

SENIOR RESEARCH FELLOW, UNIVERSITY OF BRISTOL

8 PICTON MEWS, BRISTOL, BS6 5PB, UNITED KINGDOM

□+44(0)7930951876 | ☑ g.hemani@bristol.ac.uk | 🌴 gibranhemani.com | ☑ explodecomputer

PRESENT APPOINTMENT _

MRC Integrative Epidemiology Unit, University of Bristol

Senior research fellow Jan-18 to present

UK

UK

Australia

PREVIOUS APPOINTMENTS _

MRC Integrative Epidemiology Unit, University of Bristol

Research fellow Jan-14 to Dec-17

Queensland Brain Institute, University of Queensland

Post doctoral statistical geneticist Jan-12 to Dec-13

ACADEMIC QUALIFICATIONS _____

University of Bristol Bristol

Associate of the Higher Education Academy, UK Sep-19 to Mar-20

University of Edinburgh Edinburgh

PhD in Quantitative Genetics Oct-07 to Aug-11

University of Nottingham Nottingham

BSc (hons) 2:1 Sep-03 to Jun-06

SPECIAL AWARDS, HONOURS AND DISTINCTIONS _____

Sir Kenneth Mather Memorial prize

The Genetics Society

Best PhD thesis in quantitative and population genetics 2011

TEACHING AND RELATED ADMINISTRATION

Over the course of my research career I have sought out opportunities to develop a variety of different teaching materials, starting during my PhD when I wrote and delivered a 2-day course on R programming for researchers at the Roslin Institute. I have a passion for teaching and since then I have taught on topics relating to genetics, statistics and programming to undergraduates across disciplines in medicine, biology and psychology. There has been a major shift towards using genetic data in epidemiological research over the last several years and my academic background in statistical genetics has created opportunities and substantial demand for teaching in this field at the post-graduate and life-long learning levels. I am particularly proud of my record of writing and delivering courses on genetic epidemiology to participants who are under-represented in genomic data science. In line with this I am also leading the Medical School's Anti-Racism special interest group in Decolonising the Curriculum.

(i) Undergraduate and taught postgraduate (past 3 years)

Evidence Based Medicine unit in MB ChB programme

University of Bristol

Tutor

2020

- 15 1st year undergraduate medical students
- 5 hours prep, 10 hours contact time

Genes and behaviour (PSYC30018)

University of Bristol

Lecturer

2018, 2019

- 100 3rd year undergraduate students
- Wrote and delivered three lectures
- 6 hours prep, 4 hours contact time

Genomic Medicine iBSc University of Bristol

Pastoral tutoring 2017, 2018

- Two students on the Genomic Medicine iBSc
- 8 hours contact time

Genomic Data Science unit in Genomic Medicine iBSc

University of Bristol

Course lead

2016-2018, 2020

- Up to 13 intercalating 3rd year medical dentistry and veterinary students
- Led, co-wrote and delivered 4-week module (20 credits)
- Organised material for several lecturers on programming, statistics, genetic analysis
- · Set formative and summative coursework assessments
- Designed and wrote exams
- Delivered lectures, tutorials, practicals, assessed debates
- Transitioned to flipped classroom format
- 50 hours prep, 20 hours contact time
- Several students publish papers each year on the subject.

(ii) Major teaching responsibilities in previous years

Statistical genetics unit in Biomedical Capstone Course

University of Queensland

2012, 2013

Course lead

• 250 3rd year undergraduate biomedical students

- Wrote four lectures and two workshops on GWAS written
- Set and marked coursework assessments
- Delivered lectures and practicals, and coordinated lecturers and tutors
- · 25 hours prep, 10 hours contact time

JANUARY 2021 GIBRAN HEMANI · CURRICULUM VITAE 2

(iii) Innovatory units and teaching methods

Flipped classroom: In the second year of the iBSc Genomic Medicine course I redesigned the R programming training section to be a flipped classroom, using online games for students to learn the basic principles of programming at home and the tutor led sessions as an opportunity to synthesise those skills into applied examples. The students were more adept at programming than in the previous year, and also more enthused about the subject. I transitioned the rest of the module to a flipped classroom in 2020 during the Covid-19 pandemic.

(iv) Contribution to Life-long learning and continuing professional development courses ___

Genetic Analysis of Population-based Association Studies short course, Wellcome Genome Campus Course co-lead 2018-2020

- 40+ international post-graduate students and researchers
- Invited to co-lead a course that has been running for 12 years, approx
- Contribute to course design, and recent redesign for online teaching
- Delivering lectures and practicals
- 24 hours prep, 10 hours contact time

MR-Base workshop, MR conference

Bristol

Course lead 2017, 2019

- 60 International post-graduate students and researchers
- Wrote and delivered lectures and tutorials on how to use the MR-Base database and R packages
- 12 hours prep, 6 hours contact time

Statistical methods for mediation short course

University of Bristol

2017, 2018 Lecturer

- 40 post-graduate students and researchers
- Wrote and delivered one lecture + practical
- 8 hours prep, 3 hours contact time

Genomic medicine iBSc

University of Bristol

Lecturer 2016-2018, 2020

- Up to 13 intercalating 3rd year medical, dentistry and veterinary students
- Wrote and delivered three lectures to other units
- 8 hours prep, 3 hours contact time

Genetic Epidemiology short course at EEPE

Florence, Italy

Course co-lead

Lecturer

2016-2018

- 20 international post-graduate students and researchers
- Co-wrote and delivered (with Prof Dave Evans) 5-day course
- Prepared and delivered lectures + practicals
- 40 hours prep, 12 hours contact time

Statistical genetics short course

University of Bristol

2015-2019

3

• 40 post-graduate students and researchers

- Wrote and delivered two lectures + practicals
- 16 hours prep, 6 hours contact time

UNIX and Genetic epidemiology

Course co-lead 2015

• 30 researchers and post-graduate students

- Co-wrote and delivered 7-day course
- · Lectures and practicals
- Setup cloud-based computing system for practical sessions
- 40 hours prep, 15 hours contact time

Mendelian randomisation short course

University of Bristol

Pelotas, Brazil

Lecturer

2014-2020

- 40 post-graduate students and researchers
- Wrote and delivered two lectures + practicals
- 16 hours prep, 6 hours contact time

Genetic epidemiology, H3Africa project

Johannesberg, South Africa

Course co-lead

2014

- 30 researchers and post-graduate students
- Co-wrote and delivered (with Dr Nic Timpson) 5-day course
- Delivered lectures and practicals
- 50 hours prep, 20 hours contact time

18th Summer Institute in Statistical Genetics

Seattle USA

Teaching assistant

2013

- 40+ international post-graduate students and researchers
- Teaching assistant for: "Human Complex Traits" and "Animal Genetic Data Analysis"
- 20 hours prep, 10 hours contact time

Introduction to git and programming workflows

University of Queensland

Workshop lead

2013

• 15 researchers

Lecturer

- · Wrote and delivered one-day workshop
- 12 hours prep, 6 hours contact time

Introduction to Statistics

University of Queensland

2012

• 40+ post-graduate students and researchers

- Wrote and delivered one lecture for a professional Development Course
- 3 hours prep, 1 hour contact time

Introduction to RUniversity of Edinburgh

Course co-lead 2009

- 30 researchers and post-graduate students
- Co-wrote and delivered (with Joseph Powell) 2-day short course on R programming
- 15 hours prep, 6 hours contact time

(v) Collaborative teaching projects_

Developed external speaker programmes for iBSc medical students, involving Jeff Barrett from OpenTargets and the Sanger Institute; Rob Scott from GlaxoSmithKlein; and Jonathan Ives from the Centre for Ethics in Medicine.

(iv) Postgraduate advising PhD Supervision . **Lily Andrews CRUK** 2020-2024 Secondary supervisor **Amanda Forde** Science Foundation Ireland 2020-2024 Secondary supervisor · Co-supervising with international colleague (John Ferguson), Republic of Ireland **Giulio Centorame** NHMRC. 2020-2024 Secondary supervisor • Co-supervising with international colleague (Dave Evans), Australia **Chris Moreno-Stokoe BBSRC** 2018-2022 Secondary supervisor **Hannah Wilson** BBSRC and GSK 2017-2021 Primary supervisor Thomas Battram Wellcome Trust 2016-2020 · Primary supervisor Passed viva with distinction Laurence Howe Wellcome Trust 2014-2018 Secondary supervisor

- Passed viva with distinction
- Awarded best doctoral research prize 2018/2019 in Faculty of Health Sciences

(vii) Major achievements in teaching administration _

International short courses on statistical genetics: I have organised, developed and delivered short courses (typically week-long, in collaboration with internal and/or external colleagues) to researchers at institutes in South Africa, Italy, Brazil and at the Wellcome Genome Centre in Cambridge.

Genomic Data Science module: I designed, organised and delivered a 20 credit module for medical students that involves teaching them programming and genomic data analysis from scratch. This has run for 4 years, and consistently gets very positive feedback, and the students achieve a high standard.

Anti-racism: I lead the Special Interest Group (11 members, fortnightly meetings) on decolonising the curriculum in the Bristol Medical School. We are developing an accreditation system that schedules a transparent process for course leads to work against. I also liaise with numerous related groups across the university.

MR-Base software course: I developed a course to teach researchers how to use my own software (MR-Base), with the course being heavily over-subscribed and gaining very positive feedback and increased usage of the software.

RESEARCH AND RELATED ADMINISTRATION

During my PhD I developed statistical and computational methods to detect genetic interactions influencing complex traits. This work led to my first post-doctoral position that expanded my work into determining genetic architectures of complex disease, and developing expertise in handling high dimensional genomic data. My current research lies at the interface between statistical genetics, causal inference and high performance computing. A major output that integrates these fields has been the development of the MR-Base causal inference analytical platform. This software is used by researchers globally, has led directly to funding for five post-doctoral positions from three private companies (GSK, Biogen, CHDI). I currently lead or co-lead two major international collaborations: The GoDMC consortium comprising 56 cohorts analysing the genetics of DNA methylation; the OpenGWAS consortium that combines the resources of over 100 groups and consortia. I synthesise these activities under my current fellowship which aims to construct a map of causal relationships across genotypes and phenotypes, and to use that map in diverse ways, for example to improve our understanding of human evolutionary processes, and to improve the prediction of viable drug targets for disease.

(i) Publications

Selected publications organised by category are listed below. Full publication list on google scholar.

H-index: 47i10-index: 89

• Number of publications: 149

Academic journal papers (refereed)

- 1. Lyon, M., Andrews, S., Elsworth, B., Gaunt, T., Hemani, G. & Marcora, E. The variant call format provides efficient and robust storage of gwas summary statistics. *Genome Biology* (2021) Role: senior author. International co-authors. Position: 5/6 (joint last).
- 2. Griffith, G., Morris, T., Tudball, M., Herbert, A. & Mancano, G. *et al.* Collider bias undermines our understanding of covid-19 disease risk and severity. *Nature communications* (2020) Role: senior author. Position: 14/14.
- 3. Brumpton, B., Sanderson, E., Heilbron, K., Hartwig, F. & Harrison, S. *et al.* Avoiding dynastic, assortative mating, and population stratification biases in mendelian randomization through within-family analyses. *Nature communications* (2020) Role: senior author. Position: 32/33 (joint last).
- 4. Lawson, D., Davies, N., Haworth, S., Ashraf, B. & Howe, L. *et al.* Is population structure in the genetic biobank era irrelevant, a challenge, or an opportunity? *Human Genetics* (2020) Role: senior author. Position: 7/9.
- 5. Zheng, J., Haberland, V., Baird, D., Walker, V. & Haycock, P. *et al.* Phenome-wide mendelian randomization mapping the influence of the plasma proteome on complex diseases. *Nature Genetics* (2020) Role: senior author. International co-authors. Non-academic co-authors. Position: 32/34 (joint last).
- 6. Morris, T., Davies, N., Hemani, G. & Smith, G. Population phenomena inflate genetic associations of complex social traits. *Science Advances* (2020) Role: senior author.
- 7. Anderson, E., Howe, L., Wade, K., Ben-Shlomo, Y. & Hill, W. *et al.* Education, intelligence and alzheimer's disease: Evidence from a multivariable two-sample mendelian randomization study. *International journal of epidemiology* (2020) Role: senior author. Position: 13/13.
- 8. Richardson, T., Hemani, G., Gaunt, T., Relton, C. & Smith, G. A transcriptome-wide mendelian randomization study to uncover tissue-dependent regulatory mechanisms across the human phenome. *Nature communications* (2020) Role: main analyst.

- 9. Cho, Y., Haycock, P., Sanderson, E., Gaunt, T. & Zheng, J. *et al.* Exploiting horizontal pleiotropy to search for causal pathways within a mendelian randomization framework. *Nature communications* (2020) Role: senior author. Position: 8/8.
- 10. Russell, A., Ford, T., Gunnell, D., Heron, J. & Joinson, C. *et al.* Investigating evidence for a causal association between inflammation and self-harm: A multivariable mendelian randomisation study. *Brain, behavior, and immunity* (2020) Role: senior author. Position: 9/10 (joint last).
- 11. Richardson, T., Harrison, S., Hemani, G. & Smith, G. An atlas of polygenic risk score associations to highlight putative causal relationships across the human phenome. *Elife* (2019) Role: main analyst.
- 12. Morris, A., Le, T., Wu, H., Akbarov, A. & Most, P. *et al.* Trans-ethnic kidney function association study reveals putative causal genes and effects on kidney-specific disease aetiologies. *Nature communications* (2019) Role: main analyst. International co-authors. Position: 6/72.
- 13. Taylor, D., Jackson, A., Narisu, Hemani, G. & Erdos, M. *et al.* Integrative analysis of gene expression, dna methylation, physiological traits, and genetic variation in human skeletal muscle. *Proceedings of the National Academy of Sciences* (2019) Role: main analyst. International co-authors. Position: 4/22.
- 14. Howe, L., Lawson, D., Davies, N., Pourcain, B., Lewis, S., Smith, G. & Hemani, G. Genetic evidence for assortative mating on alcohol consumption in the uk biobank. *Nature communications* (2019) Role: senior author. Position: 7/7.
- 15. Howe, L., Richardson, T., Arathimos, R., Alvizi, L. & Passos-Bueno, M. *et al.* Evidence for dna methylation mediating genetic liability to non-syndromic cleft lip/palate. *Epigenomics* (2019) Role: senior author. Position: 17/18.
- 16. Hemani, G., Zheng, J., Elsworth, B., Wade, K. & Haberland, V. *et al.* The mr-base platform supports systematic causal inference across the human phenome. *elife* (2018) Role: main author. International co-authors. Position: 1/20.
- 17. Min, J., Hemani, G., Smith, G., Relton, C. & Suderman, M. Meffil: Efficient normalization and analysis of very large dna methylation datasets. *Bioinformatics* (2018) Role: main analyst.
- 18. Haas, M., Aragam, K., Emdin, C., Bick, A. & Hemani, G. *et al.* Genetic association of albuminuria with cardiometabolic disease and blood pressure. *The American Journal of Human Genetics* (2018) Role: main analyst. International co-authors. Position: 5/8.
- 19. Richardson, T., Haycock, P., Zheng, J., Timpson, N. & Gaunt, T. *et al.* Systematic mendelian randomization framework elucidates hundreds of cpg sites which may mediate the influence of genetic variants on disease. *Human molecular genetics* (2018) Role: senior author. Position: 8/8.
- 20. Howe, L., Lee, M., Sharp, G., Smith, G. & Pourcain, B. *et al.* Investigating the shared genetics of non-syndromic cleft lip/palate and facial morphology. *PLoS genetics* (2018) Role: senior author. Position: 16/17.
- 21. Ye, J., Richardson, T., McArdle, W., Relton, C., Gillespie, K., Suderman, M. & Hemani, G. Identification of loci where dna methylation potentially mediates genetic risk of type 1 diabetes. *Journal of autoimmunity* (2018) Role: senior author. Position: 7/7.
- 22. Hemani, G., Tilling, K. & Smith, G. Orienting the causal relationship between imprecisely measured traits using gwas summary data. *PLoS genetics* (2017) Role: main author.
- 23. Noyce, A., Kia, D., Hemani, G., Nicolas, A. & Price, T. *et al.* Estimating the causal influence of body mass index on risk of parkinson disease: A mendelian randomisation study. *PLoS medicine* (2017) Role: main analyst. Position: 3/19.

7

- 24. Richardson, T., Zheng, J., Smith, G., Timpson, N., Gaunt, T., Relton, C. & Hemani, G. Mendelian randomization analysis identifies cpg sites as putative mediators for genetic influences on cardiovascular disease risk. *The American Journal of Human Genetics* (2017) Role: senior author. Position: 7/7.
- 25. Gaunt, T., Shihab, H., Hemani, G., Min, J. & Woodward, G. *et al.* Systematic identification of genetic influences on methylation across the human life course. *Genome biology* (2016) Role: main author. Position: 3/14 (joint first).
- 26. White, J., Sofat, R., Hemani, G., Shah, T. & Engmann, J. *et al.* Plasma urate concentration and risk of coronary heart disease: A mendelian randomisation analysis. *The lancet Diabetes & endocrinology* (2016) Role: main analyst. Position: 3/52.
- 27. Yang, J., Bakshi, A., Zhu, Z., Hemani, G. & Vinkhuyzen, A. *et al.* Genetic variance estimation with imputed variants finds negligible missing heritability for human height and body mass index. *Nature genetics* (2015) Role: main analyst. International co-authors. Position: 4/25.
- 28. Robinson, M., Hemani, G., Medina-Gomez, C., Mezzavilla, M. & Esko, T. *et al.* Population genetic differentiation of height and body mass index across europe. *Nature genetics* (2015) Role: main analyst. International co-authors. Position: 2/43.
- 29. Visscher, P., Hemani, G., Vinkhuyzen, A., Chen, G.-B. & Lee, S. *et al.* Statistical power to detect genetic (co) variance of complex traits using snp data in unrelated samples. *PLoS Genet* (2014) Role: main analyst. International co-authors. Position: 2/8.
- 30. Hemani, G., Shakhbazov, K., Westra, H.-J., Esko, T. & Henders, A. *et al.* Detection and replication of epistasis influencing transcription in humans. *Nature* (2014) Role: main author. International co-authors. Position: 1/14.
- 31. McRae, A., Powell, J., Henders, A., Bowdler, L. & Hemani, G. *et al.* Contribution of genetic variation to transgenerational inheritance of dna methylation. *Genome biology* (2014) Role: main analyst. International co-authors. Position: 5/10.
- 32. Hemani, G., Knott, S. & Haley, C. An evolutionary perspective on epistasis and the missing heritability. *PLoS Genet* (2013) Role: main author.
- 33. Hemani, G., Yang, J., Vinkhuyzen, A., Powell, J. & Willemsen, G. *et al.* Inference of the genetic architecture underlying bmi and height with the use of 20,240 sibling pairs. *The American Journal of Human Genetics* (2013) Role: main author. International co-authors. Position: 1/23.
- 34. Speed, D., Hemani, G., Johnson, M. & Balding, D. Improved heritability estimation from genome-wide snps. *The American Journal of Human Genetics* (2012) Role: main analyst. International co-authors.
- 35. Hemani, G., Theocharidis, A., Wei, W. & Haley, C. EpiGPU: Exhaustive pairwise epistasis scans parallelized on consumer level graphics cards. *Bioinformatics* (2011) Role: main author.

Review articles

- 1. Hemani, G., Bowden, J. & Smith, G. Evaluating the potential role of pleiotropy in mendelian randomization studies. *Human molecular genetics* (2018) Role: main author.
- 2. Richmond, R., Hemani, G., Tilling, K., Smith, G. & Relton, C. Challenges and novel approaches for investigating molecular mediation. *Human molecular genetics* (2016) Role: main author.
- 3. Smith, G. & Hemani, G. Mendelian randomization: Genetic anchors for causal inference in epidemiological studies. *Human molecular genetics* (2014) Role: main author.

8

4. Wei, W.-H., Hemani, G. & Haley, C. Detecting epistasis in human complex traits. *Nature Reviews Genetics* (2014) Role: main author. International co-authors.

Selected published open source software

AscRtain 2020 Sensitivity analysis for collider bias in observational data https://github.com/explodecomputer/epigpu **GoDMC** 2019 Website and API for querying genetic assocations with DNA methylation • http://mqtldb.godmc.org.uk/ MR-TRYX 2019 • Exploiting horizontal pleiotropy in Mendelian randomization https://explodecomputer.github.io/tryx/ **OpenGWAS** 2019 The OpenGWAS data infrastructure https://gwas.mrcieu.ac.uk/ USS pension model 2018 • Web-app for projected pensions across different valuations http://www.uss-pension-model.com/ ALSPAC data dictionary 2017 • R package and web-app for searching for ALSPAC variables http://variables.alspac.bris.ac.uk/ MR-Base 2016 Automated Mendelian randomization https://www.mrbase.org/ simulateGP 2016 Simulation methods for genotype-phenotype associations https://explodecomputer.github.io/simulateGP/ actaPower 2013 Power calculations for genomic REML analysis https://shiny.cnsgenomics.com/gctaPower/ epiGPU 2012 • Exhaustive searches for genetic interactions parallelised across graphics cards https://github.com/explodecomputer/epigpu

(ii) Forthcoming publications

- 1. Min, J., Hemani, G., Hannon, E., Dekkers, K. & Castillo-Fernandez, J. *et al.* Genomic and phenomic insights from an atlas of genetic effects on dna methylation. *medRxiv* (2020) Role: main author. Accepted in Nature Genetics. Position: 2/150 (joint first).
- 2. Sanderson, E., Richardson, T., Hemani, G. & Smith, G. The use of negative control outcomes in mendelian randomisation to detect potential population stratification or selection bias. *BioRxiv* (2020) Role: senior author. Accepted in International Journal of Epidemiology.

9

(***) Para anala manda	
(iii) Research grants	
Total income as PI, from 5 grant(s): 2,176,539 GBP	
Total income as CI, from 5 grant(s): 1,480,672 GBP	
Current income as PI, from 3 grant(s): 2,055,459 GBP	
Current income as CI, from 1 grant(s): 284,524.6 GBP	
Genetic architecture of Huntington's disease progression (Contracts pending)	
Cure Huntington's Disease Initiative	2020
• Amount: 598,881 GBP; Role: PI; Dates: 2021-01-01 to 2022-12-31; Proportion: 10%	
Aetiological Epidemiology Biogen	2020
• Amount: 284,525 GBP; Role: Co-I; Dates: 2020-09-01 to 2022-08-31; Proportion: 5%	
The causal map of the human phenome Wellcome Trust and Royal Society, Sir Henry Dale Fellowship • Amount: 1,356,578 GBP; Role: PI; Dates: 2018-01-04 to 2023-06-30; Proportion: 100%	2017
Classifying mechanisms of pleiotropy to improve causal modelling BBSRC and GlaxoSmithKline, CASE studentship • Amount: 100,000 GBP; Role: PI; Dates: 2017-10-01 to 2021-09-30; Proportion: 5%	2017
Pathways to self-harm: Biological mechanisms and genetic contribution Medical Research Councal and Medical Research Foundation • Amount: 372,334 GBP; Role: Co-I; Dates: 2017-10-01 to 2019-10-01; Proportion: 5%	2017
Identification of Traits and Biomarkers for Prediction of Huntington's Disease Phenotypes using Novel causal analysis Methodologies Cure Huntington's Disease Initiative • Amount: 117,059 GBP; Role: Co-I; Dates: 2017-04-01 to 2019-03-31; Proportion: 10%	2017
Translation of MR for drug target identification; De- tails GlaxoSmithKline • Amount: 349,099 GBP; Role: Co-I; Dates: 2017-01-01 to 2020-01-01; Proportion: 5%	2017
Translation of MR for drug target identification Biogen	2017

• Amount: 436,165 USD; Role: Co-I; Dates: 2017-01-01 to 2020-01-01; Proportion: 5%

Dissecting genetic interactions in gene expression

University of Queensland, Early Career Research Grant 2013

• Amount: 34,000 AUD; Role: PI; Dates: 2013-01-01 to 2013-12-31; Proportion: 2%

Dissecting genetic interactions in complex traits

CASE Studentship, BBSRC and Monsanto 2007

• Amount: 100,000 GBP; Role: PI; Dates: 2007-09-01 to 2011-08-30; Proportion: 100%

(iv) Indications of external recognition		
Editorships		
PLoS Computational Biology Invited guest editor	2017	
Appointment to national or international bodies		
 Early Disease Detection Research Project Member of chip design committee Invitation to a committee for designing the genotyping array for the Early Disea which will genotype 5 million UK participants by 2024 	2019 se Detection Research Project,	
Invitations for degree examinations		
Jisu Shin Dissertation of Master of precision medicine	University of South Australia 2020	
Edward Steere	Witswatersrand University, SA	
Dissertation of Master of Science in Engineering	2016	
Invited lectures (last 3 years)		
The Trøndelag Health Study, Norway Multi-omics in longitudinal cohorts	Invited workshop lead 2020	
International Agency for Research on Cancer, France Collider bias in Covid-19 research	Invited talk 2020	
Elizabeth Blackwell Institute data week keynote New data on Covid-19 is undermined by old statistical problems	Invited talk 2020	
GRC Quantitative Genetics conference, Italy Genetic architecture of complex traits	Invited session chair 2019	
Mendelian Randomization conference, Bristol Genetics of DNA methylation	Conference plenary 2019	
SEGEG, University of Oxford Automating Mendelian randomization	Invited talk 2018	
Edinburgh Alliance in Quantitative Genetics Machine learning in Mendelian randomization	Invited talk 2018	

Invited talk

Causal graph of the human phenome]

2018

(vi) Related administration

Leading group on Covid-19 epidemiology

MRC IEU 2020 to present

- Initiated project, and recruited group of 12 researchers
- Provided analysis of ZOE symptom tracker app for external collaborators
- Culminated in four publications, numerous presentations including to SAGE and HDRUK

Initiating the OpenGWAS consortium

MRC IEU 2020 to present

- The OpenGWAS data infrastructure receives 2 million queries per week
- The consortium brings together researchers who develop software for GWAS summary data
- Plans to expand the invitation to international collaborators

Member of the UoB Covid modelling subgroup

University of Bristol 2020 to present

SEGEG conference organiser

South of England Genetic Epidemiology Group

2019

• Organised the long-running SEGEG conference to be held in Bristol for the first time

Leading work package on MR method development (programme 1)

MRC IEU 2018 to present

· Line managing one post doctoral scientist

Leading statistics and informatics theme in epigenetics programme 4

MRC IEU 2018 to present

Leading Hemani research group

MRC IEU 2018 to present

- Four post-docs and four PhD students
- · Weekly group meetings including pastoral and career support

ALSPAC Board of Directors

ALSPAC 2017 to present

Leading genetics work package

ALSPAC 2017 to present

Line managing one post doctoral scientist

ACADEMIC LEADERSHIP AND CITIZENSHIP (i) Academic leadership in the discipline I orchestrate the collection and harmonisation of data across hundreds of international research groups through the OpenGWAS project. This data infrastructure is the largest of its kind, and routinely gets more than 2 million queries

I design analytical pipelines by unifying and developing statistical methods with researchers from multiple international groups. For example I developed the MR-Base software platform, which has now been cited nearly 1000 times since being published in 2018. I also developed the Genetics of DNA Methylation (GoDMC) analytical pipeline, which was recently diseminated to 36 groups around the world and resulted in a paper recently accepted in Nature Genetics.

I form part of a group coordinating the world's largest genetic data collection effort. The Early Disease Detection Research Project (EDDRP) will genotype 5 million individuals in the UK within the next 4 years and I am part of the genotype chip design committee which meets on a monthly basis.

(ii) Academic leadership in the University

Medical Anti-Racism Taskforce

per week from all over the world.

University of Bristol

Group member

2020 to present

• Leading Special interest group on decolonising the curriculum

UoB Covid-19 Situation Report

University of Bristol

Software developer

2020 to present

- · Web app developed for internal use that provides daily updates and case mapping
- Used daily by the Incident Management Team in targeting Covid-19 actions

BRMS Equality Diversity Inclusion group

University of Bristol

Group member

2018 to present

Working in career progression subgroup

USS pension calculator

University of Bristol

Software developer

2018 to present

- Developed a web-app that allows members of the USS pension scheme to calculate changes to the pension under proposed valuation changes
- Used widely by universities across the country
- http://www.uss-pension-model.com/

Teaching peer review

Reviewer

University of Bristol

Causal inference short course, University of Bristol

2018

(iii) Professional activities outside the University

Contributing to the design for the Early Disease Detection Research Programme that will be used to 2019 - genotype up to 5 million people in the UK

2017 - Regular peer review for various grant bodies including the MRC, Wellcome Trust, Cancer Research UK

Regular contributor to open source software projects (e.g. see 2012 -

https://github.com/explodecomputer/random-metal and https://github.com/explodecomputer/ldsc/)

2011 - Regular peer review for 20+ academic journals

(iv) Contributions to society

- Regularly provide private accommodation for asylum seekers and refugees through the *Refugees at Home* 2017 - 2019 charity
 - Contributing member to the charity *Statisticians Without Borders* 2015 -
 - Provide web and software support to local vegan organisations

(v) Entrepreneurship, enterprise and partnerships

I have formal partnerships with GlaxoSmithKlein, Biogen, Pfizer and CHDI that arose through developing the MR-Base platform. This has led to five post-doctoral positions and one PhD position being funded by these 2015 organisations, and the development of a standardised contract system to enable future such collaborations to occur.

(vi) Good citizenship

- Developed software for the University's Incident Management Team which maps new Covid-19 cases 2020 amongst students across the region in real time. This software is used in daily team management meetings Leading a Special Interest Group on Decolonising the Curriculum, which will bring in a framework for all 2020 courses across the medical school for dealing with implicit bias within their learning materials Member of the Bristol Clear mentoring scheme (currently mentoring two early career researchers) 2020 2016 -Participated in numerous mock interview panels for research fellowships Extensive software development for the MRC IEU research community, most notably the MR-Base software platform which I created and maintain for others to use. I am pleased that this has grown to be a platform for 2015 numerous research papers, and contributed substantially to research grants, many of which I am not named 2014 -Voluntary curation and documentation of shared data resources Web and software development for the ALSPAC project (e.g. see http://variables.alspac.bris.ac.uk/ and
- 2014 https://github.com/explodecomputer/alspac)
- Throughout my time in Bristol I have made it a priority to provide informal training to early career 2014 researchers, particularly in genetics, software development and reproducible research.

FUTURE PLANS.

My fellowship is focused on implementing causal inference on a phenome-wide scale, creating a graph of the causal estimates of every phenotype against every other phenotype. I will create collaborations within the University and externally with experts in artificial intelligence, to explore new ways to exploit this graph for biological understanding and medical applications. I will use my causal graph to develop new ways to engage with the public, exploring how perceived ideas of medical interventions would shape future trajectories of population disease burden.

I plan to develop a new professional development course that guides junior researchers and post-graduate students through best practices in code and data management and reproducible digital research.

Through leading the special interest group on decolonising the curriculum, my goal is to develop a method of acreditation for courses across the medical school to introspectively examine potential biases in their teaching materials, identify ways of addressing them, and seek external review of proposed changes. This is a project of crucial importance for equiping the graduates and trainees in redressing biases that continue to incur health inequalities between ethnic groups.