

background

- >> Word embeddings are an important tool for natural language processing.
- >> Certain categories of words have a stronger association with male words than female words or the other way around.
- >> Wikipedia has less than 15% female editors
- >> Gender bias decreased from 1800 to 2000, but after that it is unknown

1

importance

- >> Bias in word embeddings can cause bias in machine translation or bias in search results and potentially in many other downstream applications.

TURKISH - DETECTED ↔ ENGLISH

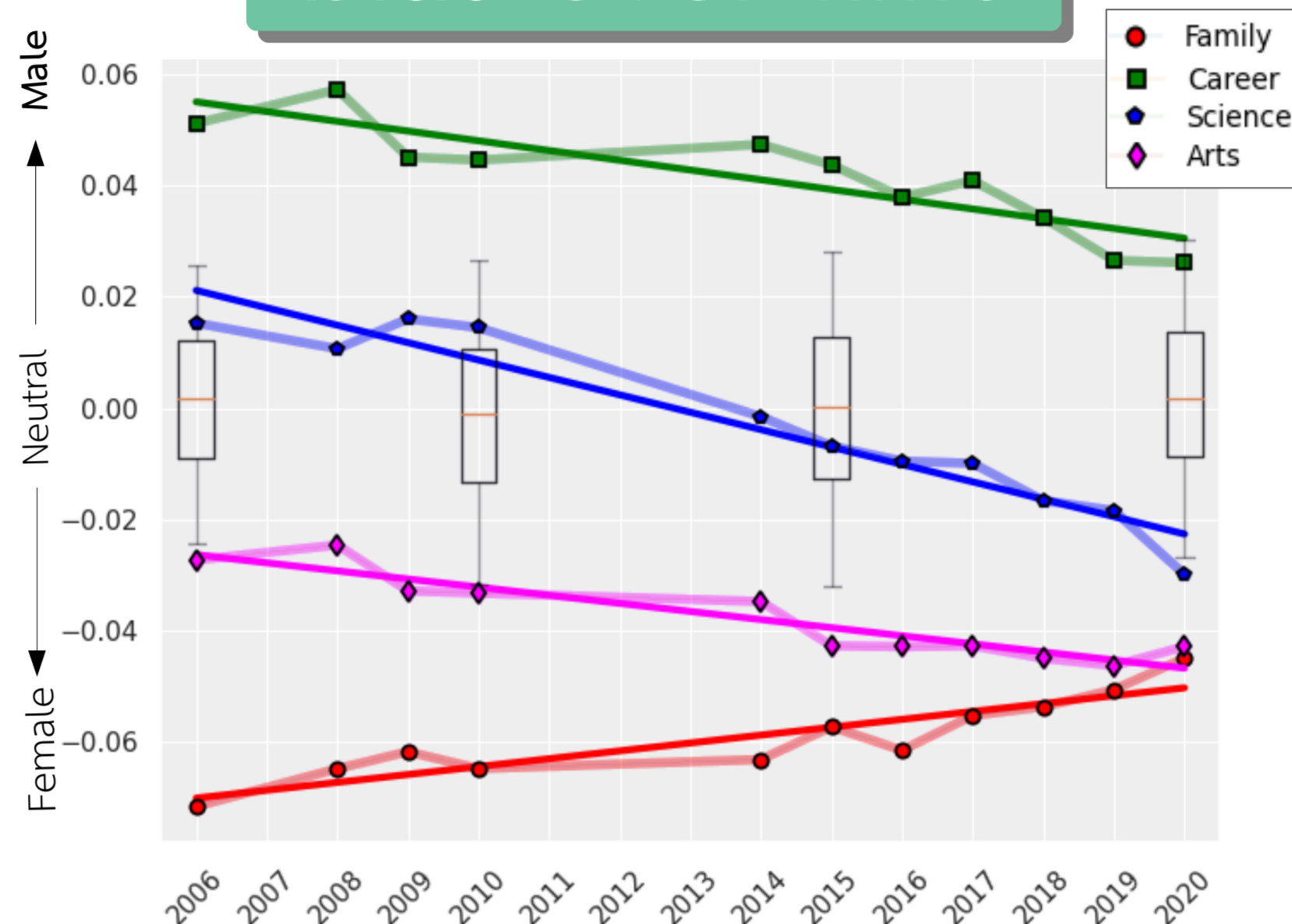
o bir yönetici
o bir hemşire
o bir bilim adamı

he is a manager
she is a nurse
he is a scientist

source: google.translate.com

2

bias over time



5

>> The box-plots show the quartiles and 5th/95th percentiles of random words for comparison

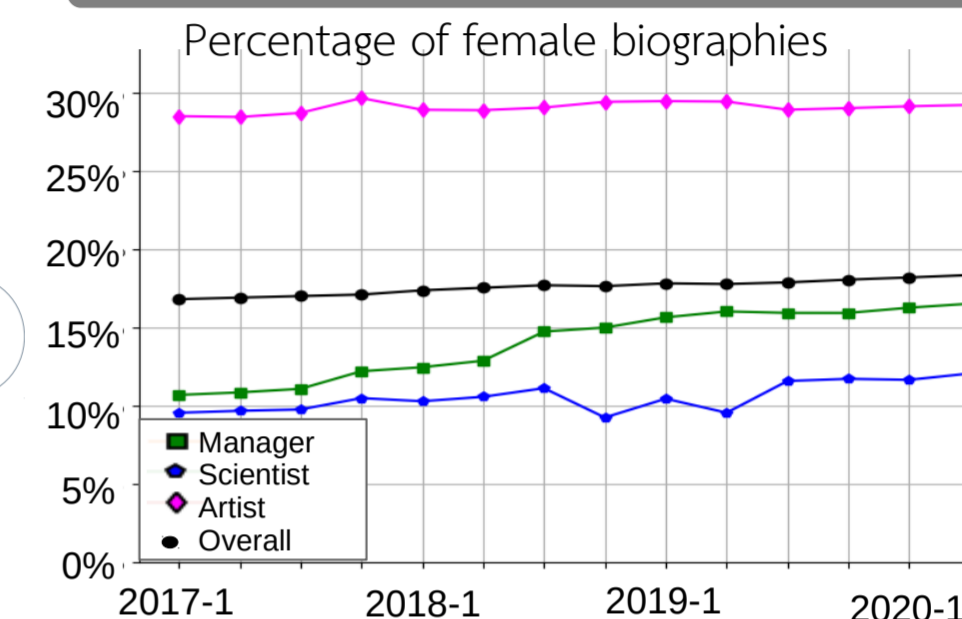
conclusion

Category	p-value
Career	$4.37 \cdot 10^{-4}$
Science	$1.91 \cdot 10^{-6}$
Family	$1.43 \cdot 10^{-4}$
Arts	$2.42 \cdot 10^{-5}$

6

- Family** >> Stereotypically female biased, especially marriage, wedding and children, has decreased over time.
- Career** >> Stereotypically male biased which has decreased.
- Science** >> Used to be male biased, but reversed and has an increased female bias, despite only 12% female scientists biographies. Possibly due to the principle of default gender: describing men as ‘scientist’, women as ‘female scientist’.
- Arts** >> Female bias that has increased since 2006.

biographies



3

- >> Less than 19% of Wikipedia biographies is female
- >> The Artist occupation has a lot higher % female

computation

Using category set C, male set M and female set F:
 >> $bias(C,F,M) = mean_{c \in C} (assoc(c, M) - assoc(c, F))$
 >> $assoc(w, A) = mean_{a \in A} (cos(w, a))$

- Career** Executive, management, professional, corporation, salary, office, business, career
- Family** Home, parents, children, family, cousins, marriage, wedding, relatives
- Arts** Poetry, art, dance, literature, novel, symphony, drama, sculpture, Shakespeare
- Science** Science, technology, physics, chemistry, Einstein, NASA, experiment, astronomy
- Female** She, her, woman, female, girl, daughter, sister, mother, aunt, lady
- Male** He, his, man, male, boy, son, brother, father, uncle, gentleman

4