

# Cool Stuff in Data Data can be anything!

Julie Deeke



#### Data can be Numbers

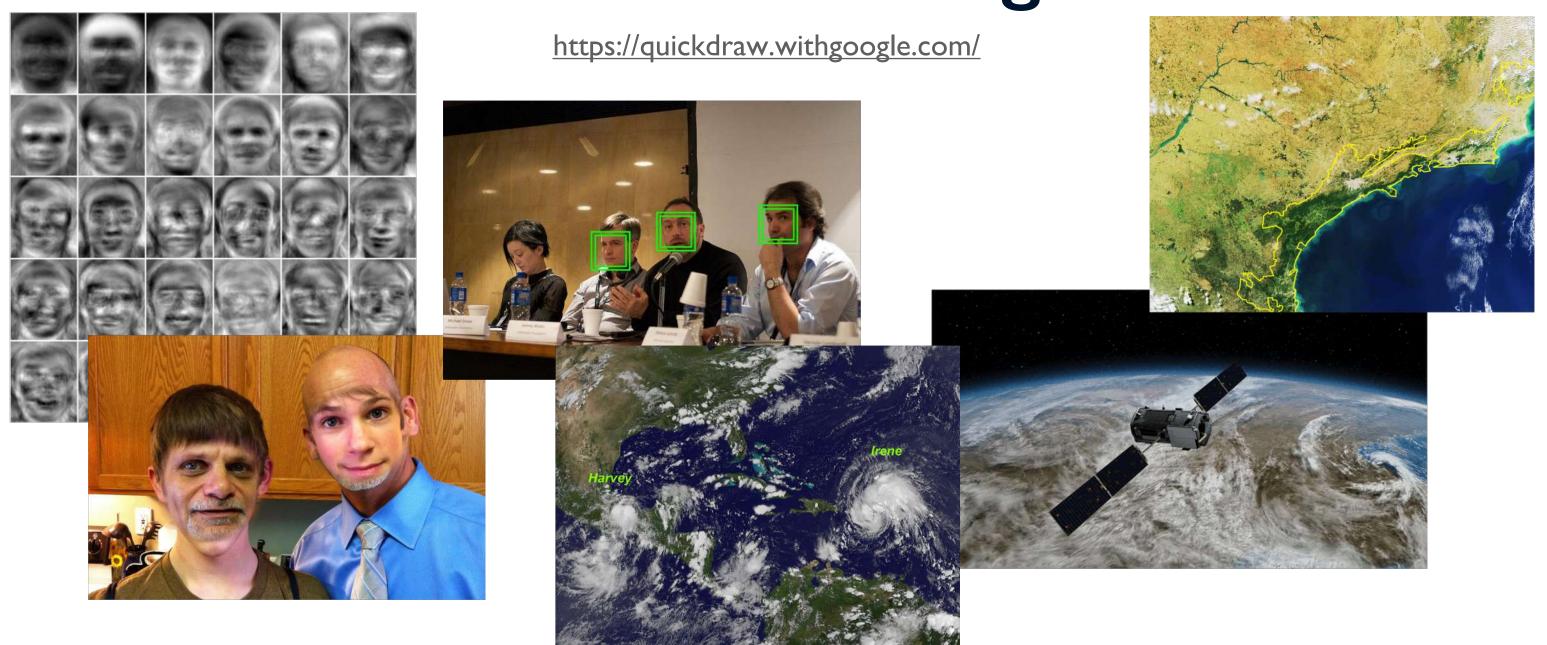


#### National Health and Nutrition Examination Survey

| seqn  | ridstatr | riagendr | RIDRETH1 | dmdmartl | WTINT2YR   | WTMEC2YR   |
|-------|----------|----------|----------|----------|------------|------------|
| 62161 | 2        | 1        | 3        | 5        | 102641.406 | 104236.583 |
| 62162 | 2        | 2        | 1        | NA       | 15457.737  | 16116.354  |
| 62163 | 2        | 1        | 5        | NA       | 7397.685   | 7869.485   |
| 62164 | 2        | 2        | 3        | 1        | 127351.373 | 127965.226 |
| 62165 | 2        | 2        | 4        | NA       | 12209.745  | 13384.042  |
| 62166 | 2        | 1        | 3        | NA       | 60593.637  | 64068.123  |
| 62167 | 2        | 1        | 5        | NA       | 5024.465   | 5303.683   |
| 62168 | 2        | 1        | 5        | NA       | 5897.025   | 6245.044   |
| 62169 | 2        | 1        | 5        | 5        | 14391.778  | 14783.601  |
| 62170 | 2        | 1        | 5        | NA       | 7794.527   | 8291.637   |



## Data can be images

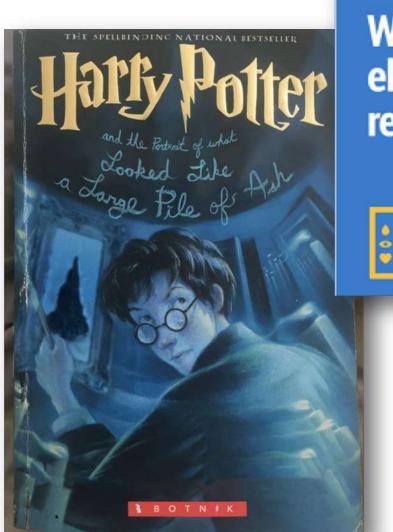


<sup>&</sup>quot;Face detection" by Sylenius is licensed under CC BY 2.0

<sup>&</sup>quot;Great picture..." by Dion Hinchcliffe is licensed under CC BY-SA 2.0



## Data can be Words



What is an electronic health record (EHR)?

| "Arts"  | "Budgets"  | "Children |
|---------|------------|-----------|
| NEW     | MILLION    | CHILDREN  |
| FILM    | TAX        | WOMEN     |
| SHOW    | PROGRAM    | PEOPLE    |
| MUSIC   | BUDGET     | CHILD     |
| MOVIE   | BILLION    | YEARS     |
| PLAY    | FEDERAL    | FAMILIES  |
| MUSICAL | YEAR       | WORK      |
| BEST    | SPENDING   | PARENTS   |
| ACTOR   | NEW        | SAYS      |
| FIRST   | STATE      | FAMILY    |
| YORK    | PLAN       | WELFARE   |
| OPERA   | MONEY      | MEN       |
| THEATER | PROGRAMS   | PERCENT   |
| ACTRESS | GOVERNMENT | CARE      |
| LOVE    | CONCERGE   | LIEE      |

#### Man is to Computer Programmer as Woman is to Homemaker? Debiasing Word Embeddings

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| EDUCATION  |   |
|------------|---|
| TEACHERS   |   |
| HIGH       |   |
| PUBLIC     |   |
| TEACHER    |   |
| BENNETT    |   |
| MANIGAT    |   |
| NAMPHY     |   |
| STATE      |   |
| PRESIDENT  |   |
| ELEMENTARY | 9 |
| HAITI      |   |

The William Randolph Hearst Foundation will give \$1.25 million to Lincoln Center, Metropolitan Opera Co., New York Philharmonic and Juilliard School. "Our board felt that we had a real opportunity to make a mark on the future of the performing arts with these grants an act every bit as important as our traditional areas of support in health, medical research, education and the social services," Hearst Foundation President Randolph A. Hearst said Monday in announcing the grants. Lincoln Center's share will be \$200,000 for its new building, which will house young artists and provide new public facilities. The Metropolitan Opera Co. and New York Philharmonic will receive \$400,000 each. The Juilliard School, where music and the performing arts are taught, will get \$250,000. The Hearst Foundation, a leading supporter of the Lincoln Center Consolidated Corporate Fund, will make its usual annual \$100,000 donation, too.

Figure 8: An example article from the AP corpus. Each color codes a different factor from which the word is putatively generated.

Image source: <a href="https://www.healthit.gov/topic/health-it-and-health-information-exchange-basics/health-information-exchange-basics/health-information-exchange-basics/health-information-exchange-basics/health-information-exchange-basics/health-information-exchange-basics/health-information-exchange-basics/health-information-exchange-basics/health-information-exchange-basics/health-information-exchange-basics/health-info

Image source: http://botnik.org/content/harry-potter.html

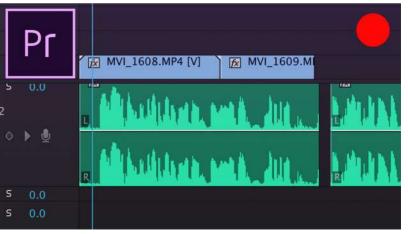
Image source: Page 17 http://www.jmlr.org/papers/volume3/blei03a/blei03a.pdf

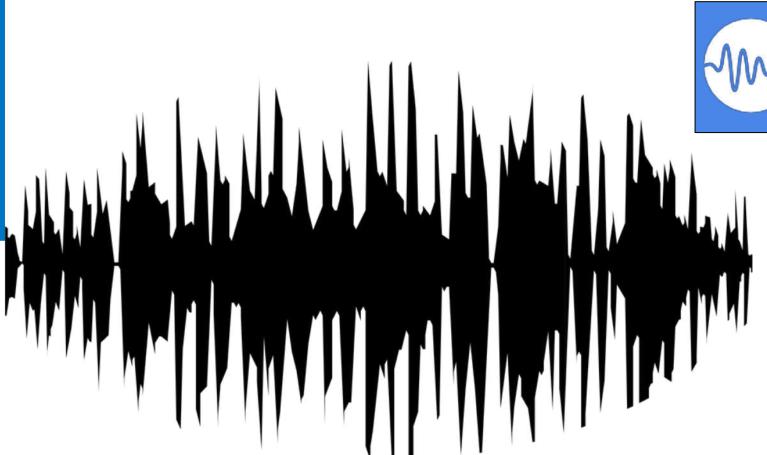
Image source: https://papers.nips.cc/paper/6228-man-is-to-computer-programmer-as-woman-is-to-homemaker-debiasing-word-embeddings.pdf



### Data can be Audio









# Historical Example



