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# Outline



2 Methodology

#### 3 Applications

- Trends Analysis
- Evaluating Human Selection Processes

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Gender Imbalance in Wikipedia

#### 4 Conclusions

# Who's Bigger: Historical Rankings

Numerical ratings/rankings provide a way to focus greater attention on the best/most important things.



Rankings are highly subjective and culturally biased, yet rankings provide a popular mix of education and entertainment.

We seek algorithms to construct informative and meaningful historical rankings of all the people described in Wikipedia.

# Who's Bigger? (Presidents)



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#### Battle: George Washington vs. Abraham Lincoln

# Who's Bigger? (Presidents)



Battle: George Washington vs. Abraham Lincoln

- George Washington (1732–1799) [6]
- Abraham Lincoln (1809–1865) [5] \*
- Chester A. Arthur (1829–1886) [490]

# Are the Beatles "Bigger than Jesus"?





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#### Battle: Jesus vs. John Lennon

# Are the Beatles "Bigger than Jesus"?





Battle: Jesus vs. John Lennon

- Jesus (7 B.C.-30 A.D.) [1] \*
- John Lennon (1940–1980) [141]
- Paul McCartney (1942– ) [399]
- George Harrison (1943–2001) [615]
- Ringo Starr (1940– ) [1729]

### Roll Over Beethoven?





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#### Battle: Elvis Presley vs. Ludwig van Beethoven

### Roll Over Beethoven?





Battle: Elvis Presley vs. Ludwig van Beethoven

- Ludwig van Beethoven (1770–1827) [28] \*
- *Elvis Presley (1935–1977)* [58]
- Pyotr Ilyich Tchaikovsky (1840–1893) [57]
- Franz Liszt (1811–1886) [108]

### Justin Time or Forever?



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#### Battle: Justin Bieber vs. Eli Whitney

### Justin Time or Forever?



Battle: Justin Bieber vs. Eli Whitney

- Justin Bieber (1994– ) [7718] (fame rank 1479)
- *Eli Whitney* (? ?) [857] \* (fame rank 2423)
- Frankie Avalon (1940– ) [17125] (fame rank 12693)

Bieber is more famous but less historically significant.

# Who's Bigger? (Wolfram Data Summit)



Battle: Stephen Wolfram vs. Ted Bundy

# Who's Bigger? (Wolfram Data Summit)



Battle: Stephen Wolfram vs. Ted Bundy

- Stephen Wolfram (1959– ) [6147]
- Ted Bundy (1946–1989) [3012] \*

# Stephen Wolfram (1959– ) [6147] Peer Group

Bigger: George Balanchine (1904–1983) [3364], Ingrid Bergman (1915–1982) [2790], Jacques Cousteau (1910–1997) [2907], Tim Berners-Lee (1955– ) [4026]

Comparable: Chuck Yeager (1923– ) [6174], Jeb Bush (1953– ) [6061], Paul Erds (1913–1996) [5278], Rex Harrison (1908–1990) [5680]

Smaller: Barbara Boxer (1940– ) [7539], John Grisham (1955– ) [7677], Tenzing Norgay (1914–1986) [8368], Andrew Wiles (1953– ) [12325]

# The Historical Top 20

Rank	Name	Dates	Description
1	Jesus	(7 B.C30 A.D.)	Central figure of Christianity
2	Napoleon	`(1769–1821)´	French military leader and emperor
3	William Shakespeare	(1564–1616)	English playwright ("Hamlet")
4	Muhammad	`(570–632)´	Founder of Islam
5	Abraham Lincoln	(1809–1865)	16th U.S. President (Civil War)
6	George Washington	(1732–1799)	1st U.S. President (Revolution)
7	Adolf Hitler	(1889–1945)	Fuehrer of Nazi Germany (WW II)
8	Aristotle	(384–322 в.с.)	Greek philosopher and scientist
9	Alexander the Great	(356-323 в.с.)	World conqueror (Greek)
10	Thomas Jefferson	(1743–1826)	3rd U.S. Pres. (Decl. of Independence)
11	Henry VIII	(1491–1547)	King of England (6 Wives)
12	Elizabeth I	(1533–1603)	Queen of England (The Virgin Queen)
13	Julius Caesar	(100—44 в.с.)	Roman general and statesman (Et tu, Brute?)
14	Charles Darwin	(1809–1882)	Scientist (Theory of Evolution)
15	Karl Marx	(1818–1883)	Philosopher ("Communist Manifesto")
16	Martin Luther	(1483–1546)	Protestant Reformation (95 Theses)
17	Queen Victoria	(1819–1901)	British Queen (Victorian Era)
18	Joseph Stalin	(1878–1953)	Russian leader (World War II)
19	Theodore Roosevelt	(1858–1919)	26th President (Spanish-American War)
20	Albert Einstein	(1879–1955)	Physicist (Theory of Relativity)

# Culturenomics: Not Just a Toy

The Big Data revolution is changing how research is done, including the humanities and social sciences.

New data sets drawn from massive text corpora let us watch history unfold, and measure seemingly unquantifiable aspects of fame.

Applications of significance ranking include:

- Klout score beyond Twitter.
- Entity disambiguation: Larry Page (1973– ) [11665] vs. Larry Page (? – ?) [116064]
- Esoteric content detection for measuring document readability.
- Objective reference standards for bias detection.

# Outline



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# Ranking Methodologies

Ranking documents by significance lies at the heart of Internet search engines like Google.

Ranking people by merit is the goal of college admissions and the job hiring process.

Subjective rankings of historical figures appear frequently in books / magazines, when awarding prizes / honors, and in populating textbooks.

Traditional approaches to ranking include:

- Expert Polls
- Public Voting
- Single Variable models
- Multiple Factor models

# Our Historical Universe: Wikipedia



We rank all the people with pages in the English edition of Wikipedia, a population roughly equal to that of San Francisco.

The least significant person is *Dejan Paji (1989– )* [771384], a Serbian sprint canoer who won a bronze medal in the K-2 500 meter event at the 2010 World Championships.

Several measures of fame/significance can be found in Wikipedia...







Wikipedia pages link to other Wikipedia pages through the text of articles, defining a network.

Links from important people to your page means you are probably important.

Google's PageRank algorithm measures the centrality of a vertex/page in a network of links.

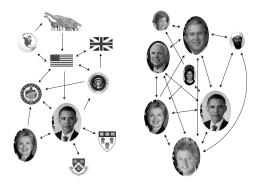
## High/Low PageRank Individuals

Person	PR1	Sig	Person	PR1	Sig
Napoleon	1	2	Vijay	16463	4269
George W. Bush	2	29	Daniel Radcliffe	12219	6462
Carl Linnaeus	3	46	Jesse McCartney	11704	3556
Jesus	4	1	Randy Orton	10966	3551
Barack Obama	5	91	Ashley Tisdale	10184	3992
Aristotle	6	8	Edge	9956	2308
William Shakespeare	7	3	Kane	8972	1934
Elizabeth II	8	125	Rey Mysterio	8493	2468
Adolf Hitler	9	7	Nicole Scherzinger	7579	5460
Bill Clinton	10	101	Big Show	7479	3851

Famous low PageRank people include young celebrities.

Why does Carl Linnaeus (1707-1778) [46] have such high PageRank?

### Should Dinosaurs Vote?



Restricting vertices in the graph to people yields a different network to compute PageRank on.

# High/Low People PageRank

Person	PR2	Sig
George W. Bush	1	29
Bill Clinton	2	101
William Shakespeare	3	3
Ronald Reagan	4	27
Adolf Hitler	5	7
Barack Obama	6	91
Napoleon	7	2
Richard Nixon	8	78
Franklin D. Roosevelt	9	41
Elizabeth II	10	125

Person	PR2	Sig
Amerigo Vespucci	19385	485
Richard Stallman	16693	4831
John Cabot	14282	389
Ashlee Simpson	14171	3678
Jimmy Wales	13307	2150
Henry Hudson	13134	433
Vijay	12720	4269
Ashley Tisdale	12285	3992
Jacques Cartier	12175	360
Jesse McCartney	11846	3556

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Explorers and programmers are propped up by their organizations.

We use both PageRanks in our final computation.

### Hits



An orthogonal measure of a person's significance is how frequently readers visit their Wikipedia page.

More famous/interesting people should have their pages read more frequently than lesser lights.

Hits measures the number of Wikipedia readers, while PageRank depends upon actions by the authors of Wikipedia pages.

# High/Low Hit Individuals

Person	Hits	Sig
Eminem	3	755
Lady Gaga	5	2142
Adolf Hitler	6	7
Lil Wayne	7	1707
Katy Perry	9	4647
Rihanna	10	1089
Barack Obama	12	91
Michael Jackson	13	136
Kanye West	15	1373
Miley Cyrus	16	1719

Person	Hits	Sig
Gough Whitlam	11391	1047
Paul Martin	9332	2989
Charles Sanders Peirce	8469	229
Brian Mulroney	7966	2415
Joseph Priestley	7725	331
Lester B. Pearson	7525	1180
Suharto	7521	1738
Anthony Burgess	7343	1398
Thomas Henry Huxley	7220	378
William Lyon Mackenzie King	7091	651

Adolf Hitler (1889–1945) [7] is the only non-contemporary figure on the frequently read list.

*Gough Whitlam (1916– )* [1047] is an important / controversial former Australian Prime Minister.

# Article Length



Wikipedia article length provides a natural measure of fame: more significant people merit longer articles.

Article length is not the hard constraint of printed texts, yet clear social pressures by the Wikipedia community favor conciseness.

Over 100,000 people have suffered the ignominy of having their (usually autobiographical) articles removed from Wikipedia.

# High/Low Article Length Individuals

Person	Words	Sig
Adolf Hitler	5	7
Stanley Kubrick	12	1811
Elvis Presley	14	58
Joseph Stalin	18	18
L. Ron Hubbard	21	1045
Che Guevara	25	429
Paul Robeson	27	1235
Janet Jackson	28	461
Michael Jackson	29	136
Douglas MacArthur	30	285

Person	Words	Sig
Euclid	37084	152
Tony Hawk	35701	3632
Hugh Hefner	35681	3494
Vijay	31906	4269
Sean Hannity	31509	4340
Ja Rule	31313	1241
Fergie	29737	3045
Euripides	27290	355
Will Smith	25942	2611
John Travolta	24479	1573

Controversial people get long articles, while certain contemporary celebrities have few accomplishments to write about.

The longest prominent article (Hitler) runs 29341 words, where the shortest (*Euclid* (? - ?) [152]) contains only 1542.

# Page Edits



The Wikipedia collaborative model empowers thousands to contribute their knowledge to the world.

Famous/important people have more refined articles than lesser personages, because more readers will have both desire and information to contribute.

# High/Low Page Edit Individuals

Person	Edits	Sig	Person	Edits	Sig
George W. Bush	1	29	Tacitus	7184	287
Michael Jackson	2	136	Francis I	6777	344
Jesus	3	1	Pope Leo XIII	6713	406
Britney Spears	4	566	Toyotomi Hideyoshi	6708	365
Adolf Hitler 5 7 Plutarch		Plutarch	6638	236	
Barack Obama	6	91	Josephus	5910	347
Muhammad	7	4	Friedrich Engels	5820	402
Elvis Presley	8	58	Jerome	5506	298
Beyonc Knowles	10	967	Aristophanes	5380	407
Roger Federer	11	746	George II	5377	335

High-edit people tend to be contemporary, or religious figures with active constituencies.

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Prominent low-edit people tend to be dead for over 1,000 years.

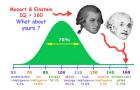
## Statistical Factor Analysis

Factor analysis is a statistical tool used to describe the communality of variables in terms of a small set of unobserved variables, or "factors."

Getting fit for a tux requires measurements of height, weight, shoe size, inseam length, waist size, neck size, jacket length.

Yet two factors explain most of them: girth and span.





*Charles Spearman (1863–1945)* [15988] developed factor analysis to prove one factor underlies performance on many types of intelligence (IQ) tests.

# Celebrity vs. Gravitas

Two factors pop out, each explaining roughly the same proportion of variance (31% and 28%), having natural interpretations as celebrity (F1) and gravitas (F2).

Gravitas loads primarily on the two forms of PageRank.

Celebrity loads heavily on page hits, revisions, and article lengths.

These factors distinguish popular personalities from lower-profile people with heftier achievements.

We define significance to be the sum of the celebrity and gravitas factors.

# High Gravitas/Celebrity Individuals

Person	Grav.	Celeb/Grav	Per	rson Celeb	Celeb/Grav
Napoleon	6	C G	Vijay	3	C G
Carl Linnaeus	21	C G	Edge	5	C G
Aristotle	26	C G	Kane	7	C G
William Shakespeare	27	C G	John Ce	ena 9	C G
Plutarch	29	C G	Triple H	I 17	C G
F. D. Roosevelt	31	C G	Rey My	sterio 19	C G
Charles II	33	C G	Roger F	ederer 22	C G
Elizabeth II	34	C 🗖 G	Britney	Spears 25	C G
Pliny the Elder	36	C G	Dave Ba	atista 26	C G
Tacitus	37	C G	Beyonc	Knowles 27	C G

Professional wrestlers tend to have almost all their significance explained by celebrity.

# The Ravages of Time

"My name is Ozymandias, king of kings: Look on my works, ye mighty, and despair!" – Percy Bysshe Shelley (1792–1822) [324]

Contemporary figures are substantially overrated by uncorrected factor scores, with 28 of the 100 most famous individuals still alive.

Uncorrected significance does serve as an effective proxy to measure fame.

Britney Spears (1981– ) [20] ranks ahead of Aristotle (384–322 B.C.) [24] in uncorrected significance!





### Modeling Reputation Decay

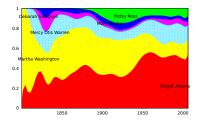
Historical figures do not have a "half-life", or else all ancient figures would have already been forgotten.

Estimating the decay rate is essential to appropriately compare the significance of current individuals with older figures long dead.

There are two distinct processes at work here: first the lapse from living memory inherent in the passage of generations, and second a more contemporary bias due to the advent of Wikipedia.

# Google Book Ngrams: http://books.google.com/ngrams

Data to calibrate a historical reputation decay model comes from reference counts in millions of scanned books.



Betsy Ross (1752-1836) [2346] didn't exist in historically until 1870.

Reputations peak between age 60 and 75 and decay relatively slowly.

### Validation: Gold Standards

We have assembled a collection of 35 published rankings (averaging about 100 people each) over a wide variety of domains, in history, sports, and entertainment, including:

- 1,000 years, 1,000 People: Ranking the Men and Women Who Shaped the Millennium
- AFI Screen Legends, compiled by AFI historians.
- Internet polls from www.thebest100lists.com, ranking the top 100 athletes, authors, and movie directors.
- The Associated Press Top 100 athletes of the century, voted by a 16-member panel.
- Baseball star rankings by experts at www.baseballevolution.com.
- The 100: A Ranking of the Most Influential Persons in History (Hart)
- The Rolling Stone magazine top 100 singers.
- IMDB STARmeter rankings of actors, determined by search history.
- The *Time 100* social networking ranks, based on Twitter followers and Facebook connections.
- The United States Presidency Center's expert poll rankings of U.S. presidents.

These serve as gold standards to assess how well our rankings correspond to expert evaluation of fame/significance.

#### Performance: Rank correlations with published rankings

ListGroup	NL	ILA	NPR	PPR	PH	NR	F1	F2	F1+F2	dPR	dF1+F2
Actors	3	0.412	0.499	0.556	0.273	0.327	0.178	0.411	0.466	0.501	0.523
Actresses	3	0.419	0.491	0.514	0.272	0.389	0.226	0.349	0.501	0.509	0.546
Authors	3	0.353	0.419	0.426	0.415	0.358	0.189	0.358	0.436	0.429	0.458
Directors	5	0.491	0.586	0.562	0.431	0.502	0.364	0.466	0.576	0.600	0.608
Musicians	3	N/A	0.648	0.621	0.572	0.569	0.416	0.413	0.618	0.638	0.672
Individual Sports	10	0.280	0.459	0.457	0.408	0.406	0.316	0.381	0.453	0.462	0.463
General Athletics	3	0.569	0.489	0.571	0.467	0.463	0.369	0.323	0.537	0.497	0.554
US Presidents	5	0.909	0.576	0.490	0.625	0.549	0.386	0.532	0.580	0.623	0.655
General Historical	3	N/A	0.434	0.388	0.499	0.489	0.420	0.324	0.482	0.458	0.511
Overall	35	0.490	0.511	0.509	0.440	0.450	0.318	0.395	0.517	0.524	0.554

Time-corrected significance correlates best (0.554) with validation lists in essentially all categories.

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## Better than the Experts?

The experts did not all agree on their relative rankings of shared people.

Authors (0.363) and sports figures (0.280) showed particularly weak correlation, while there was consensus on the ranking presidents (0.909).

The inter-list correlation of 0.490 is substantially lower than the correlation (0.554) with our corrected significance measure.

This provides evidence that our measure is, overall, substantially superior to human rankings.

# Outline



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Gender Imbalance in Wikipedia

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Trends Analysis

#### The Decline of the Great Scientist...

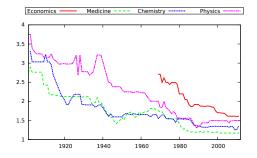


Figure: The Significance of Nobel Prize Winners in the Science and Economics

Economic laureates now out-rank the hard sciences, but all are declining.

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Applications

Trends Analysis

#### While Literature and Humanity Endure

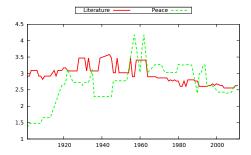


Figure: The Significance of Nobel Peace and Literature Prize Winners

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Applications

Evaluating Human Selection Processes

#### **Evaluating Human Selection Processes**

Human selection processes have critical implications with respect to job hiring, college admissions, sports drafts, and democratic elections.

Meritocracies rest on the precision with which society can make accurate judgements about the accomplishments and potential of people.

To what extent can people be trusted to get these decisions correct?

Studies of Hall of Fame elections provide an interesting laboratory to measure the extent to which experts can recognize historical significance.

HoF elections seek to recognize *achievement*, which should be substantially easier than evaluating *potential* (e.g. sports drafts or college admissions).

Michael Jordan (1963– ) [1018] vs. Sam Bowie (1961– ) [33949]?

Applications

Evaluating Human Selection Processes

#### The Hall of Fame for Great Americans

For over 70 years starting in 1900, prominent electors from this Bronx institution voted every five years to select the greatest Americans.





How well did they do?

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Evaluating Human Selection Processes

#### The Most/Least Significant Great Americans

Sig	Person	Dates
5	Abraham Lincoln	(1809 - 1865)
6	George Washington	(1732–1799)
10	Thomas Jefferson	(1743–1826)
19	Theodore Roosevelt	(1858–1919)
25	Ulysses S. Grant	(1822–1885)
36	Benjamin Franklin	(1706 - 1790)
38	Thomas Edison	(1847–1931)
41	F. D. Roosevelt	(1882–1945)
45	Alexander Hamilton	(1755 - 1804)
48	Woodrow Wilson	(1856–1924)

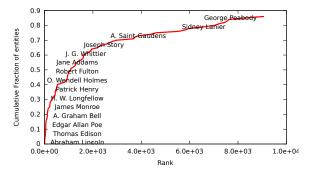
Sig	Person	Dates
110648	Mark Hopkins	(1802–1887)
64747	A. Freeman Palmer	(1855–1902)
32162	C. Saunders Cushman	(1816–1876)
27754	Lillian Wald	(1867–1940)
24265	James Buchanan Eads	(1820–1887)
23445	Rufus Choate	(1799 - 1859)
21450	John Lothrop Motley	(1814–1877)
21013	Sylvanus Thayer	(1785–1872)
16398	James Kent	(1763–1847)
15815	Emma Willard	(1787 - 1870)

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Applications

Evaluating Human Selection Processes

#### The Weakness of the Tail



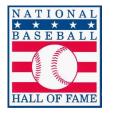
A cumulative distribution plot of Hall of Fame members by significance rank shows that the top 65% are substantially stronger than the rest.

Applications

Evaluating Human Selection Processes

#### The Baseball Hall of Fame

Since 1936, this popular Cooperstown NY institution has held annual elections to honor the greatest figures in baseball history.



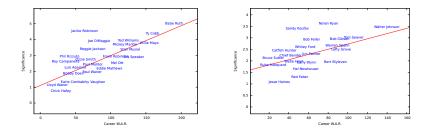


Baseball players leave an meaningful statistical measure of accomplishment, enabling comparison between historical significance, statistics, and Hall of Fame voting records.

- Applications

Evaluating Human Selection Processes

## Performance (Wins Above Replacement) vs. Significance



Historical significance is strongly corrolated with statistical performance (Wins Above Replacement) for position players (left) and pitchers (right).

Applications

Evaluating Human Selection Processes

# The Most/Least Significant Members of the Baseball Hall of Fame

Sig	Person	Dates
397	Babe Ruth	(1895 - 1948)
800	Jackie Robinson	(1919–1972)
1010	Ty Cobb	(1886–1961)
1550	Hank Aaron	(1934– )
1688	Lou Gehrig	(1903–1941)
2044	Ted Williams	(1918–2002)
2145	Joe DiMaggio	(1914 - 1999)
2223	Cap Anson	(1852–1922)
2277	Cy Young	(1867–1955)
2449	Honus Wagner	(1874–1955)

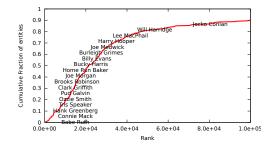
Sig	Person	Dates
246381	Alex Pompez	(1890–1974)
171864	Ray Brown	(1908–1965)
169077	Bill McGowan	(1896–1954)
167887	Andy Cooper	(1898–1941)
166440	Louis Santop	(1890–1942)
165474	Turkey Stearnes	(1901 - 1979)
162565	AI Barlick	(1915–1995)
162506	Nestor Chylak	(1922–1982)
158675	J. L. Wilkinson	(1878–1964)
153094	Hilton Smith	(1907–1983)

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Evaluating Human Selection Processes

#### The Weakness of the Tail



The top 70% of the Baseball Hall of Fame are much stronger choices than the rest.

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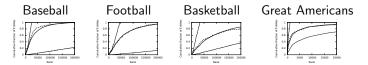
Applications

Evaluating Human Selection Processes

## Explaining Weak Selections

In these and other domains, expert panels consistantly failed to identify strong candidates for roughly 30% of its selections.

These results are consistant with a Gaussian measurement error, where significant numbers of relatively average individuals will be vastly overvalued and therefore selected



Similar evaluation errors presumably occur with job hiring and college admissions.

Look to your left and right - one of you probably doesn't belong here!

Applications

Gender Imbalance in Wikipedia

#### Are Women Underrepresented in Wikipedia?

There are far more Wikipedia articles about men than women.

Women make up only 15% of Wikipedia contributors and 8.5% of its editors, so there may be systematic bias against them.

But should there be more women in Wikipedia?

Have important women's achievements have been forgotten? Or alternately, perhaps more marginal women have been added to correct for perceived bias?

How can we tell?

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- Applications

Gender Imbalance in Wikipedia

#### Assessing Missing People

Famous people are outliers in the world population, at the very highest levels of significance.

Thus there must exist many candidates (for each gender) just below the Wikipedia standard for inclusion.

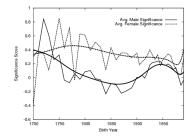
Thus if men in Wikipedia score as more significant than women, either men *should* be admitted or women excluded to maintain equal standards.

By partitioning people into cohorts based on birth year, we can study how the effect of gender varies over time.

- Applications

Gender Imbalance in Wikipedia

# Male/Female Significance by Birthyear



Women have long required far greater achievement levels (by over  $0.25\sigma$ , analogous to 4 IQ points in the mean) than men to get equally noted for posterity.

Thus women are underrepresented in the historical record.

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- Trends Analysis
- Evaluating Human Selection Processes

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Gender Imbalance in Wikipedia

#### 4 Conclusions

# Future Work

- Cross-cultural comparisons based on non-English Wikipedia analysis.
- Sociological studies of cumulative advantage and gender bias in the news/historical record.

- Ngram assembly and sentiment analysis.
- Web-scale entity ranking.
- Who's Bigger. The book

### Who's Bigger: The Resource

# Check out our analysis of any historical figure in Wikipedia at http://www.whoisbigger.com

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# Who's Bigger: The App



http://itunes.apple.com/us/app/whos-bigger/id437080657

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