

Contribution inequality in the crowdsourced knowledge: the case of Wikipedia

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Reference

- 1. Yun et al., Physical Review E 93, 012307 (2016)
- 2. Yun et al., Nature Human Behaviour 3, 103 (2019)



Good afternoon



한 장 요약







human behaviour

Article | Published: 17 December 2018

MENU 🗸

MENU V

human behaviour

Volume 3 Issue 2, February 2019



Collective knowledge formation

An analysis of all Wikimedia projects in all languages reveals deep structural inequality: a small number of editors have a disproportionately large influence on the formation of collective knowledge.

See Yun et al.

Cover image: Jinhyuk Yun (KISTI), Sang Hoon Lee (GNTECH), and Hawoong Jeong (KAIST). Cover design: Bethany Vukomanovic.

죄송합니다... 기계학습이 아닙니다...



한 장 요약

물리학자들이 (데이터로) 사회현상을 연구하는 방법에 대해...

도대체 누구세요?



이때보다 살이 좀 쪘네요....





도대체 누구세요?



이때보다 살이 좀 쪘네요....







초록창....



Future Information Analysis Center

Physics?





 $\alpha_{\text{eff}(\alpha)} = \alpha_{\text{eff}(\alpha)} = \alpha_{\text{eff}(\alpha)$

코끼리를 냉장고에 넣는 방법



냉장고 문을 연다 코끼리를 넣는다 문을 닫는다

Python



#!/usr/bin/python

냉장고 = [] 냉장고.append("코끼리")

물리학적 방법



교수님...



도대체 누구세요?



이때보다 살이 좀 쪘네요....







초록창....



Future Information Analysis Center









통계 물리학: 미시적(micro) 성질 → 상호작용(interactions) → 거시적(macro) 성질





Slides courtesy of Sang Hoon Lee @ GNTECH



Ising Model



Random walk





Percolation

개성





박사 학위논문 Ph.D. Dissertation

사회에서의 전파현상에 대한 특성 연구

Theoretical study on the spreading phenomena in human society

운 진 역 (尹 振 爀 Yun, Jinhyuk) 물리학과 Department of Physics

KAIST

2016

주로 이렇게 쓰입니다...



http://entire

"물리학자들은 다른 사람들의 학문을 **침범**하기에 더 없이 적합한 사람들이다. 물론 대단히 똑똑한 탓도 있지만 일반적으로 **연구대상에 대해 그다지 까다롭게 굴지 않기 때문**이다. 물리학자들은 스스로를 아카데미라는 정글의 제왕 쯤으로 생각하는 경향이 있고, 자신들의 방법이 일반의 수준보다 높다고 여기면서 자신들의 영토를 물샐틈없이 수호한다. 하지만 그들의 또 다른 자아는 하이에나에 비견될 만한 것이어서, **쓸모가 있을 것 같으면 생각이나 기법을 기꺼이 빌려오고 남들이 풀지 못했던 문제의 뿌리를 뽑으며 즐거워한다**. 이런 태도는 약삭빨라 보일 수도 있지만 이전까지 물리학이 제외되어 있던 영역에 그들이 등장하 면서 **위대한 발견이나 자극으로 이어지는 경우**가 많다. 수학자들이 가끔 비슷한 행동을 하기는 해도 새로운 문제의 냄새를 맡고 흥분한 굶주린 물리학자들처럼 맹렬하게 덤벼들지는 않는다..."

- 던컨 와츠 (Duncan J. Watts), "Small World: 여섯 다리면 건너면 누구와도 연결된다 (Six Degrees)" 중...





물리학 박사 (Cornell University) ↓ 사회학 교수 (Columbia University)





WIKIPEDIA The Free Encyclopedia

₩ 대덕연구개발특구 - 위키백과, 우 × +				
\leftrightarrow) G ()	https://ko.wikipedia.org/wiki/다	덕연구개발특구		🖈 🛛 🖲 📼 🚽 🕘 🗄
유 비 비 아이지	문서 토론 <u>대덕연구개발</u> 위키백과, 우리 모두의 백과시			그인하지 않음 토론 기여 계정 만들기 로그인 백과 검색 Q
대문 사용자 모임 요즘 화제 최근 바뀜 모든 문서 보기 임의 문서로 도움말 기부 도구 여기를 가리키는 문서 감리키는 글의 최근 바 감 파일 올리기 특수 문서 목록 고유 링크 문서 정보 위키데이터 항목 이 문서 인용하기 인쇄/내보내기 적 만들기 PDF로 다운로드 인쇄용 판		토론 문서에서 나누어 주세요. (2016년 2월) 開發特區)는 관련 특별법 ^[1] 에 따라 대전광역시 유 민대덕테크노밸리, 대전산업단지 및 추가 개발 예	주세요. 검증되지 않은 내용은 삭제될 수도 있습니다. 	내용에 대한 의견은 한국과학기술원 한국전자통신연구원(ETRI)
다른 언어 🌑 English Français Slovenčina 中文 《링크 편집	대덕연구단지는 1973년 계획수립 이후 1974년부터 공사가 시작되어 1992년 준공되었다. 1980년대를 거치며 대부분의 정부출연연구소가 입주하였으며, 민간부문은 대체로 1990년대에 입주하였다. 고등교육기관인 충남대학교와 한국과학기술원이 자리하고 있다. 당초 연구·학원 도시로서 생산시설이 허용되지 않았으나, 1999년 대덕연구단지관리법 개정을 통해 연구성과의 실용화 및 벤처기업 입주를 적극 지원하기 시작하였다. 2000년 9월 정부는 대덕연구단지를 산·학·연 복합단지로 발전시킨다는 취지의 대덕밸리 선포식을 가졌고, 2005년 '대덕연구개발특구 등의 육성에 관한 특별법'이 통 과되면서, 대전광역시 유성구 죽동, 궁동, 어온동, 구성동, 노온동, 하기동, 수남동, 외삼동, 신성동, 가정동, 도룡동, 장동, 방현동, 화암동, 덕진동, 자운동, 전민동, 문지 동, 원촌동, 봉산동, 탑립동, 용산동, 관평동, 송강동, 금고동, 대동, 금탄동, 신동, 둔곡동, 구룡동과 대덕구의 문평동, 신일동 등 32개 법정동 67.8 km ² (대덕연구단지 27.8 km ² , 대덕테크노밸리 4.3 km ² , 대덕산업단지 3.2 km ² , 북부 그린벨트 28.6 km ² , 국방과학연구소 일원 3.9 km ²) 면적이 신기술의 연구·개발·사업화촉진을 주기능 으로 하는 대덕연구개발특구로 출범하게 되었다. ^{[3][4]}			

Credibility issue...



Credibility issue...



Vandalism



Use

By dolphins

In 1997, use of sponges as a too when searching for food in the sa known case of tool use in marine

get a life losers

Credibility issue...



Wikipedia edit war



Created by gira Park from Noun Project



Wikipedia edit war

Liancourt Rocks

From Wikipedia, the free encyclopedia

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"Dokdo" and "Takeshima" redirect here. For other uses, see Dokdo (disambigu				
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Dokdo \rightarrow Liancourt Rocks \rightarrow Takeshima \rightarrow Dokdo \rightarrow Dokdo \rightarrow Liancourt Rocks \rightarrow ?

1) T. Chesney, An empirical examination of Wikipedia's credibility, <u>First Monday 11, 11 (2006)</u>.

Only 13% of articles in Wikipedia have perceptible academic errors¹⁾

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Only 13% of articles in Wikipedia have perceptible academic errors¹⁾

The number of typos and scientific errors in Wiki are less than traditional encyclopedias²⁾

- 1) T. Chesney, An empirical examination of Wikipedia's credibility, <u>First Monday 11, 11 (2006)</u>.
 - 2) J. Giles, Internet encyclopedias go head to head, <u>Nature (London) 438, 900 (2005)</u>.

Only 13% of articles in Wikipedia have perceptible academic errors¹⁾

The number of typos and scientific errors in Wiki are less than traditional encyclopedias²⁾

Most of Wikipedia articles and editors tend to refer to reliable scientific sources^{3),4)}

- 1) T. Chesney, An empirical examination of Wikipedia's credibility, <u>First Monday 11, 11 (2006)</u>.
 - 2) J. Giles, Internet encyclopedias go head to head, <u>Nature (London) 438, 900 (2005)</u>.
 - 3) F. A. Nielsen, Scientific citations in Wikipedia, First Monday 12, 8 (2007).
- 4) C. A. Haigh, Wikipedia as an evidence source for nursing and healthcare students, Nurse Educ. Today **31**, 135 (2011).
As the results







(41) http://en.wikipedia.org/wiki/CIE_1931_color_space.

 Wikipedia, the Free Encyclopedia. Astronomical unit. Available: http://en.wikipedia.org/wiki/Astronomical_unit. Accessed 15 October 2009.

References

 2004 Indian Ocean earthquake. In Wikipedia <u>http://en.wikipedia.org/wiki/</u> 2004 indian ocean earthquake (2005).



Top

Previous studies

Trust issue

 B T Adler et al.(2008) proposed a method that computes quantitative values of trust for the text in Wikipedia articles.

War state

 T Yasseri et al. (2012) and G Iñiguez et al. (2014) analyzed and modeled the dynamical features of editorial wars in Wikipedia.

Super editors

 Y Gandica et al. (2015) modeled the Wikipedia editing process especially focused on the "super editors".



Limitations

Editor number as the unit of time

- Edit number may not correspond to the real time.
- Example: Jesus (every 4.8 hours) vs KISTI (every 6.4 days)

Limitation in editing scale

- Article sizes increase over time, thus an edit affects a smaller proportion of an article as time goes by, on average.
- Moreover, authors can add or delete different amounts of contents for every edit.

Our Characteristic Measures (for an article)

All of the followings is measured at the last edit of data (English Wikipedia dump of December 2014)

Number of edits (*N_e*)

Total number of edits from the onset of the article

Number of editors (N_p)

Total number of editors who edit the article at least once from the onset

Article's size (S)

The current size of a Wikipedia's article in bytes

Article's age (7)

The time period between onset of the article and the last edit

J Yun et al. PRE 2016

: An article in Wikipedia



📄 : An article in Wikipedia



Mechanism behind the categorization: Agent-based model study



Real Wikipedia

of articles 34,534,110

of editors 40,536,451

Too Complex!



Key ingredients of the model

Degree of reference (*p*)

Credibility of the topic in the Wikipedia compared to the other sources

VS





Key ingredients of the model

Degree of reference (p)

Credibility of the topic in the Wikipedia compared to the other sources

Motivation of edit (q)

Significance of the topic as the common interest of society

VS

Q



Article Talk

Tom Cruise

From Wikipedia, the free encyclopedia

WikipediA The Free Encyclopedi

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Interaction Help About Wikipedia Community portal Recent changes Contact page

Tools What links here Related changes Upload file Special pages Permanent link Page information Wikidata item

This article is about the American actor. For other people named Tom Cruise. see Tom Cruise (disambiguation). Thomas Cruise [1] (born July 3. 1962) is an American actor and producer. Primarily known for his work in action films,^[2] he has also received several accolades for more dramatic work, including three Golden Globe Awards and nominations for three Academy Awards, Cruise is one of the bestpaid actors in the world, [3] and his films have earned over \$3.9 billion in North America;^[4] he is one of the highest-grossing actors of all time.^[5]

Cruise began acting in the early 1980s and made his breakthrough with leading roles in the comedy Risky Business (1983) and the



Never Go Back in 2016

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Key ingredients of the model

Degree of reference (*p*)

Credibility of the topic in the Wikipedia compared to the other sources

Motivation of edit (q)

Significance of the topic as the common interest of society

Attachment

Engagement of an editor toward topic based on her/his given effort

Model results



of editors / # of edits

Inequality in contribution





Limitations

Limited to English editions

- There are 273 editions of languages (as of 2016)



WIKIPEDIA The Free Encyclopedia



Limitations



Open books for an open world

Question

Is the contribution inequality from the innate nature of communal datasets?



Question

Is there any possible universality?

New Characteristic Measures (for a project)

All of followings is measured at last edit of data

Number of edits (*N_e*)

Total number of the edits from the onset of the Wikimedia project

Number of editors (N_p)

Total number of the editors who edit the Wikimedia project at least once

Number of articles (N_a)

Total number of the articles in a certain Wikimedia project

Size of the Wikimedia project (S)

Current size of a projects text in bytes

J Yun et al. Nat. Hum. Behav. 2019

Universal growth patterns



O Single Wikimedia project

Growth as a function of Number of edits



As more edit performed, the productivity of the project is decreased

Growth as a function of Number of articles



As the number of the articles increased, the rate to introduce a new editor is decreasing

Growth as a function of Number of editors



Regardless of size, a single editor produces the almost equivalent amount of data

Question

The universal law of inequality establishing exists?

Inequality index (Gini index)



Cumulative share of people from lower income 100%

Universal early growth of the inequality is observed!

Inequality index (Gini index)



Fading out of the short-term correlation





Case example: Koavf (English Wikipedia)

PROFILES

Tireless and dedicated: Justin Knapp

By Syed Muzammiluddin

March 14th, 2016

Profiling a tireless and dedicated American Wikipedian from Indianapolis, Indiana.





Case example: *Koavf* (English Wikipedia)

Debut (2006)	1156 A	nárion	3314	4	
	1157 <mark>k</mark>	íoavf	3312	1056	
Тор 5%	1158 T	hames	3312	219	
9 May 2008 Top 100	83	Betacommand		54633	2549
	84	Koavf		54522	3432
	85	The Rogue Penguin		54306	642
	No. 🗢	User 🗢	Edit count	\$	

1 Nov 2010 Top 2

No. 🗢	User 🔶	Edit count 🜩
1	[Placeholder]	791,589
2	Koavf	498,802
3	Bearcat	456,383

5 May 2019 Top 2

No.	User	Edit count	User groups
1	Ser Amantio di Nicolao	3,085,805	Ad
2	<u>Koavf</u>	2,025,983	AP, ECo, EM, F, IP, N, Rv, Ro, TE
3	Rich Farmbrough	1,456,507	EFM, AP, ECo, F, Rv, Ro, TE

Order without the central authority



B. Heaberlin and Simon DeDeo, Future Internet (2016)

Iron law of oligarchy



All complex organizations, regardless of how democratic they are when started, eventually develop into oligarchies

Robert Michels, 1911



Mechanistic model
Key ingredients of the new model

Long-term decay of interest

People tend to lose their interest as time goes by

Short-term stimulation of interest

Events can increase the interest

Attachment

Engagement of an editor toward the project increased by her/his given effort

Early rising of the contribution inequality





A period for a new project that is not opened to the public

Resolving of the shot-term inequality



Fading out of the short-term correlation



We should acknowledge the efforts of "super editors"



- 1) T. Chesney, An empirical examination of Wikipedia's credibility, <u>First Monday 11, 11 (2006)</u>.
 - 2) J. Giles, Internet encyclopedias go head to head, <u>Nature (London) 438, 900 (2005)</u>.
 - 3) F. A. Nielsen, Scientific citations in Wikipedia, First Monday 12, 8 (2007).
- 4) C. A. Haigh, Wikipedia as an evidence source for nursing and healthcare students, Nurse Educ. Today **31**, 135 (2011).

However, we should concern about potential biases due to the limited pool of editors

THE NOBEL PRIZE IN PHYSICS 2018

Arthur Ashkin

Gérard Mourou

Donna Strickland



COMMENT · 18 JULY 2018

AI can be sexist and racist – it's time to make it fair

Computer scientists must identify sources of bias, de-bias training data and develop artificialintelligence algorithms that are robust to skews in the data, argue James Zou and Londa Schiebinger.

AI에 의한 성·인종차별 사례

AI 기술	차별 논란 내용
니콘 카메라	눈 작은 동양인 사진 촬영할 때마다 눈을 인식 못해 깜빡인다고 경고
워드 임베딩	유럽계 미국인은 '유쾌한' 단어, 아프리카계 미국인은 '불쾌한' 단어와 연결
아마존 메커니컬 터크	서양 결혼식 사진은 결혼으로 인식, 다른 민족 전통 혼례는 인식 못함
구글 번역기	스페인어 기사를 영어로 번역할 때 여성 지칭 단어를 남성 대명사로 자주 오역
안면 인식 시스템	흑인 여성 얼굴 잘못 인식할 확률 34.7%, 백인 남성 인식 오류 확률은 0.8%







....

Nurse 1 Men : 16 Women

Doctor 13 Men : 7 Women



Professor 21 Men : 3 Women

Teacher 4 Men : 16 Women





World ▶ Europe US Americas Asia Australia Middle East Africa Inequality Cities Global development

Nobel prizes

Female Nobel prize winner deemed not important enough for Wikipedia entry

Site moderator rejected submission for Donna Strickland, the first female physics winner in 55 years, in March



9

9.080



▲ Donna Strickland, the Nobel prize for physics winner at her home in Waterloo, Ontario, Canada, on 2 October. Photograph: Peter Power/Reuters

When the Royal Swedish Academy of Sciences in Stockholm announced the Nobel prize for physics this week, anyone wanting to find out more about one of the three winners would have drawn a blank on Wikipedia.



Until around an hour and a half after the award was announced on Tuesday, the Canadian physicist Donna Strickland was not deemed significant enough to merit her own page on the user-edited encyclopedia.





Women are considerable less likely than men to be have an article on Wikipedia across all levels of achievement



ED15: Gender across Wikimedia project contributors in 2018, weighted



Age of Wikimedia community audiences in 2018 18-34 Volunteer developers 59% 21% 35-44 Asia/India Wikipedias 60% 20% 45-84 Middle East/Africa Wikipedias 58% 30% Audie Spanish & Portugese Wikipedias 33% 47% unity 35% Affiliate organizers 34% 31% Program organizers 34% 31% 35% eibe Eastern Europe Wikipedias 39% 36% Other Wikimedia projects 40% 41% 199 English Wikipedia 37% 47% Western Europe Wikipedias 29% 54% 17% 0% 25% 50% 75% 100%

Geography of Wikimedia Communities, 2018



World of white, formally educated, 30-50 ages old "Males"

Wikipedia editors surveyed by the Wikimedia Foundation in 2018

PHYSICAL REVIEW E

covering statistical, nonlinear, biological, and soft matter physics





Focus: Wikipedia Articles Separate into Four Categories



- 물리학과 첨단기술: "위키백과의 장기간 편집 기록 분석을 통한 위키백과 문서의 분류와 집단지성의 형성과정" (in Korean)

human behaviour

Article | Published: 17 December 2018

MENU 🗸

MENU V

human behaviour

Volume 3 Issue 2, February 2019



Collective knowledge formation

An analysis of all Wikimedia projects in all languages reveals deep structural inequality: a small number of editors have a disproportionately large influence on the formation of collective knowledge.

See Yun et al.

Cover image: Jinhyuk Yun (KISTI), Sang Hoon Lee (GNTECH), and Hawoong Jeong (KAIST). Cover design: Bethany Vukomanovic.

In collaboration with





Prof. Hawoong Jeong (KAIST)



Prof. Sang Hoon Lee (GNTech)

BEHAVIOURAL & SOCIAL SCIENCES

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CONTRIBUTOR

NATURE HUMAN BEHAVIOUR

BEHIND THE PAPER How I met my collaborators

This short post depicts compressed history of three physicists' 14 years of collaboration for the research on the collaborative knowledge.



In collaboration with





Prof. Hawoong Jeong (KAIST)



Prof. Sang Hoon Lee (GNTech)

여러분과 재미있는 일을 같이 할 기회가 있었으면 좋겠습니다~



LAB HALLOWEEN PARTY



facebook.com/pedromics

Size scale of types of Wiki (1)



Size scale of types of Wiki (2)



Size scale of types of Wiki (3)



Size scale of types of Wiki (4)





Clustering analysis (VBGMM) 3-dim feature vector



Clustering analysis (VBGMM) 4-dim feature vector



Clustering analysis (VBGMM) 5-dim feature vector



Correlation by the type of the project



Correlation by the written script



Socio-economic factors

Correlation with the language users



Correlation with the education levels



Correlation with the economic status



Correlation with the R&D investments



Correlation with the research outputs (patents)



Correlation with the research outputs (papers)

