body	comment_score
0	My school has paid for a huge abstract art ins	AutoModerator	Welcome to /r/teaching. Please remember the ru	Unknown
1	Why is it the teacher's responsibility to call	AutoModerator	Welcome to /r/teaching. Please remember the ru	Unknown
2	Dear students	AutoModerator	Welcome to /r/teaching. Please remember the ru	Unknown
3	Science class: 'What can we infer about Mrs. T	AutoModerator	Welcome to /r/teaching. Please remember the ru	Unknown
4	"These 13 year olds were their own bosses for	AutoModerator	Welcome to /r/teaching. Please remember the ru	Unknown
5	It begins	Anonymous	[deleted]	Unknown
6	It begins	Anonymous	[deleted]	Unknown
7	Some News!	Anonymous	[deleted]	Unknown
8	Some News!	AutoModerator	Welcome to /r/teaching. Please remember the ru	Unknown
9	Today I was assaulted	AutoModerator	Welcome to /r/teaching. Please remember the ru	Unknown
10	Today I was assaulted	Anonymous	[deleted]	Unknown
11	Today I was assaulted	Anonymous	[deleted]	Unknown
12	Today I was assaulted	Anonymous	No Comment	Unknown
13	Thank you to all the sweet older brothers and	AutoModerator	Welcome to /r/teaching. Please remember the ru	Unknown
14	TIME TO STAND WITH TEACHERS	Anonymous	[deleted]	Unknown
15	TIME TO STAND WITH TEACHERS	AutoModerator	Welcome to /r/teaching. Please remember the ru	Unknown
16	I saw one of my favorite kindergarteners (now	Anonymous	[deleted]	Unknown
17	I saw one of my favorite kindergarteners (now	Anonymous	[deleted]	Unknown
18	I saw one of my favorite kindergarteners (now \dots	AutoModerator	Welcome to /r/teaching. Please remember the ru	Unknown

EDA: CDC Survey Data

- Decreasing survey frequency over time
- Spike at December 2020
- Spike at December 2022
- Drop at July 2024

Average Percent of Each Subgroup that Exhibits Symptoms of Anxiety - May 2020 to Dec 2022





5/5/2020 12/7/2020

9/13/2021

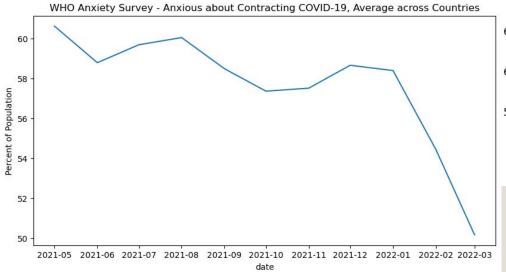
12/19/2022

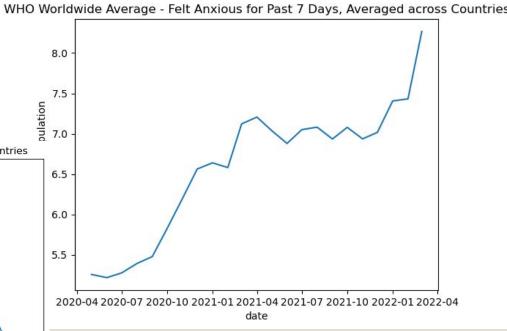
Time Period End Date

8/19/2024

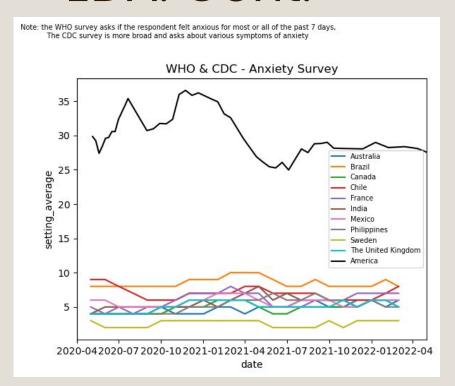
EDA: WHO Survey Data

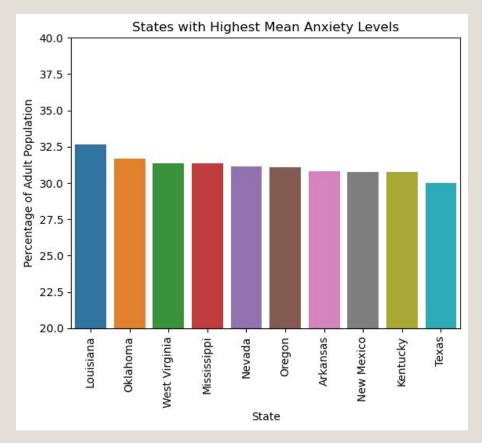
- Gradual increase over time
- Most Anxious Countries: Lebanon, Tunisia, Türkiye, Algeria, Jordan, Yemen, Egypt, Iraq, Azerbaijan, United Republic of Tanzania





EDA: Cont.





Data Analysis: VADER

Statistics - Mean Vader Compound Score (-1.00 to 1.00)

Teaching Posts

0.217

Nursing Posts

-0.122

Health Anxiety Posts

-0.095

Teaching Comments

0.198

Nursing Comments

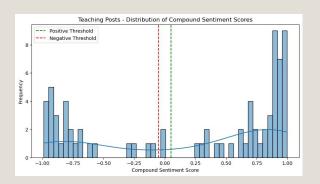
0.033

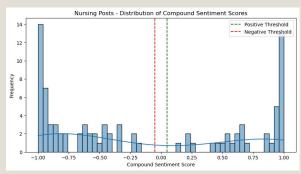
Health Anxiety Comments

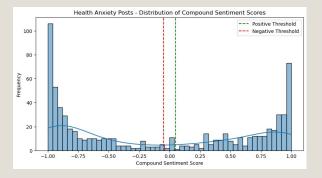
0.094

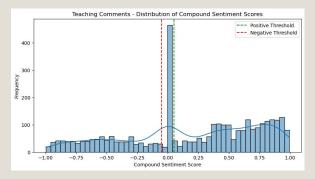
Data Analysis: VADER

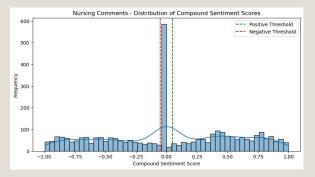
Graphs - Vader Histograms

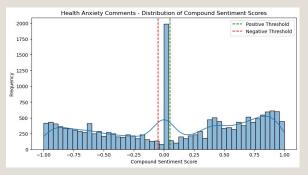




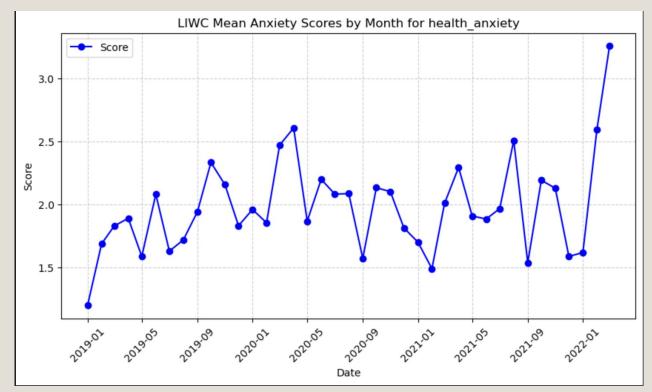






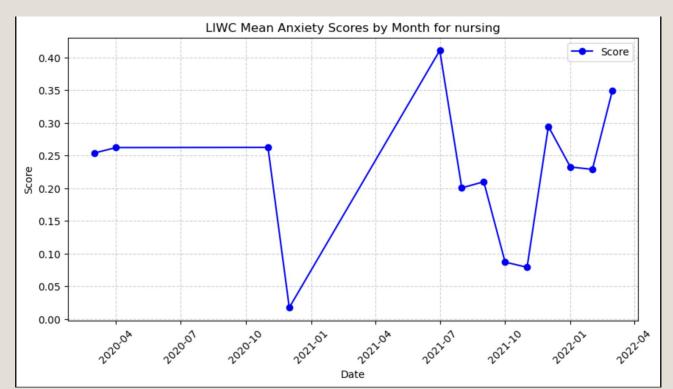


Data Analysis: LIWC



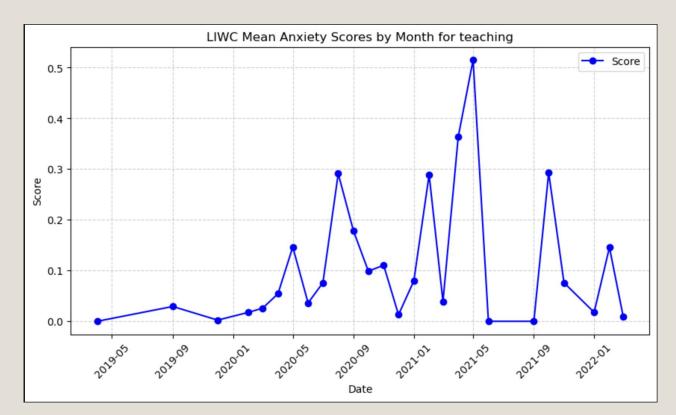
- A large increase in anxiety in early 2020
- COVID might lead to growing concerns about health

Data Analysis: LIWC



- Anxiety scores were high for 2020
- Anxious sentiment peaked in July 2021
- Generally consistent with the health anxiety subreddit

Data Analysis: LIWC



- Anxiety started to increase in 2020
- A surge in anxiety scores around May 2021

Take Home Points

Research Question:

- -Observable increase in anxiety in the first half of 2020
- -Anxiety reached a high point in the middle of 2021 across all 3 subreddits
- -During the first half of 2021, while anxiety rates declined in the general American population, they increased for teachers and nurses

Workflow/Code:

Workflow: The team worked well at each contributing to different aspects of the project/research.

Suggestions:

Data Collection: Reddit scraping was not able to gather all intended dates.

Visualizations/Analysis: The scraped data limitations meant is would be less beneficial to combine comments with their posts - something we would aim for in future research.

Thank You