# Hyejin Youn

| CONTACT<br>INFORMATION | Northwestern University<br>Kellogg School of Management<br>Evanston, IL 60208, USA   | Email: hyejin.youn@kellogg.northwestern.edu<br>Web: http://hyoun.me/  |  |
|------------------------|--|---|--|
| ACADEMIC<br>POSITIONS  | <b>Seoul National University</b> , Seoul, Korea<br>Associate Professor, Strategy & Internation<br><b>Santa Fe Institute</b>  | al Management 2024 – current  |  |
|                        | Emergent Political Economies Advisory Bo   |   |  |
|                        | External Faculty   | 2021 – current  |  |
|                        | <b>London Mathematical Laboratory</b> , Lond<br>External Fellow  | 2017 – current  |  |
| PAST POSITIONS         | Northwestern University, Evanston, IL, U<br>Associate Professor,<br>Management & Organizations, Kellogg Sch<br>Core faculty, Northwestern Institute on Cor   | 2021 – 2024<br>nool of Management   |  |
|                        | Northwestern University, Evanston, IL, U<br>Assistant Professor,<br>Management & Organizations, Kellogg Scl<br>Core faculty, Northwestern Institute on Cor   | 2017 – 2021<br>nool of Management   |  |
|                        | Santa Fe Institute<br>Postdoctoral Fellow<br>Graduate Fellow   | 2011 – 2013<br>2009 – 2010  |  |
|                        | <b>Royal Society for Arts</b> , London, UK<br>RSA Fellow   | 2017 – 2023   |  |
|                        | <b>Harvard University</b> , Cambridge, MA, US CID Fellow at John F. Kennedy School of Company of the C |   |  |
|                        | Massachusetts Institute of Technology, C<br>Media Lab Visiting Scientist   |   |  |
|                        | University of Oxford, Oxford, UK<br>Senior Research Fellow at the Mathematica<br>James Martin Fellow at Oxford Martin Sch  |   |  |
| EDUCATION              | <b>Ph. D. Physics, KAIST</b> (Daejeon, South K   | South Korea), February 2011 mamics and Emergent Behaviors in Complex Systems uth Korea), February 2006 e of Technology, Sweden, 2003–2004 |  |
| RESEARCH<br>INTERESTS  | ě i ·  | mic diversity, energy consumption, human mobility) stics (language universality, linguistic cognitive space)                              |  |

# GRANT AND CONSULTING

**Lead PI** "URoL:EN: Towards a unified theory of regulatory functions and networks across biological and social systems"

National Science Foundation, EF-2133863, **\$2,200,000** 

2021 - 2026

PI, "Understanding Technological Change from the Map of Capabilities."

National Science Foundation SciSIP,

EAGER (USA), No. SMA-1312294, \$152,500

2013 - 2017

**Co-PI,** "Understanding Urban Energy Consumption in UK"

REU mentor for Kevin Carlson under the NSF Grant No. 1005075

2011 - 2011

PI, "Quantifying Complex Systems",

National Research Foundation (Korea) ca. \$10,000

2009 - 2010

#### **PUBLICATIONS**

#### Peer-reviewed

[24] M. Hosseinioun, F. Neffke, L. (LT)Zhang, H. Youn "Nested Skills in Labor Ecosystems: A Hidden Dimension of Human Capital" arXiv:2303.15629 [physics.soc-ph] *conditionally accepted in Nature Human Behaviour* 

[23] F. van der Wouden, H. Youn "Impact of geographical distance on acquiring know-how through scientific collaboration" *Research Policy* **52** 2 (2023).

[22] R. Roller, M. Schich, H. Youn, M. Tamm, Editorial for Topical Issue on Cultural Complexity, *Advances in Complex Systems* **25** 2202002 (2022).

[21] L. Wu, A. Kittur, H. Youn, S. Milojevic, E. Leahey, S. M Fiore, Y.Y Ahn "Metrics and mechanisms: Measuring the unmeasurable in the science of science" *Journal of Informetrics* **16** (2) 101290 (2022).

[20] I. Hong, M. R. Frank, I. Rahwan, W. Jung, H. Youn "The universal pathway to innovative urban economies" *Science Advances* **6** (34) eaba4934 (2020).

[19] D. Painter, F. van der Wouden, M. Laubichler, H. Youn "Quantifying Simultaneous innovations in Evolutionary Medicine" *Theory in Biosciences* **139** (4), 319-335 (2020).

[18] M. R. Frank et al. "Toward understanding the impact of artificial intelligence on labor" *Proc. Natl. Acad. Sci USA* **116** (14) 6531–6539 (2019).

[17] M. R. Frank, L. Sun, M. Cebrian, H. Youn, I. Rahwan, "Small cities face greater impact from automation", *J. R. Soc. Interface* **15** 20170946 (2018).

[16] T. Bhattacharya et al. "Studying language evolution in the age of Big Data", *Journal of Language Evolution* **3** 94–129 (2018).

[15] M. Lee, H. Barbosa, H. Youn, G. Ghoshal, P. Holme, "Urban socioeconomic patterns revealed through morphology of travel routes", *Nature Communications* **8** 2229 (2017).

[14] X.-M. Cui, C. N. Yoon, H. Youn, S. H. Lee, J. S. Jung, S. K. Han, "Dynamic burstiness of word-occurrence and network modularity in textbook systems", *Physica A: Statistical Mechanics and its Applications* **487**, 103-110 (2017).

[13] P. L.W. Sabloff, S. Thurner, R. Hanel, and H. Youn, "Demographics and Democracy: A Network Analysis of Mongolians' Political Cognition," *Journal of Anthropological Research* **73**, no. 4: 617-646 (2017).

[12] H. Youn, L. Sutton, E. Smith, B. Croft, J. Wilkins, T. Bhattacharya, I. Maddieson, C. Moore "On universal structure of human lexical semantics", *Proc. Natl. Acad. Sci USA* **113** (7) 1766–1771 (2016).

[11] D. Kim, D. Cerigo, H. Jeong, H. Youn, "Technological novelty profile and invention's future impact", *EPJ Data Science* 2016 **5**:8 (2016).

[10] H. Youn, J. Lobo, D. Strumsky, H. Samaniego, G. B. West, L.M.A. Bettencourt "Scaling and universality in urban economic diversification", *J. R. Soc. Interface* **13**:20150937 (2016).

[9] M. Hamilton, J. Lobo, E. Rupley, H. Youn, and G. B. West "The ecological and evolutionary energetics of hunter-gatherer residential mobility", *Evolutionary Anthropology* **25** 124–132 (2016).

- [8] H. Youn, J. Lobo, L.M.A. Bettencourt, Debora Strumsky "Invention as a combinatorial process: Evidence from U.S. Patents", *J. R. Soc. Interface* **12** 20150272 (2015).
- [7] E. Arcaute, E. Hatna, P. Ferguson, H. Youn, A. Johansson, and M. Batty, "Constructing cities, deconstructing scaling laws", *J. R. Soc. Interface* **12** 20140745 (2015).
- [6] V. Salnikov, D. Schien, H. Youn, R. Lambiotte, and M. Gastner "The geography and carbon footprint of mobile phone use in Cote d'Ivoire", *EPJ Data Science* **3** 3 (2014).
- [5] L.M.A. Bettencourt, H. Samaniego, H. Youn "Professional diversity and the productivity of cities", *Scientific Reports* **4** 5393 (2014).
- [4] A. Gomez-Lievano, H. Youn, L.M.A. Bettencourt "The Statistics of Urban Scaling and Their Connection to Zipf's Law" *PLoS ONE* **7(7)** e40393 (2012).
- [3] H. Youn, M. T. Gastner, H. Jeong, "Inefficiency in Networks with Multiple Sources and Sinks", *Complex '2009* (USST, Shanghai, China, Feb. 23-25) (2010).
- [2] H. Youn, M. T. Gastner, H. Jeong, "The Price of Anarchy in Transportation Networks: Efficiency and Optimality Control", *Phys. Rev. Lett.* **101** 128701 (2009).
- [1] H. Youn, F. Roth, M. Silver, M.-H. Cloutier, P. Ittzes, and H. Jeong, "Price of Anarchy on Boston Road Network", *J. Korean Phys. Soc.* (2006). **48** 217

#### Working Paper (R&R, Under Review, Preprint)

- [25] H. Kim, M. J. Hamilton, W-S. Jung, H. Youn, "Deeply nested structure of mythological traditions worldwide" *under review in Science Advances*
- [26] J. Chae at al., "Long-term innovative potential of genetic research and its suppression" *reject* and resubmit in Nature Communication
- [27] T. Kim, D. Kim, W. Kim, H. Youn "When Jobs Automate: Entrepreneurship as an Alternative Career Path" *submitted to Humanities and Social Sciences Communications*
- [28] S. Yang, H. Youn, 'Geometrics of the Adjacent Possibles: Harvesting Values at the Curvature' *submitted to PNAS* arXiv:2311.16360 [physics.soc-ph].
- [29] J Yoon, CP Kempes, VC. Yang, GB West, H. Youn "What makes Individual I's a Collective We; Coordination mechanisms & costs" arXiv:2306.02113 [physics.soc-ph]
- [30] VC Yang, CP Kempes, H Youn, S Redner, GB West, "Scaling and the Universality of Function Diversity Across Human Organizations" arXiv:2208.06487 [physics.soc-ph]
- [31] VC Yang, CP Kempes, S Redner, GB West, H. Youn "Unifying regulatory function across complex adaptive systems" working paper available upon request.
- [32] H. Kim, D. Kim, Y.-H Eom, and H. Youn, "How exploitation and exploration shape the knowledge space" working paper available upon request.
- [33] J. Park, M. R Frank, L. Sun, H. Youn, "Industrial Topics in Urban Labor System" arXiv:2009.09799 [cs.SI]
- [34] L. M. A. Bettencourt, J. Lobo, G. B. West, H. Youn "The Hypothesis of Urban Scaling: formalization, implications, and challenges", arXiv: 1301.5919 [physics.soc-ph]
- [35] J. Lobo et al. Report submitted to the NSF on the Present State and Future of Urban Science, 2020. Available at SSRN: http://dx.doi.org/10.2139/ssrn.3526940

### In Preparation

- [36] O. Kwon, J. Yoon, H. Youn "A Tale of Two Fortunetellers"
- [37] O. Kwon, J. Yoon, L.R. Varshney, H. Youn "Suspense and Surprise in Innovations"
- H. Youn et al. "paradigm shift in technological innovation"
- H. Youn, P. Kim, S. Son, H. Jeong, "Effective Population Density and Its Applications",
- H. Youn, "Paradox of Taxation", in preparation

#### **Book Chapters**

43 Visions for complexity World Scientific, Edited by: Stefan Thurner (2017).

| EDITORIAL    | Associate Editor, Management Science   | 2023 – current             |  |
|--------------|--|----------------------------|--|
| WORK         | Academic Editor, <b>PLOS One</b> 2017 –  |                            |  |
|              | Guest Editor: Energies(2019), Advances in Complex Systems(2022), Frontiers   | in IC1(2020)               |  |
| PROFESSIONAL | <b>U.S. National Science Foundation (NSF)</b> : ad-hoc advisory panel services (20   | 21–2023)                   |  |
| SERVICE      | <b>General</b> : Science, PNAS, Nature Communication, Scientific Reports, PLOS   |                            |  |
|              | Royal Society Interface  |                            |  |
|              | Physics: Physical Review Letter, Physical Review E, Physical A, European Physical Journal B,   |                            |  |
|              | European Physical Letter, JSTAT  |                            |  |
|              | Network Science: Journal of Complex Networks   |                            |  |
|              | <b>Social Science</b> : Research Policy, Organization Science, GECON <b>Computer Science</b> : WWW, ICWSM, Socinfo                           |                            |  |
|              | Program Committees   |                            |  |
|              | Conference on Complex Systems (CCS)  | 2017–2022                  |  |
|              | Annual International Conference on Computational Social Science (IC2S2)  | 2017–2023                  |  |
|              | International World Wide Web Conference (WWW)  | 2022-2023                  |  |
|              | The Program Committee of the 2023 Cultural Data Analytics Conference   | 2023                       |  |
|              | Social Informatics (SocInfo)   | 2017-2019                  |  |
|              | International School and Conference on Network Science (NetSci-17)   | 2017-2019                  |  |
|              | The International AAAI Conference on Web and Social Media (ICWSM)  | 2015–2017                  |  |
|              | Institutional Committees Northwestern Univeristy, Center for Artificial Intelligent Committee  | 2020 – 2023                |  |
|              | Northwestern University, Center for Artificial Intelligent Committee  Northwestern University, Data Science Fellows Program Review Committee | 2020 – 2023<br>2021 – 2022 |  |
|              | Northwestern University, MORS Faculty Hiring Search Committee  | 2021 2022                  |  |
|              | Northwestern Univeristy, MORS Seminar Series Committee   | 2020                       |  |
|              | Northwestern Univeristy, MORS Brown Bag Series Committee   | 2021 - 2023                |  |
|              | Northwestern Univeristy, Kellogg Innovation Speaker Series Committee   | 2017 - 2021                |  |
|              | Northwestern University, Department Strategy Committee   | 2019                       |  |
|              | Northwestern University, Graduate Students, Search Committee<br>University of Oxford, Postdoc Fellow Search Committee                        | 2017 – 2020, 2022<br>2015  |  |
|              | University of Oxford, Research Fellow Search Committee   | 2013                       |  |
|              | University of Oxford, Research Fellow Search Committee   | 2013                       |  |
|              | Workshops (Organizer or co-organizer)  |                            |  |
|              | Santa Fe Institute Complex Systems Summer School the Santa Fe Institute, NM  | 1                          |  |
|              | organised with David Feldman   | June 17-18 2024            |  |
|              | From Cells to Societies: Regulatory Mechanisms the Santa Fe Institute, NM  |                            |  |
|              | organised with V. Yang, G. West, C. Kempes, and S. Redner  | June 13-15 2023            |  |
|              | The Structure of Technology the Santa Fe Institute, NM organised with J. McNerney and R. Haussmann   | June 14-16 2022            |  |
|              | Frontiers of Physics: Push the Envelope of Statistical Physics   | Julie 14-10 2022           |  |
|              | APCTP Headquater, Pohang, Korea  |                            |  |
|              | organised with W. Jung, S. Son, J. Jo  | Dec 12-14, 2016            |  |
|              | Building an integrated framework for innovation, organiztions, and society   |                            |  |
|              | Caucus session at Academy of Management (AOM), Anaheim, CA, USA  | A . 0 2016                 |  |
|              | organised with K. Kim  Networks and technology evolution,  | Aug 8, 2016                |  |
|              | Satellite Workshop at NetSci16, Seoul, Korea   |                            |  |
|              | organised with J. McNerney, I. Rahwan, and C. Hidalgo  | May 30, 2016               |  |
|              | Technological change,  | •                          |  |
|              | the satellite meeting at the Conference of Complex System (CCS'15)   |                            |  |
|              | Arizona State University, USA  | 0 20 204=                  |  |
|              | organised with J. Alstott, B. Yan, F. Lafond, G. Triulzi   | Sep 30, 2015               |  |
|              | Theory and practice of innovation: Different perspectives under the same nam University of Oxford, UK  | E                          |  |
|              | organised with L. Bloom (Oxford) and G. Zanello (Oxford)   | Feb 27, 2015               |  |
|              | of Landid (Official)   | _ 20,                      |  |

#### **TEACHING & Advising & Co-advising ADVISING &** Dawoon Jeong (postdoc), Kellogg, Northwestern 2024 - current **FUNDING** Moh Hosseinioun (postdoc), Kellogg, Northwestern 2023 - current Seolmin Yang (postdoc), Kellogg, Northwestern 2024 - current James Holehouse (postdoc), Santa Fe Institute 2022 - current Seoul Lee (PhD candidate), Kellogg, Northwestern 2022 - current Shambhobi Bhattacharya (PhD candidate), IEMS, Northwestern 2023 - current Sari Eisen (Undergrad), Math. Methods in the Social Sciences, Northwestern 2022 - current Ohyun Kwon (PhD candidate, co-advising), Physics, Postech 2022 - current Megan Chan (PhD candidate, co-advising), IEMS, Northwestern 2022 - 2024Jisung Yoon (postdoc), Kellogg, Northwestern (now KDI faculty) 2022 - 2024Taekyun Kim (postdoc), Northwestern (now postdoc SKEMA Business School) 2022 - 2024Moh Hosseinioun (PhD candidate, co-advising), MIS, UIC (now at Northwestern) 2019 - 2023Seolmin Yang (PhD candidate, co-advising), STP, KAIST (now at Northwestern) 2019 - 2023JiHae Choi (PhD candidate), Kellogg, Northwestern (now at Northwestern) 2022 - 2022Jaehyuk Park (postdoc), Inforamtion Science, IU Bloomington (now KDI faculty) 2020 - 2021Daehyun Kim, PhD in BTM, KAIST (now at Max Planck) 2019 - 2022Frank Van der Wouden, PhD in Economic Geography, UCLA (HKU faculty) 2018 - 20192016 - 2019Hyunuk Kim, PhD in Industrial & Management Eng., Postech (now BU faculty) Hee Youn Kwon (postdoc), PhD in Systems & Entrepreneurial Engineering, UIUC 2018 - 2019Inho Hong, PhD in Physics, Postech (now faculty at Chonnam National University) 2016 – 2018 Taehun Kim, Ms in Computer Science, Northwestern University 2019 - 2020Minjin Lee, PhD in Energy Science, SKKU 2016 - 2017Alex McCormick, Undergraduate in Physics, University of Oxford 2015 - 2016Daniel Burkhardt Cerigo, Undergraduate in Physics, University of Oxford 2015 - 2016Daniel Kim, PhD in Physics, KAIST 2016 Ross Richardson, PhD in Finance, UCL 2016 Lecture Social Dynamics Network Analysis, Kellogg School of Management at Northwestern 2018-2024 The Oxford Summer School in Economic Networks, Oxford, UK 2024 2019-2024 The Santa Fe Institute Complex Systems Summer School, Santa Fe, NM The Summer Institute in Computational Social Science (SICSS), KAIST 2022 CIFS Research Boot Camp on Innovation and Entrepreneurship, KAIST 2019-2022 The New England Complex Systems Institute Winter School, Cambridge, MA 2019-2021 Guest lecture: MIT (2016), KAIST (2016), Oxford (2015), UNM (2013) 2016-2017 Network Analysis of UK Patent Data (MSc), University of Oxford 2016 Physics and Urban Scaling (Undergraduates), University of Oxford 2014

**Teaching Assistant** 

Thermodynamics, KAIST General Physics II, KAIST

General Physics I, KAIST

Statistical Mechanics, KAIST (best teaching award in the department)

2005 2005

2004

2004

| OTHER    | Northwestern Summer Grant (#OUR-SUMMER-18163)                                     | 2023     |
|----------|---|----------|
| HONORS   | Bridge Grant for Young Researchers of the Complex Systems Society                 | 2021     |
| & AWARDS | Northwestern Faculty Recognition List   | 2020     |
|          | Northwestern the Provost Faculty Mentoring Program                                | 2020     |
|          | Northwestern Kellogg Certificate of Impact  | 2019     |
|          | London Mathematical Laboratory Fellowship 2                                       | 017-2020 |
|          | Royal Society for Arts Fellowship 2   | 017-2020 |
|          | NSF SciSIP award 2  | 013-2016 |
|          | D4D (Data for Development) Challenge from Orange (Mobile phone data in Ivory Coas | t) 2012  |
|          | Congress Fellowship of XVI International Congress on Mathematical Physics         | 2009     |
|          | The Best prize of CYRAM Social Network Analysis competition                       | 2008     |
|          | Springer Prize for the Best Presentation at APPC10                                |          |
|          | (The 10th Asia Pacific Physics Conference)  | 2007     |
|          | Distinguished Teaching Award, Dept. of Physics                                    | 2007     |
|          | The Best Student of the Year 2001, Dept. of Physics                               | 2001     |

#### **MEDIA**

**The Guardian** "The big idea: What's the secret of innovation" Jan 9, 2023

NBC News "Manufacturers embrace robots, the perfect pandemic worker" Apr 8, 2021

**Business Insider** "The pandemic could accelerate job automation — here's how the change would impact cities, the labor force, and inequality" Apr 13, 2021

WIRED "Robots will take jobs from men, the young, and minorities" Jan 24, 2019

**Bloomberg** "Self-driving cars might kill auto insurance as we know it" Feb 19, 2019

**New Scientist** "Automation will have a bigger impact on jobs in smaller cities," May 15 2017

Nature "Languages have common structure," Nature 530, 133, 2016

### The Economist:

"The process of invention: Now and then," April 25, 2015

"Queuing conundrums," September 13, 2008

Nature Physics "Innovation Slowdown," Mark Buchanan, 11, 2, 2015

#### **Kellogg Insight**

"10 years from now," Dec, 2023

"The Pandemic Could Accelerate Job Automation—and Inequality," March, 2022

"Could a Small City Become the Next Silicon Valley? It's Unlikely," Sep, 2020

"How Will Automation Affect Different U.S. Cities?," Apr, 2018

#### MIT Technology Review:

"In these small cities, AI advances could be costly," Oct 23, 2017

"Data Mining 200 Years of Patent Office Records To Reveal The Nature of Invention," June 16, 2014

**Forbes** "The hidden universal rule that helps govern the way businesses grow in a city, " Feb 10, 2016

Smart Planet "How will our cities grow?" July 27, 2011

**NEXT CITY: Science of Cities** "When it comes to making money, Big Data reveals cities have a pattern" Jan 29, 2016

National Geographic "Do languages 'think' alike?" Feb, 2016

**QUARTZ** "Scientists say the ways humans describe nature transcends culture and geography" Feb 2016

Scientific American "Detours by Design" January, 2009

**CIO** "The coming IT job apocalypse: Rise of the machines" May 28, 2019

**Others**: Gizmodo, Phys.org, News and Tribune, Ars technica, SpringerOpen, National Geography, Mathematical Institute at the University of Oxford, News in Santa Fe Institute, Highlights in PNAS, Next City.

| KEYNOTE,       |
|----------------|
| COLLOQUIUM,    |
| INVITED, PANEL |

| Computational Social Science, University of Chicago                   | Feb, 2024   |
|---|-------------|
| Organizational Behavior Seminar, Stanford GSB                         | Nov, 2023   |
| TIE Seminar, MIT Sloan, MA  | Nov, 2023   |
| Theoretical Organizational Models (TOM) Summer School, HBS, MA        | Aug, 2023   |
| Santa Fe Institute Complex Systems Summer School, NM                  | June, 2023  |
| ANN-SONIC-NICO 10th International Workshop on Network Theory, Kellogg | May, 2023   |
| Strategy Seminar, Seoul National University, Korea                    | April, 2023 |
| Complex Network Seminar, Indiana Bloomington, IN                      | April, 2023 |
| DINS Seminar Series, Pittsburgh, PA                                   | Mar, 2023   |
| GrowthLab Seminar, Harvard, MA  | Mar, 2023   |
| Complexity Speaer Series, Northeastern, MA                            | Mar, 2023   |
| The Psychology of Collectives, SPSP Annual Convention, Atlanta        | Mar, 2023   |
| 2022 (invited & keynote)  |             |
| Computational Social Science Seminar, Yale, CT                        | Nov, 2022   |
| MORS Colloquium, Haas, UC Berkeley, CA                                | April, 2022 |
| Modelling an Evolving Economy, Digital Catapult, London, UK           | Oct 7, 2022 |

#### 2021 (invited & keynote)

Social Computing at IEEE WIC ACM; Conference on Complex Systems (keynote), Lyon, France; Artificial Intelligence and the Future of Lawyering and Law Firms, Northwestern;

#### 2020 (invited & keynote)

MIT Media Lab; Korea Academy of Complexity Studies; NSF workshop on Future of Work (panel); AI Institute at Northwestern University; University of Chicago

#### 2019 (invited & keynote)

Federal University of Parana - UFPR, Brazil; The Conference on Complex Systems 2019 (invited), Sngapore; Satellite meeting of CCS2019 (invited), Singapore; Santa Fe Institute ACtioN, San Francisco, CA; Johns Hopkins University; NetSci 2019 (keynote), University of Vermont; The Future of work, Microsoft Faculty Summit 2019, Redmond, WA; Academy of Management (invited), Boston; CIFS workshop, KAIST; INET, University of Southern California

#### 2018 (invited & keynote)

Royal Statistical Society, London; Salesforce, San Francisco; International Conference on Artificial Life (keynote), Tokyo, Japan; Engineering Sciences & Applied Mathematics, Northwestern University; Civil & Environmental Engineering, Northwestern University; Northwestern Institute on Complex Systems, Northwestern University; Industrial Engineering & Management Science, Northwestern University; Universite de Lorraine, France; Santa Fe Institute, NM;

#### 2017 (invited & keynote)

Conference on Complex Systems (invited); MIT; Northeastern University; Santa Fe Institute; Updating the Production Function for the Algorithmic Economy, Menlo Park, CA; KAIST; 2017 KDD Workshop on Datadriven Discovery (keynote); Indiana University Bloomington

## 2016 (invited &keynote)

Cities as complex systems symposium (VW-Foundation), Germany; Postech; Korea Land & Housing Institute; Complexity Science HUB, Vienna;

#### 2015 (invited & keynote)

Merck KGaA, Darmstadt, Germany; Urban Innovation Centre, UK; University of Cambridge; The Future of Fund Management, UK

#### 2014 (invited & keynote)

Seoul National University; UCL; Kavli Royal Society International Centre, UK; the Ettore Majorana Centre, Erice, Italy; Harvard University; the Museum of London, UK