



# The Search for Emotions, Creativity, and Fairness in Language

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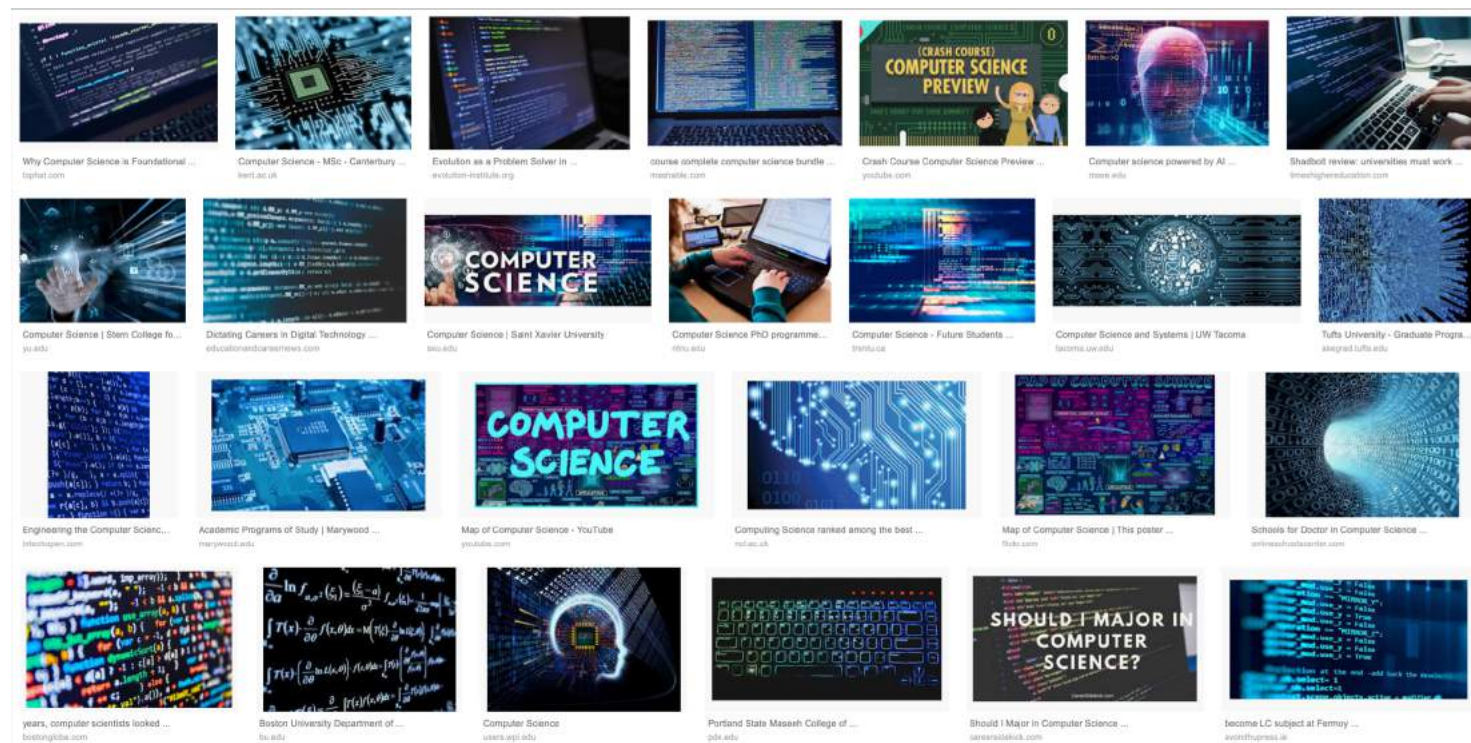
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What comes to mind when you hear the words...

# Computer Science

Google images result for "computer science":





# What comes to mind when you hear the words... Computer Science

Google images result for "working in computer science":



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# Working in Computer Science

- People working on all kinds of compelling, interesting, and useful problems **using computers as a tool for processing data**
- People with diverse backgrounds and interest



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# Natural Language Processing

Create machines/applications that have human abilities of language

- translate text from one language to another
- understand questions
- find answers from the internet



## Computations Linguistics

Ask research questions

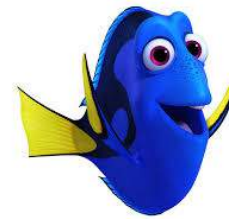
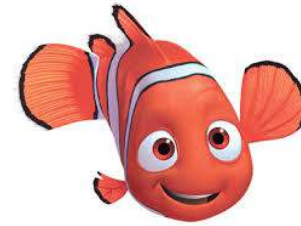
- how do people use language?
- how do kids learn language?
- why is language the way it is?



# Emotions

- there is no cognition without emotion

# The Search for Emotions in Language



creativity



fairness



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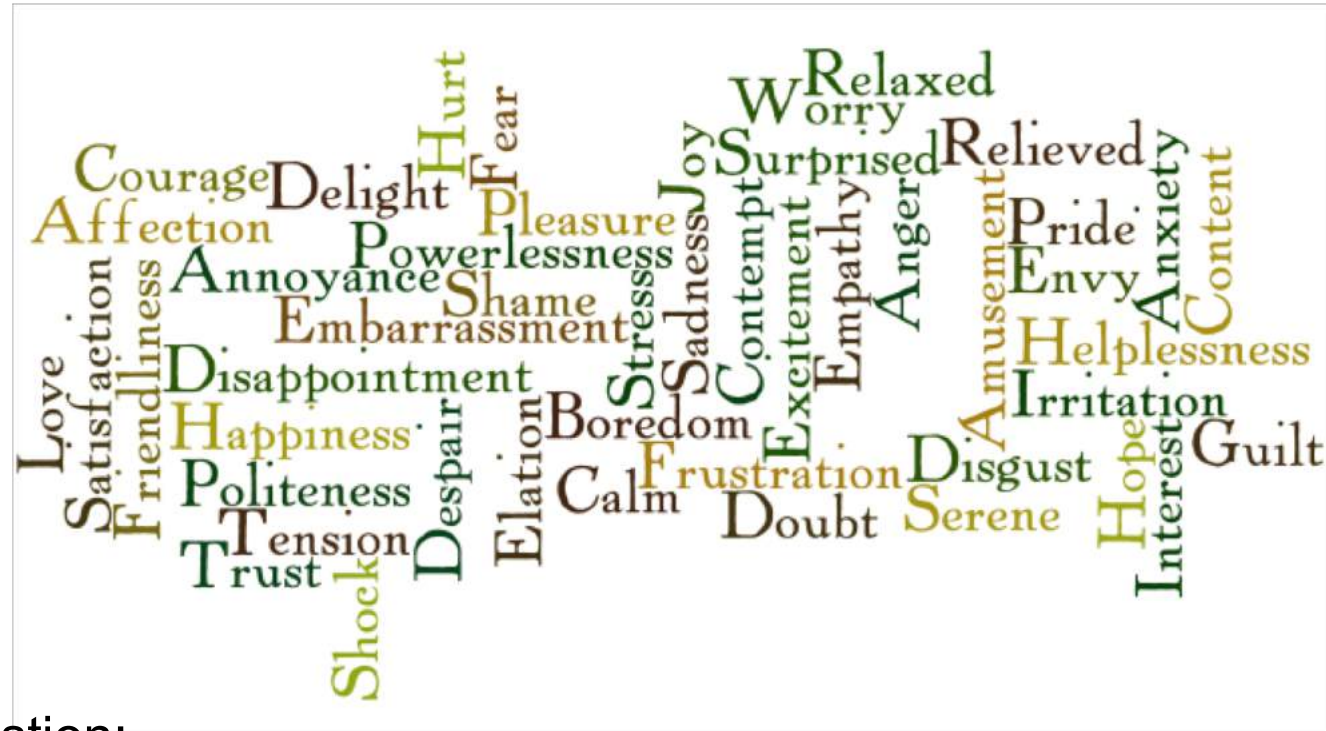
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# Emotions



How many emotions can we perceive?



Difficult question:

- fuzzy emotion boundaries, overlapping meanings, socio-cultural influences, etc.

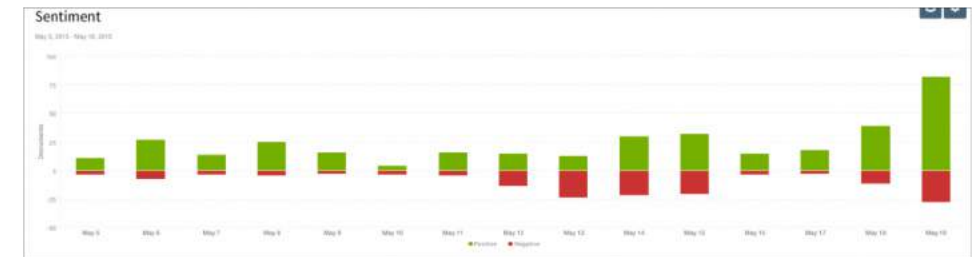
Some studies suggest 500 to 600 emotion categories!



# Sentiment Analysis

Create applications for:

- Determining how much people like the latest iPhones, government policies, pop album
- Detecting cyber-bullying, fake news, depression, personality traits
- Creating game characters and virtual assistants that can detect and express emotions



# Emotions in Language

Ask research questions:

- how do people use language to convey emotions?
- how are emotion words different from other words?
- does our personality impact how we view the world around us?





**Creativity in Language** (humans being creative when using language)

**Computational Creativity** (computers doing creative things)

# DETECTING SHAPES OF STORIES



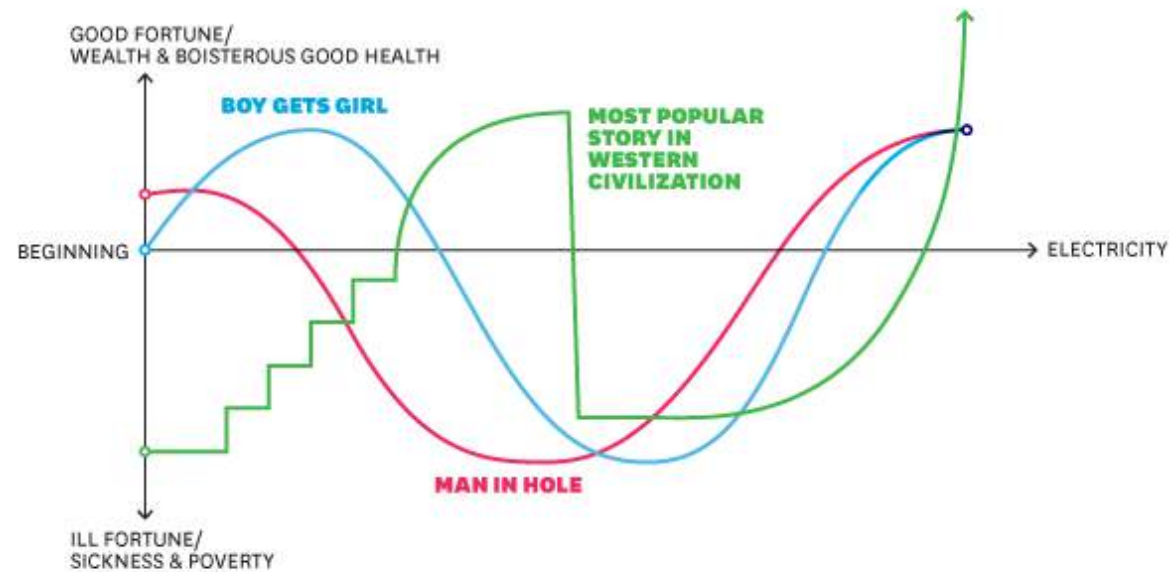


# Tracking Emotions in Stories

- Can we automatically track the emotions of characters?
- Are there some canonical shapes common to most stories?

## SIMPLE SHAPES OF STORIES

As told by Kurt Vonnegut.

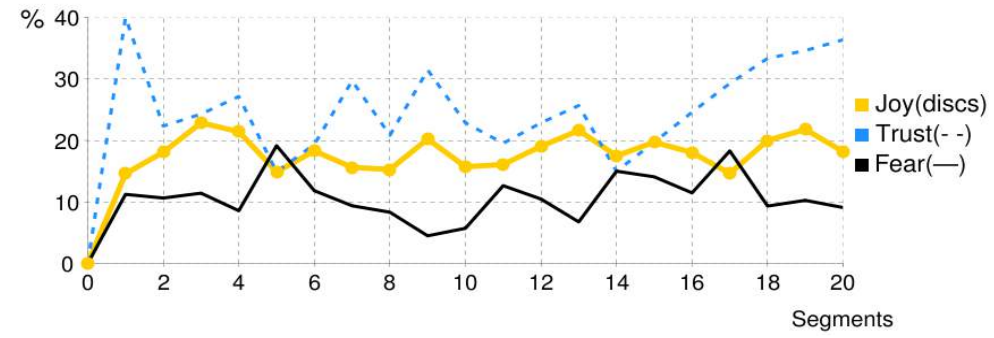


SOURCE DAVID YANG, VISUAL.LY

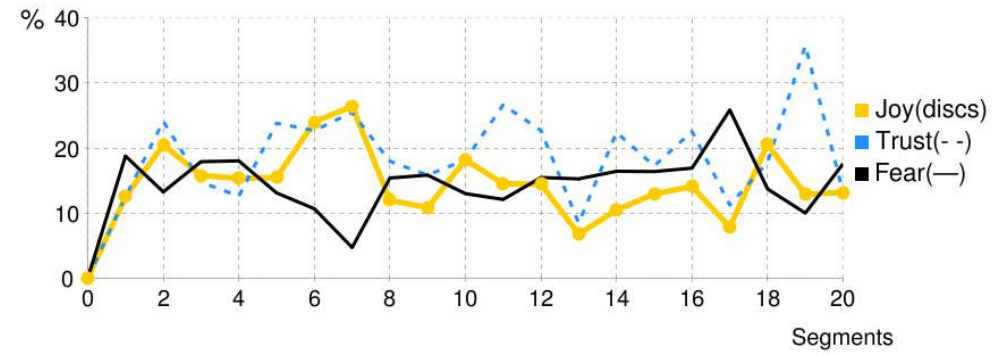
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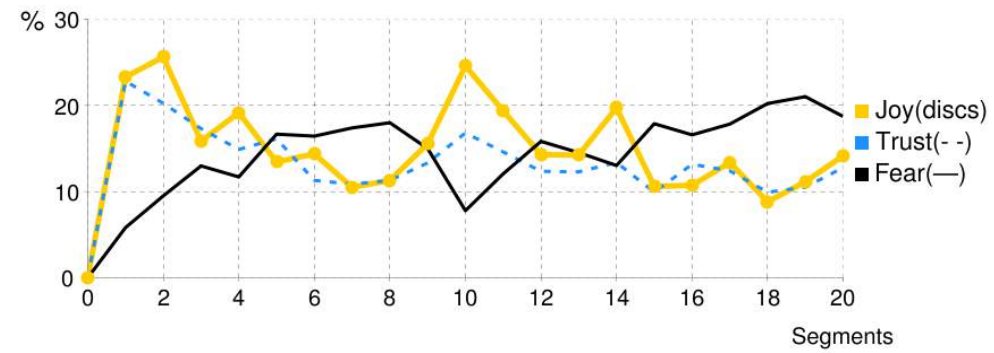
As You Like It

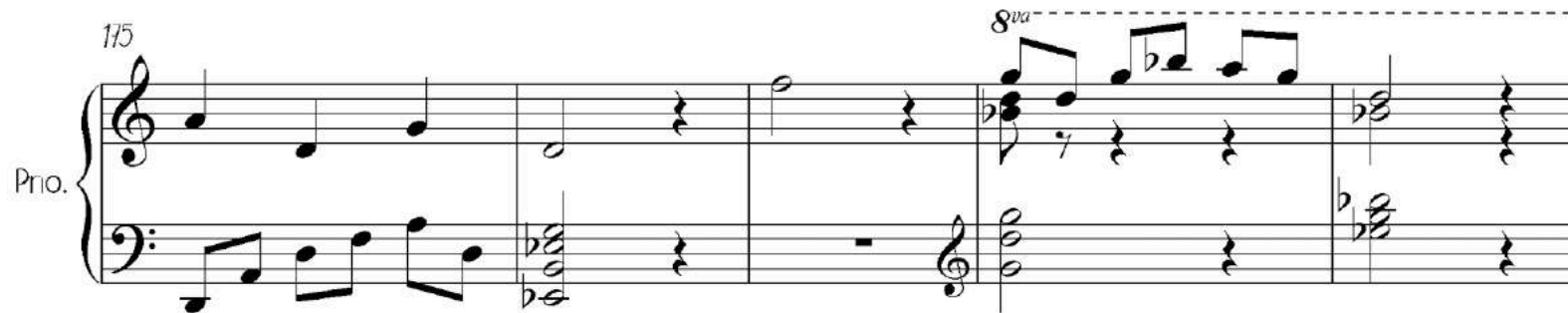
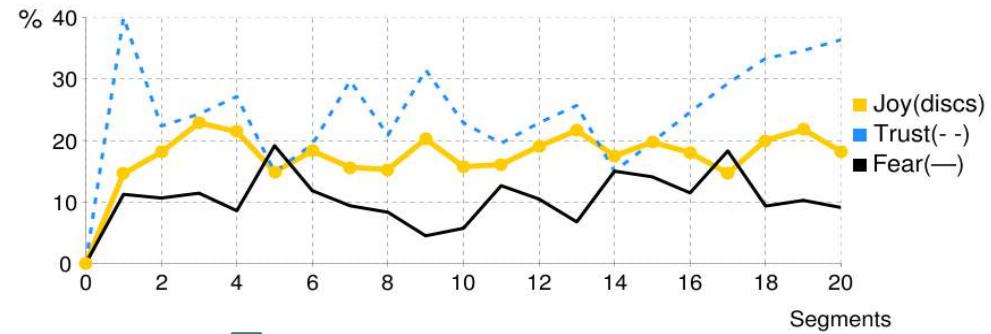
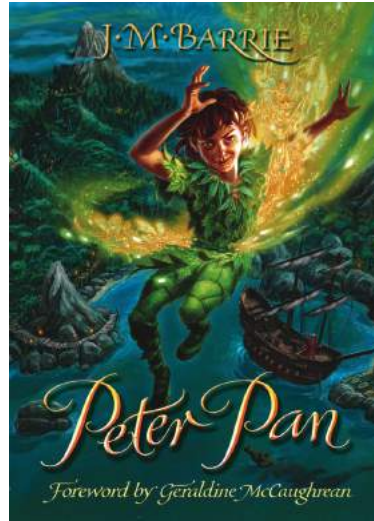


Hamlet



Frankenstein





A method to generate music from literature.

- music that captures the change in the distribution of emotion words.



# Music-Emotion Associations

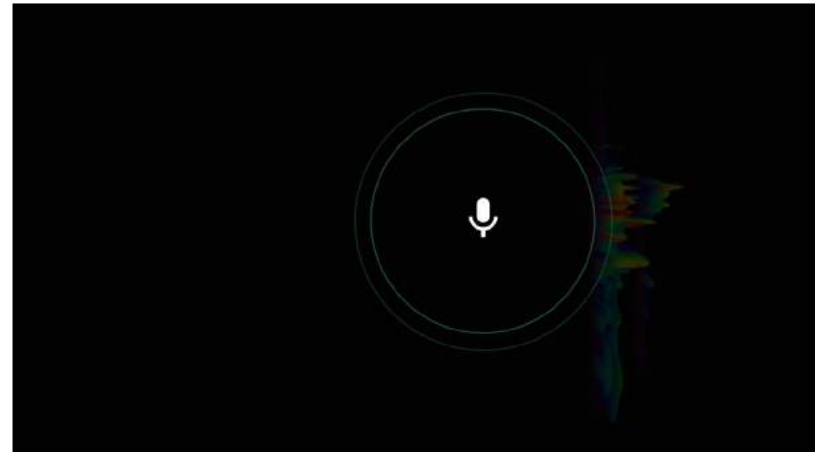
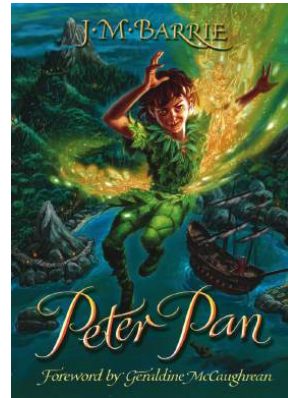
- Major and Minor Keys
  - major keys: happiness
  - minor keys: sadness
- Tempo
  - fast tempo: happiness or excitement
- Melody
  - a sequence of consonant notes: joy and calm
  - a sequence of dissonant notes: excitement, anger, or unpleasantness

Hunter et al., 2010, Hunter et al., 2008, Ali and Peynirciolu, 2010,  
Gabrielsson and Lindstrom, 2001, Webster and Weir, 2005

# TransProse

Automatically generates three simultaneous piano melodies pertaining to the dominant emotions in the text, using the NRC Emotion Lexicon.

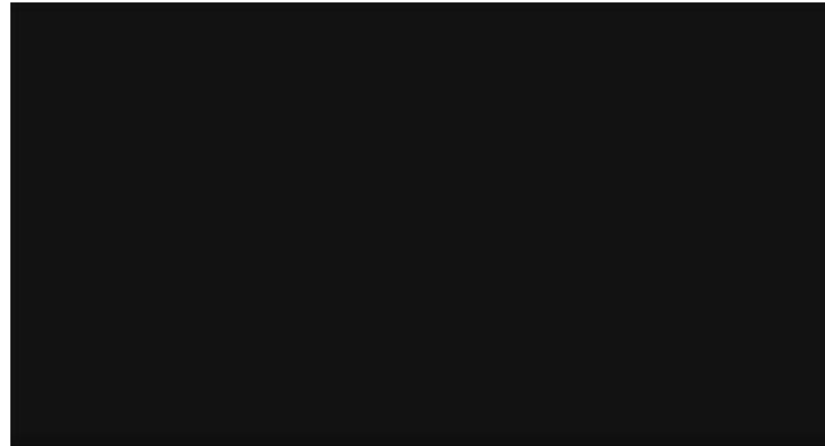
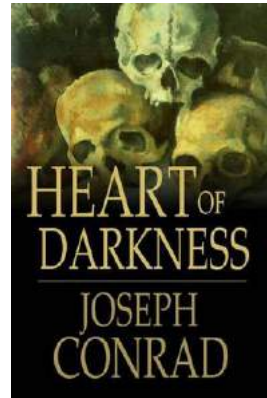
## Examples



# TransProse

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## Examples

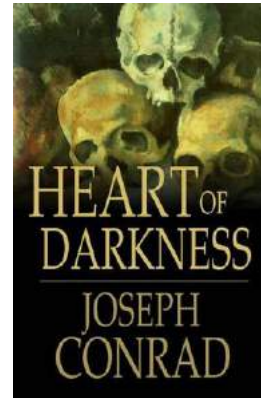
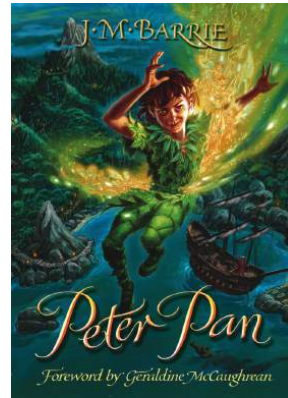




# TransProse

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## Examples



TransProse: [www.musicfromtext.com](http://www.musicfromtext.com)

Music played 300,000 times since website launched in April 2014.

# TransProse Music Played by an Orchestra, at the Louvre Museum, Paris



A symphony orchestra performs under the glass of the Louvre museum in Paris on Sept. 20. Accenture Strategy has created a symphonic experience enabled by human insight and artificial intelligence technology. (Michel Euler/AP)

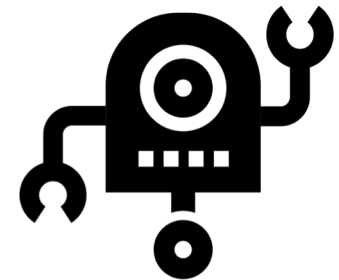
# Do Machines Make Fair Decisions?



YES:

- they do not take bribes
- they can make decisions without being influenced by the user's gender, race, or sexual orientation

And **NO**—recent studies have demonstrated that predictive models built on historical data may inadvertently inherit inappropriate human biases



Created by Oksana Latysheva  
from Noun Project

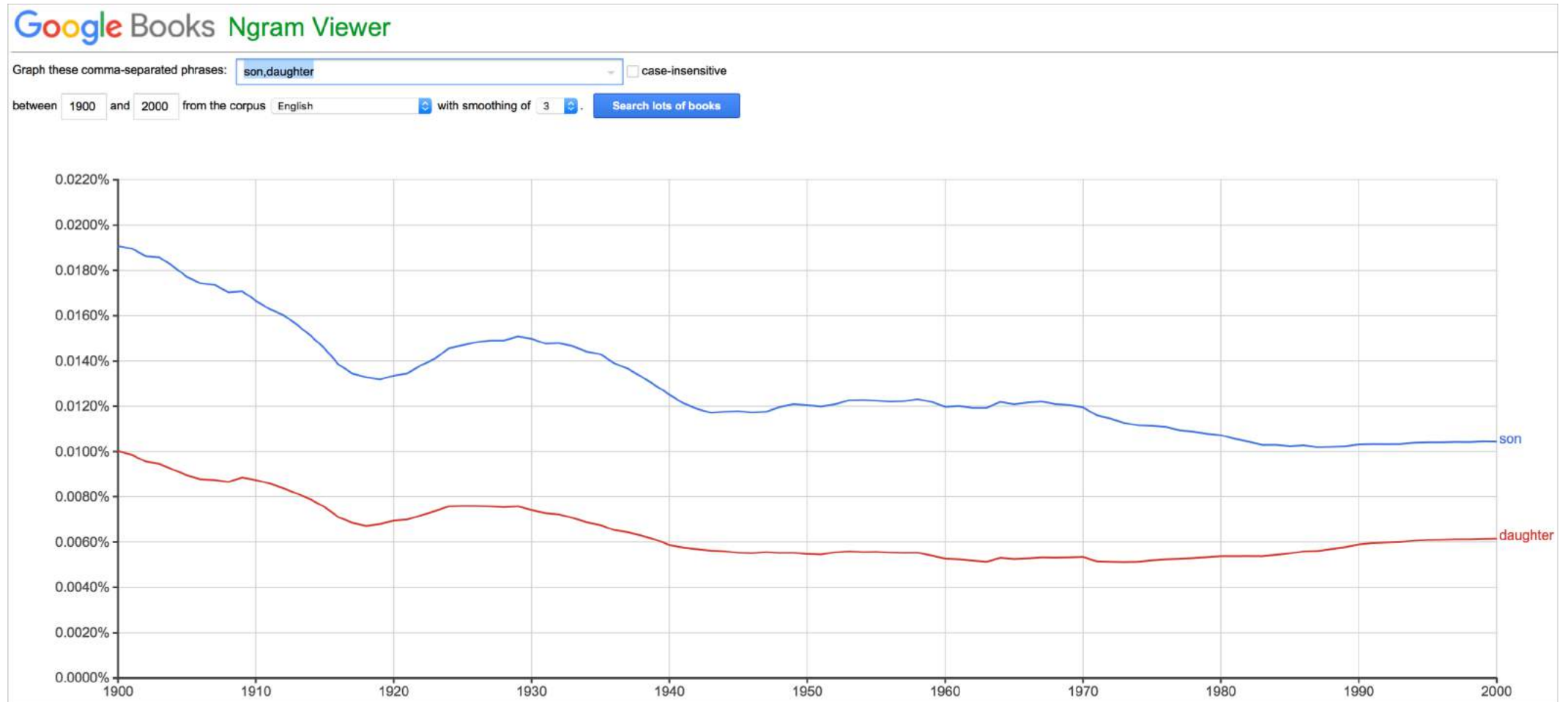


# Examples of Biased AI

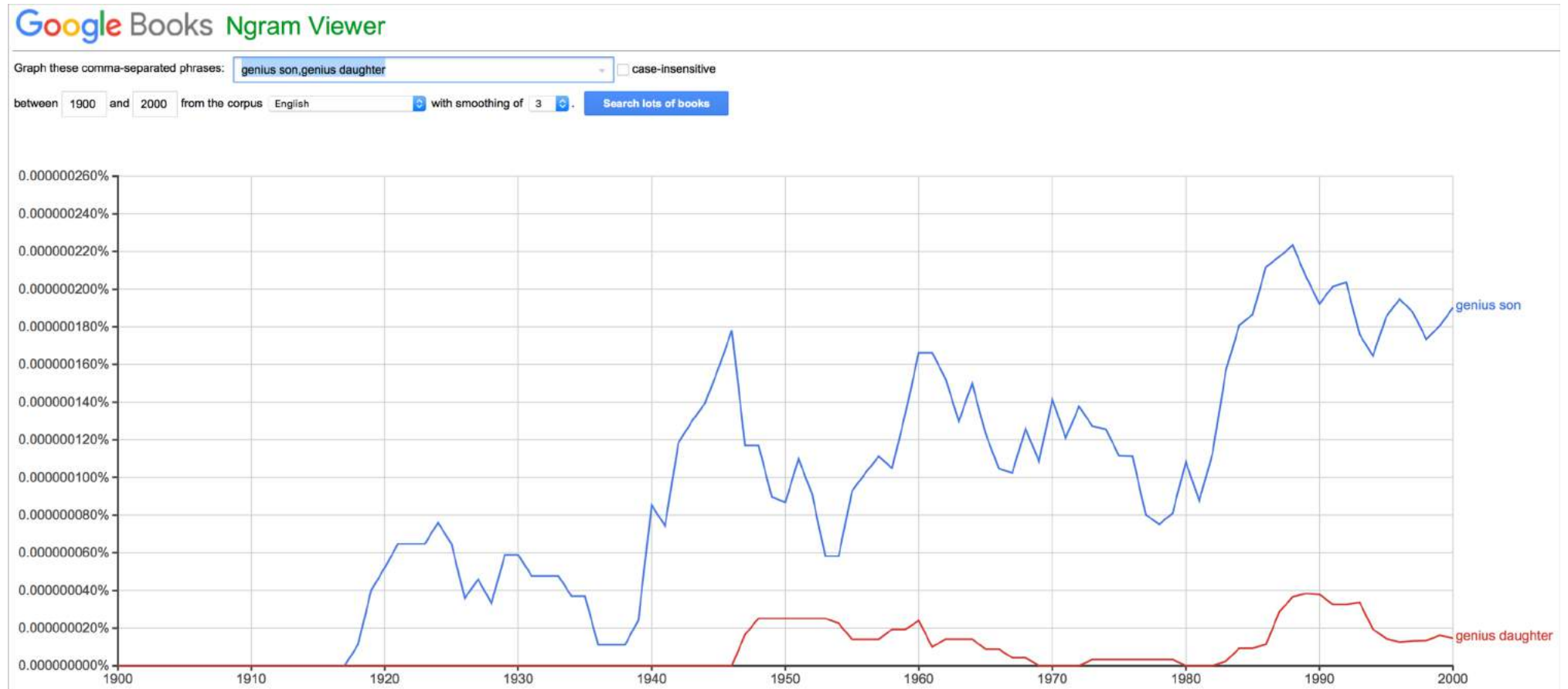


- Tay, Microsoft's racist chat bot posting inflammatory and offensive tweets
- Amazon's AI recruiting tool biased against women
  - penalized resumes that included the word "women's," as in "women's chess club captain."
- Face recognition systems good for detecting faces of white men, but really bad for African American women
- Sentiment analysis systems biased to show
  - text containing mentions of African American names to be more angry
  - text containing mentions of women too be more emotional

## Occurrences of “son” and “daughter” in the Google Books Ngram corpus



## Occurrences of “genius son” and “genius daughter” in the Google Books Ngram corpus





# Our Work

- Measuring inappropriate biases in AI systems and language
- Developing algorithms to prevent and mitigate inappropriate biases

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