

### **D&D** Basics:

- DM Dungeon Master (narrator)
- knows the world & story, plays out scenes for players to engage in Players wizards, rogues, fighters, barbarians, elves, halflings, dwarves...
- uncover plots, fight bad guys & monsters, solve problems, cause chaos Campaign The story/adventure, start to finish

Three main elements: Description, imagination, rolling dice





### **Research Question & Goals**

Analyze speech data from two D&D liveplay podcasts, Critical Role and Dimension 20. One of which has a man as the DM, and the other with a woman DM.

Using our familiar metrics, token counts, sentence counts and length, as well as looking for hedging, jargon, and "readability", investigate if there is any significant difference between our two DMs or if they both share a relatively equal balance in participation with their players.



### **Data Basics**

Critical Role

1 season

141 episodes (147 files)

1 ep ~4 hrs long

1 DM (Matt)

7 players (3W 4M)

Dimension 20

4 seasons + 3 chat seasons

54 episodes & files

1 ep ~2-2.5 hrs, 4hrs

1 DM (Aabria)

18 players (8W 8M 2NB)



#### -HTML files converted to JSON files

#### -JSON normalized until in decent shape

	name	text	ts.h	ts.m	ts.s	episode
0	MATT	We've got some cool stuff to talk about. First	0	0	15	1
1	LAURA	As in nnnn.	0	1	21	1
2	MATT	Nnnn. But yeah, so they're going to be a long	0	1	24	-1
3	TRAVIS	(vomiting noises) Would you like some?	0	2	4	1
4	MATT	So yeah. I'm super excited to have that, guys	0	2	7	1

For D20, this was a lot less decent than CR...

	index	variable	value	episode	season
9	9	Aabria: Hello, friends, and welcome. We're her	None	1	Misfits and Magic
10	10	a new game called "Misfits and Magic"! [cheeri	None	1	Misfits and Magic
11	11	Cast cheers and laughs.	None	1	Misfits and Magic
12	12	Aabria: I am your game master, Aabria Iyengar,	None	1	Misfits and Magic
13	13	Magical Misfits. Say hi, Magical Misfits!	None	1	Misfits and Magic

#### Critical Role data was much easier...

- Data speech lines contained non-speech information
  - Get rid of it? NO
  - Spend hours and hours of weekends using regex to move to another column? YES

8783	(whizzing) (explosion) (screaming)
15411	(breathing heavily) (whooshes) (surprised laug
17487	(whooshing) (whooshing) (flapping)
25846	(as Marius) (as Orly) (as Marius)
41274	(Luc struggle grunts) (as Pumat) (poof)
417661	(grunting) (gasping) (laughter)
417680	(yelling) (digital bleeping) (dial up tones)
426365	(gasping) (laughter) (laughter)
427855	(exhale) (heavy wind gust) (rolling)
432836	(laughs) (explosion) (laughter)

	index	name	text	episode	timestamp	inaudible_speech	nonspeech
0	0	MATT	We've got some cool stuff to talk about. First	1	00:00:15		
1	1	LAURA	As in nnnn.	1	00:01:21		
2	2	MATT	Nnnn. But yeah, so they're going to be a long	1	00:01:24		
3	3	TRAVIS	Would you like some?	1	00:02:04		(vomiting noises)
4	4	MATT	So yeah. I'm super excited to have that, guys	1	00:02:07		

#### Dimension 20 data had a much less tidy starting point

- Names in same column with speech
- Non speech information in same column with speech
- Single speech units split out over multiple df rows
- Character names instead of player names

	index	name	player	text	episode	inaudible_speech nonspeech	season
0	10	Aabria	Aabria	To the churlish Captain K.P. Hob, venerated s	10	ı	ACOFF
1	11	Aabria	Aabria	Goblin Court. To the master of ceremonies, Del	10		ACOFF
2	12	Aabria	Aabria	the Court of Wonder. To BINX Choppley, sole su	10		ACOFF
3	13	Aabria	Aabria	Craft. To the tenebrous Prince Andhera, scion	10		ACOFF
4	14	Aabria	Aabria	to the notorious Lords of the Wing, Lady Chirp	10		ACOFF

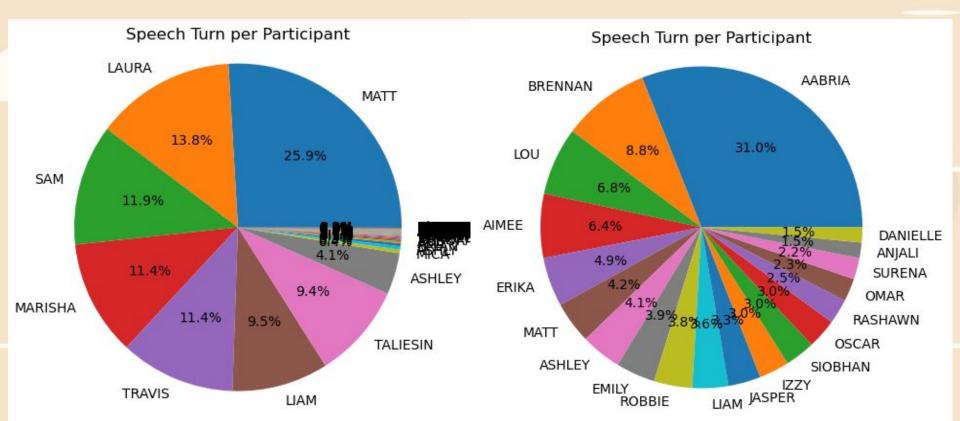
More and more hours of regex later, 3/4 of these problems were solved!



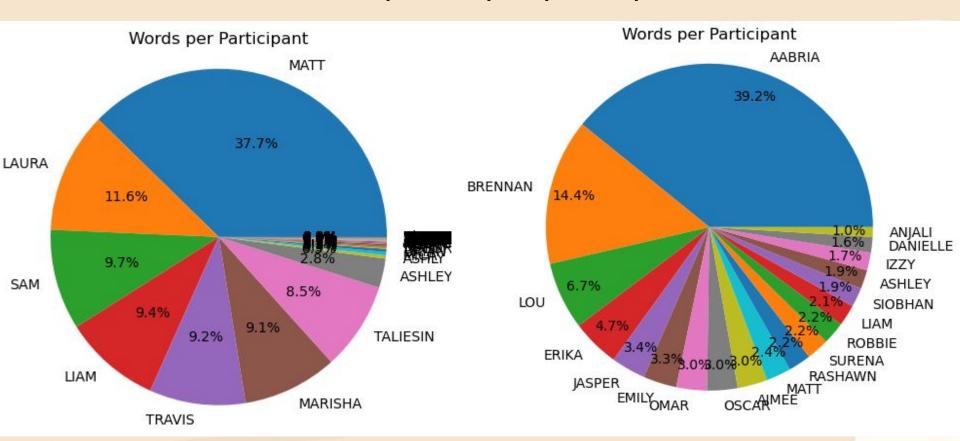
### Information to consider

- 1. CR is only one season over 3.5 yrs, not everyone was present for every episode. Out of 141 episodes, Ashley was only there for 86!
- 2. D20 is 4 seasons with mostly unique players. (Brennan is in 3/4 seasons, Lou and Erika are in 2)
- 3. Character types: excitable and chatty or stoic and serious?
- 4. Role among the group?

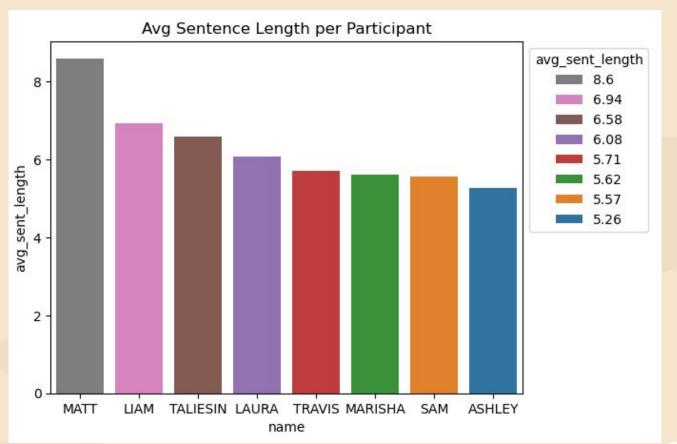
# Speech turn per participant



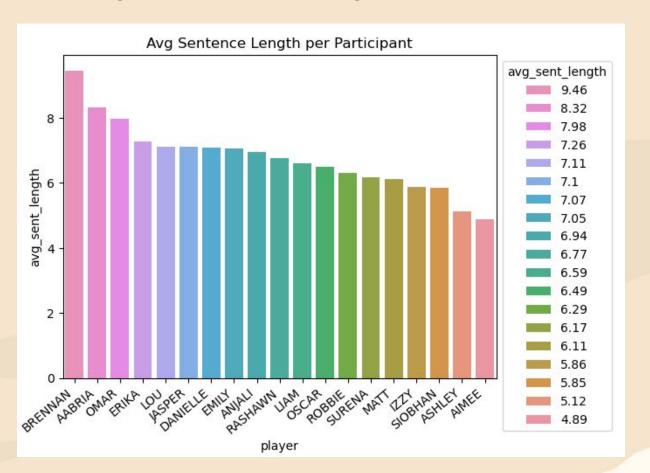
## Words spoken per participant

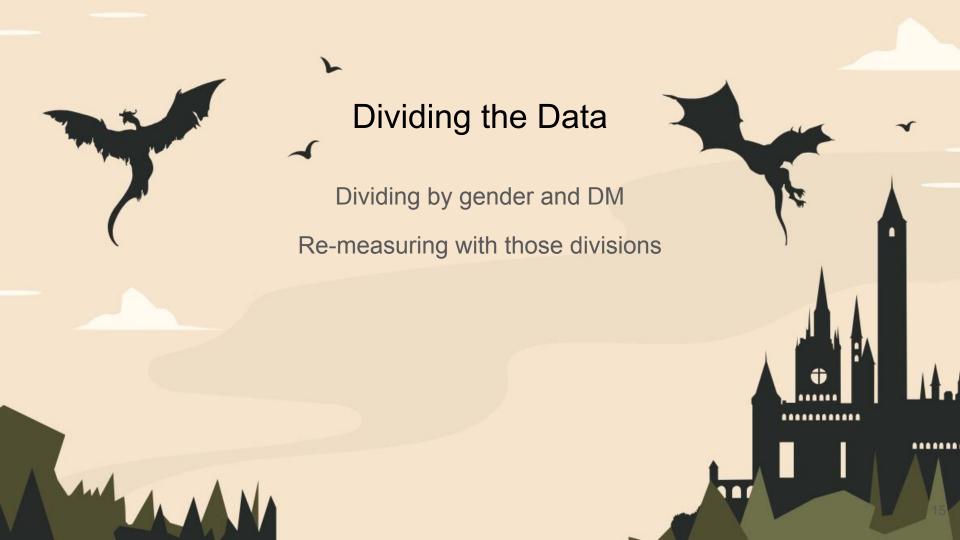


# Average sentence length per participant



# Average sentence length per participant



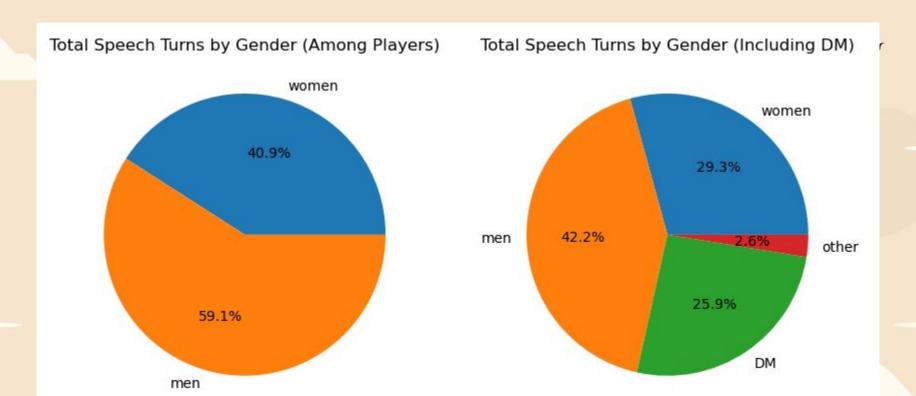


#### Information to remember

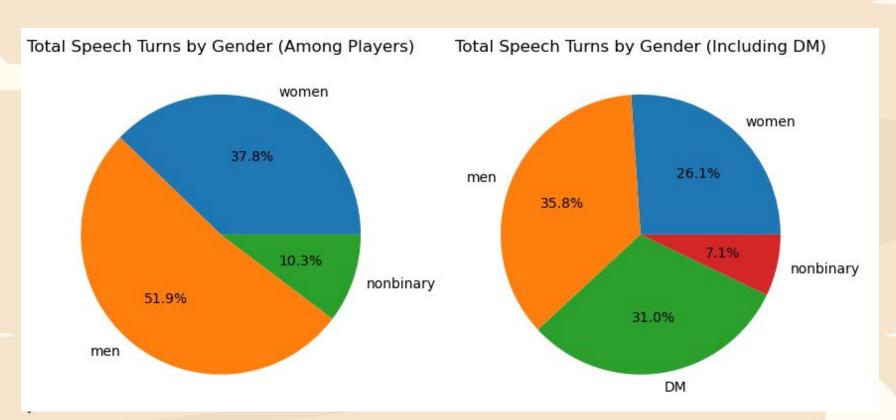
Critical Role has 1 more man than woman & 1 woman missed 40% of episodes ~

D20 has 8 men, 8 women, and 2 nonbinary players (both use she/they)

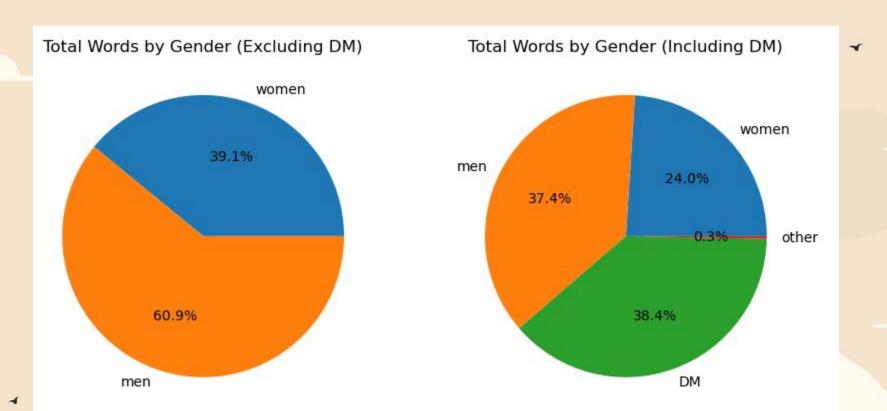
# Speech Turns (Critical Role)



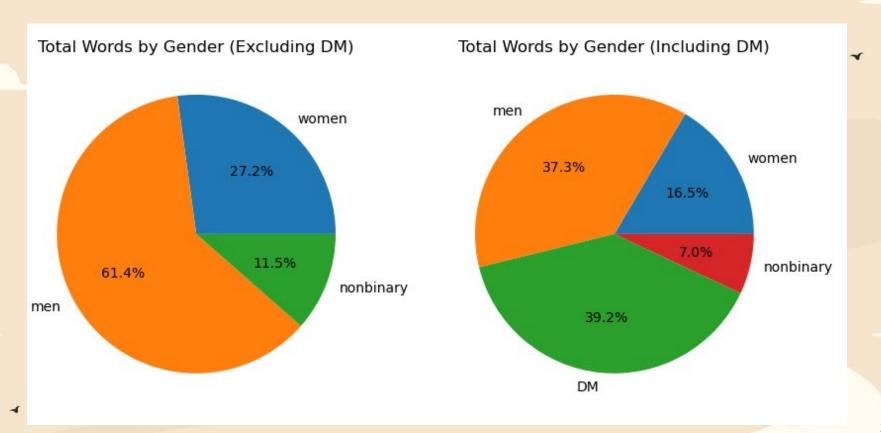
# Speech Turns (D20)



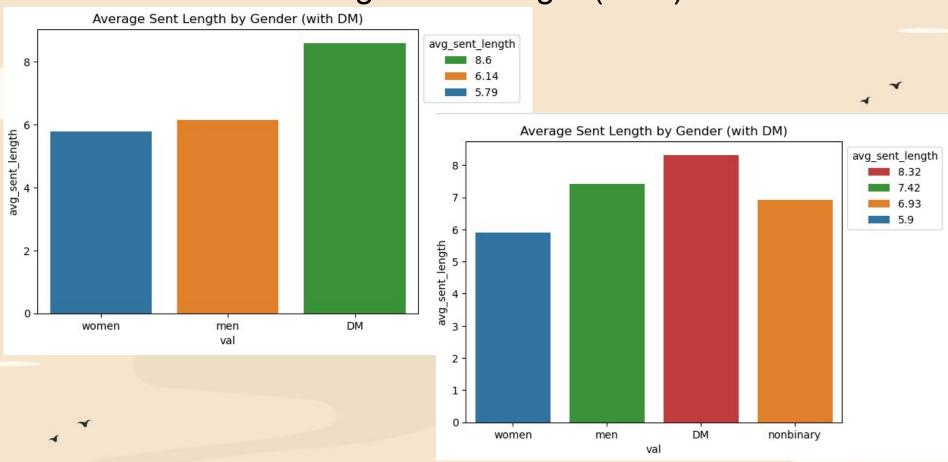
# Total Words (Critical Role)



# Total Words (D20)



# Average Sent Length (Both)





# Searching for and calculating hedging

Combination of list comprehension and regex string count for words like: Maybe, might, suggests, possibly, appears, seems, tends, I guess, I think, could be.

#### In Critical Role data:

For every thousand words spoken:

- 5.68 words spoken by women,
- 5.75 words spoken by men, and
- **2.64** words spoken by the DM are among the scanned for hedging words and phrases.

#### In Dimension 20 data:

For every thousand words spoken:

- 6.93 words spoken by women,
- 6.25 words spoken by men,
- 5.64 words spoken by nonbinary players, and
- ✓ 2.35 words spoken by the DM are among the scanned for hedging words and phrases.



## **Defining Jargon**

Using the full text of the Player's Handbook, compare with the ~330k word Norvig Google unigram data. If not in the unigram list, it's defined as jargon.

#### What was left over?

- 1. **vocab**: subrace, clanless, cantrip, multiattack
- 2. **names**: thamior, breena, stumbleduck, myrkul, agathys, keyleth, strahd
- 3. **locations**: shadowfell, feywild, candlekeep
- 4. **spells**: thaumaturgy, barkskin, truesight, enfeeblement, longstrider, cloudkill, revivify, countercharm, thunderwave
- 5. **groups**: archfey, dragonborn, tiefling(s), lightfoots, merfolk, lizardfolk
- 6. **creatures**: hippogriffs, were rats, tarrasque, owlbear
- 7. **weapons**: greatclub, handaxes, scimitars, greataxe, longswords, shortbow, shortsword
- 8. **languages**: dwarvish, undercommon, draconic

Some of my personal favorites: Sibilants, blibdoolpoolp, mordenkainen, maglubiyet

## Jargon Frequency

#### In Critical Role:

For every million words spoken:

**304.8** words spoken by the women players,

285.2 words spoken by men players, and

**262.6** words spoken by the DM will be from this jargon list.



# Jargon Frequency

#### In Dimension 20:

For every million words spoken:

**154.3** words spoken by the women players,

211.8 words spoken by men players,

73 words spoken by nonbinary players, and

**201.7** words spoken by the DM will be from this jargon list.

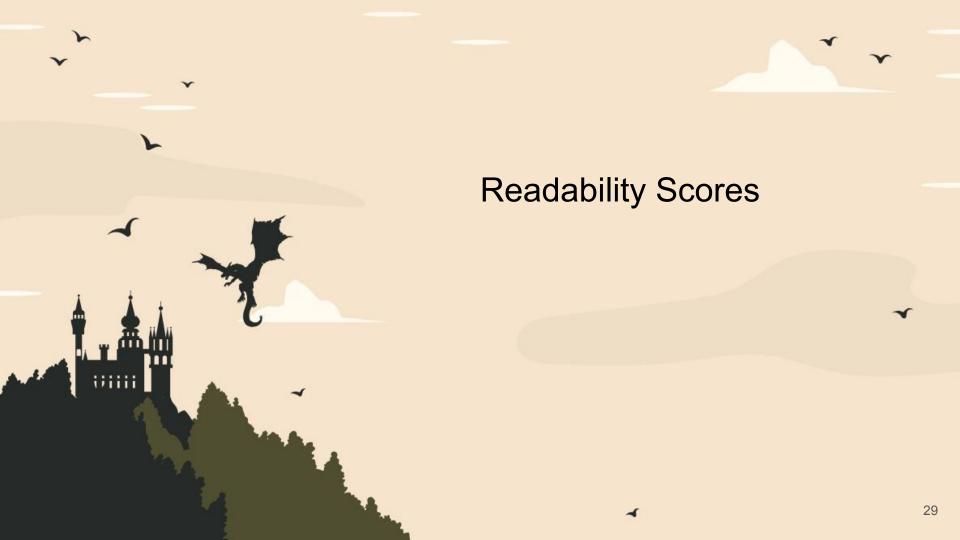


## Why the difference?

In my opinion, genre.

CR tends to play high fantasy, classic D&D - like from the PHB

D20 are more varied, playing as stoats, magical school, regency romance... and one high fantasy story. Plus the chat shows!



## Getting a Baseline

The Flesch–Kincaid readability test formula:

$$206.835 - 1.015 \left(\frac{\text{total words}}{\text{total sentences}}\right) - 84.6 \left(\frac{\text{total syllables}}{\text{total words}}\right)$$

Designed to ensure things like military instructional books and medical aftercare reports are readable to a majority of people.

1-120, the higher a score, the easier it is to read. (also converts to a grade level)

Time Magazine : 52, Moby Dick : 57.9, highest score 121 is all words are 1 syllable (like Dr. Seuss!)

### The Scores

For PHB: ~49, at the easier end of the "difficult" level. Grade level: 11

For Critical Role:

Women: 85

Men: 83

DM: 73

Range of easy to fairly easy, 6/7th grade.

For Dimension 20:

Women: 85

Men: 79

NB: 80

DM: 74

### Problems with "readability"

Readability vs comprehensibility

- IRS tax forms have a "readability" grade score of 8th grade

NLTK syllable tokenizer is not very good, these scores are iffy

```
[['gno', 'mes'],
 ['Most'],
 ['gno', 'mes'],
 ['in'],
 ['the'],
 ['worlds'],
 ['of'],
 ['DND'],
 ['a', 're'],
 ['rock'],
 ['gno', 'mes'],
 ['in', 'clu', 'ding'],
['the'],
 ['tin', 'ker'],
 ['gno', 'mes'],
['of'],
 ['the'],
 ['Dra', 'gon', 'lan', 'ce'],
 ['set', 'ting'],
 ['Abi', 'li', 'ty'],
 ['Sco', 're'],
 ['Increa', 'se'],
['Yo', 'ur'],
 ['Cons', 'ti', 'tu', 'tion'],
 ['sco', 're']]
```

