# Sang Hong Lee, Ph.D.

*Curriculum Vitae* Associate Professor in Statistical Genetics, Australian Centre for Precision Health (ACPrecH), UniSA Allied Health and Human Performance, University of South Australia.

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#### **Executive Summary**

Dr Lee has introduced paradigm-shifting concepts and tools in the context of complex trait analyses that have had a significant impact on the field, evidenced by the number of citations, 26,000 (Google Scholar) for his publications (h-index = 55). The number of citations counted since 2016 is around 20,000. The number of his peer-reviewed publications is 109 (Scopus ID 26643600700). Dr Lee has been awarded two ARC Fellowships, two ARC Discovery Projects, one ARC Linkage Infrastructure, Equipment and Facilities Grant and three NHMRC Project Grants since 2013, totaling around \$4.3M. Dr Lee has established a research group in ACPrecH and has worked on multiple projects. He has also been collaborating with many world-leading scientists. Dr Lee has vigorously planned future research projects aligned with the national priority.

# 1. Education

**Date of award:** April, 2006 **Degree:** Doctor of Philosophy at the University of New England **Title:** Fine mapping of quantitative trait loci: Statistical development and application in livestock

**Date of award:** February, 2002 **Degree**: Master of Agriculture at the University of New England

**Date of award:** February, 1998 **Degree**: Bachelor of Agriculture at DONG-A University, Pusan, Korea

# 2. Employment

**Date**: Jan, 2019 – present **Institute:** The University of South Australia **Position:** Associate Professor (level D) **Duty**: Scientific research and teaching

Date: Sep, 2017 – Dec, 2018 Institute: The University of South Australia Position: Senior Lecturer (level C) Duty: Scientific research and teaching

**Date**: Mar, 2015 – Aug, 2017

**Institute:** The University of New England **Position:** Senior Research Fellow (level C) **Duty:** Scientific research and teaching

Date: Jan, 2012 – Feb, 2015 Institute: Queensland Brain Institute, The University of Queensland Position: Research Fellow (level B) Duty: Scientific research

Date: Feb, 2009 – Dec, 2011 Institute: Queensland Institute of Medical Research Position: Post-doctoral research fellow (level A) Duty: Scientific research

Date: Feb, 2008 – Feb, 2009
Institute: Korean National Institute of Animal Science
Position: Government officer
Duty: Extension, farmer education, related agricultural research and administration

Date: April, 2006 – Feb, 2008 Institute: The University of New England Position: Post-doctoral research fellow (level A) Duty: Scientific research

Date: March, 2005 – April, 2006: Institute: The University of New England Position: Research Assistant Duty: Scientific data analysis

# 3. Awards and appointments

Finalist in the Australian Museum Eureka Prizes in the category of Scientific Research (2012) Finalist in the Australia Society of Medical Research Queensland Health and Medical Senior Researcher Award (2014) Adjunct Senior Lecturer in University of New England (2017 – 2019) Adjunct Senior Lecturer in University of Queensland (2015 – 2020) A Faculty Appointment at the South Australian Health and Medical Research Institute (SAHMRI) (2018 – 2021)

#### 4. Research support

I have been successful in obtaining multiple research grants from various funding bodies including Australian Research Council and National Health and Medical Research Council, totaling around \$4.6M.

MRFF Research Grant (MRF2007431) (2021 – 2025), 1,260K, CIC Cooperative Research Program for Agriculture Science and Technology Development (PJ0160992021) (2021 – 2022), 330K, CIA ARC Discovery project grant (DP190100766) (2019 – 2022), 410K, CIA NHMRC Project Grant (GNT1157281) (2019 – 2021), 440K, CIC ARC Future Fellowship (FT160100229) (2017-2020), 720K, CIA ARC Linkage Infrastructure, Equipment and Facilities (LE170100032) (2017), 900K, Co-investigator ARC Discovery project grant (DP160102126) (2016 – 2018), 330K, CIA NHMRC project grant (APP1087889) (2015 – 2019), 700K, CIB NHMRC project grant (APP1080157) (2015 – 2017), 344K, CIA NHMRC project grant (APP1047956) (2013 – 2015), 5560K, CIB Discovery Early Career Research Award (DE130100614) (2013 – 2015), 375K, CIA University of New England Research Assistantship (UNERA) (2003 - 2005)

# 5. Contribution to the field

As evidence of my engagement and national and international standing, I am regularly invited to provide peer review for high quality journals in the discipline and for esteemed funding agencies, and to join key professional bodies and to organise significant events in the field. These include:

#### **Editorial Board**

Associate Editor in Frontiers in Genetics, Frontiers in Plant Science, Frontiers in Ecology and Evolution, International Journal of Genomics.

#### **Referee for peer-reviewed journals**

Nature Genetics, Nature Communications, American Journal of Human Genetics, PLoS Genetics, Human Molecular, Genetics, Genetics, Current Genomics, PLoS One, BMC Genetics, Genetics Selection Evolution, Gene and many others.

#### **Referee for funding agencies**

NHMRC, ARC and Wellcome Trust/DBT India Alliance.

#### **Referee for PhD/Honours thesis**

University of Sydney, University of Queensland and University of New England

#### Organising conference and workshop

The sole organiser for the Brisbane Statistical Human Genetics Forum (October 2013) and member of the organizing committee for the summer school in animal genetics and breeding in Armidale in Feb/2005, Feb/2006 and Feb/2007.

# Consulting and other forms of knowledge exchange

I regularly participate scientific discussions via email, media and online forum, e.g. a few hundreds time per year. I have released software that helps students and researchers solve their problems in their data analyses, addressing their (numerous) demands to implement functions and methods that are necessary for them. In the process, I have also disseminated novel knowledge about specific algorithms and models. I have documented some essential components from these discussions and made available to public (MTG2 manual including 13 chapters).

#### **Resource managements**

In the genomic era, there are a number of genotype and phenotype data publicly available as a form of "big data". For example, I have managed to have access to multiple data sets from Wellcome Trust Case Control Consortium (WTCCC), therosclerosis Risk in Communities (ARIC), Framingham Heart Study (FHS), Genetic Epidemiology Research on Adult Health and Aging (GERA), Database of Genotype and Phenotype (dbGaP), UK10K and UK Biobank. I have made these data sets available to other researchers within the centre and university (following the data agreement policy, which is a part of data management). This will help enhance research capacity of the centre and university. I also regularly contribute computing facility to the institute so that other researchers in the institute can use the facility for free. For example, I contributed a computer server (~ \$30,000) in 2013, two blade servers (~ \$50,000) in 2015 and plan to purchase a blade server (~ \$50,000) in this year.

### **6. Invited Speaker/Lecturer** (Travel/accommodation expenses covered by the host)

- 1. The efficiency of designs for fine mapping of quantitative trait loci using combined linkage disequilibrium and linkage. Lee, S. H. and van der Werf, J. H. J. Bioinformatics Symposium, 1-2nd September 2003, Sydney University, Biological Informatics and Technology Centre, Australia.
- 2. Regional Training Course on Selective Breeding Gene Technologies (Korea), organized by FAO/IAEA, 3–7 April 2006.
- 3. Fine-mapping of quantitative trait loci using combined linkage disequilibrium and linkage with general pedigrees. **Lee, S. H.** and Van der Werf, J. H. J. (2007) The Association for the Advancement of Animal Breeding and Genetics 17: 376-382.
- Statistical analysis and application for animal breeding using genomic information. Lee, S.H., Kim, S., Lee, S.H., Choi, S.B., Cho, Y.M., Park, E.W., Choi, Y.L. and Lee, S.C. (2008) The 8<sup>th</sup> Congress of the Korean Society of Animal Science and Technologies 1: 139-150.
- 5. Estimating genetic variances for disease liability explained by all SNPs from case-control GWAS. **Lee, S. H.,** Wray, N. R., Goddard, M. E., Visscher, P. M. (2010) Queensland Workshop Frontiers in Statistical Genetics and Genomics; Resolving complex traits through coancestry and the shared inheritance of genome (Brisbane, Australia).
- 6. Summer Institute in Statistical Genetics, Seattle, USA (2010) (Tutor)
- 7. Summer Institute in Statistical Genetics, Seattle, USA (2011) (Tutor)
- 8. Lee, S. H. (2012) Genomic Partitioning by Functional Annotation of variance and Covariance Explained by SNPs. XXth World Congress of Psychiatric Genetics; Confounding the Complexity of Brain and Behavior (Hamburg, Germany).
- 9. Lee, S. H. (2013) Estimation of SNP-heritability from dense genotype data. Brisbane Statistical Human Genetics Forum (Brisbane, Australia)

- 10. Lee, S. H. (2014) Joint analysis of psychiatric disorders increases accuracy of risk prediction for schizophrenia. XXII<sup>nd</sup> World Congress of Psychiatric Genetics; Pathways to Therapy and Prevention (Copenhagen, Denmark).
- 11. Quantitative, Population and Statistical Genetics. The 1st Winter Workshop, Chung-Nam National University, South Korea 22-24 Feb 2016.
- 12. Investigating the Genetic Architecture of Complex Traits & Prediction of Phenotype from Genome-wide SNPs, Armidale Summer Course 2016, Armidale, Australia
- 13. Genotype by environment interaction in breeding programs, Armidale Summer Course 2017, Armidale, Australia
- 14. Lee, S. H. (2018) Genomic prediction, The Korean society of animal breeding and genomics, Chung-Nam National University, South Korea, 5 7 July 2018.
- 15. Lee, S. H. (2021) Novel statistical methods for genetic evaluations, The Korean society of animal breeding and genomics, Daejeon Convention Centre, South Korea, 1-2 July 2021.
- 16. Lee, S. H. (2021) Population analysis using statistical tools, Data science in human disease symposium, Seoul, South Korea, 24 Aug 2021.

The quality of my presentation and contribution is evidenced by highly positive feedbacks from the audiences, e.g. Figure 1.

KSABG The Korean Society of Animal Breeding & Genetics

#### Questionnaire for the 1<sup>st</sup> Genetic Workshop of Animal Breeding and Genomics

- Date: 2016. 22. Feb (Mon) ~ 24. Feb (Wed)
- Venue: College of Agriculture and Life Science, Chungnam National University
- Attendance: Research Scientist and Postgraduate Students (50 persons)
- Lecturer: Dr. Sang Hong Lee, University of New England, Australia

Q1. The course contributed to my understanding of the subject materials

| Very Good | Good | Normal | Bad | Worse |
|-----------|------|--------|-----|-------|
| 35        | 13   | 1      |     |       |

Q2. The lecturer was well prepared for each lecture

| Very Good | Good | Normal | Bad | Worse |
|-----------|------|--------|-----|-------|
| 30        | 15   | 5      |     |       |

Q3. The lecturer's explanations were clear and understandable

| Very Good | Good | Normal | Bad | Worse |
|-----------|------|--------|-----|-------|
| 32        | 17   | 1      |     |       |

Q4. The course materials (textbook, handouts, readings, etc.) were helpful

| Very Good | Good | Normal | Bad | Worse |
|-----------|------|--------|-----|-------|
| 40        | 10   |        |     |       |
|           |      |        |     |       |

Q5. The lecturer has expertise in the content of the lecture

| Very Good | Good | Normal | Bad | Worse |
|-----------|------|--------|-----|-------|
| 45        | 5    |        |     |       |

Q6. I am satisfied with this course

| Very Good | Good | Normal | Bad | Worse |
|-----------|------|--------|-----|-------|
| 50        |      |        |     |       |

Overall Evaluation: This course was very helpful for attendee to improve knowledge of quantitative genetic theory and practical things with genome data. All of the attendee evaluated that Dr. Hong Lee's lecture was very clear and qualified so that they would like to take this course again in near future.



**Professor Chang Hee Do** 

President of Korean Society of Animal Breeding and Genetics

The Korean Society of Animal Breeding & Genetics



**Figure 1**. Averaged evaluation score of 77% at the highest rate "very good" from a statistical genetics course

# 7. Teaching Experience

I teach novel concepts, designs and tools that can essentially improve students' capacity to analyse and characterise complex traits in the population based on genomic information in the context of Statistical Genetics. I have coordinated and taught a number of regular university courses including Statistical Learning, Biomedical Science, Quantitative, Population and Statistical Genetics and Health Data Sources and Management (Big Genomic data).

Date: 2012 (trimesters 3) Role: Tutor Course: Biomedical Science (BIOM3), University of Queensland

Date: Mar, 2016 – Jul, 2017 (weekly)Role: LecturerCourse: Quantitative, Population and Statistical Genetics (for postgraduate students)

**Date:** 2017 (trimesters 1) **Role:** Coordinator **Course:** Statistical learning (STAT330), University of New England

Date: 2018 (trimesters 2)Role: LecturerCourse: Health Data Sources and Management (HLTH 5190), University of South Australia

# 8. Supervision Experience

From the supervisions of 6 research students and 6 junior researchers, there were 12 publications in high-profile journals (including JAMA Psych (impact factor (IF) 15), Mol Psych (IF 13), Am J Hum Genet (IF 9) and PLoS Genet (IF 6)). There are currently 8 manuscripts in preparation.

| Postdoctoral<br>Fellow/Stude<br>nt Name | Years<br>Involved | Supervisor<br>y Role | Postdoctoral<br>Fellow/Student's<br>Degree/Course/Training/<br>Study      | Status    | Trainee status   | Outcomes   |
|---|-------------------|----------------------|---|-----------|--|--|
| Mr Seung<br>Whan Lee                    | 2006-<br>2008     | Co-<br>supervision   | PhD at Animal Genetics,<br>the University of New<br>England               | Completed | Assistant Professor at<br>Chungnam National<br>University, South Korea | Three papers (Co-<br>author) <sup>2-4</sup>                        |
| Ms Aimee<br>Hanson                      | 2012              | Co-<br>supervision   | Winter Research<br>Scholarship Program at the<br>University of Queensland | Completed | PhD in UQ  |  |
| Mr Wouter<br>Peyrot                     | 2013              | Co-<br>supervision   | Visiting student  | Completed | Postdoctoral fellow at VU<br>University Medical Center                 | One paper (Co-author) <sup>12</sup>                                |
| Ms Cara<br>Nolan                        | 2014              | Supervision          | Associate Researcher  | Completed | Master in UC Berkeley  |  |
| Mr Robert<br>Maier                      | 2014-<br>2015     | Co-<br>supervision   | PhD at Queensland Brain<br>Institute, University of<br>Queensland         | Completed | Postdoctoral fellow at<br>Broad Institute, USA                         | Two papers<br>(Corresponding and co-<br>author) <sup>7, 8</sup>    |
| Dr Divya<br>Mehta                       | 2014-<br>2016     | Co-<br>supervision   | Postdoctoral Fellow   | Completed | Senior Research Fellow at<br>Queensland University<br>Technology       | One paper<br>(Corresponding author) <sup>9</sup>                   |
| Dr Gerhard<br>Moser                     | 2015-<br>2016     | Supervision          | Data analyst and consultant   | Completed | Senior Research Scientist<br>at Australian Agriculture<br>Company      | Two papers (Co-author) <sup>1,</sup>                               |
| Ms Shalanee<br>Weerasinghe              | 2016              | Supervision          | Associate Researcher  | Completed | Research Scientist at<br>Agricultural Business<br>Research Institute   | Two papers<br>(Corresponding author) <sup>5,</sup><br><sup>6</sup> |
| Mr<br>Mohammad<br>Zaher al<br>Kalaldeh  | 2017-<br>2018     | Co-<br>supervision   | PhD at Animal Genetics,<br>University of New England                      | Submitted | Postdoctoral Fellow at<br>University of New England                    | Two papers (Co-<br>author) <sup>15,16</sup>                        |
| Dr Guiyan Ni                            | 2016-<br>2019     | Supervision          | Postdoctoral Fellow   | Completed | Postdoctoral Fellow at<br>University of Queensalnd                     | Four papers<br>(Corresponding<br>author) <sup>11,13,17,18</sup>    |
| Dr Azmeraw<br>Amare                     | 2018              | Supervision          | Research Associate  | Completed | Research Associate at SAHMRI   | One paper<br>(Corresponding author) <sup>17</sup>                  |
| Dr Gopal<br>Gowane                      | 2018-<br>2019     | Co-<br>supervision   | Visiting scholar  | Completed | Research Scientist at ICAR in India                                    | One paper (Co-author) <sup>14</sup>                                |
| Mr Buu<br>Turong                        | 2019              | Supervision          | Research Associate  | Completed | MD degree to be finished<br>in Jul/2021                                | One manuscript<br>(Corresponding author)                           |
| Ms Yoonji<br>Jung                       | 2019              | Supervision          | Visiting student (Master)   | On-going  | Master at Chung Nam<br>University in S. Korea                          | One manuscript<br>(Corresponding author)                           |
| Ms Sohyoung<br>Won                      | 2019              | Supervisor           | Visiting student (Master)   | Completed | PhD in Seoul University  |  |
| Dr Xuan Zhou                            | 2017-<br>2018     | Supervision          | Research Associate  | On-going  | Research Associate at<br>University of South<br>Australia              | Two manuscripts<br>(Corresponding author)                          |
| Dr<br>Cheonglong<br>Yu                  | 2018-<br>2020     | Supervision          | Research Fellow   | On-going  | Research Fellow at<br>University of South<br>Australia                 | One manuscript<br>(Corresponding author)                           |
| Ms Jisu Shin                            | 2019-<br>2021     | Supervision          | Master  | On-going  |  |  |
| Mr Muktar<br>Ahmed                      | 2019-<br>2022     | Co-<br>supervision   | PhD   | On-going  |  |  |

**Table 1**. Summary of (co)supervisions and outcomes.

### **Publications from my supervisions** (annotated in Table 1)

- 1. Chen, G.-B., Lee, S.H., Montgomery, G.W. et al. 2017. Performance of risk prediction for inflammatory bowel disease based on genotyping platform and genomic risk score method. BMC Medical Genetics 18(1) 94.
- 2. Lee, S., Cho, Y., Lee, S. et al. 2008. Identification of marbling-related candidate genes in Mlongissimus dorsi of high- and low marbled Hanwoo (Korean Native Cattle) steers. BMB Reports 41(12) 846-851.
- 3. Lee, S., van der Werf, J., Lee, S. et al. 2010. Genetic polymorphisms of the bovine Fatty acid binding protein 4 gene are significantly associated with marbling and carcass weight in Hanwoo (Korean Cattle). *Animal Genetics* 41(4) 442-444.
- 4. Lee, S.H., van der Werf, J.H.J., Kim, N.K. et al. 2011. QTL and gene expression analyses identify genes affecting carcass weight and marbling on BTA14 in Hanwoo (Korean Cattle). *Mammalian Genome* 22(9-10) 589-601.
- 5. Lee, S.H., Weerasinghe, W.M.S.P. and van der Werf, J.H.J. 2017. Genotype-environment interaction on human cognitive function conditioned on the status of breastfeeding and maternal smoking around birth. *Scientific Reports* 7 6087. (Corresponding author)
- 6. Lee, S.H., Weerasinghe, W.M.S.P., Wray, N. et al. 2017. Using information of relatives in genomic prediction to apply effective stratified medicine. *Scientific Reports* 7 4209. (Corresponding author)
- 7. Maier, R., Moser, G., Chen, G.-B. et al. 2015. Joint analysis of psychiatric disorders increases accuracy of risk prediction for schizophrenia, bipolar disorder and major depression disorder. *Am J Hum Genet* 96 283-294. (Corresponding author) (Impact Factor 10)
- 8. Maier, R.M., Zhu, Z., Lee, S.H. et al. 2018. Improving genetic prediction by leveraging genetic correlations among human diseases and traits. *Nat Commun* 9(1) 989. (**Impact Factor 12**)
- 9. Mehta, D., Tropf, F.C., Graten, J. et al. 2016. Evidence for genetic overlap between schizophrenia and age at first birth in women. *JAMA Psych* 73 497-505. (Corresponding author) (Impact Factor 15)
- Moser, G., Lee, S.H., Hayes, B.J. et al. 2015. Simultaneous discovery, estimation and prediction analysis of complex traits using a Bayesian mixture model. *PLoS Genet* 11 e1004969. (Impact Factor 6)
- Ni, G., Moser, G., Schizophrenia Working Group of the Psychiatric Genomics Consortium et al. 2018. Estimation of genetic correlation using linkage disequilibrium score regression and genomic restricted maximum likelihood. *Am J Hum Genet* 102 1185-1194. (Corresponding author) (Impact Factor 10)
- 12. Peyrot, W.J., Lee, S.H., Milaneschi, Y. et al. 2015. The association between lower educational attainment and depression owing to shared genetic effects? Results in ~25,000 subjects. *Mol Psychiatry* 20(6) 735-743. (Impact Factor 13)
- 13. Ni, G., van der Werf, J., Zhou, X., Hyppönen, E., Wray, N.R., and **Lee, S.H**. Genotype– covariate correlation and interaction disentangled by a whole-genome multivariate reaction norm model. *Nature communications* 10, 2239 (2019)
- 14. Gowane, G.R., Lee, S.H., Clark, S., Moghaddar, N., Al-Mamun, H.A., and van der Werf, J.H.J. Effect of selection and selective genotyping for creation of reference on bias and accuracy of genomic prediction. *J Anim Breed Genet* (2019)
- 15. Al Kalaldeh M, Gibson J, Lee SH, Gondro C, van der Werf JHJ. Detection of genomic regions underlying resistance to gastrointestinal parasites in Australian sheep. Genetics Selection Evolution. 2019;51(1):37. doi: 10.1186/s12711-019-0479-1

- 16. Al Kalaldeh M, Gibson J, Duijvesteijn N, Daetwyler HD, MacLeod I, Moghaddar N, et al. Using imputed whole-genome sequence data to improve the accuracy of genomic prediction for parasite resistance in Australian sheep. Genetics Selection Evolution. 2019;51(1):32. doi: 10.1186/s12711-019-0476-4
- 17. Ni, G., Amare, A.T., Zhou, X. ..., Lee SH. 2019. The genetic relationship between female reproductive traits and six psychiatric disorders. *Scientific Reports* 9(1) 12041
- 18. Ni, G., Gratten, J., Wray, N.R. & Lee, S.H. Age at first birth in women is genetically associated with increased risk of schizophrenia. *Sci Rep* **8**, 10168 (2018).

# 9. Publications

### **Book Chapters**

- 1. **Lee, S. H.**, Sapkota, Y., Fung, J., Montgomery, G. W. Genetic Biomarkers for Endometriosis: Biomarkers for Endometriosis. Edited by T. M. D'Hooghe (Springer) (2017) pp 83–93.
- 2. Yang, J., **Lee**, S. H., Goddard, M. E., Visscher, P. M. Genome-Wide Complex Trait Analysis (GCTA): Methods, Data Analyses, and Interpretations Genome-Wide Association Studies and Genomic Prediction. 1019, 215-236 (2013).

# **Peer-reviewed Journal Article**

Q= Quartile and denotes the journals relative impact within their category, *e.g.* Q1 = the 'best' 25 % of journals in the SCI Subject Category, from Journal Citation Reports; IF= 2016 Impact Factor; Cited= from Google Scholar, Feb 2018

- 3. Ahmed, M., Gebremichael, A., **Lee, S.H**., et al. (2021) Adiposity and Cancer: A Mendelian Randomization Analysis in the UK Biobank. International Journal of Obesity. Accepted.
- 4. Yang, Z., Wu, H., Lee, P.H., Tsetsos, F., Davis, L.K., Yu, D., **Lee, S.H.** et al. (2021) Investigating shared genetic basis across Tourette Syndrome and comorbid neurodevelopmental disorders along the impulsivity-compulsivity spectrum. Biological Psychiatry. In press. <u>https://doi.org/10.1016/j.biopsych.2020.12.028</u>
- 5. Zhou, D., Yu, D., Scharf, J.M., Mathews, C.A., McGrath, L., Cook, E., **Lee, S.H.** et al. (2021) Contextualizing genetic risk score for disease screening and rare variant discovery. Nature Communications **12**, 4418.
- 6. Gershon, E.S.\*, **Lee, S.H.**\* et al. (2021) An opportunity for primary prevention research in psychotic disorders. Schizophrenia Research (\*Joint first author). In press. https://doi.org/10.1016/j.schres.2021.07.001
- 7. Shin, J., and **Lee, S.H.** (2021). GxEsum: a novel approach to estimate the phenotypic variance explained by genome-wide GxE interaction based on GWAS summary statistics for biobank-scale data. Genome Biology **22**: 183.
- 8. Zhou, X., Im, H.K., and **Lee, S.H.** (2020). CORE GREML for estimating covariance between random effects in linear mixed models for complex trait analyses. Nat Comm **11**, 4208
- 9. Zhou, X., van der Werf, J., Carson-Chahhoud, K., Ni, G., McGrath, J., Hyppönen, E., and **Lee**, **S.H.** Whole-Genome Approach Discovers Novel Genetic and Nongenetic Variance Components Modulated by Lifestyle for Cardiovascular Health. J Am Heart Assoc **9**, e015661 (2020).
- 10. Yu, C., Ni, G., van der Werf, J. & **Lee, S.H.** Detecting Genotype-Population Interaction Effects by Ancestry Principal Components. *Frontiers in Genetics* **11**, 379 (2020)
- 11. Truong, B., Zhou, X., Shin, J., Li, J., van der Werf, J.H.J., Le, T.D., and **Lee, S.H.** Efficient polygenic risk scores for biobank scale data by exploiting phenotypes from inferred relatives. Nature communications **11**, 3074 (2020)
- 12. Lam, M., Awasthi, S., Watson, H.J., Goldstein, J., Panagiotaropoulou, G., Trubetskoy, V., Karlsson, R., Frei, O., Fan, C.-C., De Witte, W., et al. RICOPILI: Rapid Imputation for COnsortias PIpeLIne. Bioinformatics **36**, 930-933 (2020).
- 13. Ni, G., van der Werf, J., Zhou, X., Hyppönen, E., Wray, N.R., and **Lee, S.H**. Genotypecovariate correlation and interaction disentangled by a whole-genome multivariate reaction norm model. *Nature communications* 10, 2239 (2019)

- 14. Ni, G., Amare, A.T., Zhou, X. ..., Lee SH. The genetic relationship between female reproductive traits and six psychiatric disorders. *Scientific Reports* 9: 12041 (2019)
- 15. Mulder, H.A., **Lee, S.H**., Clark, S., Hayes, B.J., and van der Werf, J.H. The Impact of Genomic and Traditional Selection on the Contribution of Mutational Variance to Long-Term Selection Response and Genetic Variance. Genetics (In press) (2019)
- 16. Van Rheenen, W., Peyrot, W.J., Schork, A.J., **Lee, S.H**., and Wray, N.R. Genetic correlations of polygenic disease traits: from theory to practice. *Nature Reviews Genetics* **20**: 567-581 (2019)
- 17. Gowane, G.R., **Lee, S.H**., Clark, S., Moghaddar, N., Al-Mamun, H.A., and van der Werf, J.H.J. Effect of selection and selective genotyping for creation of reference on bias and accuracy of genomic prediction. *J Anim Breed Genet* (2019)
- 18. Al Kalaldeh M, Gibson J, **Lee SH**, Gondro C, van der Werf JHJ. Detection of genomic regions underlying resistance to gastrointestinal parasites in Australian sheep. Genetics Selection Evolution. 2019;51(1):37. doi: 10.1186/s12711-019-0479-1
- 19. Al Kalaldeh M, Gibson J, Duijvesteijn N, Daetwyler HD, MacLeod I, Moghaddar N, et al. Using imputed whole-genome sequence data to improve the accuracy of genomic prediction for parasite resistance in Australian sheep. Genetics Selection Evolution. 2019;51(1):32. doi: 10.1186/s12711-019-0476-4
- 20. Ni, G., Moser, G., Schizophrenia Working Group of the Psychiatric Genomics Consortium, Wray, N.R. & **Lee, S.H**. Estimation of genetic correlation using linkage disequilibrium score regression and genomic restricted maximum likelihood. *Am J Hum Genet* **102**, 1185-1194 (2018).
- 21. Ni, G., Gratten, J., Wray, N.R. & **Lee, S.H**. Age at first birth in women is genetically associated with increased risk of schizophrenia. *Sci Rep* **8**, 10168 (2018).
- 22. Bipolar Disorder and Schizophrenia Working Group of the Psychiatric Genomics Consortium. Genomic dissection of bipolar disorder and schizophrenia, including 28 subphenotypes. *Cell* **173**, 1705-1715 (2018).
- 23. Maier, R., Zhu, Z., Lee, S.H., Trzaskowski, M., Rudefer, D.M., Stahl, E.A., Ripke, S., Wray, N.R., Yang, J., Visscher, P., *et al.* Improving genetic prediction by leveraging genetic correlations among human diseases and traits. *Nature Communications* **9**, 989 (2018). [**Q1**; IF 12.12, Cited **0**].
- 24. Martin, J., Walters, R.K., Demontis, D., Mattheisen, M., **Lee, S.H.**, Robinson, E., Brikell, I., Ghirardi, L., Larsson, H., Lichtenstein, P., *et al.* A Genetic Investigation of Sex Bias in the Prevalence of Attention-Deficit/Hyperactivity Disorder. *Biological Psychiatry*. 83(12):1044-1053 (2018). [**Q1**; IF 11.41, Cited **1**].
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# **Refereed Conference Papers**

- 94. **Lee, S. H.,** Clark, S. A., & van der Werf, J. H. J. Estimation of genomic prediction accuracy based on population structure. 20<sup>th</sup> World Congress Genetics Applied Livestock Production. (2018)
- 95. Mulder, H.A., **Lee, S.H.,** Clark, S., Hayes, B. J., & van der Werf, J.H.J. The fate of new mutations: genomic selection exploits new mutation variance to a much smaller degree than traditional selection. 20<sup>th</sup> World Congress Genetics Applied Livestock Production, vol. Genetic Gain Breeding Strategies 1, p. 415 (2018)
- 96. G. Gowane, **Lee**, **S. Hong**, Clark, S., Moghaddar, N., A Hawlader, A. M., and van der Werf, J. H. J., "Optimising bias and accuracy in genomic prediction of breeding values", *Proceedings of*

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- 97. Clark, S. A., Lee, S. H., & van der Werf, J. H. J. Using genomic information to estiamte genotype by environment interactions. *Proceedings of the Association for the Advancement of Animal Breeding and Genetics* 21: 137-140 (2015).
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- Marshall, K., Lee, S. H. & van der Werf, J. H. J. Information sources in linkage disequilibrium

   linkage mapping using half-sib designs. 8<sup>th</sup> World Congress Genetics Applied Livestock
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- 100. **Lee, S. H.** & van der Werf, J. H. J. Fine mapping of multiple QTL using a reversible jump MCMC. 8<sup>th</sup> World Congress Genetics Applied Livestock Production. Communication 21-08 (2006).
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#### Preparations

Zhou, X., ... & Lee, S.H. (2021) ERM (submitted).

Jisu Shin, ..., Lee SH (2021) GxE for type II diabetes (submitted)

Turong, B., ... & Lee, S.H. (2021) GECIM (in preparation).

Muktar Ahmed, ..., Lee SH (2021) GxE for cancer (in preparation)

Momin Moksedul, ..., Lee SH (2021) Cross-ethnicity genetic correlation (in preparation)

Momin Moksedul, ..., Lee SH (2021) Cross-breed analysis using Hanwoo (in preparation)

Nashat, M., Zhou, X., ... & Lee, S.H. (2021) Cancer using ERM approach (in preparation).

Pabres., P., ... & Lee, S.H. (2021) Genome-transcriptome using GTEx (in preparation).

Nashat, M., ... & Lee, S.H. (2021) ssGBLUP (in preparation).

# **10.** Ten career-best research output

Citations are from Google Scholar, Feb 2018

1. **Lee, S. H**.; Van der Werf, J. H. J. An efficient variance component approach implementing an average information REML suitable for combined LD and linkage mapping with a general complex pedigree. *Genetics Selection Evolution* 38: 25-43 (2006). [1<sup>st</sup> author; **43** citations]

In this work, I developed an efficient and robust genomic residual maximum likelihood (GREML) method and the direct average information (AI) algorithm that has been used to tackle important problems in complex traits over the last 10 years.

2. **Lee, S.H.**, van der Werf, J., Hayes, B., Goddard, M. & Visscher, P. Predicting unobserved phenotypes for complex traits from whole-genome SNP data. *PLoS Genetics* **4**, e1000231 (2008). [1<sup>st</sup> author; **171** citations]

A pioneering study that predicts future phenotypes using a cutting-edge method, featured in the Nov 2008 issue of Nature Review Genetics.

3. Yang, J., **Lee, S.H**., Goddard, M. & Visscher, P. GCTA: A tool for genome-wide complex trait analysis. *The American Journal of Human Genetics* **88**, 76-82 (2011). [2<sup>nd</sup> author; **1833** citations]

One of most widely used software in complex traits analysis that has implemented the direct AI algorithm developed in #1.

4. **Lee, S.H.**, Wray, N., Goddard, M. & Visscher, P. Estimating Missing Heritability for Disease from Genome-wide Association Studies. *The American Journal of Human Genetics* **88**, 294-305 (2011). [1<sup>st</sup> author; **595** citations]

A breakthrough theory study that generalised Robertson transformation in the liability threshold model. This method has been implemented in GCTA software developed in #3.

 Lee, S.H., DeCandia, T.R., Ripke, S., Yang, J., PGC-SCZ, ISC, MGS, Sullivan, P.F., Goddard, M.E., Keller, M.C., Visscher, P.M. & Wray, N.R. Estimating the proportion of variation in susceptibility to schizophrenia captured by common SNPs. *Nature Genetics* 44, 247-250 (2012). [1<sup>st</sup> author; 438 citations]

This paper is the first to dissect the genetic architecture of schizophrenia based on genomewide SNPs using our method developed in #1, #3 and #4.

6. Lee, S.H., Yang, J., Goddard, M.E., Visscher, P.M. & Wray, N.R. Estimation of pleiotropy between complex diseases using single-nucleotide polymorphism-derived genomic relationships and restricted maximum likelihood. *Bioinformatics* 28, 2540-2542 (2012). [1<sup>st</sup> author; 265 citations]

A cutting-edge method was developed to estimate genetic corelation between two independent groups. This method has contributed to a breakthorough study to show evidence of shared genetic architecture of complex tratis (#8).

7. Ripke, S. *et al.* Genome-wide association analysis identifies 13 new risk loci for schizophrenia. *Nature Genetics* **45**, 1150-1159 (2013). [12<sup>th</sup> author; **918** citations]

A comprehensive study that find novel causal variatns for schizophrenia. We contributed substantially to this study using the statistical models for complex traits developed in #1, #3 and #4.

8. **Lee, S.H**. *et al.* Genetic relationship between five psychiatric disorders estimated from genomewide SNPs. *Nature Genetics* **45**, 984-994 (2013). [1<sup>st</sup> author; **983** citations] (Funded by ARC grant DE130100614)

A breakthrough study that dissects shared genetic architecture between complex traits using the statistical methods developed in #1, #3, #4, #6, which has attracted outstanding media attention (Altmetric score 313 ranked 1<sup>st</sup> out of 66 tracked articles of a similar age in Nature Genetics).

9. Ripke, S. *et al.* Biological insights from 108 schizophrenia-associated genetic loci. *Nature* **511**, 421-427 (2014). [118<sup>th</sup> author ; **1995** citations]

A landmark study in psychiatric genetics to which we contributed substantially, e.g. analyses of prediction measures in validation data sets, using the statistical methods developed in #4 and in this study.

 Maier, R., Moser, G., Chen, G.-B., Ripke, S., Cross disorder Working group of the Psychiatric Genomics Consortium, Coryell, W., Potash, J.B., Scheftner, W.A., Shi, J., Weissman, M.M., Hultman, C.M., Landén, M., Levinson, D.F., Kendler, K.S., Smoller, J.W., Wray, N.R., & Lee, S.H. Joint analysis of psychiatric disorders increases accuracy of risk prediction for schizophrenia, bipolar disorder and major depression disorder. *The American Journal of Human Genetics* 96, 283-294 (2015). [Last author; 74 citations] (Funded by ARC grant DE130100614)

In this study we developed an efficient multivariate model for estimation and prediction that has been implemented in software, MTG2, a multivariate version of GCTA (#3).