Graduate School of Data Science Seoul National University Bldg 942, Research Park, 1 Gwanak-ro Seoul, Republic of Korea

Email: lee7801@snu.ac.kr Web: www.leelabsg.org

#### **Research Interests**

Statistical Genetics; Genomics; Health Data Science; Precision Health; Statistics; Machine Learning/AI; Biobank; EHR

# Employment

Professor (with tenure), Graduate School of Data Science, Seoul National Univ	versity
	2023 - present
Associate Professor (with tenure), Graduate School of Data Science, Seoul Na	tional University
	2020 - 2023
Associate Professor (with tenure), Department of Biostatistics, University of	Michigan
	2018 - 2020
Assistant Professor, Department of Biostatistics, University of Michigan	2013 - 2018
John G Searle Assistant Professor, Department of Biostatistics,	
University of Michigan	2017 - 2018
Education and Training	
	0010 0019
Research Fellow, Harvard School of Public Health	2010 - 2013
• Mentor: Dr. Xihong Lin	
Ph.D., Biostatistics, University of North Carolina at Chapel Hill	2010
• Dissertation: "Principal Component Analysis for High Dimensional Data, Genomewide-association studies"	Application for
• Advisors: Dr. Fei Zou and Dr. Fred A. Wright	
B.S., Biology and Statistics, Seoul National University, Korea	2005
Experience	
<b>Research Assistant</b> , University of North Carolina, Chapel Hill, NC	2006 - 2010
Software Engineer, ECO Inc., Korea	2000 - 2004
Honor and Awards	
Lawrence F. Chinala Distinguished Alamani Associational UNIC Distance (1990)	
<ul> <li>James E. Grizzle Distinguished Alumni Award, UNC Biostatistics. 2017</li> <li>NIH Pathway to Independence Award (K99/R00). 2012</li> <li>Delta Omega Honorary Society. 2011</li> </ul>	
• Denta Omega Honorary Dociety. 2011	

- IMS Laha Travel Award. 2010
- Special Commendation for Highest Score in Qualifying Exam, Biostatistics. 2007

- Greenberg Fellowship. 2005
- Merit Assistantship. 2005-2006
- Worak institution Scholarship. 1999,2000
- Merit based Tuition Scholarship. 1996,1997

#### Publications

#### Peer reviewed journal publications

- Wenjian Bi, Wei Zhou, Peipei Zhang, Yaoyao Sun, Weihua Yue, Seunggeun Lee (2023) Scalable mixed model methods for set-based association studies on large-scale categorical data analysis and its application to exome-sequencing data in UK Biobank American Journal of Human Genetics, 110 (5), 762-773
- Jangho Kim<sup>\*</sup>, Junhyeong Lee<sup>\*</sup>, Kisung Nam, Seunggeun Lee (2023) Genome-wide study on 72,298 Korean individuals in Korean biobank data for 76 traits identifies hundreds of novel loci, *Scientific Reports*, 13 (1), 1526
- 3. Adrian I. Campos, Shinichi Namba, ..., **Seunggeun Lee** ..., Loic Yengo (2023) Boosting the power of genome-wide association studies within and across ancestries by using polygenic scores, *Nature Genetics*, In press
- 4. Wei Zhou, Wenjian Bi, Zhangchen Zhao, Kushal K Dey, Karthik A Jagadeesh, Konrad J Karczewski, Mark J Daly, Benjamin M Neale, Seunggeun Lee (2022) SAIGE-GENE+ improves the efficiency and accuracy of set-based rare variant association tests Nature Genetics, 54 (10), 1466-1469
- Kisung Nam<sup>\*</sup>, Jangho Kim<sup>\*</sup>, Seunggeun Lee (2022) Genome-wide study on 72,298 Korean individuals in Korean biobank data for 76 traits identifies hundreds of novel loci, *Cell Genomics*, 2 (10), 100189
- Zhangchen Zhao\*, Lars G Fritsche, Jennifer A Smith, Bhramar Mukherjee, Seunggeun Lee (2022) The Construction of Multi-ethnic Polygenic Risk Score using Transfer Learning *American Journal of Human Genetics*, 109 (11), 1998-2008
- Yongwen Zhuang<sup>\*</sup>, Brooke N Wolford, Kisung Nam, Wenjian Bi, Wei Zhou, Cristen J Willer, Bhramar Mukherjee, Seunggeun Lee (2022) Incorporating family disease history and controlling case-control imbalance for population-based genetic association studies, *Bioinformatics*, 38, 4337-4343
- 8. Wei Zhou, et al (2022) Global Biobank Meta-analysis Initiative: Powering genetic discovery across human disease, *Cell Genomics*, 2 (10), 100192
- Rounak Dey, Wei Zhou, et al (2022) Efficient and accurate frailty model approach for genome-wide survival association analysis in large-scale biobanks *Nature Communications*, 13 (1), 1-13
- 10. Masahiro Kanai, et al (2022) Meta-analysis fine-mapping is often miscalibrated at singlevariant resolution, *Cell Genomics*, 2 (10), 100210

- 11. Vivek Sriram, Manu Shivakumar, Sang-Hyuk Jung, Yonghyun Nam, Lisa Bang, Anurag Verma, **Seunggeun Lee**, Eun Kyung Choe, Dokyoon Kim (2022) NETMAGE: A human disease phenotype map generator for the network-based visualization of phenome-wide association study results *GigaScience*, 11
- Jiacong Du, Lauren J Beesley, Seunggeun Lee, Xiang Zhou, Walter Dempsey, Bhramar Mukherjee (2022) Optimal diagnostic test allocation strategy during the COVID-19 pandemic and beyond *Statistics in medicine*, 41, 310-327
- 13. Jingchunzi Shi<sup>\*</sup>, Michael Boehnke, **Seunggeun Lee** (2021) Trans-ethnic meta-analysis of rare variants in sequencing association studies, *Biostatistics*, 22, 706-722
- 14. Zhangchen Zhao\*, Stephen Salerno, Xu Shi, **Seunggeun Lee**, Bhramar Mukherjee, Lars G Fritsche (2021) Understanding the Patterns of Serological Testing for COVID-19 Pre-and Post-Vaccination Rollout in Michigan, *Journal of clinical medicine*, 10, 4341
- Lars G Fritsche, Ying Ma, Daiwei Zhang, Maxwell Salvatore, Seunggeun Lee, Xiang Zhou, Bhramar Mukherjee (2021) On cross-ancestry cancer polygenic risk scores, *PLoS genetics*, 17, e1009670
- 16. Seungjin Ryu, Jeehae Han, Trina M Norden-Krichmar, Quanwei Zhang, Seunggeun Lee, Zhengdong Zhang, Gil Atzmon, Laura J Niedernhofer, Paul D Robbins, Nir Barzilai, Nicholas J Schork, Yousin Suh (2021) Genetic signature of human longevity in PKC and NF-kB signaling, *Aging cell*, 20, e13362
- Wenjian Bi\*, Seunggeun Lee (2021) Scalable and Robust Regression Methods for Phenome-Wide Association Analysis on Large-Scale Biobank Data, Frontiers in Genetics, 12, 682638
- Wenjian Bi\*, Wei Zhou, Rounak Dey, Bhramar Mukherjee, Joshua N Sampson, Seunggeun Lee (2021) Efficient mixed model approach for large-scale genome-wide association studies of ordinal categorical phenotypes, *American Journal of Human Genetics*, 108, 5-6
- 19. Yatong Li, **Seunggeun Lee** (2021) Novel score test to increase power in association test by integrating external controls, *Genetic Epidemiology*, 45, 293-304
- 20. Diptavo Dutta\*, Peter VandeHaar, Lars G Fritsche, Sebastian Zöllner, Michael Boehnke, Laura J Scott, Seunggeun Lee (2021) A powerful subset-based method identifies gene set associations and improves interpretation in UK Biobank, American Journal of Human Genetics, 108, 669-681
- 21. Bi., W.\*, Fritsche, L.G., Mukherjee, B., Kim, S., Lee, S. (2020) A Fast and Accurate Method for Genome-Wide Time-to-Event Data Analysis and Its Application to UK Biobank, *American Journal of Human Genetics*, 207, 222-233
- Zhou, W.\*#, Zhao, Z.\*#, Nielsen, J.B, Fritsche, L.G., LeFaive, J., Gagliano Taliun, S.A., Bi, W., Gabrielsen, M.E., Daly, M.J., Neale, B.M., Hveem, K., Abecasis, G.R., Willer, C.J., Lee, S. (2020) Scalable generalized linear mixed model for region-based association tests in large biobanks and cohorts, *Nature Genetics*, 52, 634–639

 $^{\#}Equal \ contribution$ 

- 23. Zhao, Z.\*, Bi, W.\*, Zhou, W., VandeHaar, P., Fritsche, L.G., Lee, S. (2020) UK-Biobank Whole Exome Sequence Binary Phenome Analysis with Robust Region-based Rare Variant Test, American Journal of Human Genetics, 106, 3-12
- 24. Shi, J.\*, Boehnke, M., Lee, S. (2020) Trans-ethnic meta-analysis of rare variants in sequencing association studies, *Biostatistics*, in press, doi:https://doi.org/10.1093/biostatistics/kxz061
- 25. Zhang, D.\*, Dey, R., Lee, S. (2020), Fast and robust ancestry prediction using principal component analysis, *Bioinformatics*, in press, preprint: https://doi.org/10.1101/713172
- 26. Bi, W.\*, Zhao, Z.\*, Dey, R., Fritsche, L.G., Mukherjee, B., Lee, S. (2019) A Novel Method for Genome-Wide Scale Phenome-Wide GxE Analysis and its Application to UK Biobank, *American Journal of Human Genetics*, 105, 1182-1192
- 27. Dutta, D.\*, Gagliano Taliun, S.A., Weinstock, J.S., Zawistowski, M., Sidore, C., Fritsche, L.G., Cucca, F., Schlessinger, D., Abecasis, G.R., Brummett, C.M., Lee, S. (2019) Meta-MultiSKAT: Multiple phenotype meta-analysis for region-based association test, *Genetic Epidemiology*, in press
- Dey, R.\*, Nielsen, J.B., Fritsche, L.G., Zhou, W., Zhu, H., Willer, C.J., Lee, S. (2019) Robust meta-analysis of biobank-based genome-wide association studies with unbalanced binary phenotypes, *Genetic Epidemiology*, doi:https://doi.org/10.1002/gepi.22197
- 29. Dey, R.\*, and Lee, S. (2019) Asymptotic properties of principal component analysis and shrinkage-bias adjustment under the generalized spiked population model, *Journal of Multivariate Analysis*, doi:https://doi.org/10.1016/j.jmva.2019.02.007
- 30. Chen, H, Huffman, J.E., [... including Lee, S., ...], Lin, X (2019) Efficient variant set mixed model association tests for continuous and binary traits in large-scale whole-genome sequencing studies, *American Journal of Human Genetics*, 104, 260-274
- 31. Graham, S.E., Nielsen, J.B., [... including **Lee**, **S.**, ...], Willer, C.J. (2019) Sex-specific and pleiotropic effects underlying kidney function identified from GWAS meta-analysis, *Nature Communication*, in press
- 32. Zhou, W.\*, Nielsen, J.B., Fritsche, L.G., Dey, R., Elvestad, M.B., Wolford, B.N., LeFaive, J., VandeHaar, P., Gagliano, S.A., Gifford, A., Bastarache, L.A., Wei, W-Q, Denny, J.C., Lin, M., Hveem, K., Kang, H.M., Abecasis, G.R., Willer, C.J.<sup>#</sup>, Lee, S.<sup>#</sup> (2018) Efficiently controlling for case-control imbalance and sample relatedness in large-scale genetic association studies, *Nature Genetics*, 50, 1335-1341 <sup>#</sup>Equal contribution
- Dutta, D.\*, Scott, L., Boehnke, M., Lee, S. (2018) Multi-SKAT: General framework to test multiple phenotype associations of rare variants, *Genetic Epidemiology*, 43(1), 4-23
- 34. Yu, Y., Xia, Lu, Lee, S., Zhou, X., Stringham, H.M., Boehnke, M., Mukherjee, B. (2018) Subset-Based Analysis using Gene-Environment Interactions for Discovery of Genetic As-

sociations across Multiple Studies or Phenotypes, *Human Heredity*, in press

- Nielsen, J.B., Thorolfsdottir, R.B., [... including Lee, S. , ...], Willer, C.J. (2018) Biobankdriven genomic discovery yields new insight into atrial fibrillation biology, *Nature Genetics*, 50, 1234-1239
- 36. Dey, R.\*, Schmidt, E.M., Abecasis, G.R., Lee, S. (2017) A fast and accurate algorithm to test for binary phenotypes and its application to PheWAS, *American Journal of Human Genetics*, 101, 37-49
- Lee, S., Sun, W., Wright, F.A., Zou, F. (2017) An improved and explicit surrogate variable analysis procedure by coefficient adjustment, *Biometrika*, 104, 303-316
- 38. Lee, S., Kim, S., Fuchsberger, C. (2017) Improving power for rare variant tests by integrating external controls, *Genetic Epidemiology*, 41, 610-619
- 39. He, Z.\*, Zhang, M., Lee, S., Smith, J.A., Kardia, S., Diez Roux, A.V., Mukherjee, B. (2017) Set-based tests for gene-environment interaction in longitudinal studies, *Journal of the American Statistical Association*, 101, 340-352
- 40. He, Z.\*, Lee, S., Zhang, M., Smith, J.A., Guo, X., Palmas, W., Kardia, S., Iuliana, I., Mukherjee, B. (2017) Rare-variant association tests in longitudinal studies, with an application to the Multi-Ethnic Study of Atherosclerosis (MESA), *Genetic Epidemiology*, 41, 801-810
- He, Z., Xu, B., Lee, S., Ionita-Laza, I. (2017) Unified sequence-based association tests allowing for multiple functional annotation scores, and applications to meta-analysis of noncoding variation in Metabochip data, *American Journal of Human Genetics*, 101, 340-352
- 42. Schmidt, E.M., Fritsche, L.G., Lee, S., VandeHaar, P., Brummett, C.M., Kheterpal, S., Abecasis, G.R. (2017) The Michigan Genomics Initiative: A Model Framework for Genetic Discovery Using Patient Electronic Health Records, *Genetic Epidemiology*, 41, 676-677
- 43. Liu, G., Mukherjee, B., Lee, S., Lee, A.W, Wu, A.H., Bandera, E.V., Jensen, A., Rossing, M.A, Moysich, K.B., Chang-Claude, J., Doherty, J., Gentry-Maharaj, A., Kiemeney, L., Modugno, F., Massuger, L., Goode, E.L., Fridley, B., Terry, K.L., Cramer, D.W., Anton-Culver, H., Ziogas, A., Tyrer, J.P., Schildkraut, J.M., Kjaer, S.K., Webb, P.M., Ness, R.B., Pike, M.C., Menon, U., Berchuck, A., Pharoah, P.D., Risch, H., Pearce, C.L, the Ovarian Cancer Association Consortium (2017) Robust Tests for Additive Gene-Environment Interaction in Case-Control Studies Using Gene-Environment Independence, *American Journal of Epidemiology*, 187, 366-377
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- 46. X Wang, Z Zhang, N Morris, T Cai, **S Lee**, C Wang, TW Yu, CA Walsh, X Lin. (2016) Rare variant association test in family based sequencing studies, *Briefings in Bioinformatics*, bbw083.
- 47. Shi, J.\* and Lee, S. (2016) A novel random effect model for GWAS meta-analysis and its application to trans-ethnic meta-analysis, *Biometrics*, 72(3):945-54
- Lee, S., Fuchsberger, C., Kim, S., Scott, L. (2016) An efficient resampling method for calibrating single and gene-based rare variant association analysis in case-control studies, *Biostatistics*, 17, 1-15.
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- 53. Urrutia, E., Lee, S., Maity, A., Zhao, N., Shen, J., Li, Y., Wu, M.C. (2015) Rare variant testing across methods and thresholds using the multi-kernel sequence kernel association test (MK-SKAT), *Statistics and Its Interfaces*, 8, 495-505.
- He, Z.\*, Zhang, M., Lee, S., Smith, JA, Guo, X., Palmas, W., Kardia, S., Rouz, A, Mukherjee, B. (2015) Set-based tests for genetic association in longitudinal studies, *Biometrics*, 71, 606-15
- 55. He, Z.\*, Payne, EK, Mukherjee, B., Lee, S., Smith, JA, Ware, EB, Sanchez, BN, Seeman, TE, Kardia, S, Roux, A. (2015) Association between stress response genes and features of diurnal cortisol curves in the Multi-Ethnic Study of Atherosclerosis: a new multi-phenotype approach for gene-based association tests, *Plos One*, 10(5):e0126637
- 56. Lee, S. Abecasis, G., Boehnke, M., Lin, X. (2014) Rare-Variant Association Analysis: Study Designs and Statistical Tests, *American Journal of Human Genetics*, 95, 5-23. [cite > 200]
- 57. Lee, S., Zou, F. and Wright, F.A. (2014). Convergence of sample eigenvalues, eigenvectors

and PC scores for ultra-high dimensional data, Biometrika, 101, 484-490.

- 58. Mukherjee, B., Chen, Y-H, Ko, Y-A, He, Z., Lee, S., Zhang, M., Park, SK. (2014) Statistical strategies for modeling gene-environment interactions in longitudinal cohort studies, Statistical Approaches to Gene-Environment Interactions for Complex Phenotypes, Cambridge, MA: MIT Press, in press
- Wang, X., Lee, S., Zhu, X., Redline, S., Lin, X. (2013). GEE-based SNP Set Association Test for Continuous and Discrete Traits in Family Based Association Studies, *Genetic Epidemiology*, 37:778-786.
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- 61. Ionita-Laza, I.<sup>#</sup>, Lee, S.<sup>#</sup>, Makarov, V., Buxbaum, J. Lin, X. (2013). Sequence kernel association tests for the combined effect of rare and common variants, *American Journal of Human Genetics*, 92, 841-853. [cite > 100]
  <sup>#</sup> Joint first author
- Lin, X., Lee, S., Christiani, D. and Lin, X. (2013). Test for interactions between a Gene/SNP-set and Environment/Treatment in generalized linear models, *Biostatistics*, doi: 10.1093/biostatistics/kxt006.
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- Lee, S., Wu, M. and Lin, X. (2012). Optimal tests for rare variant effects in sequencing association studies. *Biostatistics*, 13, 762-775. [cite > 200]
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\* doctoral student/research assistant under my supervision

# Grants

# Current

BP+ 2020H1D3A2A03100666 (NRF of Korea), "Genomic data science methods and system for precision health", (PI: Lee), 07/01/20-12/31/23 Role: Principal Investigator

R01-HG-008773-01 (NIH), "Statistical and computational methods for rare variant association analysis", (PI: Mukherjee), 05/17/16-04/30/21 Role: Subcontract Principal Investigator.

R01-LM-012535-01 (NIH), "Integrating Neuroimaging, Multi-omics, and Clinical Data in Complex Disease", (Subcontract PI: Lee), 05/17/16-04/30/21 Role: Subcontract Principal Investigator.

# Past

R01-HL142023-01 (NIH), "Integrative analysis to uncover biology of blood lipids and coronary heart disease", (PI: Lee, Willer and Zhou), 05/01/18-04/30/20 Role: Principal Investigator (Contact PI)

R00-HL-113164-03 (NIH), "Statistical methods for rare variant effects in sequencing association studies", (PI: Lee), 09/01/13-06/30/17 Role: Principal Investigator.

K99-HL113164 (NIH), "Statistical methods for rare variant effects in sequencing association studies", (PI: Lee), 06/2012 - 08/2013 Role: Principal Investigator.

3U01DK082345-08S1 (NIH), "University of Michigan MAPP research network discovery site", (PI: Clauw) Role: Co-investigator

U01 HL137182-01 (NIH), "Scalable and Translational Analysis Tools on the Cloud for Deep Integrative Omics Data", (PI: Kang), 04/15/17-03/31/20 Role: Co-investigator

5216271-5500000816/1-U01-DK-105554-01 (NIH), "Proposal for the AMP T2D-GENES Data Coordination Center and Web Portal", (PI: Boehnke), 05/01/15-05/31/17 Role: Co-investigator

R01-HL117626 (NIH), "Studies of Rare Genetic Variation in the Isolated Population of Sardinia", (PI: Abecasis), 01/15/13-12/31/17 Role: Co-investigator

# Paper/Poster Presentations

#### **Invited Presentations**

- 1. "Biobank data and analysis methods", KOBIO registry, 2022
- 2. "Biobank data and analysis methods", Department of Statistics Seminar, Sookmyung Women's University, 2022
- "Biobank data and analysis methods", Department of Statistics Seminar, Chung-Ang University, 2022
- 4. "The Construction of Multi-ethnic Polygenic Risk Score using Transfer Learning", Korean Statistical Society Meeting, 2022
- 5. "Biobank data and analysis methods", SAIHST, 2022
- 6. "Biobank data and analysis methods", Yonsei University College of Medicine, 2022
- 7. "Biobank data and analysis methods", SNU School of Dentistry, 2022
- "Set-based rare variant association tests for biobank scale data", Genomics at Columbia (Columbia University), 2022
- 9. "Set-based rare variant association tests for biobank scale sequencing data sets", Korean Statistical Society Meeting, 2021
- 10. "Public DBs and New Analytic Tools, Potentials for Future Research", Korean Society of Cardiology, 2021
- 11. "Dimension reduction in high-dimensional data analysis and Two-stage PLS", EcoSTAT, 2021
- 12. "Biobank data analysis, with consideration on strategies for privacy protection", KOSHIS meeting, 2020
- 13. "Make Biobank Data in action", KoNECT International Conference, 2020
- 14. "Scaleable and accurate rare variant test for big biobank data analysis", IBC, 2020
- 15. "Scalable and accurate association analysis of big biobank data", JSM, July, 2019
- 16. "Integrating external controls to association test', ENAR, Mar, 2019
- 17. "Scalable and accurate analysis of big genetics and biomedical data", Seoul National University, Jan, 2019
- 18. "Scalable and accurate association analysis of Biobank data", PQG Conference, Nov, 2018
- 19. "Statistical methods for Biobank data analysis", JSM, Aug, 2018

- 20. "Statistical methods and tools for analyzing 100,000 samples", ENAR, May, 2018
- 21. "PCA in the high-dimensional genetics data", Department of Biostatistics Seminar, University of North Carolina, April, 2017
- 22. "Improving power for rare variant tests by integrating external controls", ICSA Conference, December, 2016
- 23. "Statistical methods for large scale genetics data analysis", Joint Conference of Korean FDA and Biostatistical society, December, 2016
- 24. "Asymptotic properties of PCA and shrinkage-bias adjustment in high-dimensional data", Department of Statistics Seminar, Michigan State University, September, 2016
- 25. "Improving power for rare variant tests by integrating external controls", IISA Conference, August, 2016
- 26. "Improving power for rare variant tests by integrating external controls", JSM, August, 2016
- "Statistical Methods For Rare Variant Association Analysis", Center for Systems Genomics, Penn State University, May, 2015
- "Convergence of principal component scores in high dimensional setting", Department of Statistics Seminar, Younsei University, Korea, July, 2014
- 29. "Rare Variant Analysis in Sequencing-based Association Studies", Department of Biostatistics Seminar, Washington University in St.Louis, December, 2013
- "Rare Variant Analysis in Sequencing-based Association Studies", Department of Biostatistics Seminar, University of Minnesota, October, 2013
- "Rare Variant Analysis in Sequencing-based Association Studies", Department of Biostatistics Seminar, Columbia University, October, 2013
- 32. "Rare Variants Analysis in Sequencing Studies", ICSA, Boston, MA, June 2012.
- 33. "Rare Variant Association Analysis for Sequencing Data with the Kernel Association Tests", Department of Biostatistics Seminar, University of Michigan, March, 2012
- "Statistical methods for high dimensional genomic data", Department of Biostatistics Seminar, University of Pittsburgh, March, 2012
- 35. "Rare Variant Association Analysis for Sequencing Data with the Kernel Association Tests", Department of Biostatistics Seminar, FHCRC, Feburary, 2012
- "Statistical methods for high dimensional genomic data", Department of Biostatistics Seminar, University of Pittsburgh, March, 2012

- "Statistical methods for high dimensional genomic data", Department of Biostatistics Seminar, NCSU, January, 2012
- 38. "Rare Variant Association Testing for Sequencing Data Using the Sequence Kernel Association Test", PQG Short Course, HSPH, Boston, MA, December 2011.
- 39. "Rare Variant Association Testing for Sequencing Data Using the Sequence Kernel Association Test", PMAGE Seminar Series, HSPH, Boston, MA, September 2011.
- 40. "Rare Variant Association Testing for Sequencing Data Using the Sequence Kernel Association Test", New England Statistics Symposium, Storrs, CT, April 2011.
- 41. "Principal Component Analysis in High Dimensional Data: Application to Genome-wide Association Studies", High dimensional data seminar series. HSPH, MA, October 2010.

#### Other Presentations

- 1. "General framework for meta-analysis of rare variants in sequencing association studies", ENAR, Orlando, FL, March 2013.
- 2. "General framework for meta-analysis of rare variants in sequencing association studies", PQC Conference, Boston, MA, November 2012.
- 3. "General framework for meta-analysis of rare variants in sequencing association studies", ASHG meeting, San Francisco, CA, November 2012.
- 4. "Convergence and prediction of principal component scores in high dimensional and ultra high dimensional settings", JSM, Miami, FL, August 2011.
- 5. "Convergence and prediction of principal component scores in high dimensional settings", ENAR, New Orleans, LA, March 2010.
- 6. "Principal component score prediction for related and unrelated GWA samples", ASHG meeting, Honolulu, HI, October 2009.
- 7. "Control of Population Stratification by Correlation-selected principal components", ASHG meeting, Philadelphia, PA, November 2008.
- 8. "Control of population stratification using correlated SNPs by shrinkage Principal components", Gain Analysis Workshop III, Philadelphia, PA, November 2008.
- 9. "Preliminary result for association study", Carolina Center for Exploratory Genetic Analysis meeting, Chapel Hill, NC, November 2006.

#### Short course

- 1. "Rare variant association analysis", STOM: Genomics workshop, Seoul, Korea, December 2016.
- 2. "Analysis of Genetic Association Studies Using Sequencing Data and Related Topics",

STOM: Genomics workshop, Seoul, Korea, July 2014.

3. "Analysis of Genetic Association Studies Using Sequencing Data and Related Topics", ICSA-KISS meeting, Portland, OR, June 2014.

#### Software Developed

#### SKAT

- R-package for SNP-set (Sequence) Kernel Association Test (SKAT)
- Downloaded > 170000

#### MetaSKAT

- R-package for meta-analysis burden test, SKAT and SKAT-O
- Downloaded > 80000

#### SAIGE

- R-package for logistic mixed effect model with large sample sizes

### POLMM

- R-package for GWAS of proportional odds model for categorical phenotypes

#### iECAT

- R-package for integrating external controls to association tests

#### SPAtest

- R-package for fast saddle point approximation based score test

### $\mathbf{dSVA}$

- R-package for fast saddle point approximation based score test

### TransMeta

- R-package for trans-ethnic meta-analysis

### EigenCorr

- R-package for selecting principal components for adjusting population stratification.

### Academic Service

- Peer Review: Nature, Nature Genetics, Nature Methods, Nature Communications, Cell Genomics, American Journal of Human Genetics, JASA, Biometrics, Biostatistics, Genetics, PLOS Genetics, PLOS One, Genetic Epidemiology, BMC bioinformatics, European Journal of Human Genetics, Nature Communication, Heredity and Statistics in Medicine
- Member, Program Committee, 2016 $\mathit{ENAR}$ Spring Meetings
- Organizer,  $J\!S\!M$ 2016 Invited Session
- Organizer, ICSA 2012 Invited Session
- Co-organizer, HSPH PQG short courses and tutorials, 2011-2012

# **Teaching Experience**

- BIOSTAT 830: Special topic course, Genetic Associations and Interactions 2014 - This is a special topic course on genetic associations and interactions
- BIOSTAT 651: Applied Statistics II: Extensions for Linear Regression 2015-2017 – This is a required course for the first year BIOSTAT students.
- BIOSTAT 666: Statistical Models and Numerical Methods in Human Genetics 2018-2019

   This course covers statistical methods for human genetics data analysis.

#### **Postdoctroal Researcher**

Jack Flanagan, Graduate School of Data Science, Seoul National University
 Jack is working on methods for WGS

#### PhD Students, Dissertation Committee Chair

- Kisung Nam, Graduate School of Data Science, Seoul National University
- Na Yeon Kim, Graduate School of Data Science, Seoul National University
- Seokho Jeong, Graduate School of Data Science, Seoul National University
- Jeonghyun Moon, Graduate School of Data Science, Seoul National University
- Junhyeong Lee, Graduate School of Data Science, Seoul National University
- Wonyoung Jang, Graduate School of Data Science, Seoul National University
- Chanhee Lee, Graduate School of Data Science, Seoul National University
- Hohyun Kim, Graduate School of Data Science, Seoul National University
- Changhoon Kang, Graduate School of Data Science, Seoul National University

#### Former PhD students and postdocs

- Minjung Kho (Postdoc), Visiting Faculty, Seoul National University
- Wenjian Bi (Postdoc), Assistant Professor, Peking University
- Yongwen Zhuang, Graduated 2022, Illumina
- Yatong Li, Graduated 2022, Google
- Zhangchen Zhao, Graduated 2020, Eli Lilly
- Jingchunzi Shi, Graduated 2018, 23 and Me
- Rounak Dey, Graduated 2018, Research fellow at HSPH
- Wei Zhou, Graduated 2018, Research fellow at MGH/Broad
- Diptavo Dutta, Graduated 2019, Research fellow at John's Hopkins University

### **Dissertation Committee Member**

• Clement Ma, Department of Biostatistics, University of Michigan, 2014

- Zihuai He, Department of Biostatistics, University of Michigan, 2016
- Brooke Wolford, Department of Computational Medicine and Bioinformatics, University of Michigan, 2018 -

### **Professional Affiliations**

- American Statistical Association
- Institute of Mathematical Statistics
- ENAR : Eastern North American Region, International Biometric Society
- American Society of Human Genetics