
Uncovering the Scientific Impact of Women at the Smithsonian Using Machine Learning

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Photo of Vicki Funk by Mauricio Diazgranados

AWHI Science Women Spreadsheet

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1	SI UNIT	WIKIPEDIA PAGE	WIKIPEDIA PAGE NEEDS IMPROVEMENT?	NAME	WIKIPEDIA ST
22	NMNH	y		Archambault, JoAllyn	Done
23	NMNH	y	y	Piperno, Dolores	Done
24	NMNH	y	y	Bruwelheide, Kari	Done
25	NMNH	y	y	Zeder, Melinda	Melina Zeder is a
26	NMNH	n		Báez, Gabriela Pérez	Gabriela Pérez B
27	NMNH	n		Sholts, Sabrina	Sabrina Sholts is
28	NMNH	n		Arnoldi, Mary Jo	Mary Jo Arnoldi i
29	NMNH	y	y	Greene, Candace	Done
30	NMNH	n		Isaac, Gwyneira	Gwyneira Isaac is
31	NMNH	y		Kaeppeler, Adrienne	Done
32	NMNH	n		Scherer, Joanna	Joanna Scherer is
33	NMNH	n		Stirling, Marion	Marion Stirling w
34	NMNH	y	y	Walsh, Jane	Done
35	NMNH	n		Watanabe, Barbara	Barbara Watanat
36	NMNH	y		Stevenson, Matilda	Done
37				

+ Sheet1

The Funk List

The Funk List includes more than 400 current and past Smithsonian women in science

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From left to right: Vicki Funk, Sophie Lutterlough, and Jessie Cohen

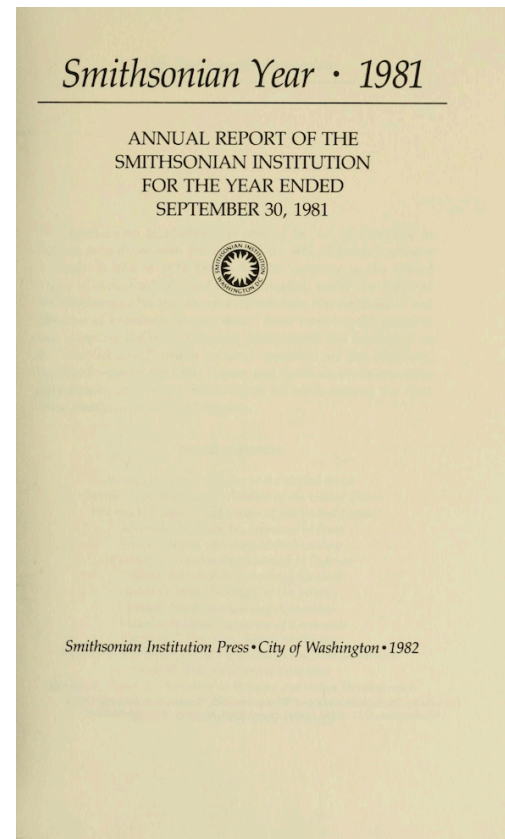
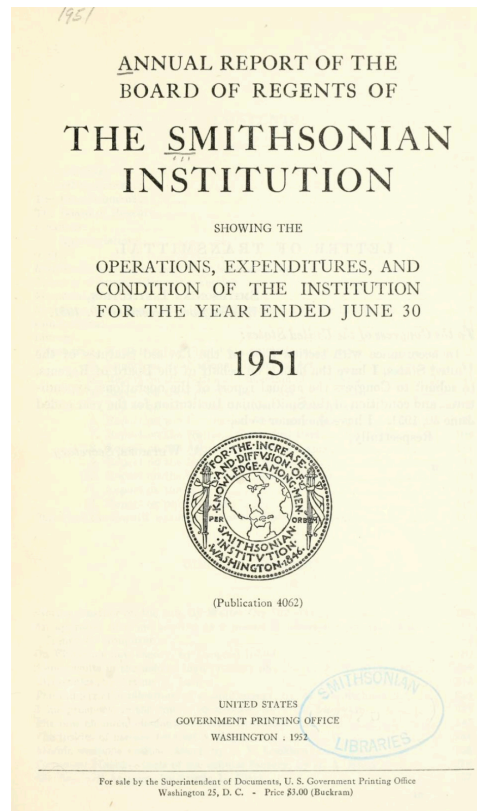
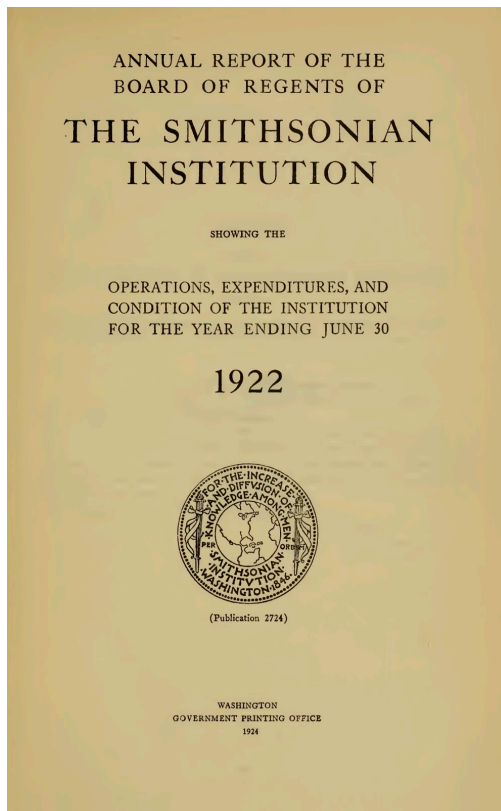
How do we measure scientific impact?

- Publications
- Service
- Collections
- Public outreach

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Machine learning tools can help us connect women on the Funk List to Smithsonian archives and collections data to help us better understand their scientific impact.



Smithsonian Annual Reports

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Funk, Vicki A. 2019. "James Lee Zarucchi (1952-2019)." *Taxon* 68 (5):1143–1144. <https://doi.org/10.1002/tax.12136>

Funk, Vicki A. 2019. "The 2018 Nicolson Fellow: Targol Chatreoor: Targol Chatreoor is preparing a monograph of the genus *Climacoptera* and a phylogeny of *Caroxyleae* (*Chenopodiaceae*)." *Taxon* 68 (1):178–179. <https://doi.org/10.1002/tax.12018>

Jones, Katy E., Fér, Tomáš, Schmickl, Roswitha E., Dikow, Rebecca B., Funk, Vicki A., Herrando–Moraira, Sonia, Johnston, Paul R., Kilian, Norbert, Siniscalchi, Carolina M., Susanna, Alfonso, Slovák, Marek, Thapa, Ramhari, Watson, Linda E., and Mandel, Jennifer R. 2019. "An empirical assessment of a single family-wide hybrid capture locus set at multiple evolutionary timescales in *Asteraceae*." *Applications in Plant Sciences* 7 (10):Article e11295. <https://doi.org/10.1002/aps3.11295>

More...

Kelloff, Carol L., Funk, Vicki A., and Alexander, Sara N. 2019. *Smithsonian Plant Collections, Guiana Shield: 1985 - 2014, Biological Diversity of the Guiana Shield Collections*. Washington, DC: Smithsonian Institution Scholarly Press. <https://doi.org/10.5479/si.1938-2812.110>

Mandel, Jennifer R., Dikow, Rebecca B., Siniscalchi, Carolina M., Thapa, Ramhari, Watson, Linda E., and Funk, Vicki A. 2019. "A fully resolved backbone phylogeny reveals numerous dispersals and explosive diversifications throughout the history of *Asteraceae*." *Proceedings of the National Academy of Sciences of the United States of America* 116 (28):14083–14088. <https://doi.org/10.1073/pnas.1903871116>

More...

Sample search for publications by Vicki Funk

SRO – Smithsonian Research Online

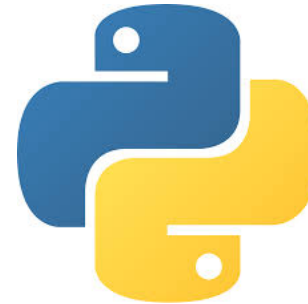
Smithsonian
Libraries

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Methods

- Used a combination of Natural Language Processing in **spaCy** and shell scripting to:
 - Extract and count mentions of women on the Funk List in Annual Reports
 - Count publications for women on the Funk List from Smithsonian Research Online
 - Extract and count occurrences first names and words related to science in the Annual Reports



William J. Bennett **PERSON** , Secretary of **Education** **ORG**

John S. Herrington **PERSON** , Secretary of **Energy Board of Regents** **ORG**

Warren E. Burger **PERSON** , Chief Justice of **the United States** **GPE** ,

ex officio , Chancellor

George H. W. Bush **PERSON** , Vice President of **the United States** **GPE** , ex

officio

Edwin J. **PERSON** (**Jake**) Garn **PERSON** , Senator from **Utah** **GPE**

Barry Goldwater **PERSON** , Senator from **Arizona** **GPE**

James R. Sasser **PERSON** , Senator from **Tennessee** **GPE**

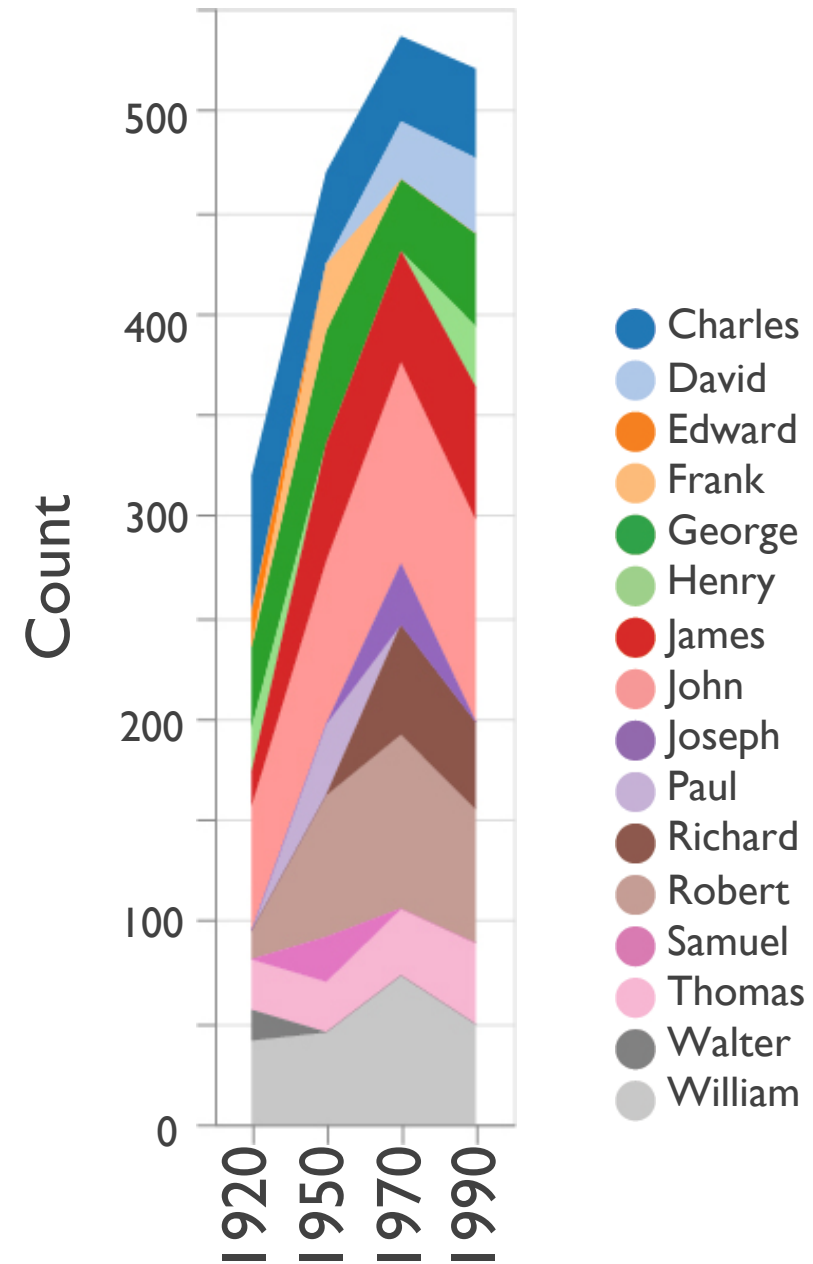
A portion of the 1985 Annual Report - this section lists the members of the Board of Regents

NER – Named Entity Recognition

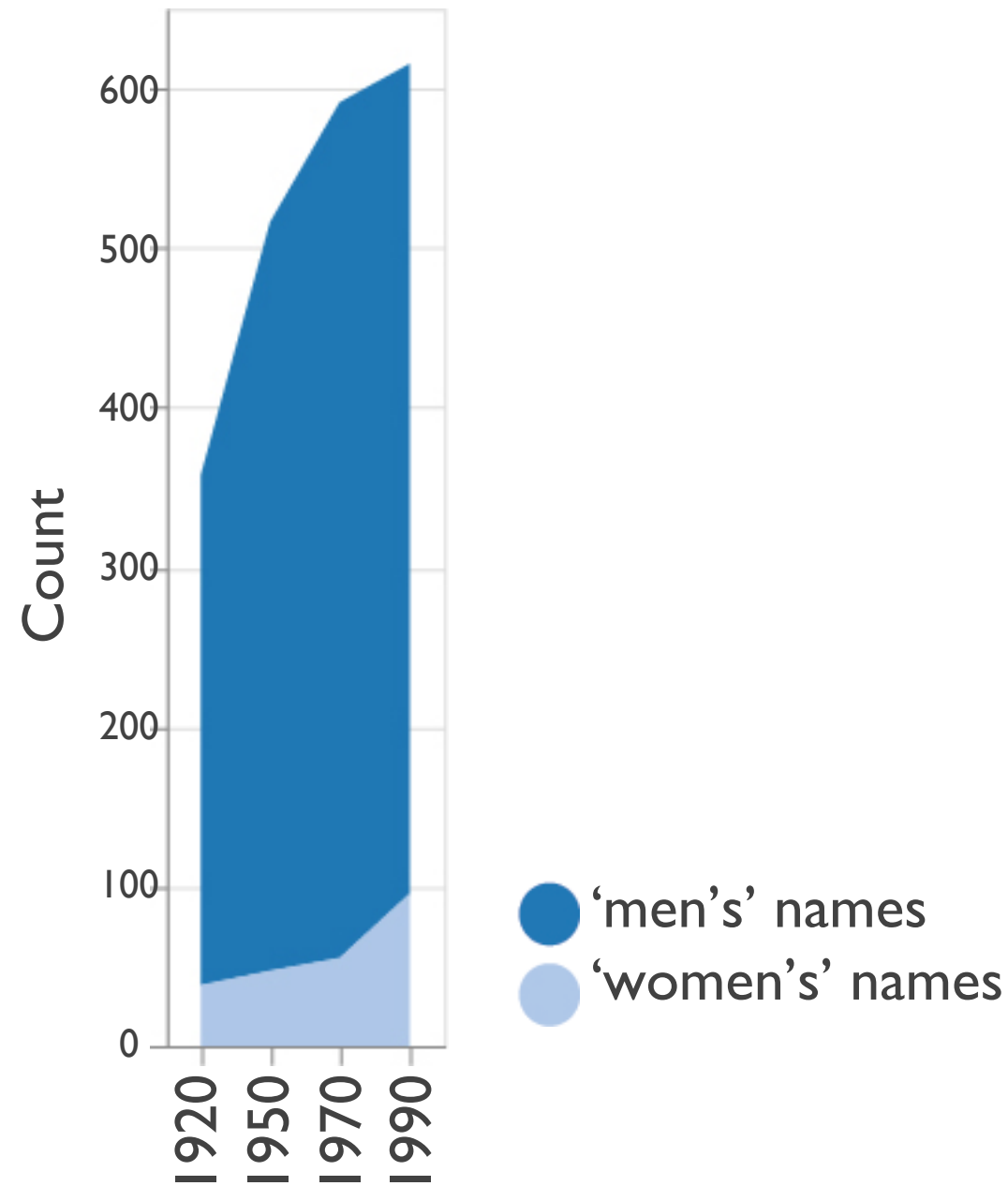
Methods

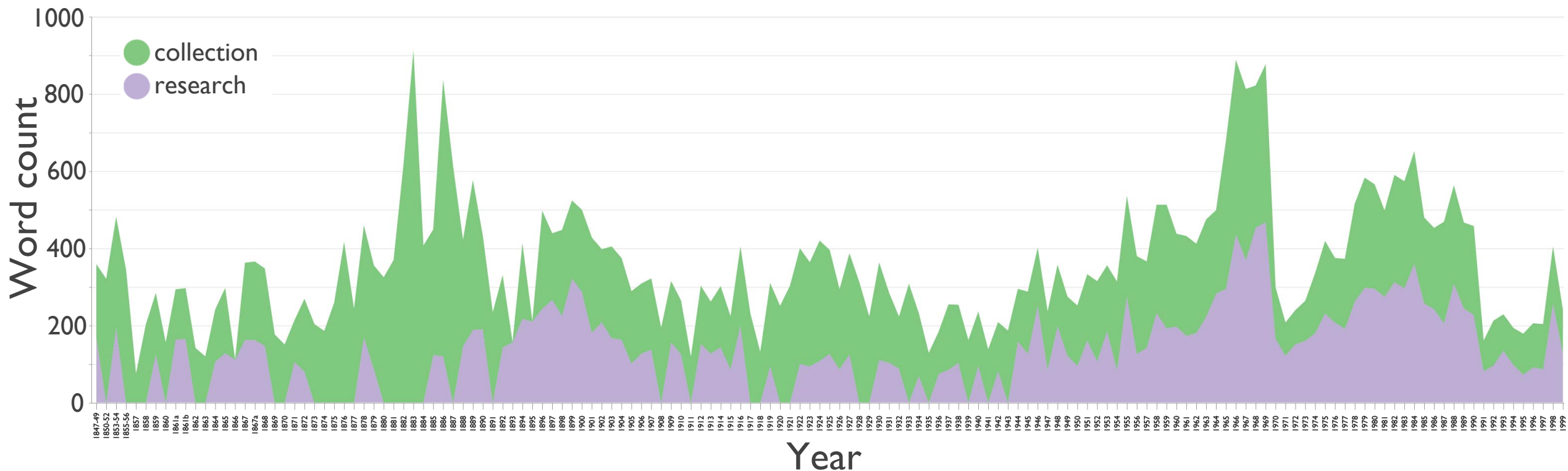
- Included all women from the Funk List no longer at the Smithsonian – 127 total
- Analyzed Annual Reports from 1846-1999
- Downloaded all citations from SRO

Count of mentions of 10 most common first names in four Annual Reports



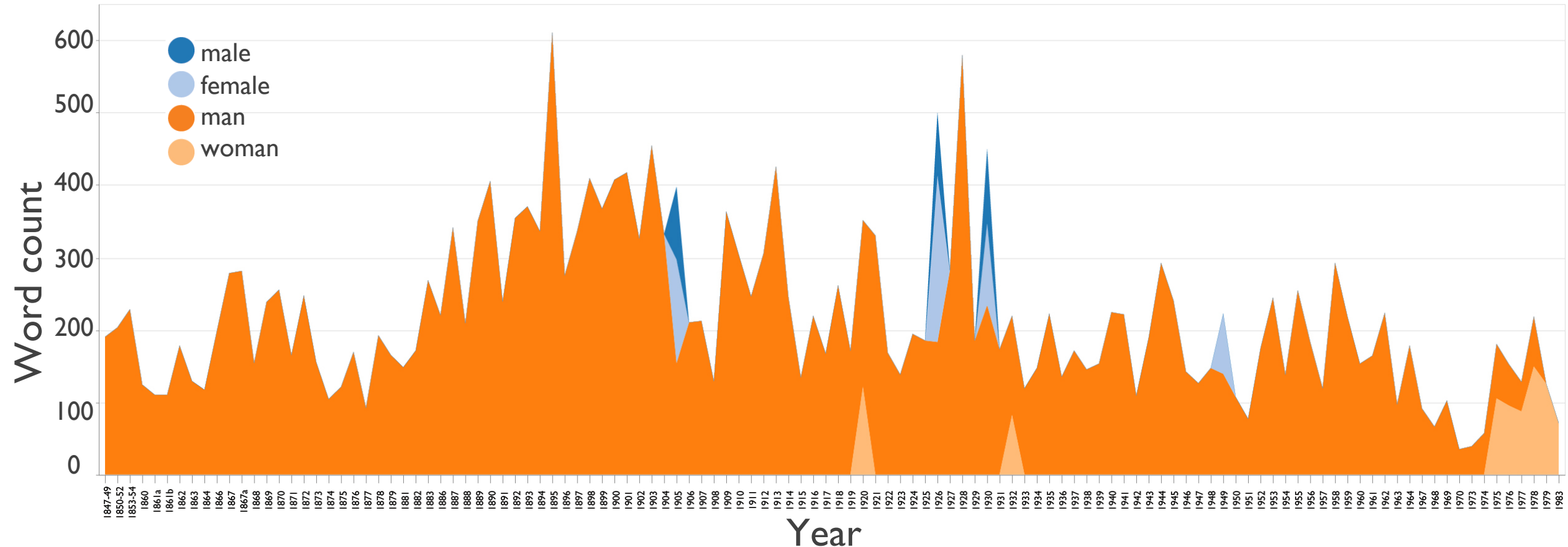
Count of mentions of 10 most common 'men's' and 'women's' first names in four Annual Reports





Annual Report word counts through time

Mentions of the words:
research and collection

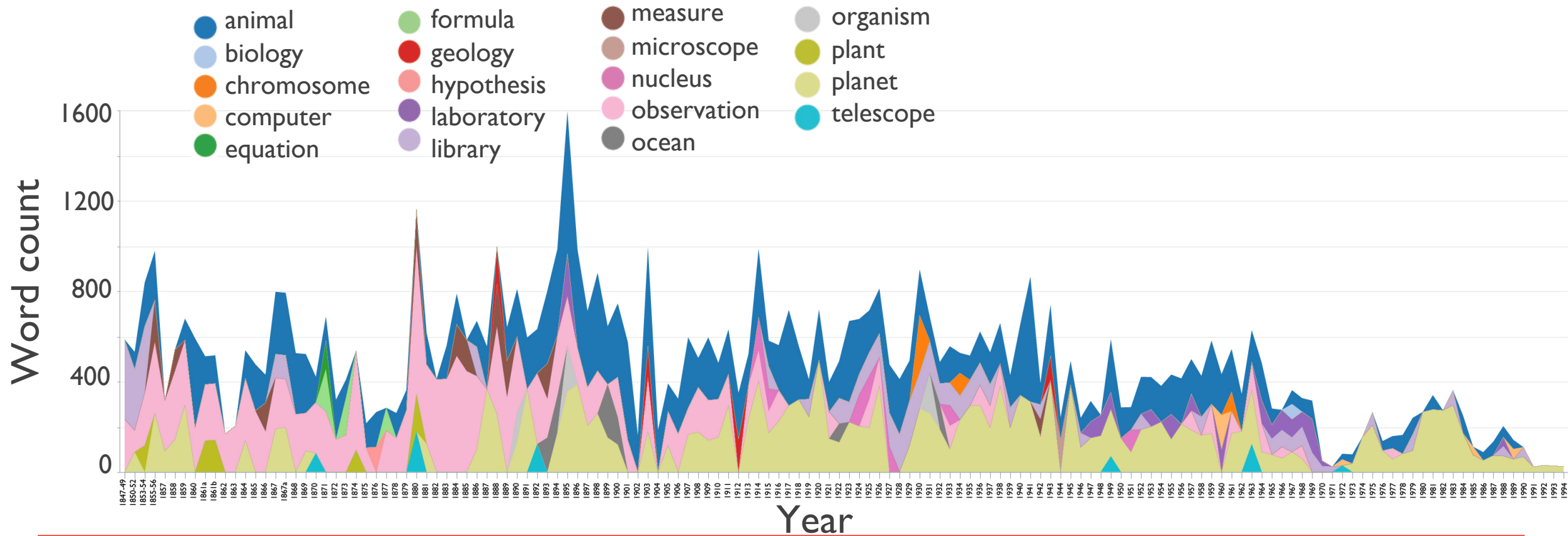


Annual Report word counts through time

Mentions of the words: man, male, women, and female

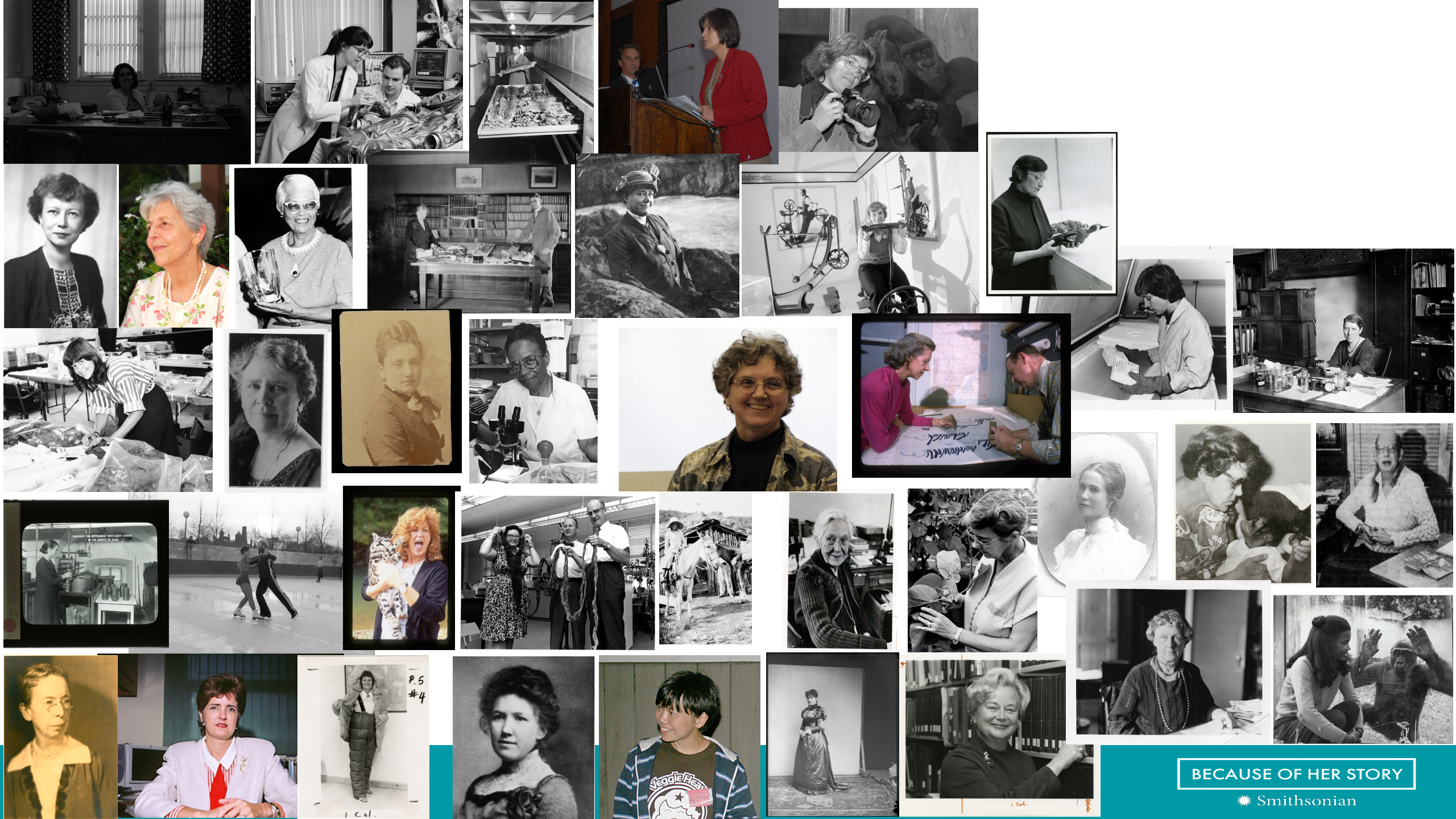
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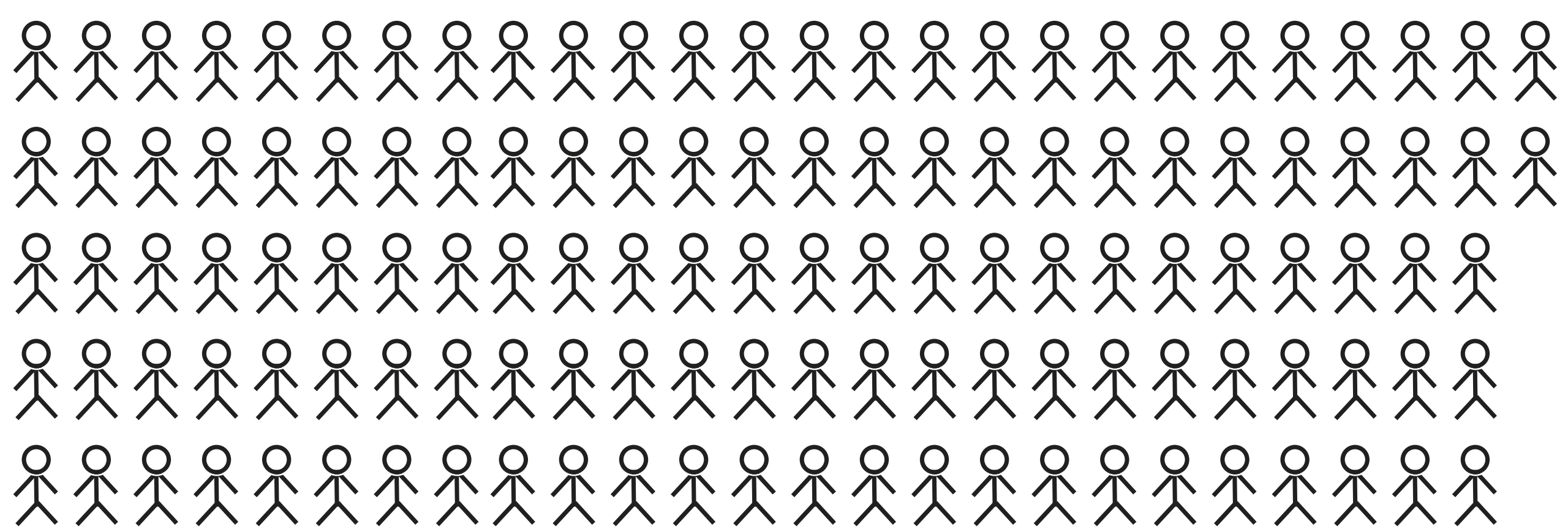
Annual Report word counts through time

Mentions of some common science words



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**How many times was each
woman mentioned?**

Zero

Between 2
and 10

Between
26 and
50

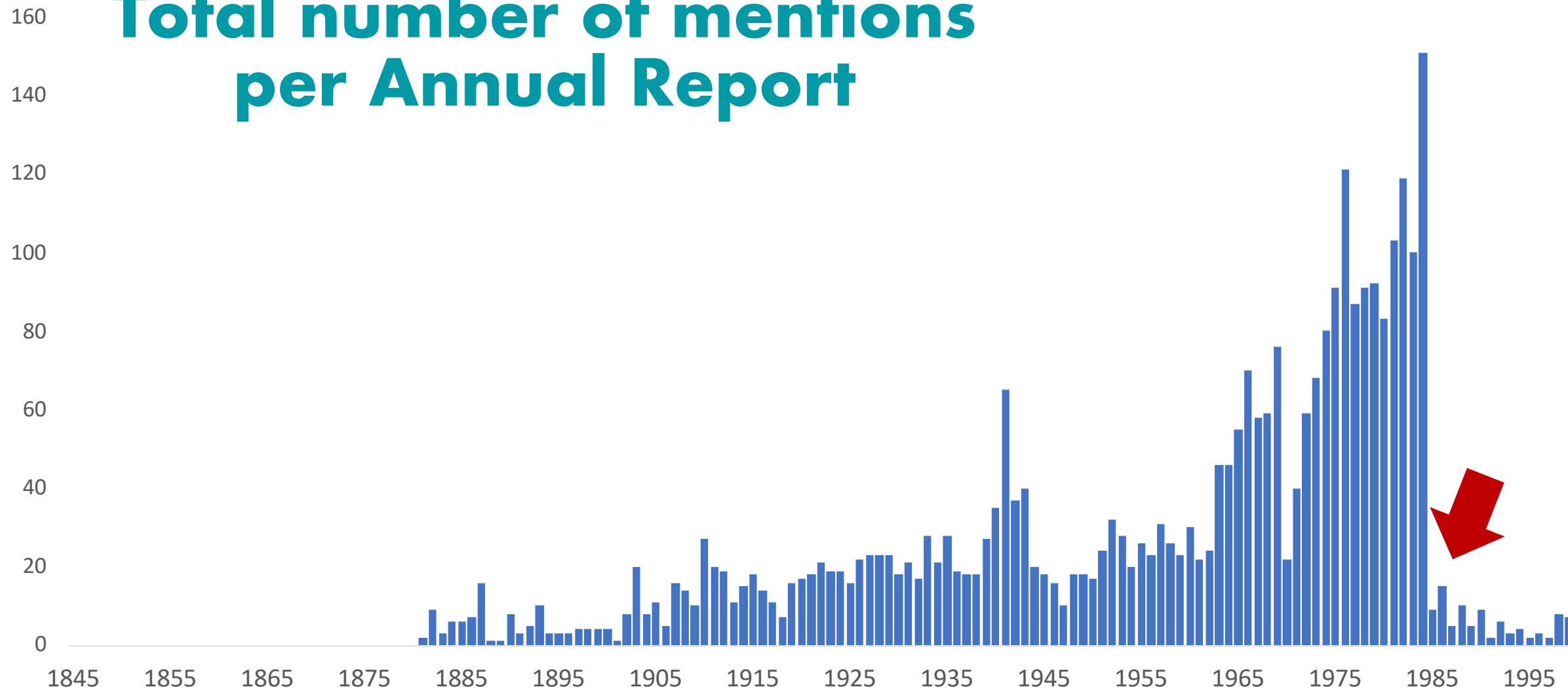
Once

Between 11
and 25

More
than 50

How many times was each woman mentioned?

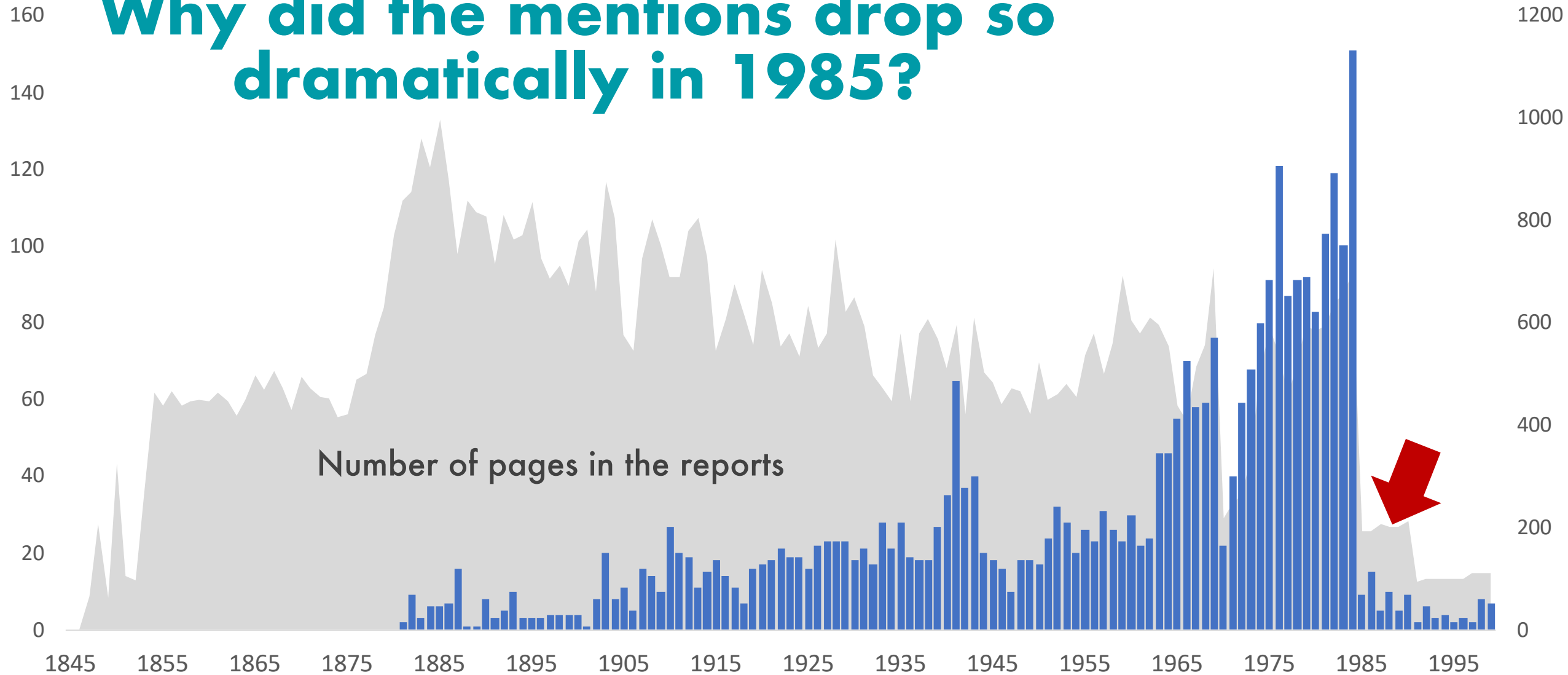
Total number of mentions per Annual Report



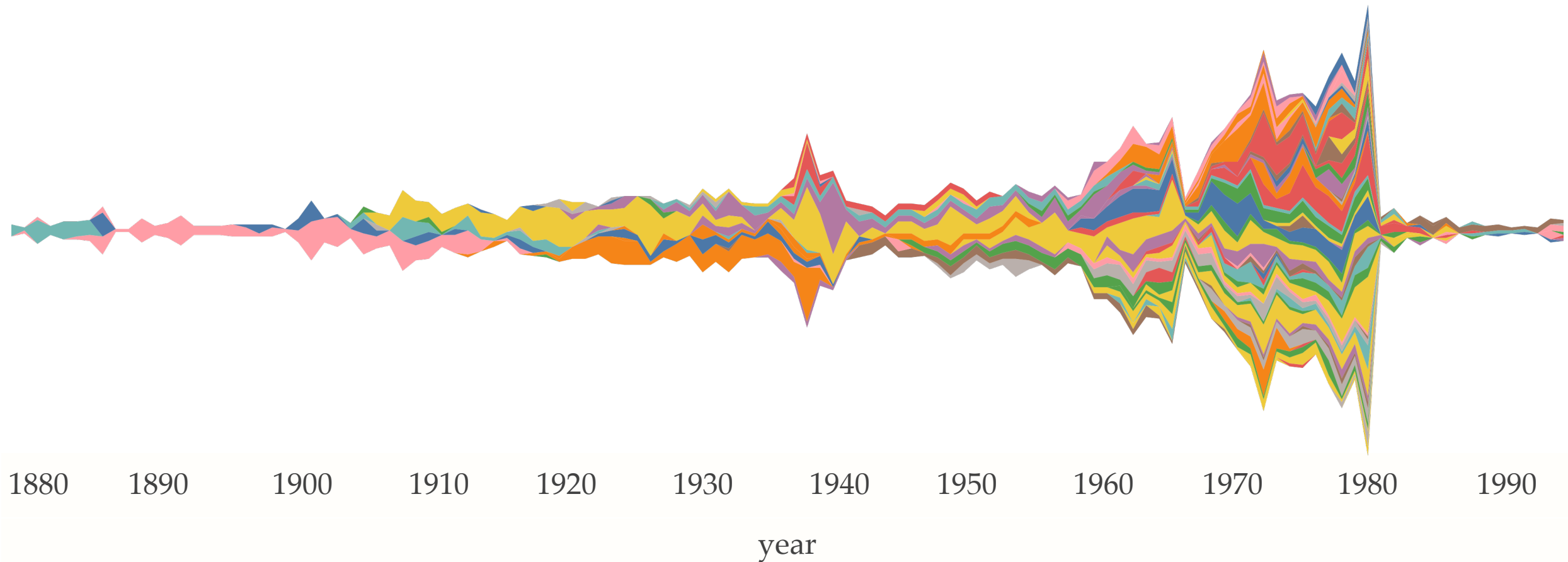
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Why did the mentions drop so dramatically in 1985?



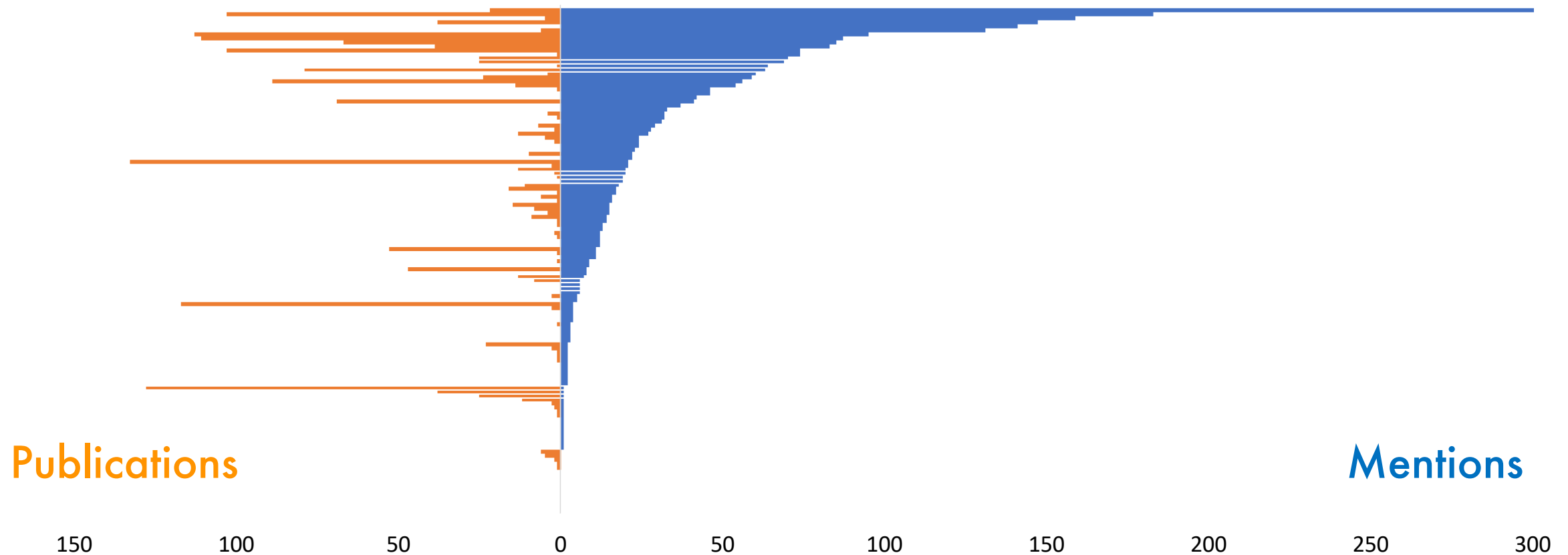
How many women are represented in each year?



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Number of mentions in the report do not correspond to scientific publications



Publications

Mentions

Number of mentions in the report do not correspond to scientific publications



Betty Jane Meggers
NMNH

Tenure: 1954-2012

Mentions: 183

Publications: 103



Frances Theresa Densmore
NMNH

Tenure: 1907-1957

Mentions: 330

Publications: 22



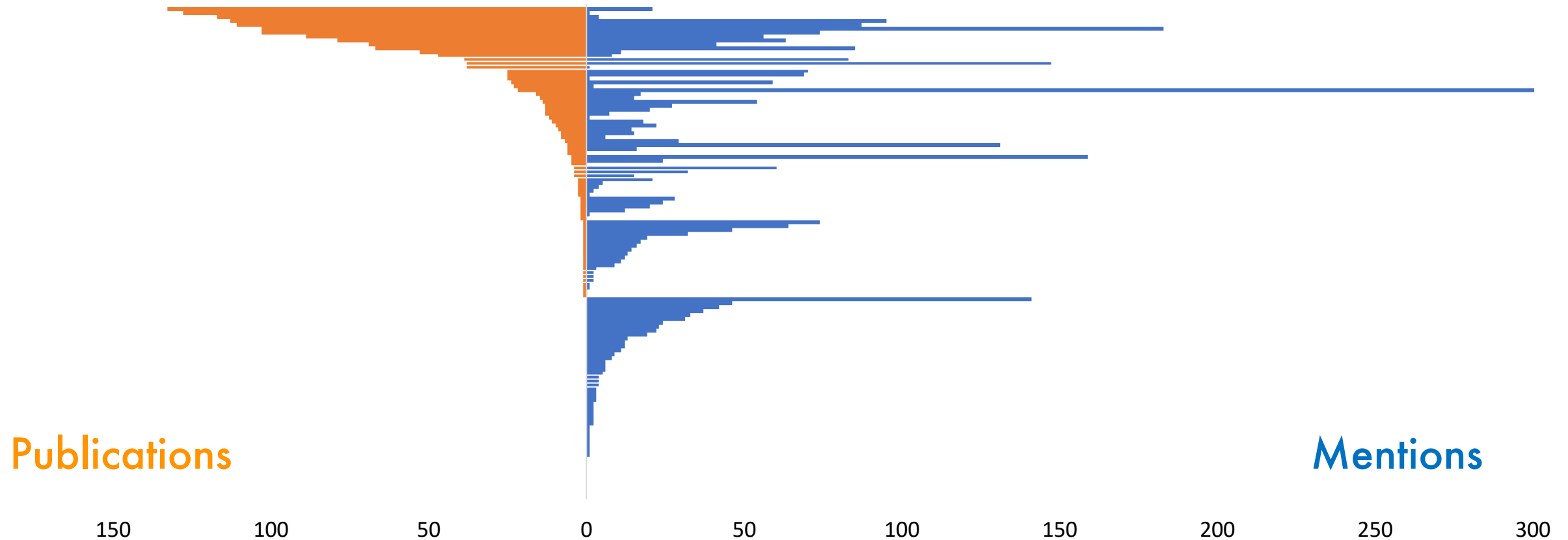
Matilda C. (Evans) Stevenson
NMNH

Tenure: 1889-1915

Mentions: 159

Publications: 5

Number of mentions in the report do not correspond to scientific publications



Number of mentions in the report do not correspond to scientific publications



JoGayle Howard
NZP/SCBI
Tenure: 1994-2011
Mentions: 4
Publications (until 1999): 117

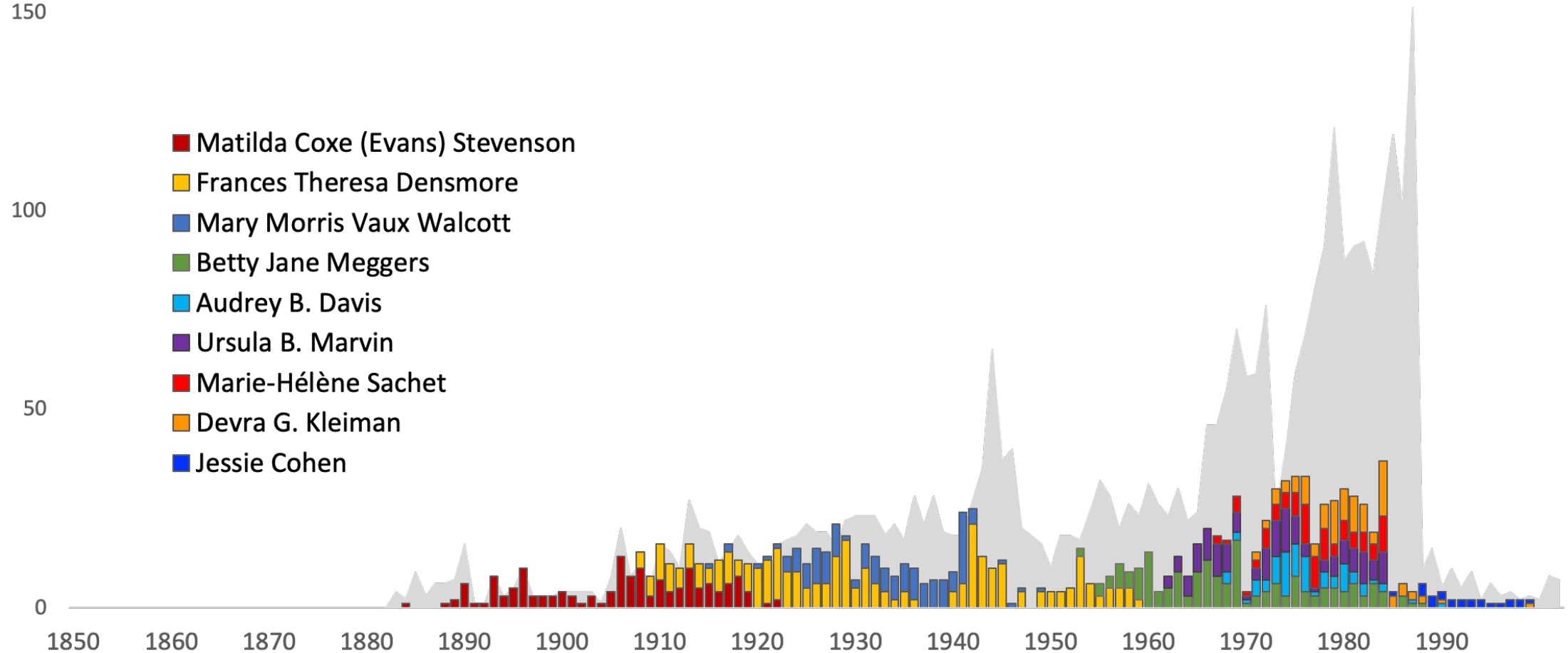


Vicki A. Funk
NMNH
Tenure: 1981-2019
Mentions: 21
Publications (until 1999): 133

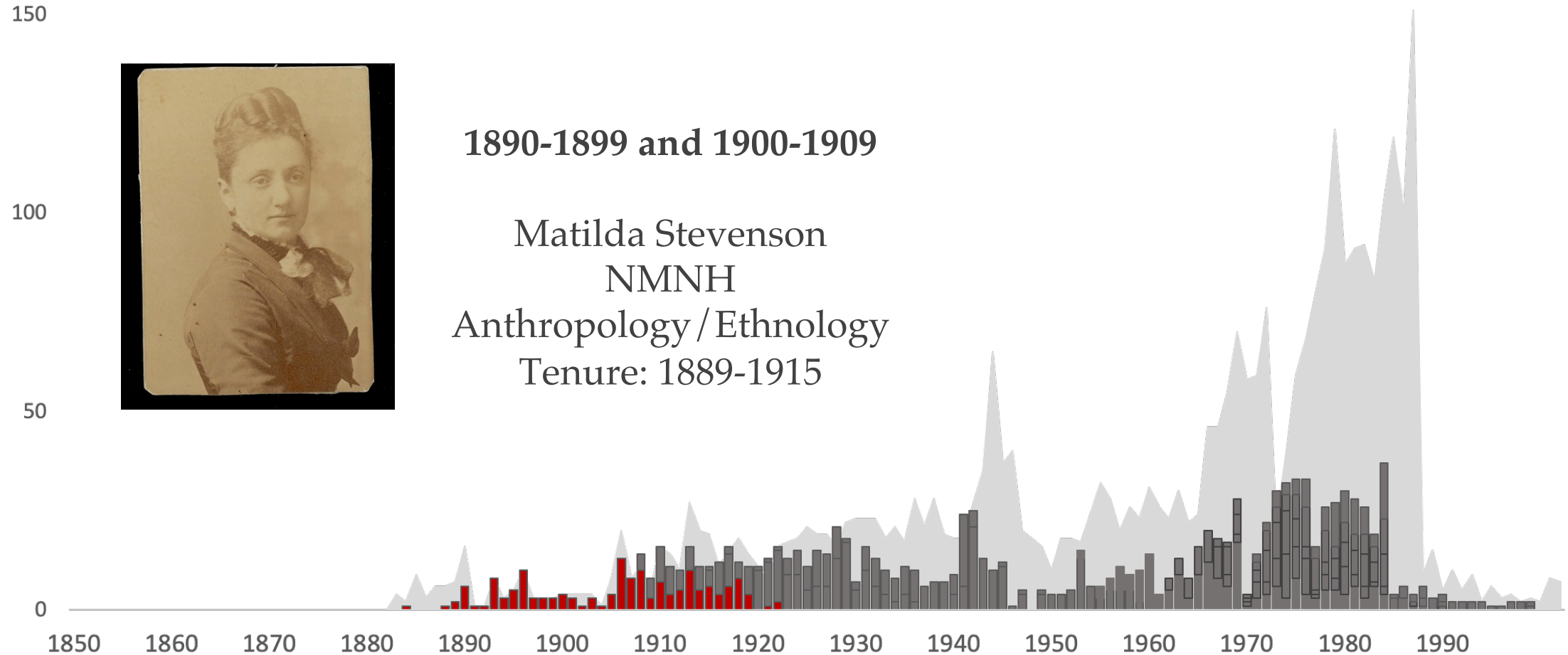


Pamela B. Vandiver
MCI
Tenure: 1985-2003
Mentions: 1
Publications: 128

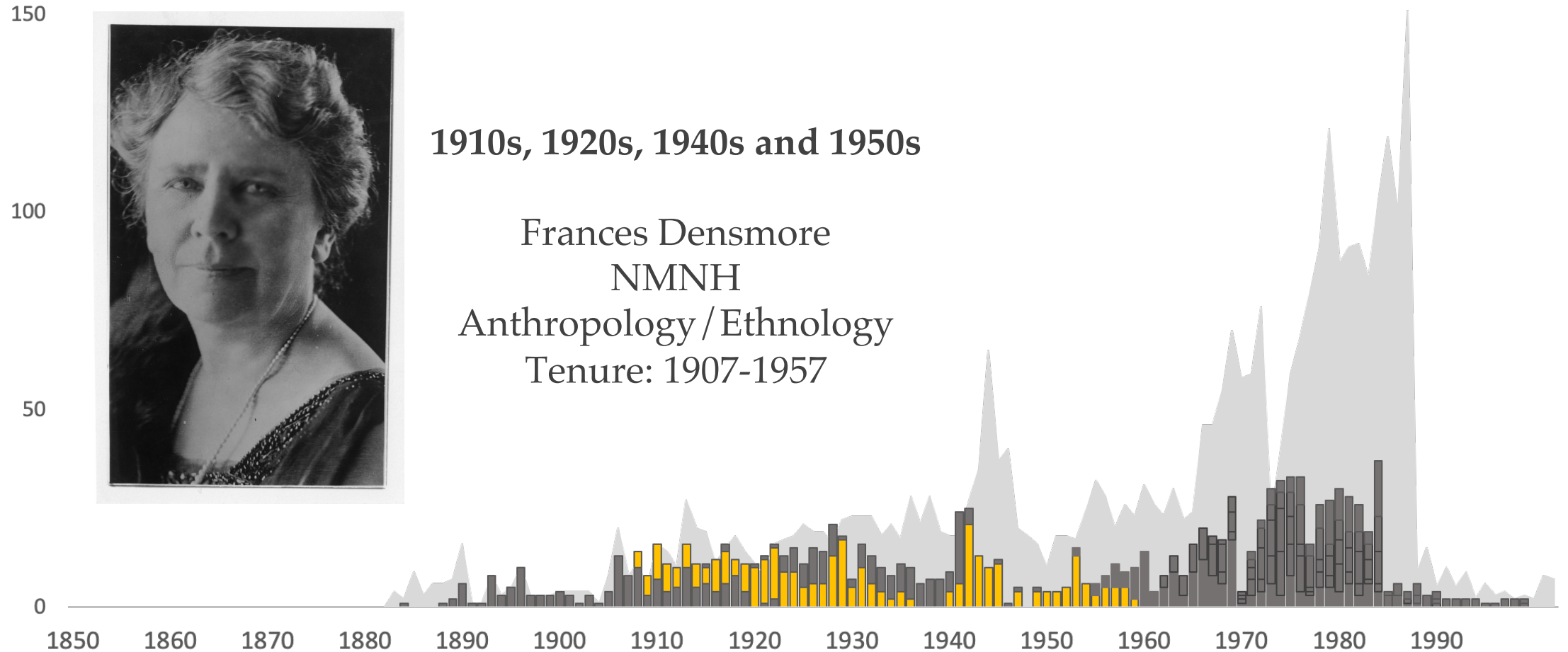
Who are the most-mentioned women in each decade?



Who are the most-mentioned women in each decade?



Who are the most-mentioned women in each decade?



Who are the most-mentioned women in each decade?

150

100

50

0



1930s

Mary Vaux Walcott
NMNH
Botanical Illustration
Tenure: 1914-1940

1850 1860 1870 1880 1890 1900 1910 1920 1930 1940 1950 1960 1970 1980 1990

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Who are the most-mentioned women in each decade?

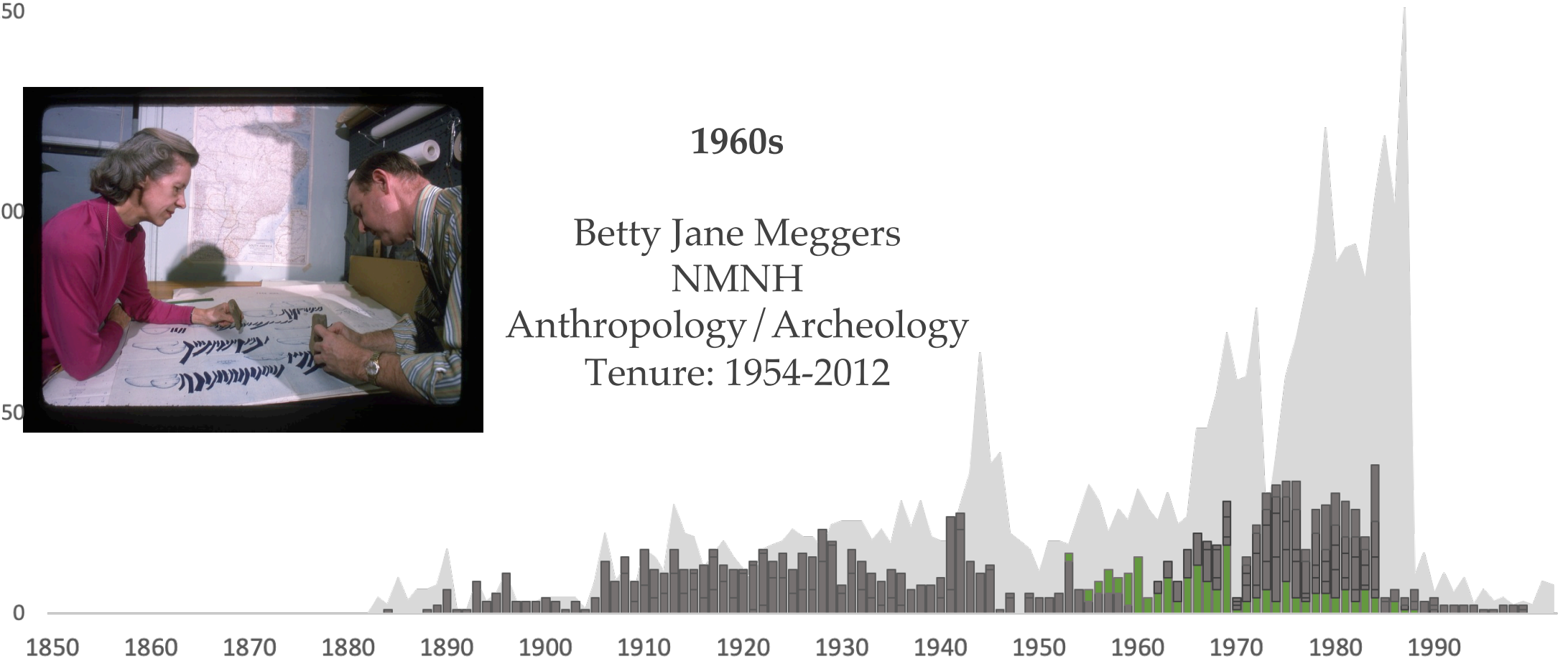
150



1960s

Betty Jane Meggers
NMNH

Anthropology / Archeology
Tenure: 1954-2012



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Who are the most-mentioned women in each decade?



Audrey B. Davis
NMAH

Curator, Medicine and Science
Tenure: 1967-1993



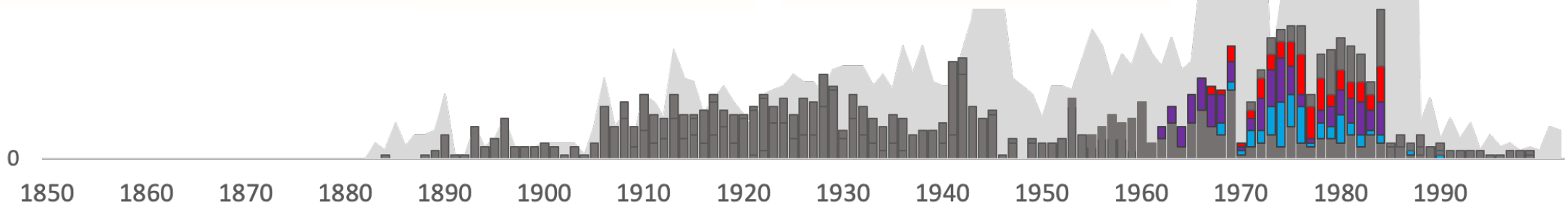
Ursula B. Marvin
SAO

Geologist
Tenure: 1961-1998



Marie-Helene Sacht
NMNH

Curator, Botany
Tenure: 1966-1986



Who are the most-mentioned women in each decade?

150

100

50

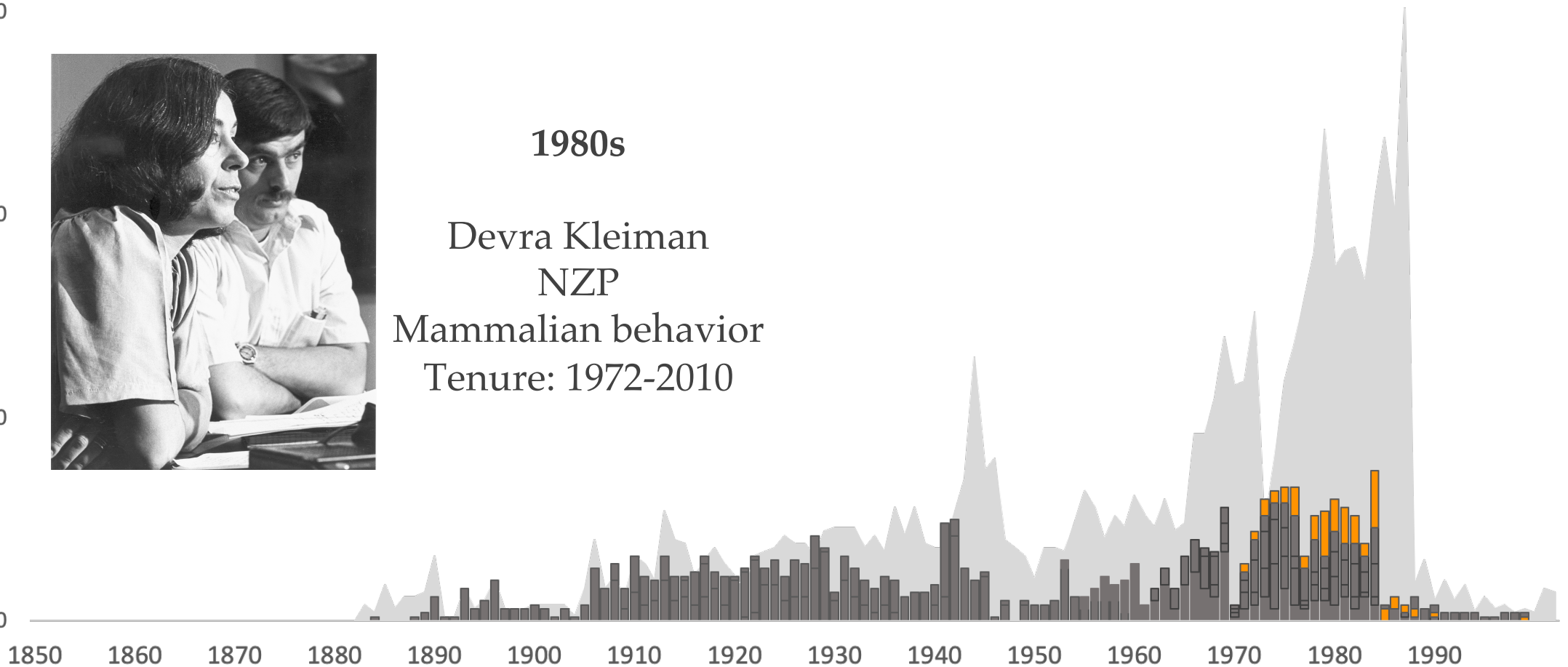
0



1980s

Devra Kleiman
NZP

Mammalian behavior
Tenure: 1972-2010



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Who are the most-mentioned women in each decade?

150

100

50

0



1990s

Jessie Cohen
NZP
Photographer
Tenure: 1979-2009

1850 1860 1870 1880 1890 1900 1910 1920 1930 1940 1950 1960 1970 1980 1990

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**find more online:
datascience.si.edu**

Acknowledgments

- **Smithsonian Women's Committee**
- Tiana Curry
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- Grace May
- Richard Naples
- Jenn Schneider
- Keri Thompson
- Mike Trizna

