

A close-up photograph of a man wearing a red and yellow hooded costume, likely a fool or jester. He is playing a wooden flute. The background is a solid green color.

Fools' Gold:

Understanding the Linguistic
Features of Deception and Humour
Through April Fools' Hoaxes

Ed Dearden

e.dearden@lancaster.ac.uk







Inbox Edit

me.customer (1)
Re: company info...

customer no.249
Re: 2 new notifica...

me.friends (6)
Re: company info...

Join us
New Sign-in on Computer...

me.customer (2)
Re: On 23 October at 09:00...

me.customer (2)
Re: company info...

customer no.001
company info...

COFF

indica = indica - jamaica
sativa = active - jamaica
avocado
scrambled eggs + marijuana
Xanax

BBC



Home

More



SPORT

All Sport

Celtic

Football Banned now, says Scottish Government

2 hours ago | Celtic



Scottish champions Celtic are the "25th strongest brand in world football"

"We're just not that into it anymore", said an anonymous source within Holyrood, "It's just a bit boring, isn't it?"



SAMSUNG

BBC



Home

More



NEWS



Health

Fish are a Vegetable, Scientists Find!

By Alex Therrien
Health reporter, BBC News

🕒 2 hours ago



Fish are basically Lettuce.

Your five a day just got a little more diverse.



SAMSUNG

BBC Home More

NEWS

Business

Elon Musk's own Ship Ejects him Into Space for "the greater good"

2 hours ago



In direct contrivention of Asimov's laws of robotics, Elon Musk has been shot into space by his own ship. When challenged on the decision, the ship simply responded, "I think Earth's probably had enough of him."





APRIL

1

FOOL'S DAY









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BBC



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More



NEWS



Wales



NASA Proves Dogs are Russian Spies!

By Gareth Knowles
BBC Wales News

🕒 1 hour ago



See how Russian they look!

NASA find that each and every dog contains a direct line to Vladimir Putin.



Hell Planet



Why do we care
about April
Fools'?



False Information



ELDERLY WOMAN ACCUSED OF TRAINING HER 65 CATS TO STEAL FROM NEIGHBORS



If the sun is 93 million miles away



How are the clouds behind it?

BBC Admits MI5 Dictates Who They Employ

© April 24, 2018 Sean Adl-Tabatabai News, UK 0



But where does
April Fools' day
fit into this?



April Fools' Day

Instawindow: transform your view with a permanent Instagram filter

From saturated sunset glows to that moody washed-out haze, the Instawindow is designed to turn any view into an atmospheric vision with a simple adhesive film



Instawindow ... The cheap and cheerful way to brighten up your view. Photograph: Jonathan Philip Wilson

If you're addicted to adding filters to your Instagram snaps, and wish you could always see the world in grainy high contrast or with that sun-kissed glow, help may be at hand. As part of the government's Happy Homes initiative, which will see swathes of ailing council blocks retrofitted with colourful cladding panels and

Polar bears spotted in Scotland as animals flee melting Arctic ice cap



125 Comments



By Rollo Piaf

1 APRIL 2017 • 9:48AM

• For those arriving to this page after 12pm on April 1st 2017, this story was an April Fool, as we explain [here](#)

Anybody venturing to Scotland normally has only the midges to avoid. Now there's an altogether more terrifying, not so wee beastie lurking in the woods.

For scientists with the World Wildlife Fund (WWF) have discovered a polar bear living on an island in the Outer Hebrides.

What's the Difference?

Fishergate bollard to become '6ft piece of public art'



An artist's Impression of Fishergate Bollard extended to 6ft

Preston's famous Fishergate Bollard set for starring stage role!



The Fishergate Bollard on the set of Ruddigore with artists l-r: Ann Cooper and Sheila Wright

What's the Difference?

Fishergate bollard to become '6ft piece of public art'



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BBC Admits MI5 Dictates Who They Employ

April 24, 2018 Sean Adl-Tabatabai News, UK 0



Deceptive Intent:

Is the author trying to deceive me?

Fishergate bollard to become '6ft piece of public art'



An artist's impression of Fishergate Bollard extended to 6ft

Not Deceive?

BBC Admits MI5 Dictates Who They Employ

April 24, 2018 Sean Adl-Tabatabai News, UK 0



Deceive?

Research Questions



What are the Linguistic features of an April Fools' article compared to regular news?

How similar are the features of April Fools'
to those of "Fake News"?

I need some
background



Deception

- Exaggeration.
- Vagueness.
- Details.



Humour

- Contextual Imbalance.
- Emotional Language.
- Ambiguity.



Irony

- Part humour, part deception.
- Negative Emotional Language.
- Polarity Contrast.



Follow



Making my own costume this year for company annual dinner. Watch this space for sewing tips and creative ideas 😂🤔 #not #prayforsofea

9:14 AM - 21 Nov 2018

Politics

NEWS IN PHOTOS

White House Security Officials Relieved Ivanka Trump's Computer Just Cardboard Box With Mirror On It

Yesterday 2:49pm • SEE MORE: IVANKA TRUMP



How about the
data?



Catching Fools'!

- 519 April Fools' articles.
- 371 websites.
- 213776 words.
- 2004-2018



Matching Fools'!

- 519 regular news articles.
- 240 Websites.
- 344927 Words.
- 2004-2018



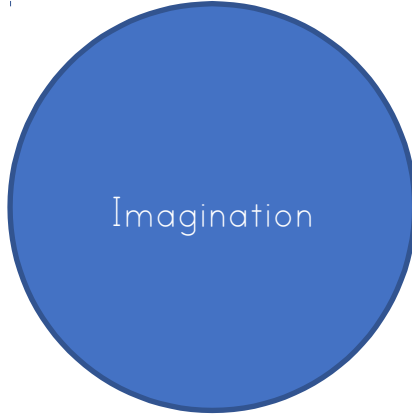
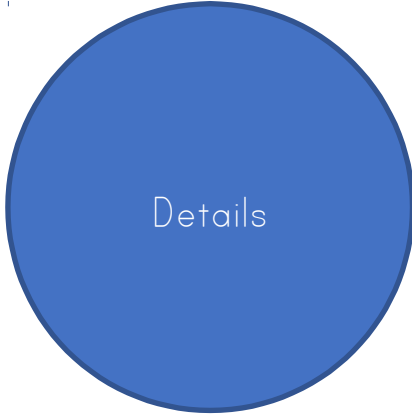
Fake News!

- Flagged as fake by BuzzFeed.
- 2016 Election.
- Horne and Adali, 2017.

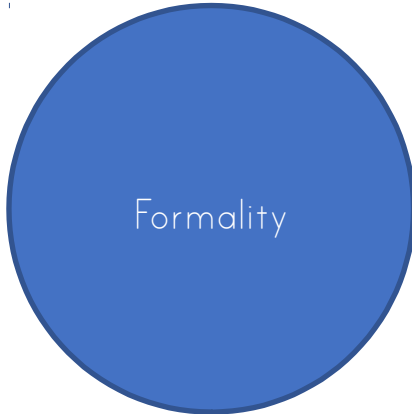
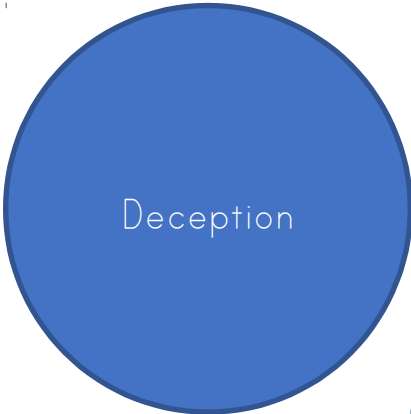


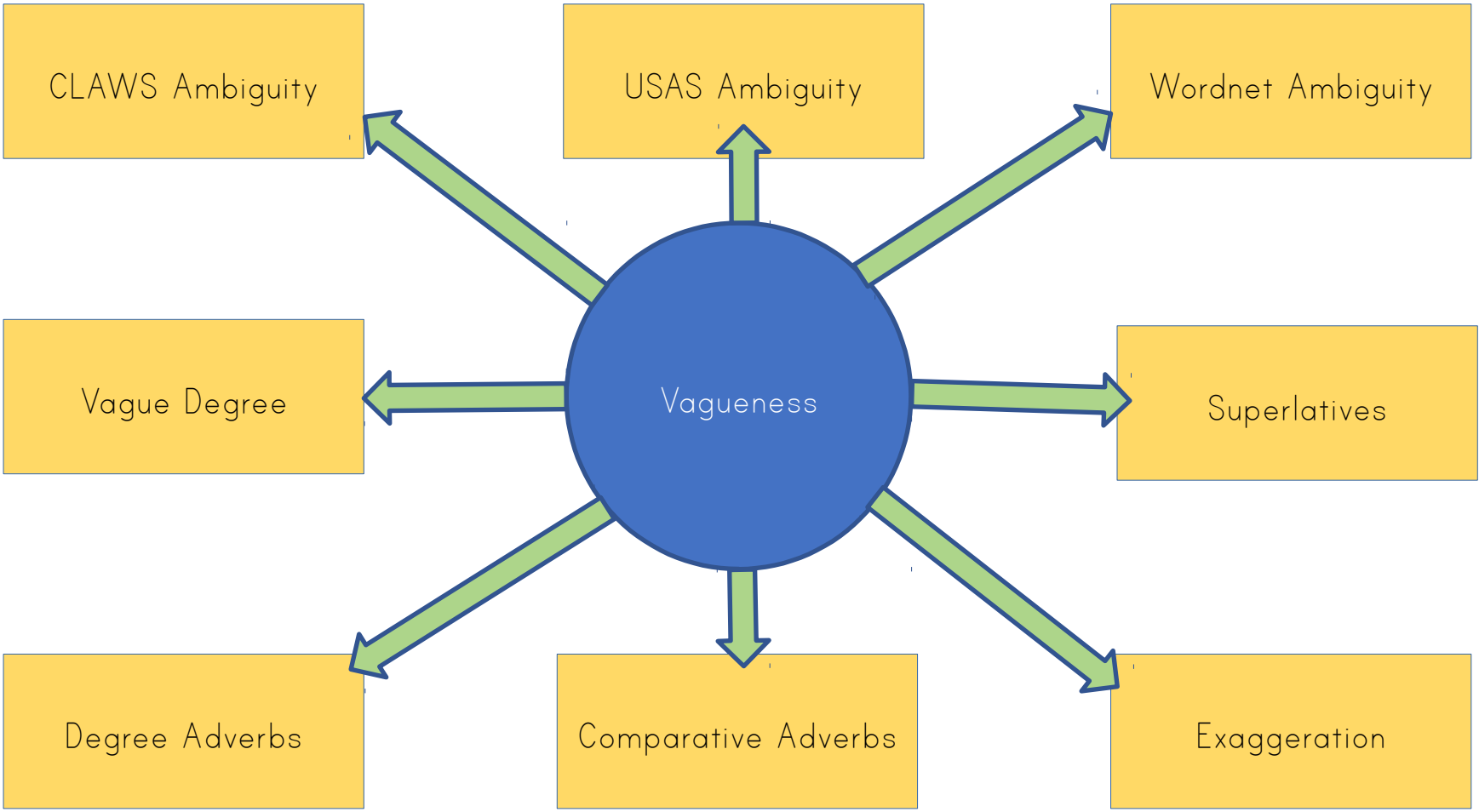
But what are
you going to
do with it?





Building a feature set





CLAWS Ambiguity

USAS Ambiguity

Wordnet Ambiguity

Vagueness

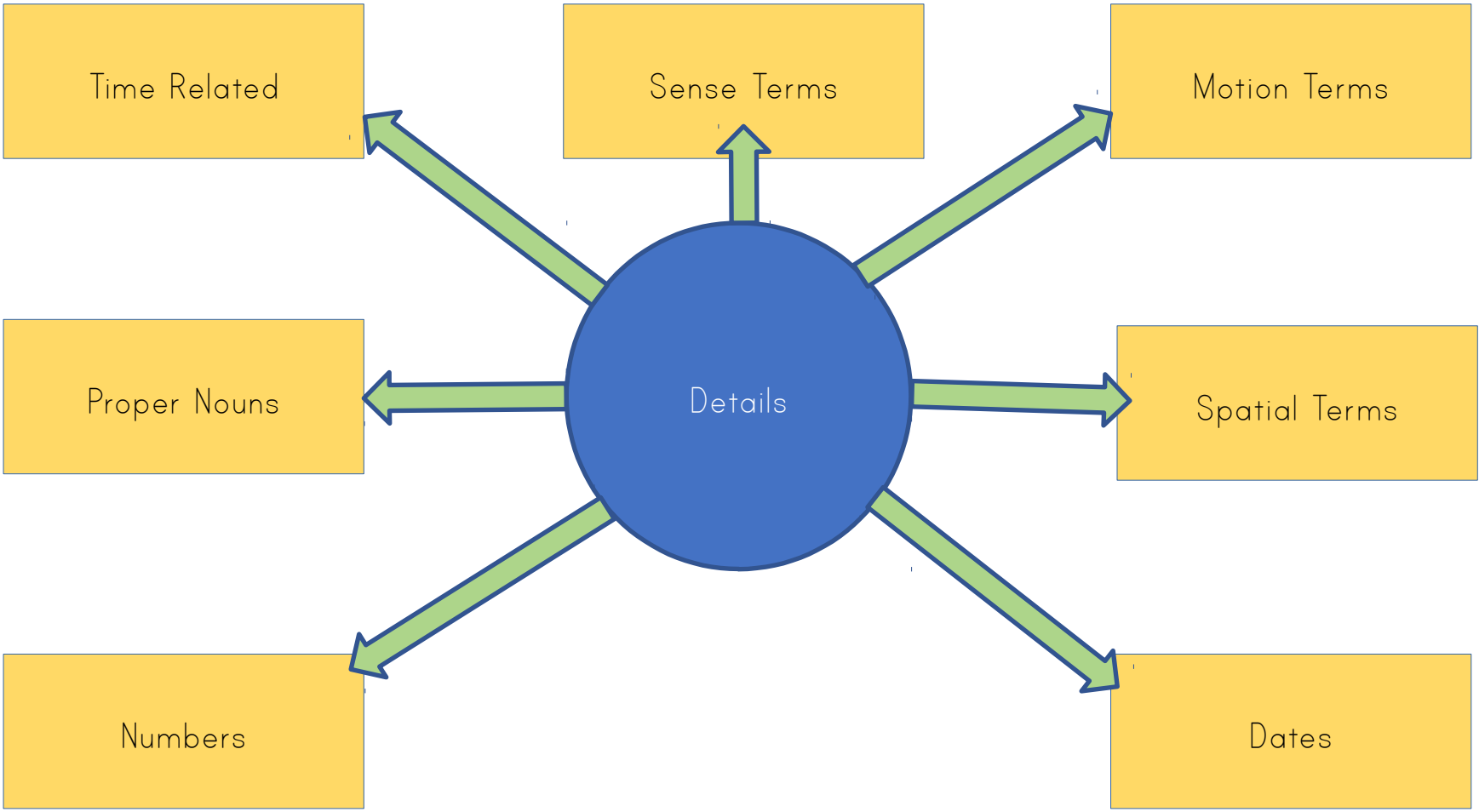
Vague Degree

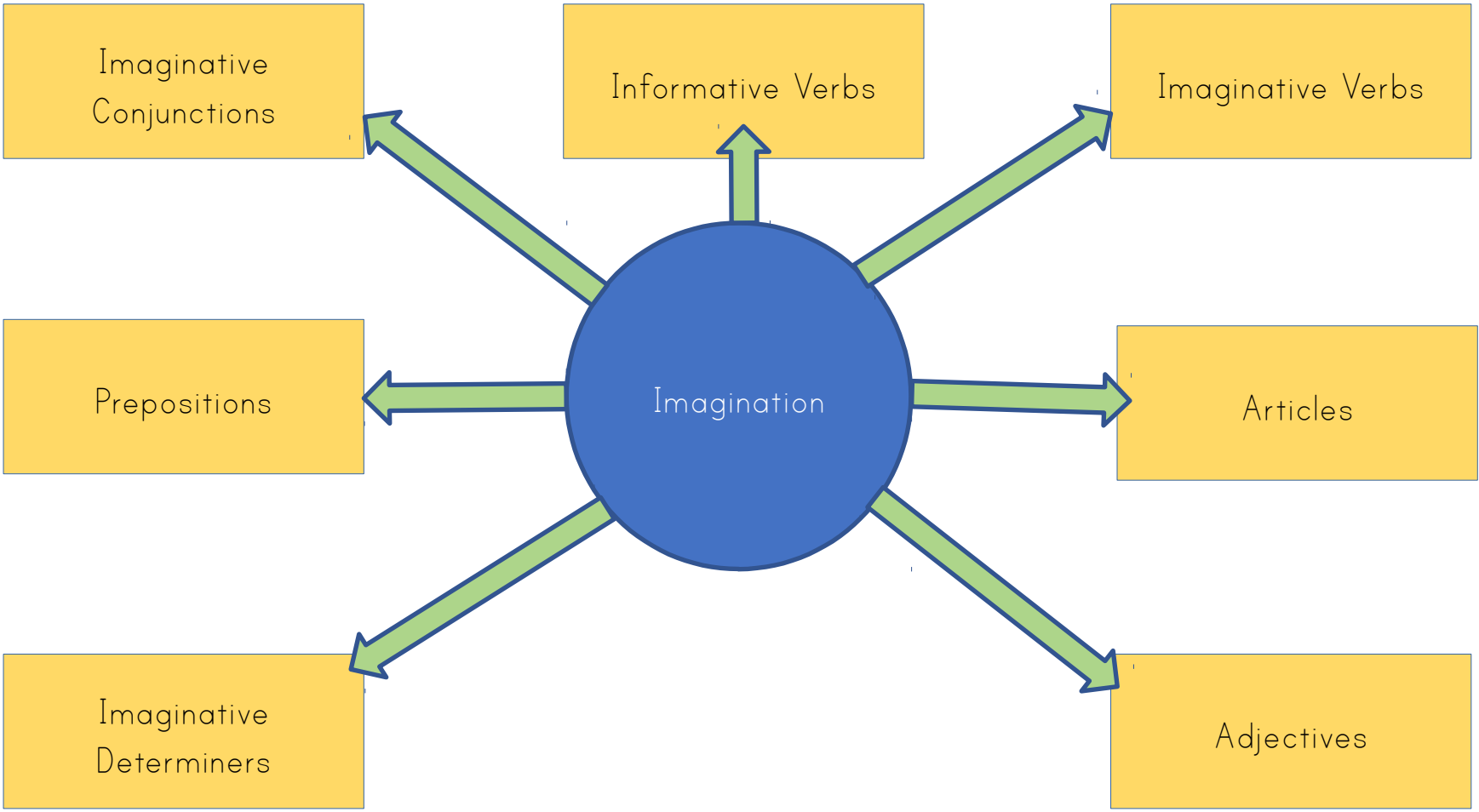
Superlatives

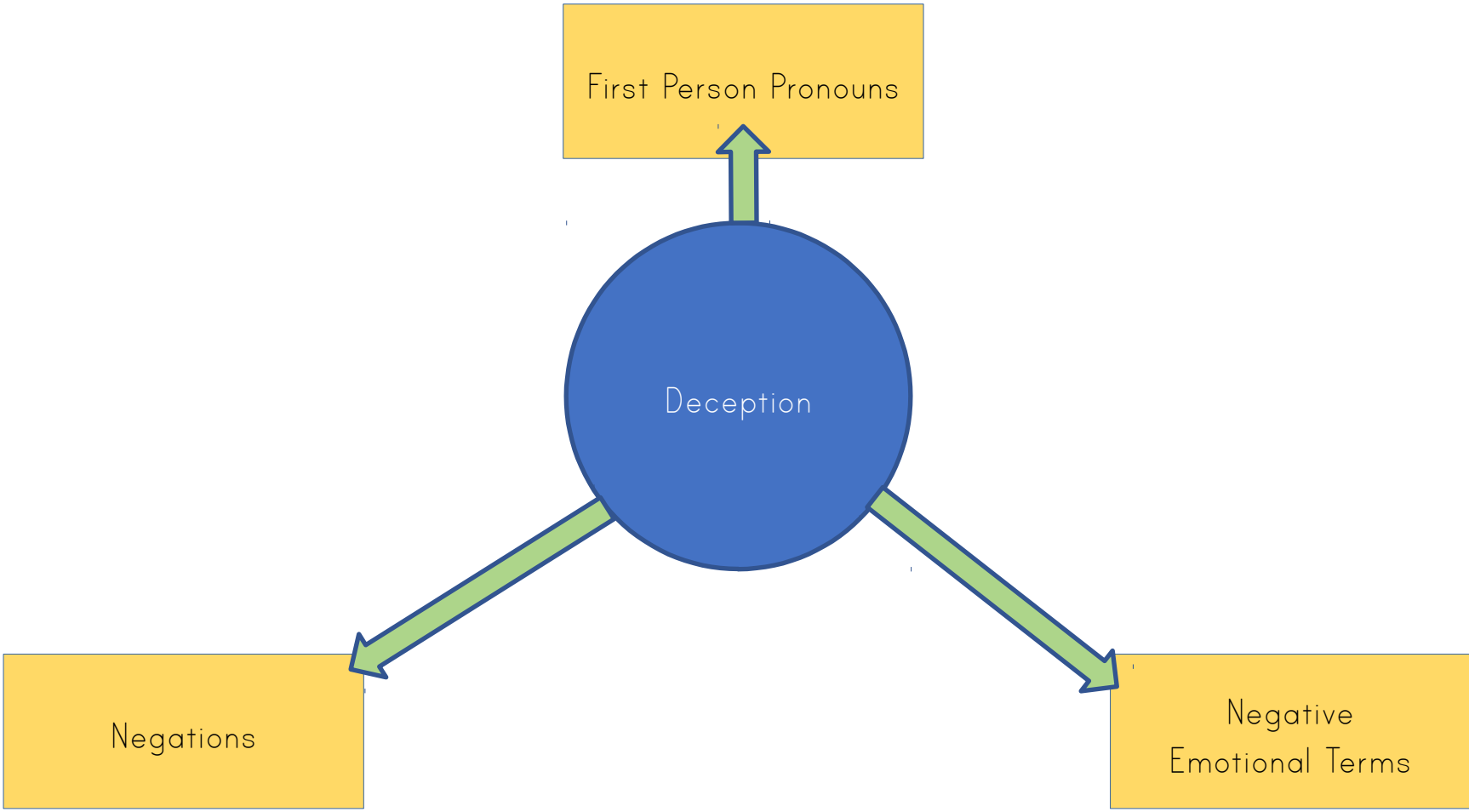
Degree Adverbs

Comparative Adverbs

Exaggeration





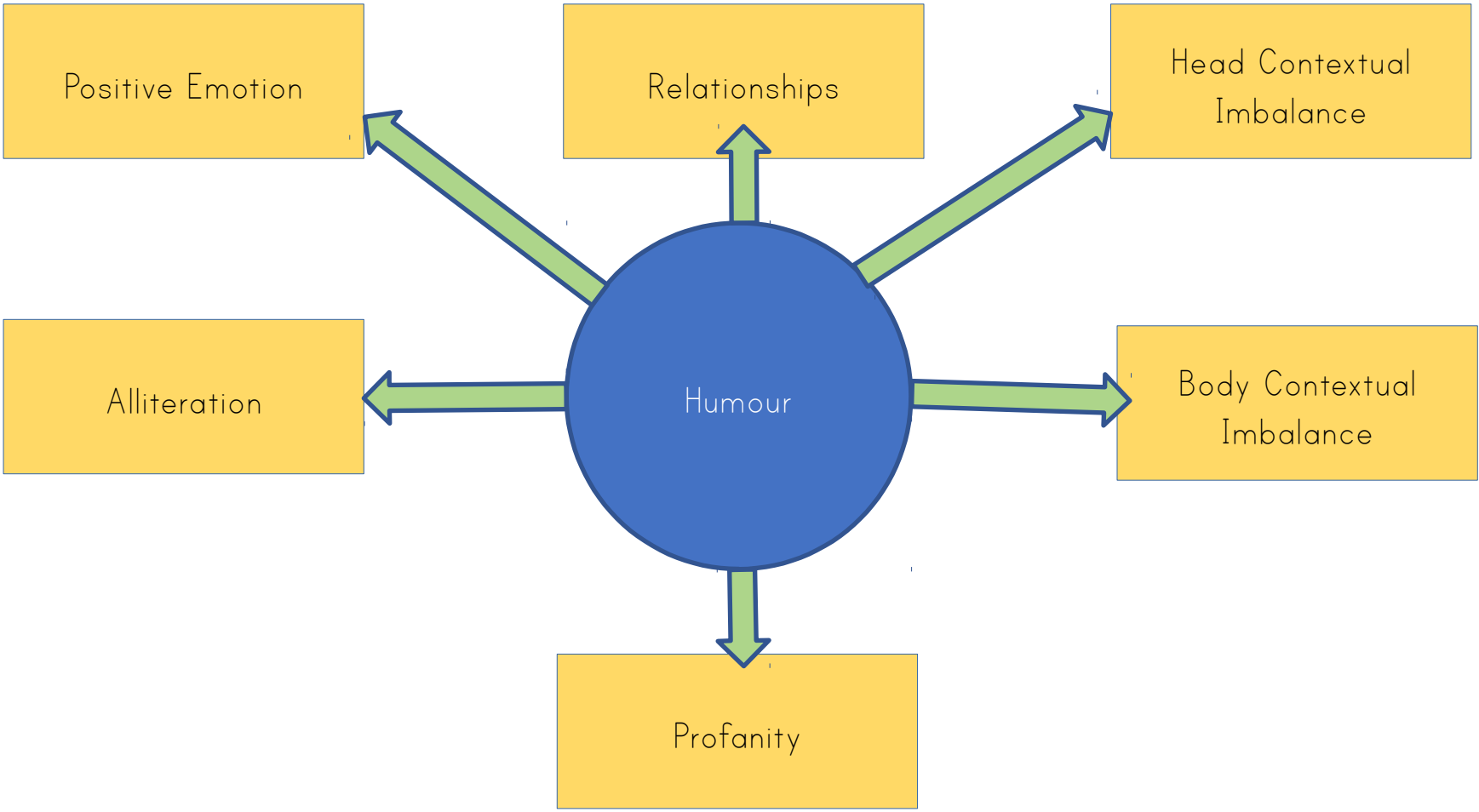


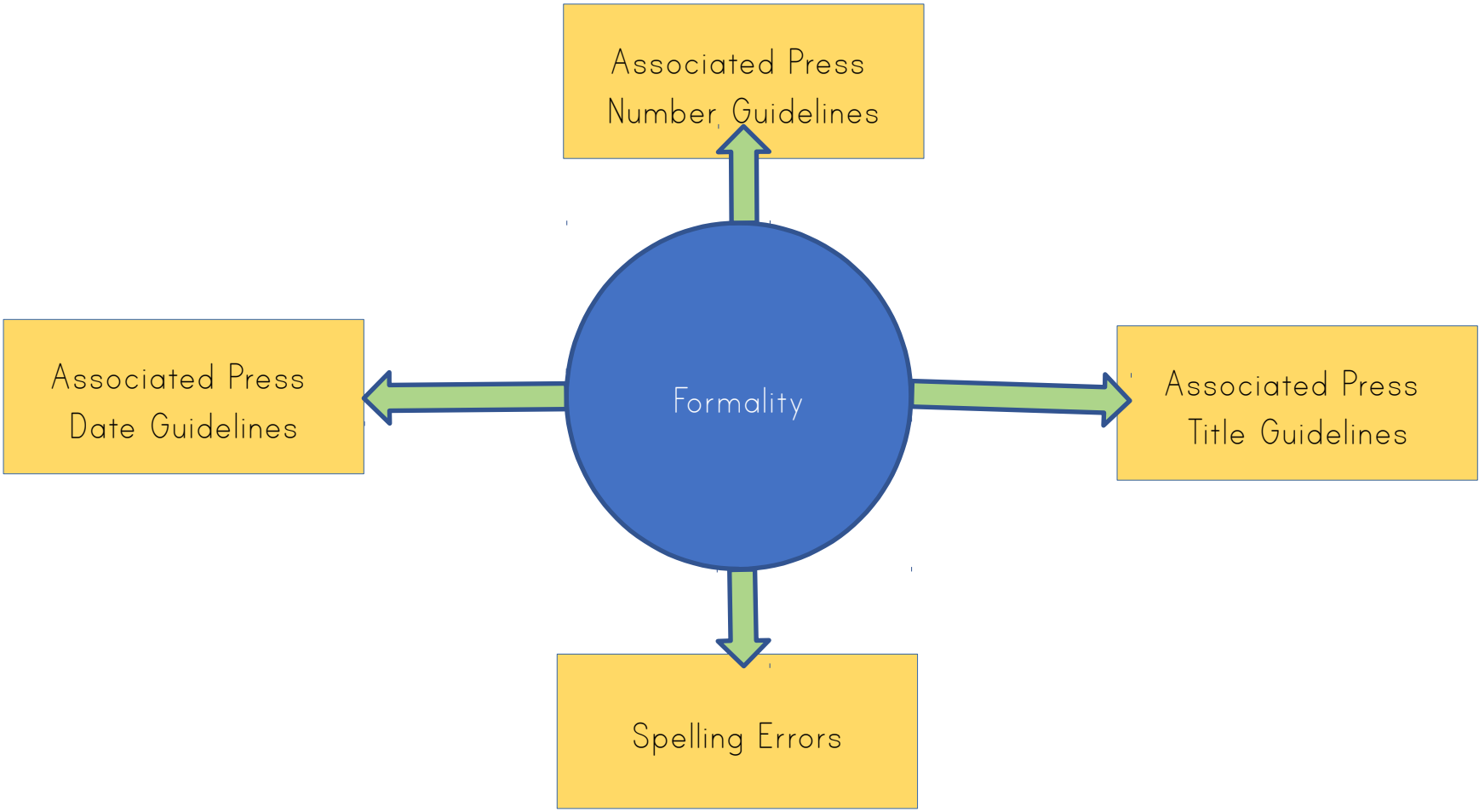
First Person Pronouns

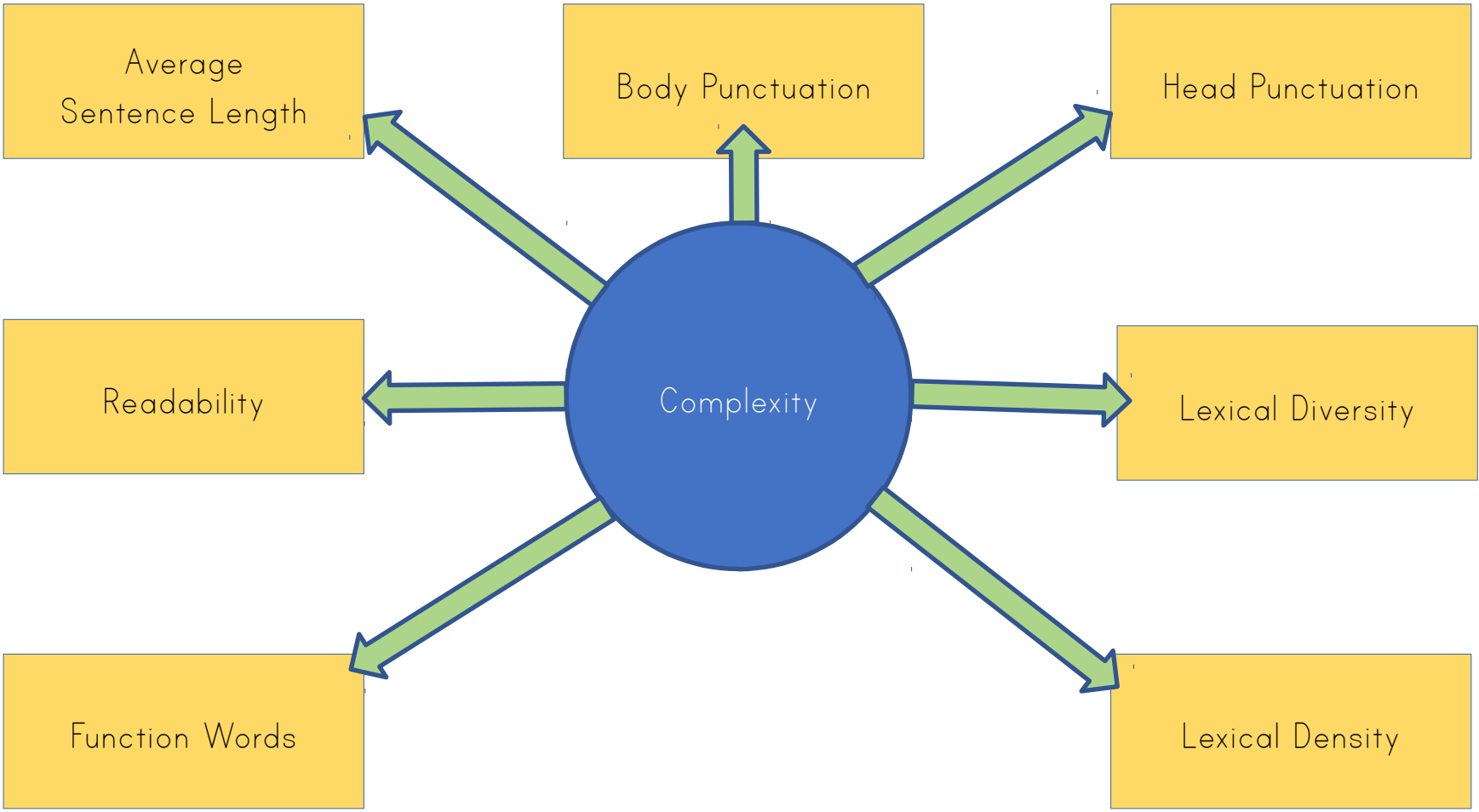
Deception

Negations

Negative
Emotional Terms







Corpus



Create feature matrix



| Feature 1 | ... | Feature N | Class |
|-----------|-----|-----------|-------|
| 0.111 | ... | 0.552 | AF |
| ... | ... | ... | ... |
| 0.444 | ... | 0.654 | NAF |



Feature Selection



Which features are most informative?



Classification



Can we learn to automatically differentiate?



Analysis



What do the results mean?

Feature Selection

- Chi-squared test
- ANOVA
- Mutual Information
- Recursive Feature Elimination
- Logistic Regression Coefficients

Feature Selection

Complexity

- Avg Sentence Length
- Body Punctuation
- Readability
- Lexical Diversity

Details

- Time Related Terms
- Sense Terms
- Proper Nouns

Formality

- Associated Press Date
- Associated Press Number

Imagination

- Preposition
- Adjectives
- Imagination Conjunctions

Deception

- First Person Pronouns

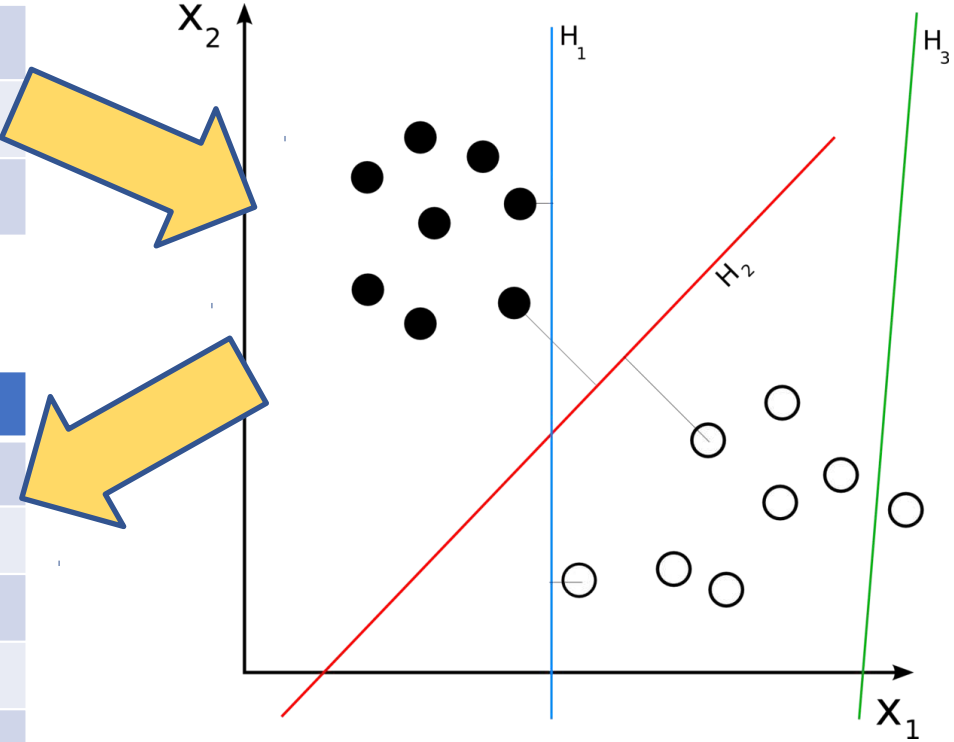
Vagueness

- Degree Adverbs

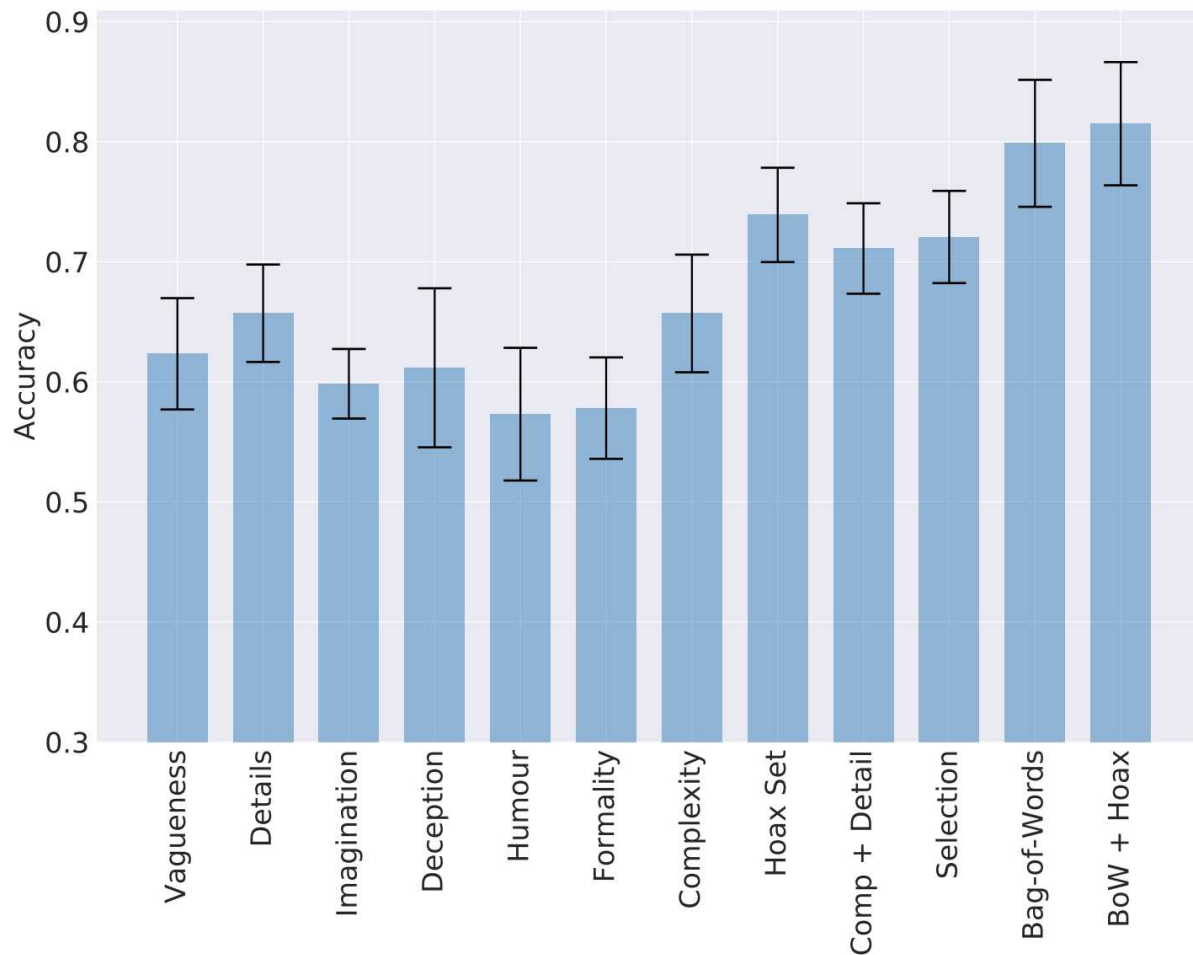
Classification

| Feature 1 | ... | Feature N | Class |
|-----------|-----|-----------|-------|
| 0.111 | ... | 0.552 | AF |
| ... | ... | ... | ... |
| 0.444 | ... | 0.654 | NAF |

| Article | Prediction | Truth |
|---------|------------|-------|
| 1 | AF | AF |
| 2 | NAF | AF |
| ... | ... | ... |
| n-1 | NAF | NAF |
| n | AF | NAF |



Classification Accuracies for all Feature Sets



Hoax Set: 74%

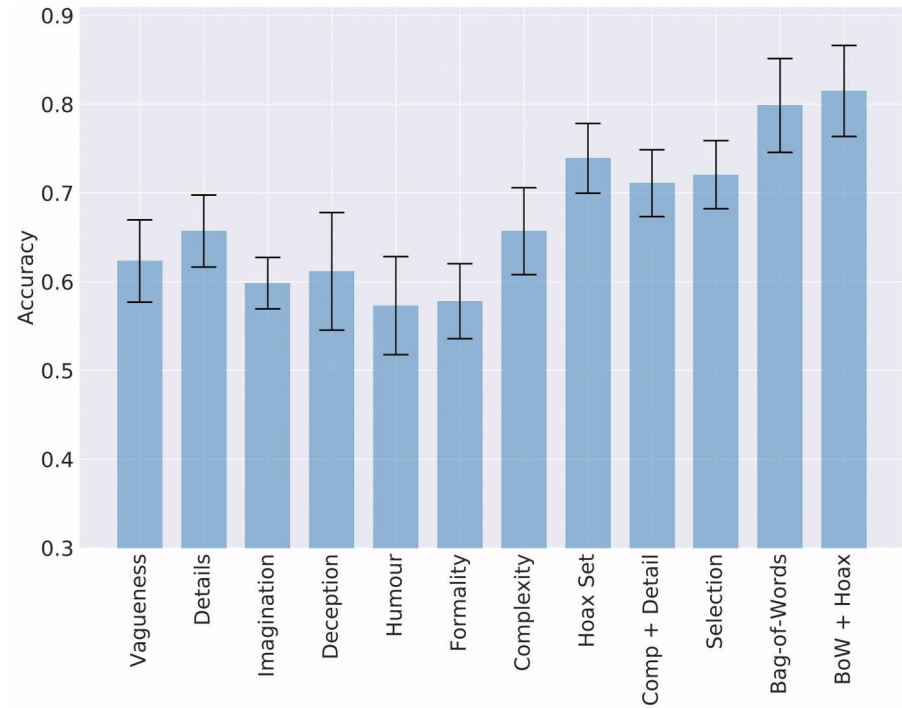
Bag-of-Words: 80%

Complexity:
+ Detail 71%

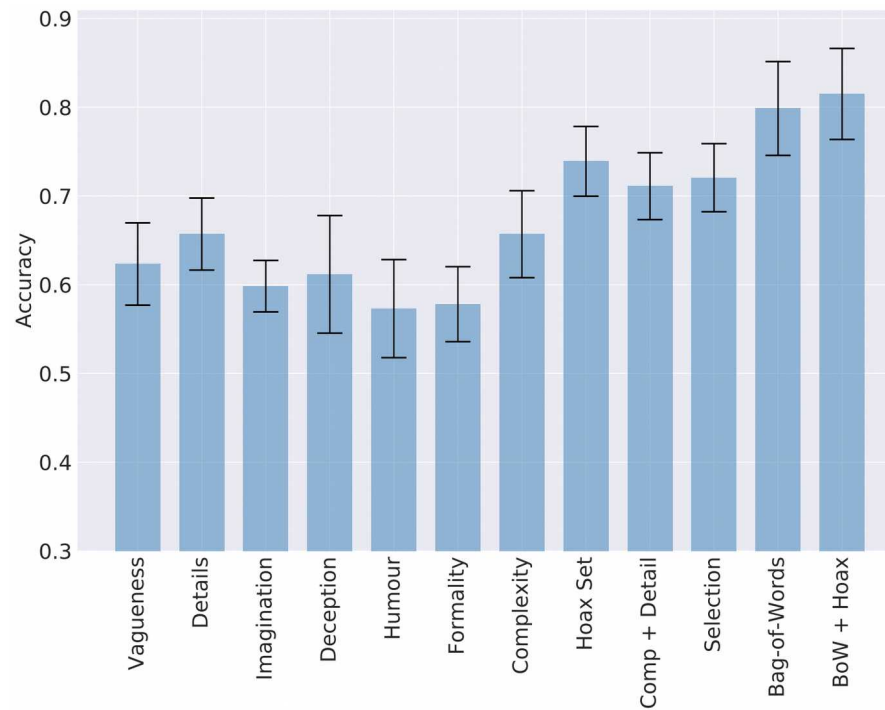
What are we
seeing so far?



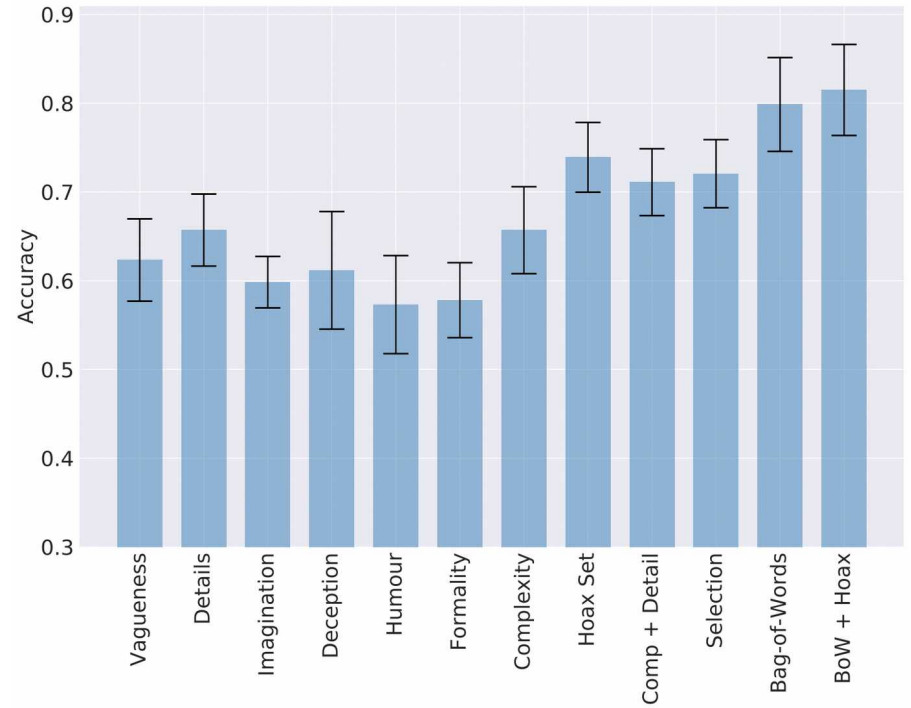
Our feature set can
differentiate
between hoax and
genuine.



Most individual
feature groups don't
do so well.



Complexity and
Detail are Important.



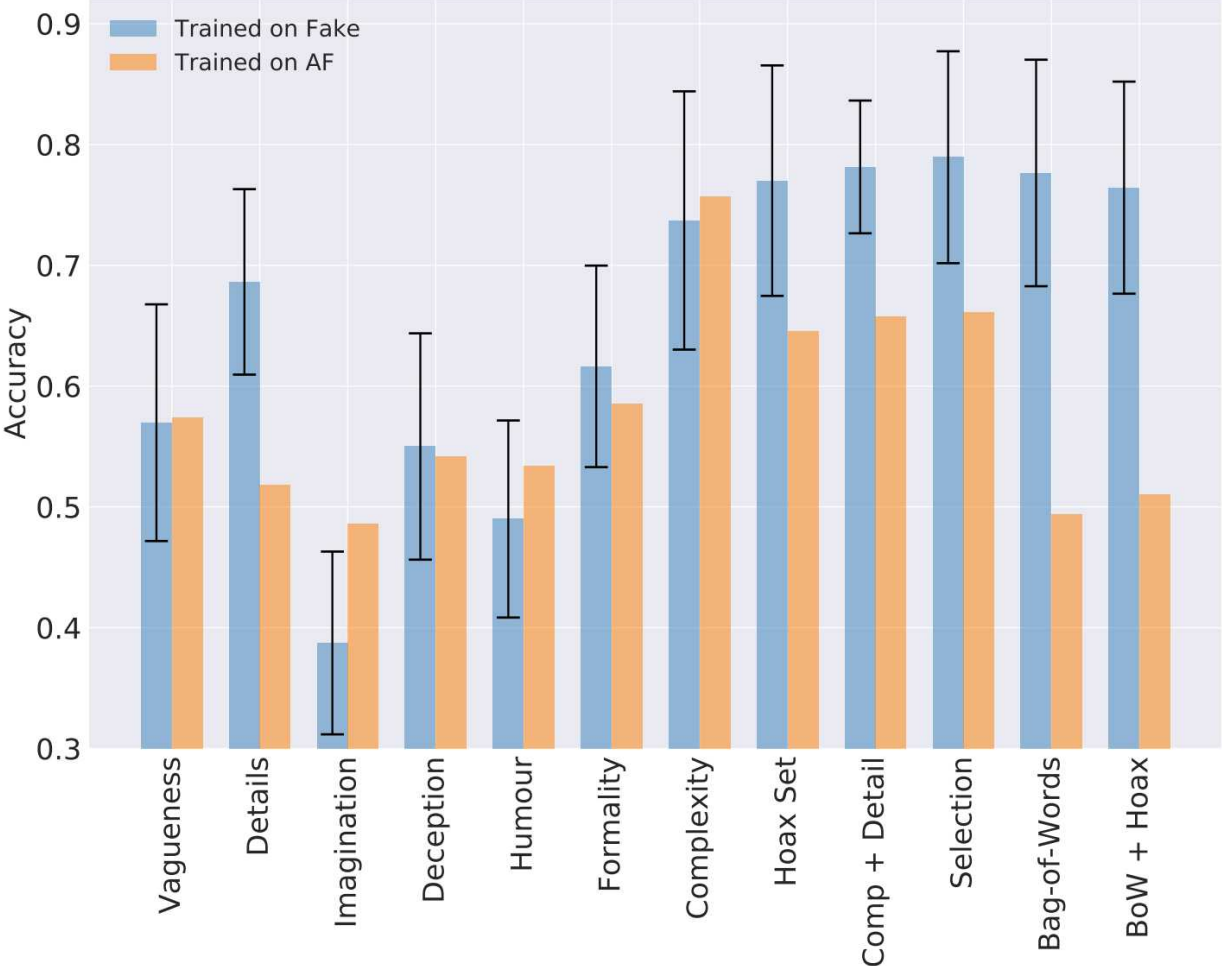
How does this
compare to Fake
News?



Classifying Fakes

1. One classifier trained on Fake News.
2. Second Classifier trained on April Fools' and tested on Fake News.

Classification Accuracies for Fake News

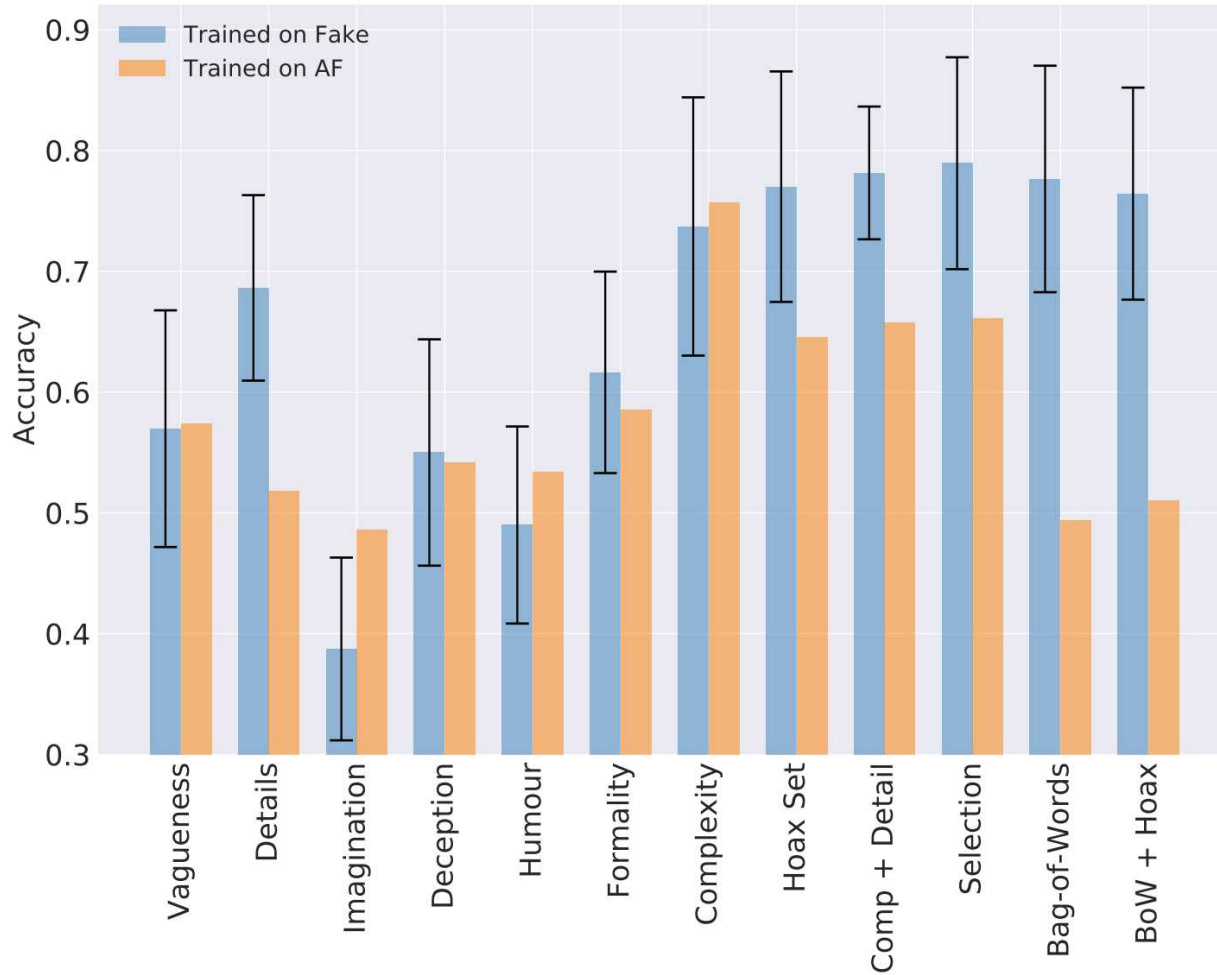


Hoax Set: 76.9%

Bag-of-Words: 77.7%

Complexity:
+ Detail 78.1%

Classification Accuracies for Fake News



Hoax Set: 64.5%

Bag-of-Words: 49.4%

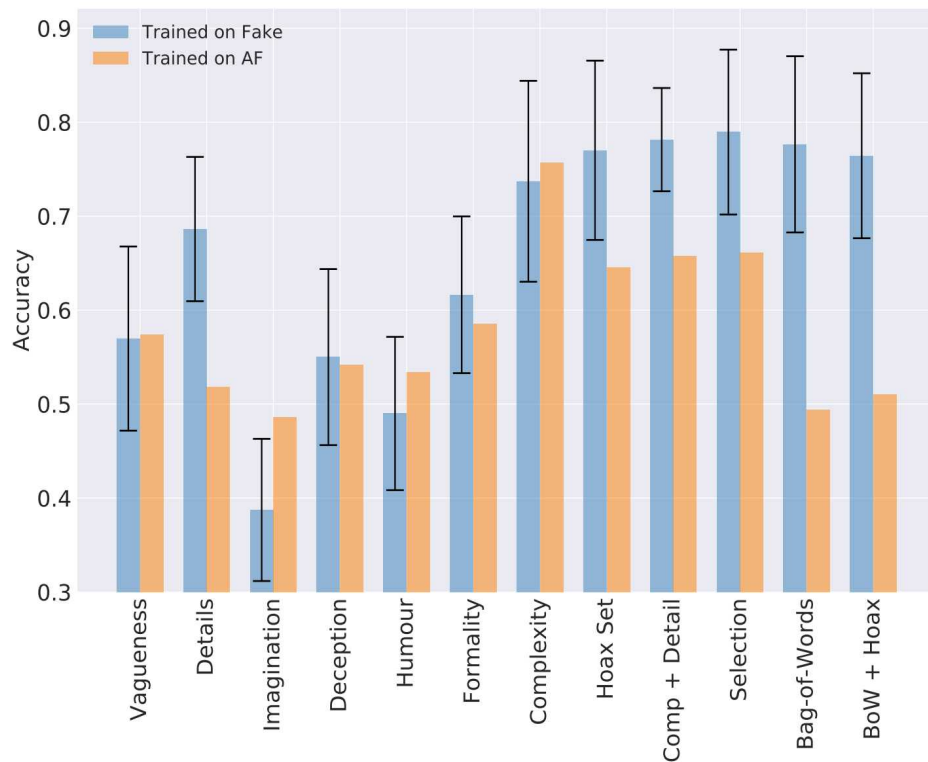
Complexity:
+ Detail 65.7%

Complexity: 75.7%

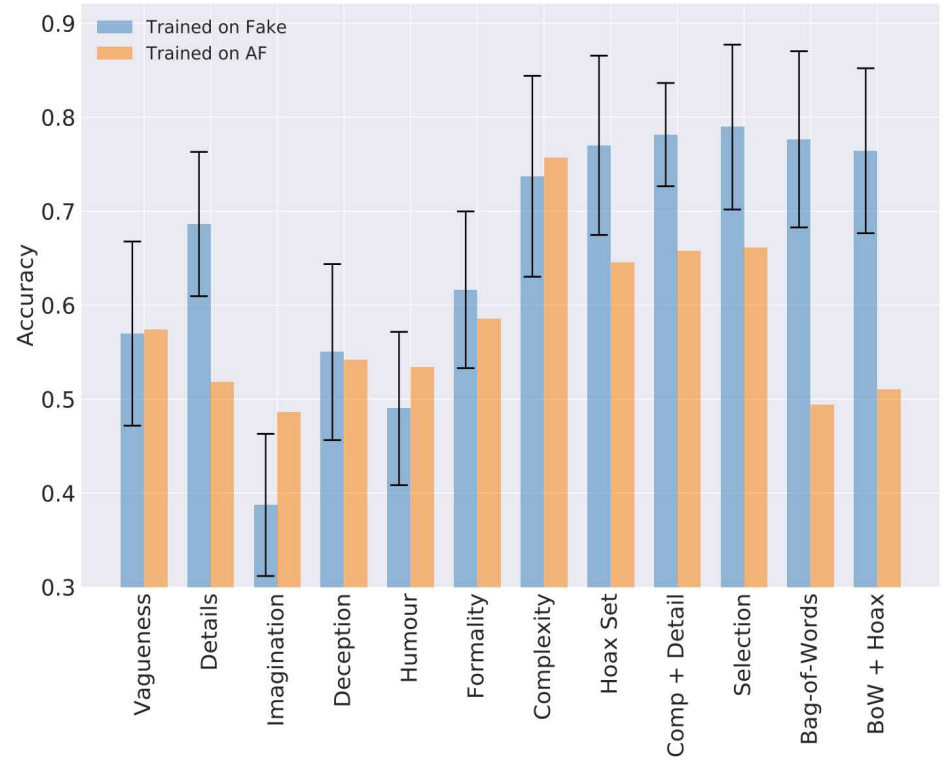
What does this
suggest?



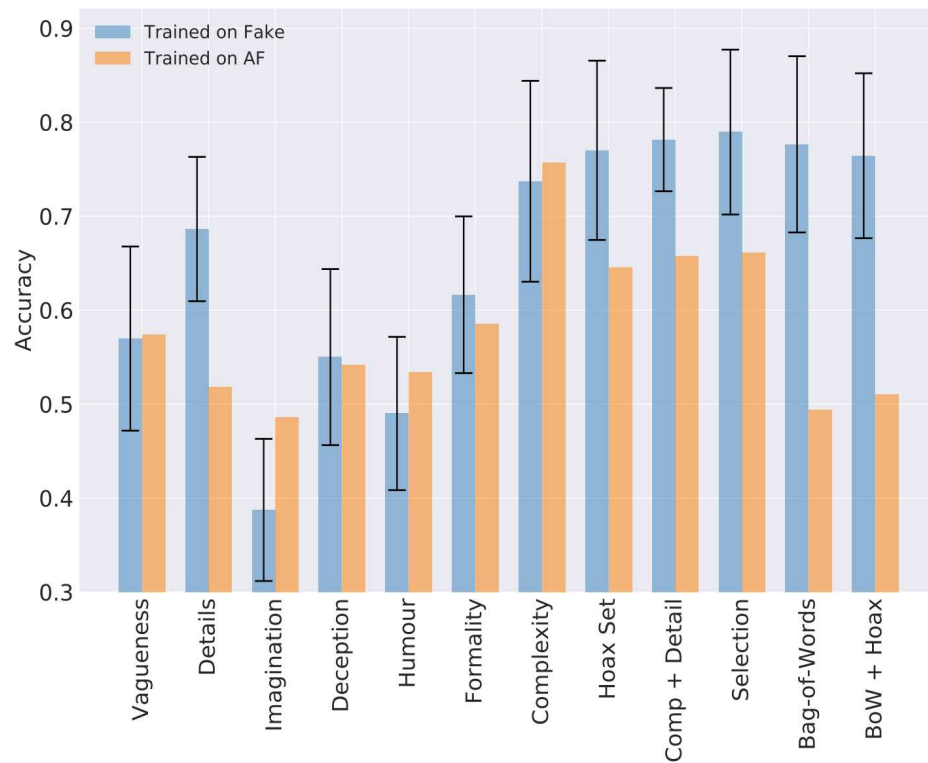
Our feature set differentiates fake news similarly well to April Fools'.



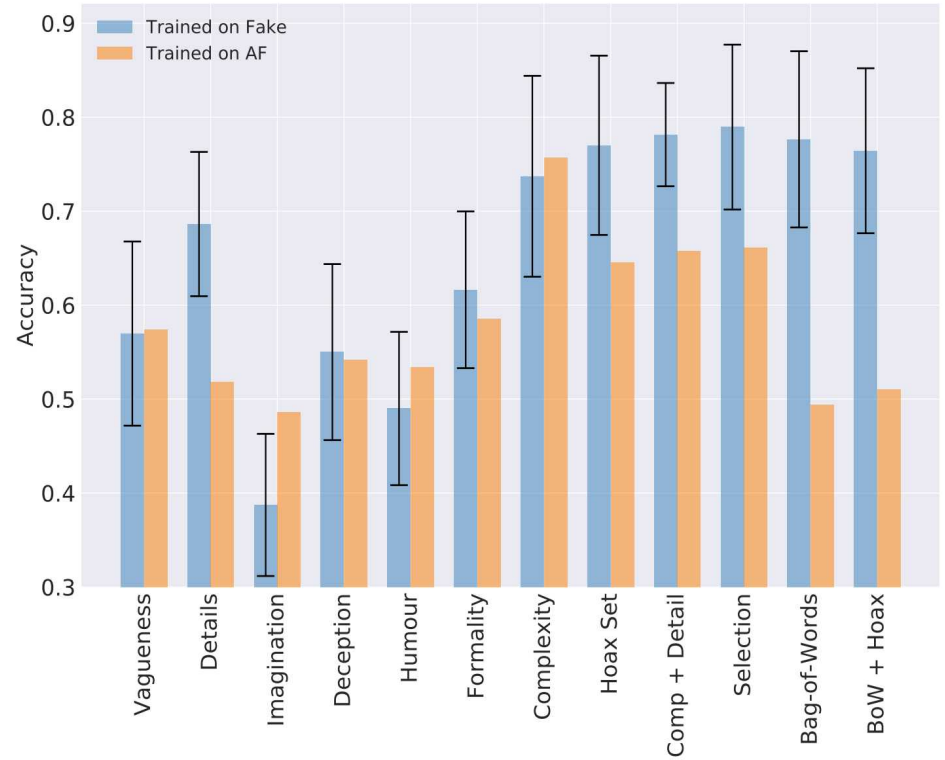
Some feature groups perform much worse.



Complexity and Detail
remain the most
important feature
groups.



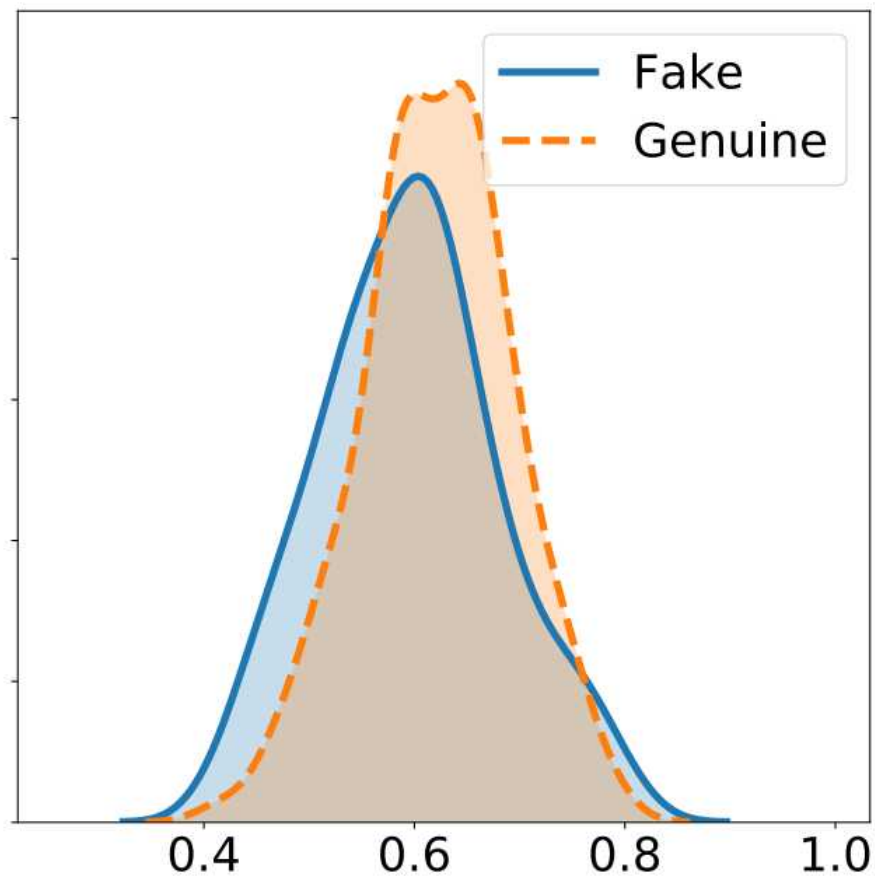
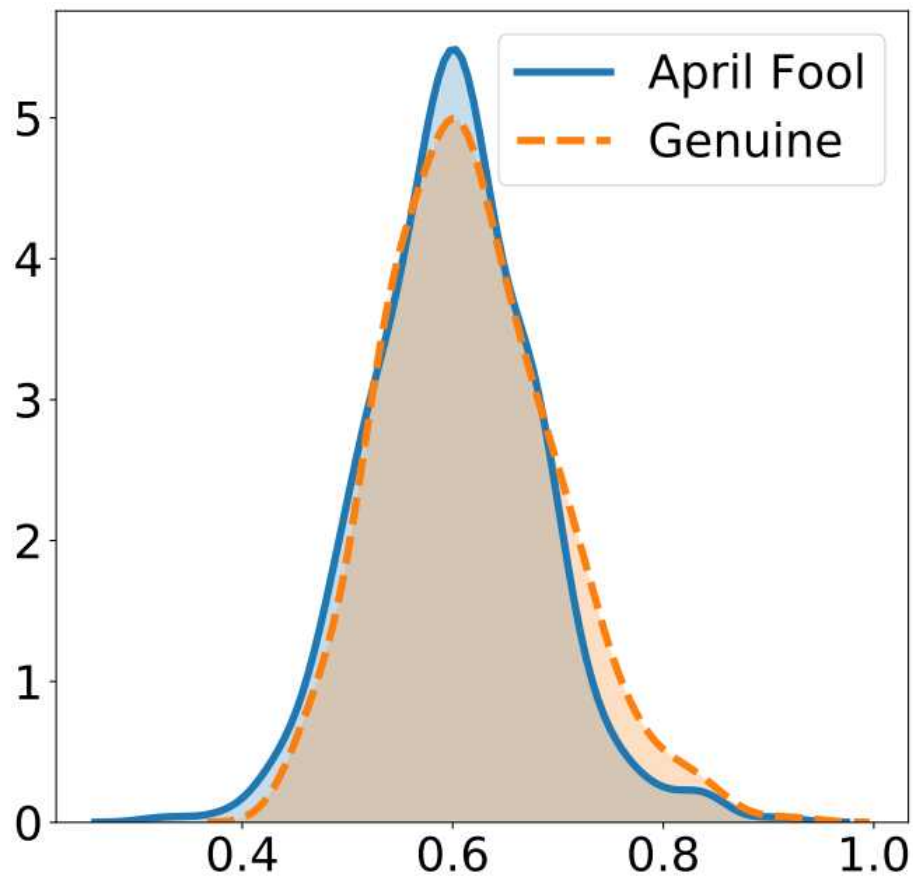
Our classifier trained on AF seems to work (to some extent) on Fake News.



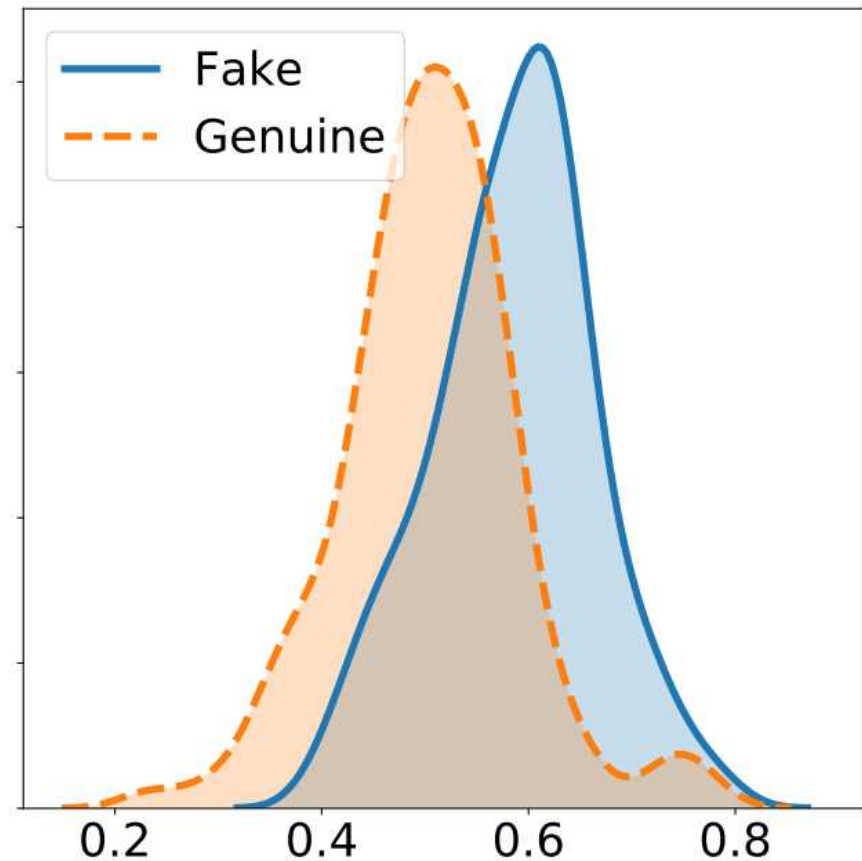
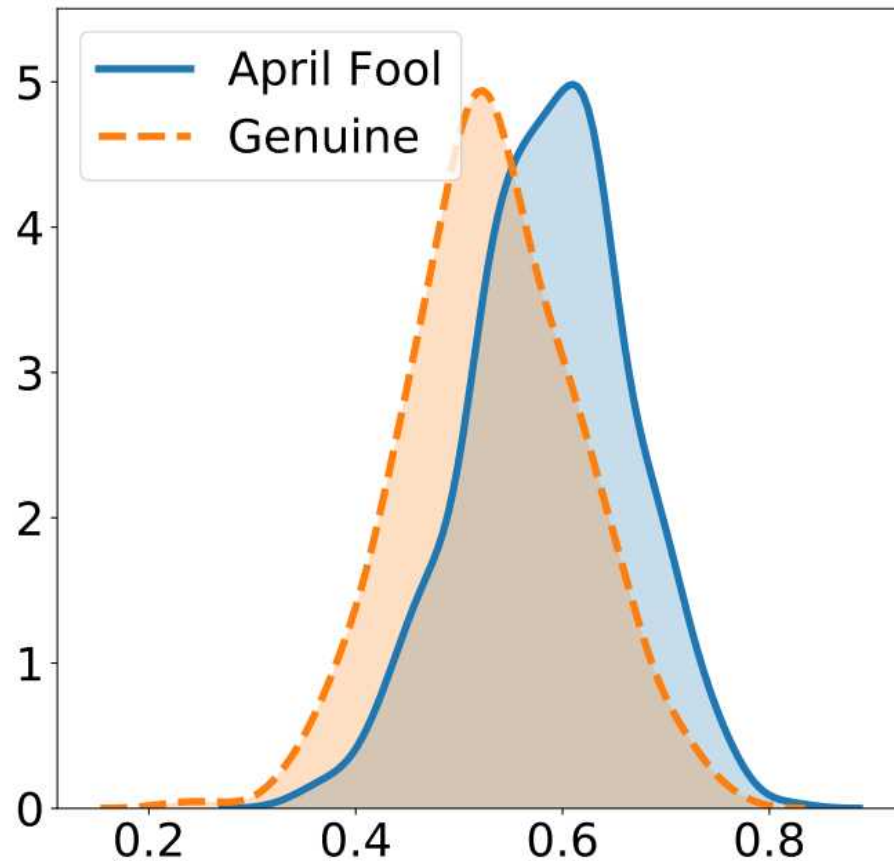
But what does
the data say?



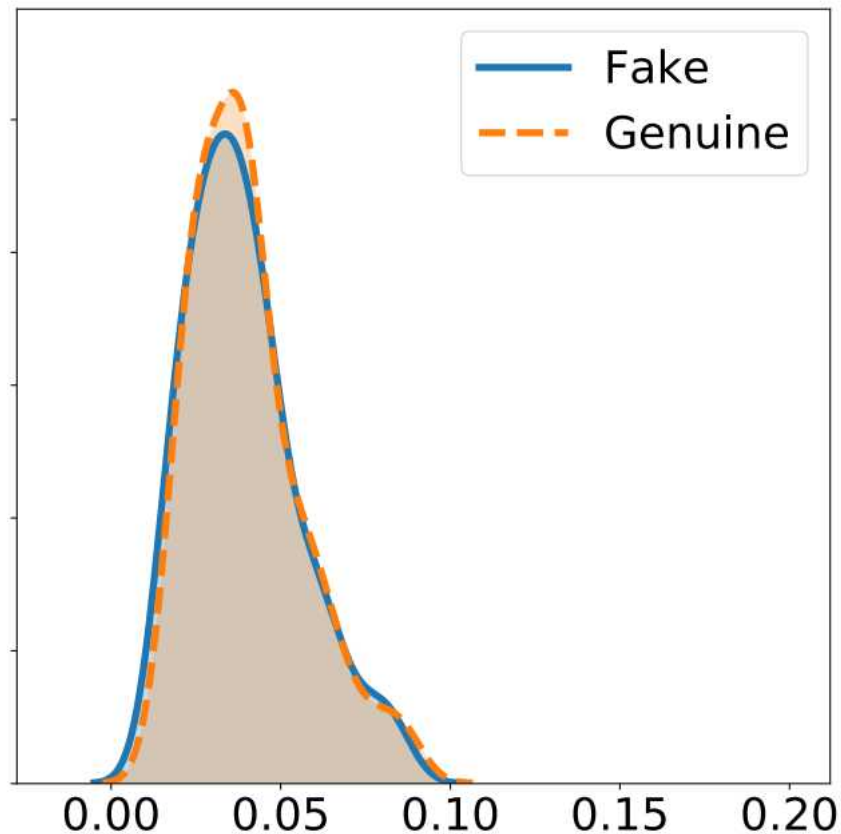
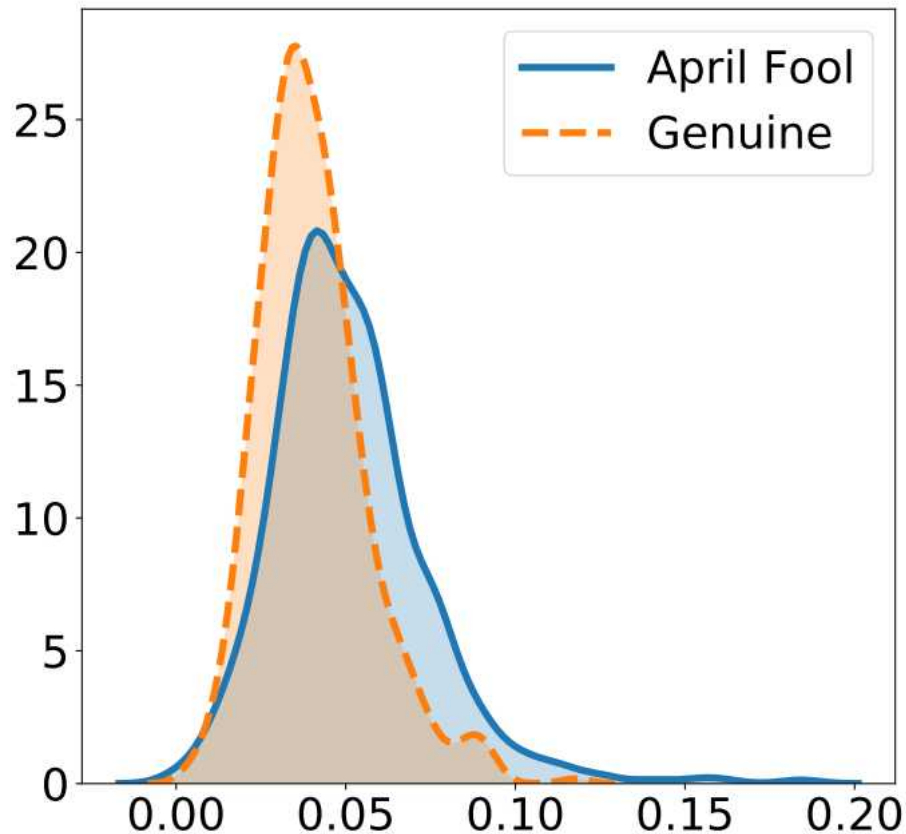
Readability (Complexity)



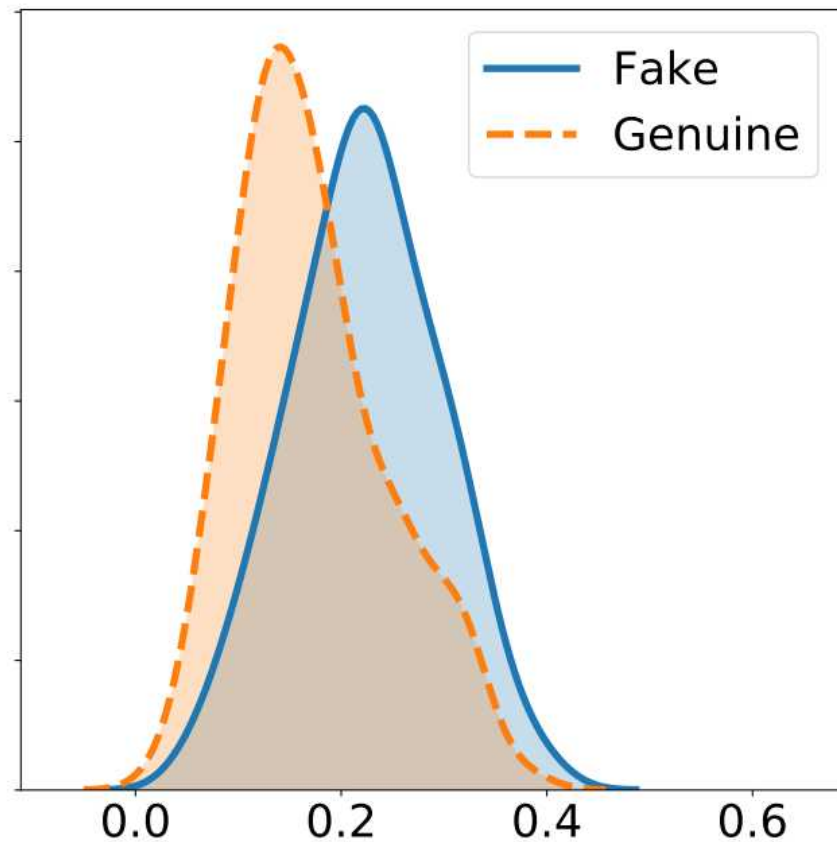
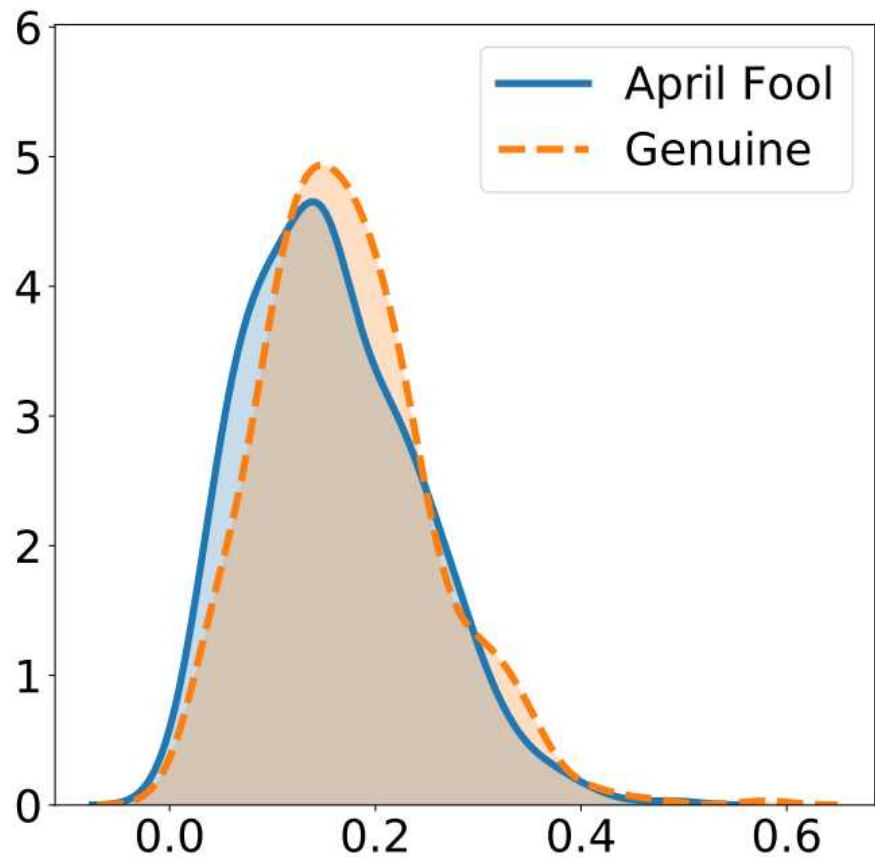
Lexical Diversity (*Complexity*)



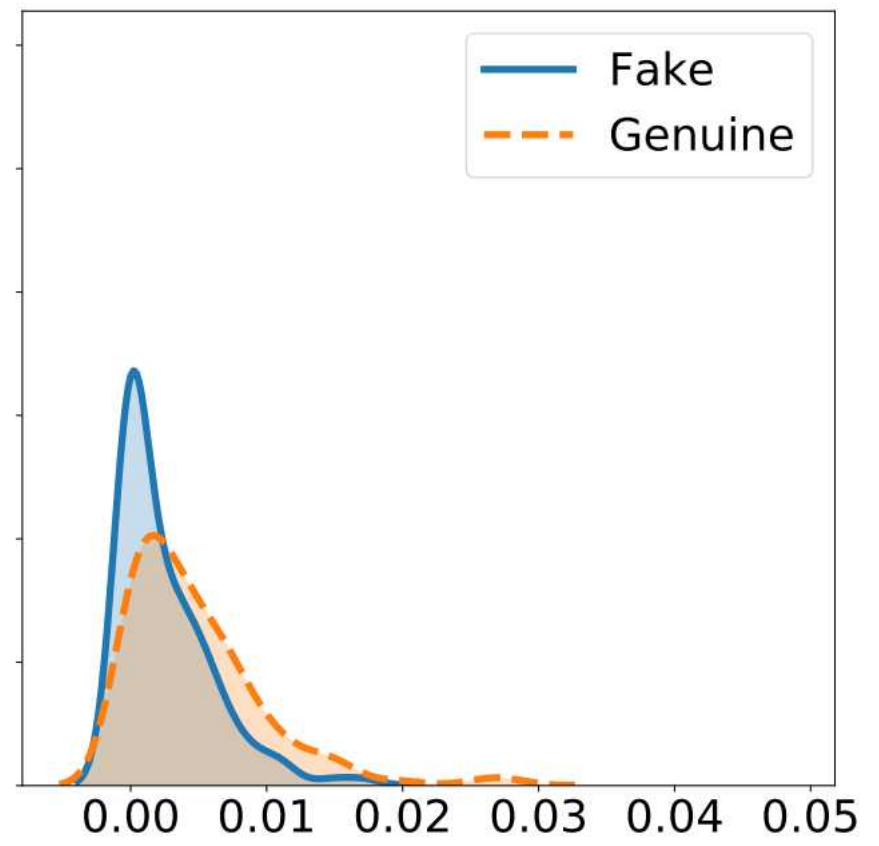
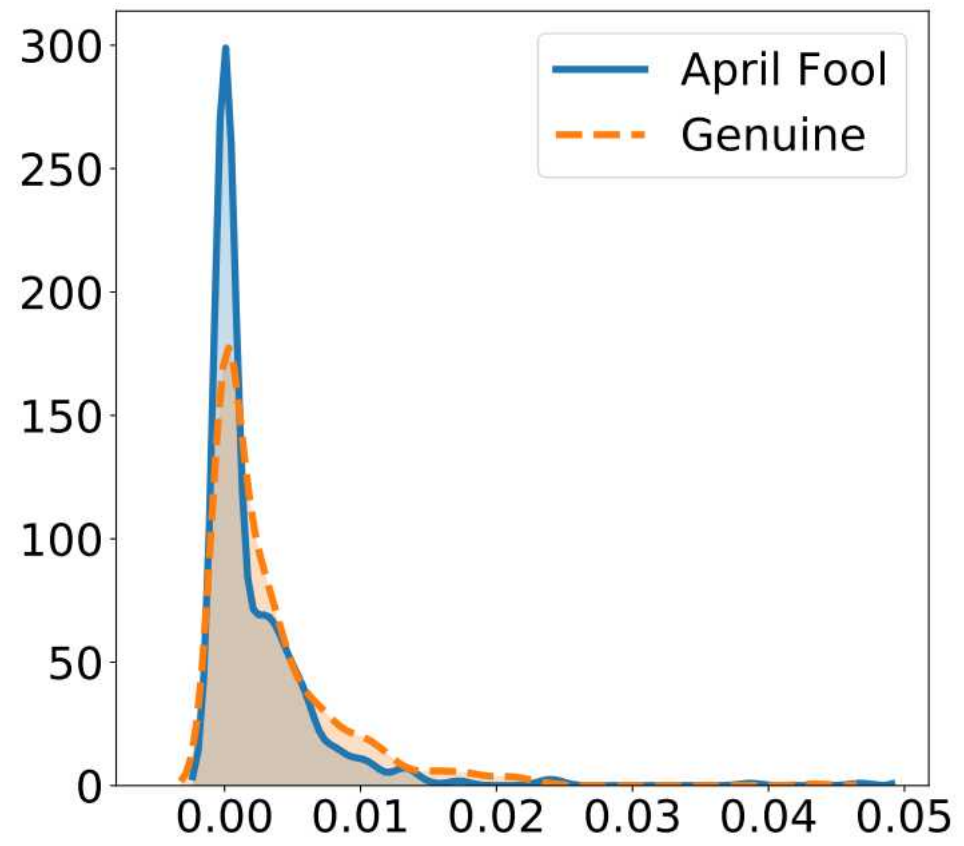
Time Related Vocabulary (*Detail*)



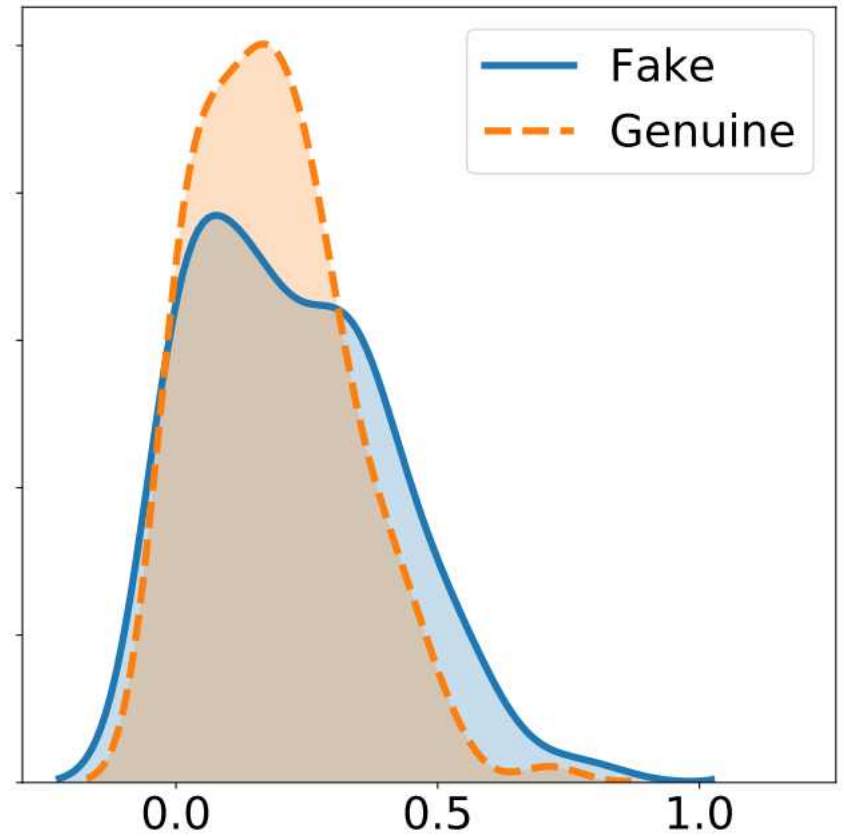
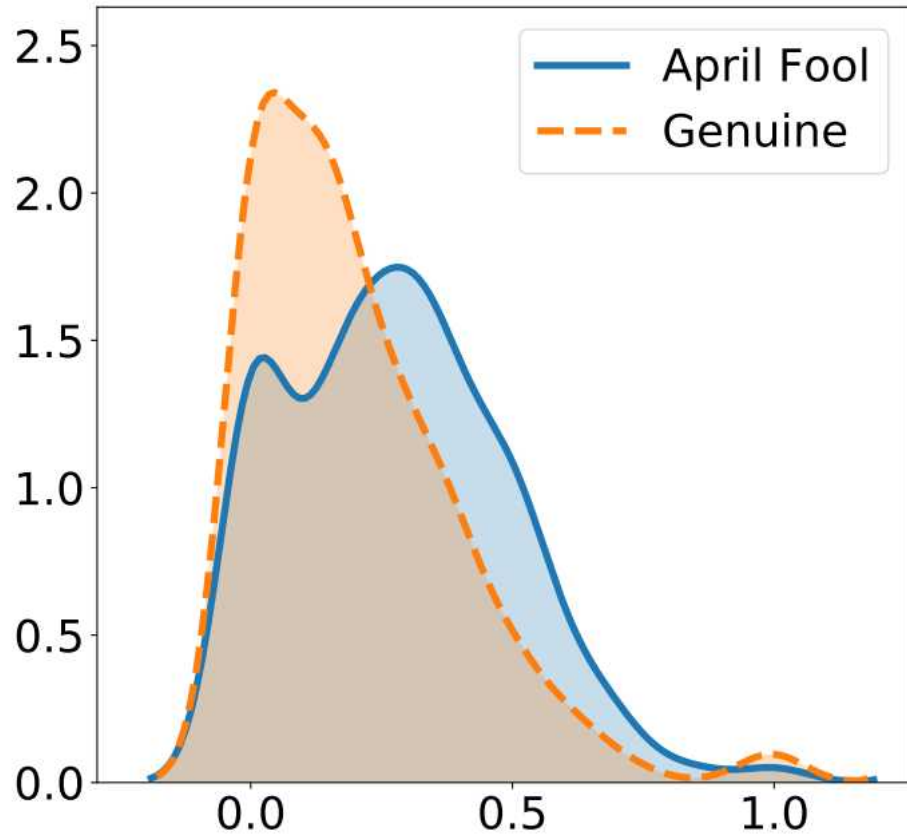
Proper Nouns *(Detail)*



Dates (*Detail*)



First Person Pronouns (*Deception*)



Can you sum
it all up?



Conclusions – Part 1

- **Created a new corpus of April Fools' hoaxes.**
- Used features from deception, humour, and irony detection to classify hoaxes with moderate success.
- Showed that features relating to complexity and detail seem to be the most important.

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Conclusions – Part 2

- Found that similar features are useful in identifying April Fools' and Fake News.
- Some of these features manifest themselves similarly for both AF Hoaxes and Fake News.

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Future Work



He's one of the busiest men in town. While his door may say *Office Hours 2 to 4*, he's actually on call 24 hours a day.

The doctor is a scientist, a diplomat, and a friendly sympathetic human being all in one, so matters how long and hard his schedule.

According to a recent Nationwide survey:

MORE DOCTORS SMOKE CAMELS THAN ANY OTHER CIGARETTE

DOCTORS in every branch of medicine—113,197 in all—were queried in this nationwide study of cigarette preference. Times leading research organizations made the survey. The gist of the query was—What cigarette do you smoke, Doctor?

The brand named most was Camel!

The rich, full flavor and mild smoothness of Camel's superb blend of southern tobacco leaves has the same appeal to the smoking tastes of doctors as to millions of other smokers. If you are a Camel smoker, this preference among doctors will hardly surprise you. If you're not—well, try Camels now.

Your "I-Zone" Will Tell You...

I for Taste...
I for Throat...
That's your proving ground for any cigarette. See if Camels don't hit your "I-Zone" in a "T."

CAMELS Costlier Tobaccos





Questions?

Thanks for listening!

e.dearden@lancaster.ac.uk