#### **CURRICULUM VITAE**

#### Karl W. Broman

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### **EDUCATION**

| 1997 – 1999 | Postdoctoral Fellow, Center for Medical Genetics, Marshfield Medical Research Foundation, Marshfield, Wisconsin (Advisor: James L. Weber)               |
|-------------|---|
| 1997        | PhD, Statistics, University of California, Berkeley (Advisor: Terry Speed; thesis: <i>Identifying quantitative trait loci in experimental crosses</i> ) |
| 1991        | BS, Summa Cum Laude, Mathematics, University of Wisconsin-Milwaukee   |

### **PROFESSIONAL POSITIONS**

| 2009 – present | Professor, Department of Biostatistics and Medical Informatics, School of Medicine and Public Health, University of Wisconsin–Madison           |
|----------------|---|
| 2007 – 2009    | Associate Professor, Department of Biostatistics and Medical Informatics, School of Medicine and Public Health, University of Wisconsin–Madison |
| 2002 – 2007    | Associate Professor, Department of Biostatistics, Bloomberg School of Public Health, The Johns Hopkins University, Baltimore, Maryland          |
| 1999 – 2002    | Assistant Professor, Department of Biostatistics, Bloomberg School of Public Health, The Johns Hopkins University, Baltimore, Maryland          |
| 1999           | Associate Research Scientist, Center for Medical Genetics, Marshfield Medical Research Foundation, Marshfield, Wisconsin                        |

# **ADDITIONAL PROFESSIONAL APPOINTMENTS**

Faculty member, Computational Systems Biology Cluster, University of Wisconsin–Madison Affiliate faculty member, Department of Statistics, University of Wisconsin–Madison Member, Genome Center of Wisconsin, University of Wisconsin–Madison Faculty trainer, Biostatistics Training Program, Cellular and Molecular Pathology Graduate Program, Computation and Informatics in Biology and Medicine Training Program, Genetics PhD Program, Genomic Sciences Training Program, Master of Public Health Program, Plant Breeding and Plant Genetics Program, and Population Health Graduate Program, University of Wisconsin–Madison

# **RESEARCH INTERESTS**

My research concerns statistical issues arising in problems in genetics and genomics. I focus particularly on the characterization of meiotic recombination and the development of improved methods for detecting and identifying genes contributing to variation in complex phenotypes in experimental organisms.

#### SCIENTIFIC ADVISORY BOARDS

2009 – 2016 Nature Source Genetics, Ithaca, New York

2010 – 2011 Wisconsin Genomics Initiative

### **HONORS AND AWARDS**

Fellow of the American Statistical Association (2016)

Graduate of the Last Decade Award, University of Wisconsin–Milwaukee Alumni Association (2001) Best Paper in *Genetic Epidemiology* in 1999, International Genetic Epidemiology Society (2000) John Wasmuth Fellowship in Genomic Analysis, National Human Genome Research Institute (1998) Evelyn Fix Prize for great promise in statistical research, University of California, Berkeley (1997) Outstanding Graduate Student Instructor, University of California, Berkeley (1997) University Fellowship, University of California, Berkeley (1994) Phi Beta Kappa Society (1991) General Chemistry Award, University of Wisconsin–Milwaukee (1989) Wisconsin All-State Scholar (1988)

### PROFESSIONAL SOCIETY MEMBERSHIPS

American Statistical Association Genetics Society of America Institute of Mathematical Statistics International Biometric Society (ENAR)

# **EDITORIAL ACTIVITIES**

### **Editorial Board Membership**

2017 - present Academic Editor, PeerJ
2016 - present Senior Editor, Genetics
2016 - present Editorial Board, BMC Biology
2004 - 2010 Associate Editor, Genetics
2006 - 2009 Associate Editor, Journal of the American Statistical Association, Applications and Case Studies
2004 - 2007 Associate Editor, Biostatistics

# Peer Review Activities

Referee for American Journal of Epidemiology; American Journal of Human Genetics; American Statistician; Annals of Applied Statistics; Annals of Human Genetics; Annals of Statistics; Arteriosclerosis, Thrombosis, and Vascular Biology; Bioinformatics; Biometrics; Biostatistics; BMC Bioinformatics; BMC Biology; BMC Genetics; BMC Genomics; BMC Medical Research Methodology; BMC Proceedings; BMC Research Notes; Cancer Research; Circulation Research; Computational Statistics & Data Analysis; Crop Science; eLife; European Journal of Human Genetics; Evolution; Gene; Genes, Brain, and Behavior; Genes & Immunity; Genetic Epidemiology; Genetica; Genetical Research; Genetics; Genetics Research; Genetics

Selection Evolution; Genome; Genome Research; Genomics; Growth, Development, & Aging; Heredity; Human Genetics; Human Heredity; Human Molecular Genetics; IEEE/ACM Transactions on Computational Biology and Bioinformatics; Journal of Agricultural, Biological, and Environmental Statistics; Journal of the American Society of Nephrology; Journal of the American Statistical Association; Journal of Applied Genetics; Journal of Bioinformatics and Computational Biology; Journal of Computational and Graphical Statistics; Journal of Fish Biology; Journal of Heredity; Journal of Immunology; Journal of Neuroscience; Journal of Open Source Software; Journal of Statistical Distributions and Applications; Journal of Statistical Planning and Inference; Journal of Statistical Software; Mammalian Genome; Methods in Ecology and Evolution; Molecular Biology and Evolution; Molecular Ecology Resources; Molecular Genetics and Genomics; Molecular Informatics; Nature Communications; Nature Genetics; Nature Methods; Nature Protocols; Nature Reviews-Genetics; Nucleic Acids Research; Ophthalmic Epidemiology; Pacific Symposium on Biocomputing; Physical Review Letters; Physiological Genomics; Plant Cell; PLoS Biology; PLoS Computational Biology; PLoS Genetics; PLoS ONE; Proceedings of the National Academy of Sciences USA; R Journal; Scandinavian Journal of Immunology; Science; Statistical Applications in Genetics and Molecular Biology; Statistics; Theoretical Population Biology; and Trends in Genetics

*Book reviewer* for Arnold Publishers, Chapman & Hall/CRC, Columbia University Press, Oxford University Press, Princeton University Press, Springer–Verlag, and Taylor & Francis

# **Review Panels**

| 2010 – 2015 | Center for Inherited Disease Research (CIDR) Access Committee, National Human Genome Research Institute, National Institutes of Health ( <i>Chair</i> , 2014 – 2015) |
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| 2006 – 2010 | Genomics, Computational Biology, and Technology Study Section (GCAT), Center for Scientific Review, National Institutes of Health                                    |

### Ad hoc Review of Proposals

Center for Inherited Disease Research Access Committee; Clinical Research Review Committee, National Center for Research Resources; Genomics, Computational Biology, and Technology Study Section (NIH); Hatch grant competition, College of Agriculture and Life Sciences, University of Wisconsin–Madison; Johns Hopkins Center for Alternatives to Animal Testing; Mammalian Genetics Study Section (NIH); Microsoft Research European Fellowship Programme; National Cancer Institute Special Emphasis Panel (NIH); National Institute of Environmental Health Sciences Special Emphasis Panel (NIH); National Institute on Aging Special Emphasis Panel (NIH); National Science Council (Republic of China); National Science Foundation; National Sciences and Engineering Research Council (Canada); Council for Earth and Life Sciences, Netherlands Organization for Scientific Research; Neurological Sciences and Disorders A Study Section (NIH); and Telethon (Italy)

# **PUBLICATIONS**

#### **Books**

Broman KW, Sen S (2009) A Guide to QTL Mapping with R/qtl. Springer (ISBN: 978-0-387-92124-2)

### Journal Articles

**Broman KW**, Gatti DM, Svenson KL, Sen Ś, Churchill GA (2019) Cleaning genotype data from Diversity Outbred mice. *G3*, to appear

- 2019 **Broman KW**, Gatti DM, Simecek P, Furlotte NA, Prins P, Sen Ś, Yandell BS, Churchill GA (2019) R/qtl2: software for mapping quantitative trait loci with high-dimensional data and multi-parent populations. *Genetics* 211: 495–502
- 2018 Palus M, Sohrabi Y, **Broman KW**, Strnad H, Šíma M, Růžek D, Volkova V, Slapničková M, Vojtíšková J, Mrázková L, Salát J, Lipoldová M (2018) A novel locus on mouse chromosome 7 that influences survival after infection with tick-borne encephalitis virus. *BMC Neurosci* 19:39

Keller MP, Gatti DM, Schueler KL, Rabaglia ME, Stapleton DS, Simecek P, Vincent M, Allen S, Broman AT, Bacher R, Kendziorski C, **Broman KW**, Yandell BS, Churchill GA, Attie AD (2018) Genetic drivers of pancreatic islet function. *Genetics* 209:335–356

Broman KW, Woo KH (2018) Data organization in spreadsheets. Am Stat 72:2–10

Keele GR, Prokop JW, He H, Holl K, Littrell J, Deal A, Francic S, Cui L, Gatti DM, **Broman KW**, Tschannen M, Tsaih S-W, Zagloul M, Kim Y, Baur B, Fox J, Robinson M, Levy S, Flister MJ, Mott R, Valdar W, Solberg Woods LC (2018) Genetic fine-mapping and identification of candidate genes and variants for adiposity traits in outbred rats. *Obesity* 26:213–222

- 2017 Florek NW, Kamlangdee A, Mutschler JP, Kingstad-Bakke B, Schultz-Darken N, **Broman KW**, Osorio JE, Friedrich TC (2017) A modified vaccinia Ankara vaccine vector expressing a mosaic H5 hemagglutinin reduces viral shedding in rhesus macaques. *PLoS ONE* 12:e0181738
  - Wang RJ, Gray MM, Parmenter MD, **Broman KW**, Payseur BA (2017) Recombination rate variation in mice from an isolated island. *Mol Ecol* 26:457–470
- 2016 Keller MP, Paul PK, Rabaglia ME, Stapleton DS, Schueler KL, Broman AT, Ye SI, Leng N, Brandon CJ, Neto EC, Plaisier CL, Simonett SP, Kebede MA, Sheynkman GM, Klein MA, Baliga NS, Smith LM, Broman KW, Yandell BS, Kendziorski C, Attie AD (2016) The transcription factor Nfatc2 regulates β-cell proliferation and genes associated with type 2 diabetes in mouse and human islets. PLoS Genet 12:e1006466

Parmenter MD, Gray MM, Hogan CA, Ford IN, **Broman KW**, Vinyard CJ, Payseur BA (2016) Genetics of skeletal evolution in unusually large mice from Gough Island. *Genetics* 204:1559–1572

Zigler JS Jr, Hodgkinson CA, Wright M, Klise A, Sundin O, **Broman KW**, Hejtmancik F, Huang H, Patek B, Sergeev Y, Hose S, Brayton C, Xaiodong J, Vasquez D, Maragakis N, Mori S, Goldman D, Hoke A, Sinha D (2016) A spontaneous missense mutation in branched chain keto acid dehydrogenase kinase in the rat affects both the central and peripheral nervous systems. *PLoS ONE* 11:e0160447

Sloan Z, Arends D, **Broman KW**, Centeno A, Furlotte N, Nijveen H, Yan L, Zhou X, Williams RW, Prins P (2016) GeneNetwork: framework for web-based genetics. *J Open Source Software* 1(2): 25

De Simone M, Spagnuolo L, Lorè NI, Cigana C, De Fino I, **Broman KW**, Iraqi FA, Bragonzi A (2016) Mapping genetic determinants of host susceptibility to Pseudomonas aeruginosa lung infection in mice. *BMC Genomics* 17:351

Tian J, Keller MP, Broman AT, Kendziorski C, Yandell BS, Attie AD, **Broman KW** (2016) The dissection of expression quantitative trait locus hotspots. *Genetics* 202:1563–1574

Gruhn JR, Al-Asmar N, Fasnacht R, Maylor-Hagen H, Peinado V, Rubio C, **Broman KW**, Hunt PA, Hassold T (2016) Correlations between synaptic initiation and meiotic recombination: A study of humans and mice. *Am J Hum Genet* 98:102–115

- Kwak I-L, Moore CR, Spalding EP, **Broman KW** (2016) Mapping quantitative trait loci underlying function-valued traits using functional principal component analysis and multi-trait mapping. *G*3 6:79–86
- Tian J, Keller MP, Oler AT, Rabaglia ME, Schueler KL, Stapleton DS, Broman AT, Zhao W, Kendziorski C, Yandell BS, Hagenbuch B, **Broman KW**, Attie AD (2015) Identification of the bile acid transporter *Slco1a6* as a candidate gene that broadly affects gene expression in mouse pancreatic islets. *Genetics* 201:1253–1262

**Broman KW**, Keller MP, Broman AT, Kendziorski C, Yandell BS, Sen Ś, Attie AD (2015) Identification and correction of sample mix-ups in expression genetic data: A case study. *G*3 5:2177–2186

Gray MM, Parmenter M, Hogan C, Ford I, Cuthbert RJ, Ryan PG, **Broman KW**, Payseur BA (2015) Genetics of rapid and extreme size evolution in island mice. *Genetics* 201:213–228

Whitney KD, **Broman KW**, Kane NC, Hovick SM, Randell RA, Rieseberg LH (2015) Quantitative trait locus mapping identifies candidate alleles involved in adaptive introgression and range expansion in a wild sunflower. *Mol Ecol* 24:2194–2211

**Broman KW** (2015) R/qtlcharts: Interactive graphics for quantitative trait locus mapping. *Genetics* 199:359–361

2014 Florek NW, Weinfurter JT, Jegaskanda S, Brewoo JN, Powell TD, Young GR, Das SC, Hatta M, **Broman KW**, Hungnes O, Dudman SG, Kawaoka Y, Kent SJ, Stinchcomb DT, Osorio JE, Friedrich TC (2014) Modified vaccinia Ankara encoding influenza virus hemagglutinin induces heterosubtypic immunity in macaques. *J Virol* 88:13418–13428

Gatti DM, Svenson KL, Shabalin A, Wu L-Y, Valdar W, Simecek P, Goodwin N, Cheng R, Pomp D, Palmer A, Chesler EJ, **Broman KW**, Churchill GA (2014) Quantitative trait locus mapping methods for Diversity Outbred mice. *G*3 4:1623–1633

Street VA, Kujawa SG, Manichaikul A, **Broman KW**, Kallman JC, Shilling DJ, Iwata AJ, Robinson LC, Robbins CA, Li J, Liberman MC, Tempel BL (2014) Resistance to noise-induced hearing loss in 129S6 and MOLF mice: Identification of independent, overlapping, and interacting chromosomal regions. *J Assoc Res Otolaryngol* 15:721–738

Kwak I-Y, Moore CR, Spalding EP, **Broman KW** (2014) A simple regression-based method to map quantitative trait loci underlying function-valued phenotypes. *Genetics* 197: 1409–1416

**Broman KW** (2014) Fourteen years of R/qtl: Just barely sustainable. J Open Res Softw 2(1):e11

Rowsey R, Gruhn J, **Broman KW**, Hunt PA, Hassold T (2014) Examining variation in recombination levels in the human female: A test of the production line hypothesis. *Am J Hum Genet* 95:108–112

Huang BE, Raghavan C, Mauleon R, **Broman KW**, Leung H (2014) Efficient imputation of missing markers in low-coverage genotyping-by-sequencing data from multi-parent crosses. *Genetics* 197:401–404

Baier B, Hunt P, **Broman KW**, Hassold T (2014) Variation in genome-wide levels of meiotic recombination is established at the onset of prophase in mammalian males. *PLoS Genet* 10:e1004125

2013 Gruhn JR, Rubio C, Broman KW, Hunt PA, Hassold T (2013) Cytological studies of human meiosis: sexspecific differences in recombination originate at, or prior to, establishment of double-strand breaks. PLoS ONE 8:e85075

Moore CR, Johnson LS, Kwak IY, Livny M, **Broman KW**, Spalding EP (2013) High-throughput computer vision introduces the time axis to a quantitative trait map of a plant growth response. *Genetics* 195:1077–1086

Bautz DJ, **Broman KW**, Threadgill DW (2013) Identification of a novel polymorphism in X-linked sterol-4-alpha-carboxylate 3-dehydrogenase (Nsdhl) associated with reduced HDL cholesterol levels in I/LnJ mice. *G*3 3:1819–1825

Harris M, Burns CM, Becker EA, Braasch AT, Gostick E, Johnson RC, **Broman KW**, Price DA, Friedrich TC, O'Connor SL (2013) Acute-phase CD8 T cell responses that select for escape variants are needed to control live attenuated simian immunodeficiency virus. *J Virol* 87:9353–9364

Maenner MJ, Baker MW, **Broman KW**, Tian J, Barnes JK, Atkins A, McPherson E, Hong J, Brilliant MH, Mailick MR (2013) *FMR1* CGG expansions: Prevalence and sex ratios. *Am J Med Genet B Neuropsychiatr Genet* 162:466–473

2012 **Broman KW**, Kim S, Sen Ś, Ané C, Payseur BA (2012) Mapping quantitative trait loci onto a phylogenetic tree. *Genetics* 192:167–179

Rice CA, Riehl J, **Broman K**, Soukup JW, Gengler WR (2012) Comparing the degree of exothermic polymerization in commonly used acrylic and provisional composite resins for intraoral appliances. *J Vet Dent* 29: 78–83

Galvan A, Colombo F, Noci S, Pazzaglia S, Mancuso M, Manenti G, **Broman KW**, Saran A, Dragani TA (2012) The *Lsktm1* locus modulates lung and skin tumorigenesis in the mouse. *G3* 2:1041–1046

Greene JM, Chin EN, Budde ML, Lhost JJ, Hines PJ, Burwitz BJ, **Broman KW**, Nelson JE, Friedrich TC, O'Connor DH (2012) *Ex vivo* SIV-specific CD8 T cell responses in heterozygous animals are primarily directed against peptides presented by a single MHC haplotype. *PLoS ONE* 7:e43690

Neto EC, Keller MP, Broman AF, Attie AD, Jansen RC, **Broman KW**, Yandell BS (2012) Quantile-based permutation thresholds for quantitative trait loci hotspots. *Genetics* 191:1355–1365

King EG, Merkes CM, McNeil CL, Hoofer SR, Sen S, **Broman KW**, Long AD, Macdonald SJ (2012) Genetic dissection of a model complex trait using the *Drosophila* Synthetic Population Resource. *Genome Res* 22:1558–1566

Wang CY, Stapleton DS, Schueler KL, Rabaglia ME, Oler AT, Keller MP, Kendziorski CM, **Broman KW**, Yandell BS, Schadt EE, Attie ED (2012) *Tsc2*, a positional candidate gene underlying a quantitative trait locus for hepatic steatosis. *J Lipid Res* 53:1493–1501

Arends D, van der Velde KJ, Prins P, **Broman KW**, Möller S, Jansen RC, Swertz MA (2012) xQTL workbench: a web based environment for xQTL analysis. *Bioinformatics* 28:1042–1044

Amlin-Van Schaick JC, Kim S, **Broman KW**, Reilly KM (2012) *Scram1* is a modifier of spinal cord resistance for astrocytoma on mouse chromosome 5. *Mamm Genome* 23:277–285

**Broman KW** (2012) Genotype probabilities at intermediate generations in the construction of recombinant inbred lines. *Genetics* 190:403–412

Broman KW (2012) Haplotype probabilities in advanced intercross populations. G3 2:199–202

Collaborative Cross Consortium [97 authors] (2012) The genome architecture of the Collaborative Cross mouse genetic reference population. *Genetics* 190:389–401

Amlin-Van Schaick JC, Kim S, DiFabio C, Lee M-H, **Broman KW**, Reilly KM (2012) *Arlm1* is a male-specific modifier of astrocytoma resistance on mouse chr 12. *Neuro Oncol* 14:160–174

Davis RC, Van Nas A, Castellani LW, Zhao Y, Zhou Z, Wen P, Yu S, Qi H, Rosales M, Schadt EE, **Broman KW**, Peterfy M, Lusis AJ (2012) Systems genetics of susceptibility to obesity-induced diabetes in mice. *Physiol Genomics* 44:1–13

2011 Weinfurter JT, Brunner K, Capuano SV III, Li C, **Broman KW**, Kawaoka Y, Friedrich T (2011) Cross-reactive T cells are involved in rapid clearance of 2009 pandemic H1N1 influenza virus in nonhuman primates. *PLoS Pathog* 7:e1002381

Aylor DL, Valdar W, Foulds-Mathes W, Buus RJ, Verdugo RA, Baric RS, Ferris MT, Frelinger JA, Heise M, Frieman MB, Gralinski LE, Bell TA, Didion JD, Hua K, Nehrenberg DL, Powell CL, Steigerwalt J, Xie Y, Kelada SNP, Collins F, Yang IV, Schwartz DA, Branstetter LA, Chesler EJ, Miller DR, Spence J, Liu EY, McMillan L, Sarkar A, Wang J, Wang W, Zhang Q, **Broman KW**, Korstanje R, Durrant C, Mott R, Iraqi FA, Pomp D, Threadgill D, Pardo-Manuel de Villena F, Churchill GA (2011) Genetic analysis of complex traits in the emerging Collaborative Cross. *Genome Res* 21:1213–1222

Greene JM, Wiseman RW, Lank SM, Bimber BN, Karl JA, Burwitz BJ, Lhost JJ, Hawkins OE, Kunstman KJ, **Broman KW**, Wolinsky SM, Hildebrand WH, O'Connor DH (2011) Differential MHC class I expression in distinct leukocyte subsets. *BMC Immunol* 12:39

Bradley KM, Breyer JP, Melville DB, **Broman KW**, Knapik EW, Smith JR (2011) A SNP-based linkage map for zebrafish reveals sex determination loci. *G*3 1:3–9

Moreland AJ, Guethlein LA, Reeves RK, **Broman KW**, Johnson RP, Parham P, O'Connor DH, Bimber BN (2011) Characterization of killer immunoglobulin-like receptor genetics and comprehensive genotyping by pyrosequencing in rhesus macaques. *BMC Genomics* 12:295

Svetec N, Werzner A, Wilches R, Pavlidis P, Álvarez-Castro JM, **Broman KW**, Metzler D, Stephan W (2011) Identification of X-linked quantitative trait loci affecting cold tolerance in *Drosophila melanogaster* and fine-mapping by selective sweep analysis. *Mol Ecol* 20:530–544

2010 Murdoch B, Owen N, Shirley S, Crumb S, **Broman KW**, Hassold T (2010) Multiple loci contribute to genome-wide recombination levels in male mice. *Mamm Genome* 21:550–555

Billings T, Sargent EE, Szatkiewicz JP, Leahy N, Kwak, I-Y, Bektassova N, Walker M, Hassold T, Graber JH, **Broman KW**, Petkov PM (2010) Patterns of recombination activity on mouse chromosome 11 revealed by high resolution mapping. *PLoS ONE* 5:e15340

Arends D, Prins P, Jansen RC, **Broman KW** (2010) R/qtl: High-throughput multiple QTL mapping. *Bioinformatics* 26:2990–2992

Bader HL, Ruhe AL, Wang LW, Wong AK, Walsh KF, Packer RA, Mitelman J, Robertson KR, O'Brien DP, **Broman KW**, Shelton GD, Apte SS, Neff MW (2010) An *ADAMTSL*2 founder mutation causes Musladin-Lueke Syndrome, a heritable disorder of beagle dogs, featuring stiff skin and joint contractures. *PLoS ONE* 5:e12817

Jurisic G, Sundberg JP, Bleich A, Leiter EH, **Broman KW**, Buechler G, Alley L, Vestweber D, Detmar M. (2010) Quantitative lymphatic vessel trait analysis suggests *Vcam1* as candidate modifier gene of inflammatory bowel disease. *Genes Immun* 11:219–231

Burrage LC, Baskin-Hill AE, Sinasac DS, Singer JB, Croniger CM, Kirby A, Kulbokas EJ, Daly MJ, Lander ES, **Broman KW**, Nadeau JH (2010) Genetic resistance to diet-induced obesity in chromosome substitution strains of mice. *Mamm Genome* 21:115–129

Greene JM, Lhost JJ, Burwitz BJ, Budde ML, Macnair CE, Weiker MK, Gostick E, Friedrich TC, **Broman KW**, Price DA, O'Connor SL, O'Connor DH (2010) Extralymphoid CD8<sup>-</sup>T cells resident in tissue from Simian Immunodeficiency Virus SIVmac239Δnef-vaccinated macaques suppress SIVmac239 replication *ex vivo*. *J Virol* 84:3362–3372

Wong AK, Ruhe AL, Dumont BL, Robertson KR, Guerrero G, Shull SM, Ziegle JS, Millon LV, **Broman KW**, Payseur BA, Neff MW (2010) A comprehensive linkage map of the dog genome. *Genetics* 184:595–605

2009 Shavit JA, Manichaikul A, Lemmerhirt HL, **Broman KW**, Ginsburg D (2009) Modifiers of von Willebrand factor identified by natural variation in inbred strains of mice. *Blood* 114:5368–5374

Cheng EY, Hunt PA, Naluai-Cecchini TA, Fligner CL, Fujimoto VY, Pasternack TL, Schwartz JM, Woodruff TJ, Cherry SM, Hansen TA, Vallente RU, **Broman KW**, Hassold TJ (2009) Meiotic recombination in human oocytes. *PLoS Genet* 5:e1000661

Fledel-Alon A, Wilson DJ, **Broman KW**, Wen W, Ober C, Coop G, Przeworski M (2009) Broad-scale recombination patterns underlying proper disjunctions in humans. *PLoS Genet* 5:e1000658

Cox A, Ackert-Bicknell CL, Dumont BL, Ding Y, Bell, JT, Brockmann GA, Wergedal JE, Bult C, Paigen B, Flint J, Tsaih S-W, Churchill GA, **Broman KW** (2009) A new standard genetic map for the laboratory mouse. *Genetics* 182:1335–1344

Dumont BL, **Broman KW**, Payseur BA (2009) Variation in genomic recombination rates among heterogeneous stock mice. *Genetics* 182:1345–1349

Manichaikul A, **Broman KW** (2009) Binary trait mapping in experimental crosses with selective genotyping. *Genetics* 182:863–874

Venkatesan M, **Broman KW**, Sellers M, Rasgon JL (2009) An initial linkage map of the West Nile Virus vector *Culex tarsalis*. *Insect Mol Biol* 18:453–463

Sen Ś, Johannes F, **Broman KW** (2009) Selective genotyping and phenotyping strategies in a complex trait context. *Genetics* 181:1613–1626

Manichaikul A, Moon JY, Sen Ś, Yandell BS, **Broman KW** (2009) A model selection approach for the identification of quantitative trait loci in experimental crosses, allowing epistasis. *Genetics* 181:1077–1086 [Erratum: *Genetics* 184:607, 2010]

2008 Shao H, Burrage LC, Sinasac DS, Hill AE, Ernest SR, O'Brien W, Courtland HW, Jepsen KJ, Kirby A, Kulbokas EJ, Daly MJ, **Broman KW**, Lander ES, Nadeau JH (2008) Genetic architecture of complex traits: Large phenotypic effects and pervasive epistasis. *Proc Natl Acad Sci USA* 105:19910–19914

Hill M, **Broman KW**, Stupka E, Smith W, Jiang D, Sidow A (2008) The *C. savignyi* genetic map and its integration with the reference sequence facilitates insights into chordate genome evolution. *Genome Res* 18:1369–1379

Lupi I, **Broman KW**, Tzuo S-C, Gutenberg A, Martino E, Caturegli P (2008) Novel autoantigens in autoimmune hypophysitis. *Clin Endocrinol* 69:269–278

Paigen K, Szatkiewicz JP, Sawyer K, Leahy N, Parvanov ED, Ng SH, Graber JH, **Broman KW**, Petkov PM (2008) The recombinational anatomy of a mouse chromosome. *PLoS Genet* 4(7): e1000119

Bjornsson HT, Albert TJ, Ladd-Acosta CM, Green RD, Rongione MA, Middle CM, Irizarry RA, **Broman KW**, Feinberg AP (2008) SNP-specific array-based allele-specific expression analysis. *Genome Res* 18:771–779

Peirce JL, **Broman KW**, Lu L, Chesler EJ, Zhou G, Airey DC, Birmingham AE, Williams RW (2008) Genome Reshuffling for Advanced Intercross Permutation (GRAIP): Simulation and permutation for advanced intercross population analysis. *PLoS ONE* 3(4):e1977

Roy-Gagnon M-H, Mathias RA, Fallin MD, Jee SH, **Broman KW**, Wilson AF (2008) An extension of the regression of offspring on mid-parent to test for association and estimate locus-specific heritability: The revised ROMP method. *Ann Hum Genet* 72:115–125

Sinha D, Klise A, Sergeev Y, Hose S, Bhutto IA, Hackler L Jr, Malpic-Ilanos T, Samtani S, Grebe R, Goldberg MF, Hejtmancik JF, Nath A, Zack DJ, Fariss RN, McLeod DS, Sundin O, **Broman KW**, Lutty GA, Zigler JS Jr (2008)  $\beta$ A3/A1-crystallin in astroglial cells regulates retinal vascular remodeling during development. *Mol Cell Neurosci* 37:85–95

2007 Rajagopal SK, Ma Q, Obler D, Shen J, Manichaikul A, Tomita-Mitchell A, Boardman K, Briggs C, Garg V, Srivastava D, Goldmuntz E, **Broman KW**, Benson DW, Smoot LB, Pu WT (2007) Spectrum of heart disease associated with murine and human *GATA4* mutation. *J Mol Cell Cardiol* 43:677–685

Manichaikul A, Palmer AA, Sen Ś, **Broman KW** (2007) Significance thresholds for quantitative trait locus mapping under selective genotyping. *Genetics* 177:1963–1966

Petkov PM, **Broman KW**, Szatkiewicz JP, Paigen K (2007) Crossover interference underlies sex differences in recombination rates. *Trends Genet* 23:539–542

Peirce JL, **Broman KW**, Lu L, Williams RW (2007) A simple method for combining genetic mapping data from multiple crosses and experimental designs. *PLoS ONE* 2(10):e1036

Teuscher F, **Broman KW** (2007) Haplotype probabilities for multiple-strain recombinant inbred lines. *Genetics* 175:1267–1274

Sen Ś, Satagopan JM, **Broman KW**, Churchill GA (2007) R/qtlDesign: Inbred line cross experimental design. *Mamm Genome* 18:87–93

Lemmerhirt HL, **Broman KW**, Shavit JA, Ginsburg D (2007) Genetic regulation of plasma von Willebrand factor levels: QTL analysis in a mouse model. *J Thromb Haemost* 5:329–335

Nichols KM, **Broman KW**, Sundin K, Young JM, Wheeler PA, Thorgaard GH (2007) Quantitative trait loci by maternal cytoplasmic environment interaction for development rate in *Oncorhynchus mykiss*. *Genetics* 175:335–347

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# Editorials

Broman KW (2005) Mapping expression in randomized rodent genomes. Nat Genet 37:209–210

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# Letters

Sieberts SK, **Broman KW**, Gudbjartsson DF (2004) "Biased towards the null" means reduced power. *Am J Hum Genet* 75:720–722

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### Proceedings and Book Chapters

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González-Recio O, López de Maturana E, Vega AT, Engelman CD, **Broman KW** (2009) Detecting single-nucleotide polymorphism by single-nucleotide polymorphism interactions in rheumatoid arthritis by a two-step approach with machine learning and a Bayesian threshold least absolute shrinkage and selection operator (LASSO) model. *BMC Proc* 3(Suppl 7):S63

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Weber JL, **Broman KW** (2001) Human whole genome polymorphism scans: Past, present and future. In: Rao DC, Province MA (eds) *Genetic Dissection of Complex Traits*. Vol. 42: *Advances in Genetics*. Academic Press, New York, pp. 77–96

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**Broman KW**, Speed TP (1999) A review of methods for identifying QTLs in experimental crosses. In: Seillier-Moiseiwitsch F (ed) *Statistics in Molecular Biology and Genetics. IMS Lecture Notes–Monograph Series*, Vol. 33, pp. 114–142

### **Technical Reports**

**Broman KW** (2010) Genetic map construction with R/qtl. Technical report #214, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison

**Broman KW** (2006) Use of hidden Markov models for QTL mapping. Working paper 125, Department of Biostatistics, Johns Hopkins University, Baltimore, MD

Blades NJ, **Broman KW** (2002) Estimating the number of essential genes in a genome by random transposon mutagenesis. Technical Report MS02-20, Department of Biostatistics, Johns Hopkins University, Baltimore, MD

Bowman KO, Shenton LR, Kastenbaum MA, **Broman K** (1992) Overdispersion: Notes on discrete distributions. Technical Report ORNL/TM-12167, Oak Ridge National Laboratory

### SOFTWARE AND OTHER RESOURCES

| R/qtl | An R package for mapping genes contributing to variation in |
|-------|---|
|       |   |

quantitative traits in experimental crosses (rqtl.org).

R/qtlcharts An R package to create interactive data visualizations for quantitative

trait locus mapping data (kbroman.org/qtlcharts).

aRxiv An R package for searching arXiv, a repository of electronic preprints

for computer science, mathematics, physics, quantitative biology, quantitative finance, and statistics. (github.com/ropensci/aRxiv).

git/GitHub guide Online tutorial on the git version control system and its use with

GitHub.com(kbroman.org/github\_tutorial).

knitr in a knutshell Online tutorial on knitr, a tool for creating documents that mix code

and text (kbroman.org/knitr knutshell).

minimal make Online tutorial on GNU Make, for automating computational tasks

(kbroman.org/minimal make).

R package primer Online tutorial on writing packages for the R statistical software

(kbroman.org/pkg primer).

simple site Online tutorial on constructing simple websites with GitHub Pages

(kbroman.org/simple\_site).

RelCheck Software for the verification of relationships between individuals

with use of autosomal genotype data.

Marshfield genetic maps Genetic maps of the human genome, with internet-based tools for the

search for genetic markers and semi-automated map construction.

#### **EDUCATIONAL ACTIVITIES**

#### PhD Advisees

Fred Boehm, PhD student, Statistics, University of Wisconsin-Madison

Quoc Tran, PhD student, Statistics, University of Wisconsin–Madison

Jianan Tian, PhD, Statistics, University of Wisconsin–Madison (Thesis: *Dissection and fine-mapping of trans-eQTL hotspots*), 2015

Il-Youp Kwak, PhD, Statistics, University of Wisconsin–Madison (Thesis: *Regression-based methods to map quantitative trait loci underlying function-valued phenotypes*), 2014

Ani Manichaikul, PhD, Biostatistics, Johns Hopkins Bloomberg School of Public Health (Thesis: *Statistical methods for mapping quantitative trait loci in experimental crosses*), 2007

Wei-Min Chen, PhD, Biostatistics, Johns Hopkins Bloomberg School of Public Health (Thesis: *Robust quantitative trait linkage analysis in extended human pedigrees*), 2004

# Master's Advisees

Sungjin Kim, MS, Statistics, University of Wisconsin-Madison, 2011

Laura C. Plantinga, ScM, Biostatistics, Johns Hopkins Bloomberg School of Public Health (Thesis: *Inference of clusters of related individuals with dominant genetic marker data*), 2001

# Undergraduate Advisees

Alexandra Lobo, summer student, Biomedical Data Science Summer Research Program, University of Wisconsin–Madison, summer, 2017

Janel Barnes, summer student, Integrated Biological Sciences Summer Research Program, University of Wisconsin–Madison, summer, 2012

Leah Fehr, summer student, Integrated Biological Sciences Summer Research Program, University of Wisconsin–Madison, summer, 2008

# Academic Advisees, Johns Hopkins University

| 2006 - 2007 | Sheng-Chih Jin          | ScM candidate, Biostatistics        |
|-------------|-------------------------|-------------------------------------|
| 2005 - 2007 | Ani Manichaikul         | PhD candidate, Biostatistics        |
| 2005 - 2006 | Alex Phan               | candidate for MHS in Bioinformatics |
| 2005 - 2006 | Jichao Chen             | candidate for MHS in Bioinformatics |
| 2004 - 2006 | Snaebjorn Gunnsteinsson | PhD candidate, Biostatistics        |
| 2003 - 2007 | Benilton Carvalho       | PhD candidate, Biostatistics        |
| 2003 - 2005 | Wenyi Wang              | PhD candidate, Biostatistics        |
| 2000 - 2004 | Wei-Min Chen            | PhD candidate, Biostatistics        |
| 2000 - 2003 | Michelle Shardell       | PhD candidate, Biostatistics        |
| 1999 – 2001 | Sora Kim                | ScM candidate, Biostatistics        |

# Doctoral Thesis Committees, University of Wisconsin–Madison

| 2018 – present | Theeva Chandereng            | Statistics                        |
|----------------|------------------------------|-----------------------------------|
| 2018 – present | Michael Kartje               | Genetics                          |
| 2017 – present | Jeremy Lange                 | Genetics                          |
| 2017 – present | Christopher McAllester       | Genetics                          |
|                | April Peterson               | Genetics                          |
| 2015 – present | Quentin Sprengelmeyer        | Genetics                          |
| 2012 - 2019    | Molly McDevitt               | Biochemistry                      |
| 2017 - 2018    | Kyubin Lee                   | Computer Sciences                 |
| 2015 - 2018    | René Welch                   | Statistics                        |
| 2012 - 2017    | Michelle Parmenter           | Genetics                          |
| 2014 - 2017    | Alessandra York              | Genetics                          |
| 2013 - 2017    | Richard Wang                 | Genetics                          |
| 2013 - 2016    | Shuang Huang                 | Statistics                        |
| 2011 - 2013    | Raja Farhana Raja Mohd Anuar | Plant Breeding and Plant Genetics |
| 2010 - 2015    | Katie Clowers                | Genetics                          |
| 2010           | Jingfang Zhang               | Oncology                          |
| 2010 - 2011    | Michael White                | Genetics                          |
| 2010           | Elias Chaibub Neto           | Statistics                        |
| 2007 - 2010    | Beth Dumont                  | Genetics                          |

# Doctoral Thesis Committees, Johns Hopkins University

| 2006 - 2007 | Meera Venkatesan     | Molecular Microbiology and Immunology |
|-------------|----------------------|---------------------------------------|
| 2006 - 2007 | Ching-Yu Cheng       | Epidemiology                          |
| 2005 - 2007 | Robert Wojciechowski | Epidemiology                          |
| 2004 - 2007 | Tanya Teslovich      | Human Genetics (School of Medicine)   |
| 2004 - 2005 | Katherine Swanson    | Molecular Microbiology and Immunology |
| 2003 - 2004 | Shin Lin             | Human Genetics (School of Medicine)   |
| 2003 - 2004 | Adele Mitchell       | Human Genetics (School of Medicine)   |
| 2002 - 2003 | Rivka Glaser         | Human Genetics (School of Medicine)   |
| 2002        | Shawn Soutiere       | Environmental Health Sciences         |
| 2001 - 2004 | Sadeep Shresthra     | Epidemiology                          |
| 2001 - 2002 | Rasika Mathias       | Epidemiology                          |
| 1999 – 2002 | Cynthia James        | Human Genetics (School of Medicine)   |
|             |                      |                                       |

# Oral Exams, University of Wisconsin–Madison

| 2018 | Christopher McAllester<br>Thevaa Chandereng | Genetics<br>Statistics |
|------|---|------------------------|
| 2017 | Constanza Rojo                              | Statistics             |

|                       | Quentin Sprengelmeyer<br>Jeremy Lange<br>Kyubin Lee<br>Fred Boehm                             | Genetics Genetics Computer Sciences Statistics   |
|-----------------------|---|--|
| 2016                  | April Peterson<br>Alessandra York   | Genetics<br>Genetics   |
| 2015                  | René Welch  | Statistics   |
| 2014                  | Shuyun Ye<br>Michelle Parmenter<br>Jeea Choi  | Statistics Genetics Statistics   |
| 2013                  | Jianan Tian<br>Richard Wang<br>Shuang Huang<br>Raja Farhana Raja Mohd Anuar<br>Molly McDevitt | Statistics<br>Genetics<br>Statistics<br>Plant Breeding and Plant Genetics<br>Biochemistry                                |
| 2012                  | Katie Clowers   | Genetics   |
| 2011                  | Il Youp Kwak  | Statistics   |
| 2010                  | Jee Young Moon<br>John Dawson<br>Elias Chaibub Neto<br>Qinglin Pei<br>Jingfang Zhang          | Statistics Statistics Statistics Statistics Oncology   |
| 2008                  | Beth Dumont   | Genetics   |
| Oral Exams, Johns Hop | kins University   |  |
| 2006                  | Lindsey Garver<br>Benilton Carvalho<br>Yen-Yi Ho<br>Lindsey Enewold<br>Renee Gardner          | Molecular Microbiology and Immunology<br>Biostatistics<br>Biostatistics<br>Epidemiology<br>Environmental Health Sciences |
| 2005                  | Ani Manichaikul<br>Wenyi Wang<br>Meera Venkatesan<br>Audrey Grant                             | Biostatistics<br>Biostatistics<br>Molecular Microbiology and Immunology<br>Epidemiology                                  |
| 2004                  | Katherine Swanson   | Molecular Microbiology and Immunology  |
| 2003                  | Sadeep Shrestha<br>Wei-Min Chen   | Epidemiology<br>Biostatistics  |
| 2002                  | Marie-Hélène Roy-Gagnon   | Epidemiology   |
| 2001                  | Leslie Cope<br>Vivian Yuan<br>Jean-Paul Chretien  | Mathematical Sciences (School of Engineering)<br>Mathematical Sciences (School of Engineering)<br>Epidemiology           |
| 2000                  | Xin Liu<br>Tsuo-Hung Lan<br>Halcyon Skinner   | Epidemiology<br>Epidemiology<br>Epidemiology   |

| 1999  | David Kaufman   | Epidemiology  |
|---|---|---|
| Doctoral Thesis Defenses, University of Wisconsin–Madison |   |   |
| 2019  | Molly McDevitt  | Biochemistry  |
| 2018  | Kyubin Lee<br>René Welch  | Computer Sciences<br>Statistics   |
| 2017<br>2016  | Richard Wang<br>Michelle Parmenter<br>Shuang Huang                      | Genetics<br>Genetics<br>Statistics  |
| 2015  | Jianan Tian<br>Katie Clowers  | Statistics<br>Genetics  |
| 2014  | Il-Youp Kwak  | Statistics  |
| 2013  | Qinglin Pei   | Statistics  |
| 2012  | John Dawson   | Statistics  |
| 2011  | Michael White   | Genetics  |
| 2010  | Beth Dumont<br>Elias Chaibub Neto                                       | Genetics<br>Statistics  |
| 2009  | YounJeong Choi  | Statistics  |
| Doctoral Thesis Defens                                    | ses, Johns Hopkins University   |   |
| 2007  | Ani Manichaikul   | Biostatistics   |
| 2005  | Katherine Swanson<br>Laura LaRosa<br>Ji Wan Park<br>Martina Johannesson | Molecular Microbiology and Immunology<br>Environmental Health Sciences<br>Epidemiology<br>Lund University, Sweden |
| 2004  | Wei-Min Chen<br>Marie-Hélène Roy-Gagnon                                 | Biostatistics<br>Epidemiology   |
| 2001  | Alison Klein<br>Tsuo-Hung Lan   | Epidemiology<br>Epidemiology  |
| Master's Thesis Defens                                    | ses, University of Wisconsin–Mad  | dison   |
| 2013  | Raja Farhana Raja Mohd Anuar  | Plant Breeding and Plant Genetics   |
| Master's Thesis Reading, Johns Hopkins University         |   |   |
| 2001  | Jane Peredo, MS   | Genetic Counseling  |
| 2000  | Jennifer Mulle, MHS<br>Heping Hu, MHS<br>Rita Peila, ScM                | Epidemiology<br>Epidemiology<br>Epidemiology  |

# Classroom Instruction, University of Wisconsin-Madison

| The state of the s |   |   |  |
|--|---|---|--|
| Spring, 2019   | Statistics 877                                    | Statistical Methods in Molecular Biology<br>(jointly with Drs. Kendziorski, Lu, Dewey, Newton,<br>Keles, Roy, Ané, and Tang)  |  |
| Spring, 2018   | Agronomy 957                                      | Plant Breeding and Plant Genetics seminar (jointly with Brian Yandell)  |  |
| Spring, 2017   | Statistics 877                                    | Statistical Methods in Molecular Biology<br>(jointly with Drs. Kendziorski, Larget, Ané, Newton,<br>Roy, Keles, Wang, and Craven)   |  |
| Spring, 2016   | BMI 826-003                                       | Tools for Reproducible Research   |  |
| Spring, 2015   | BMI 826-003                                       | Tools for Reproducible Research   |  |
| Spring, 2014   | BMI 826-003<br>Statistics 877                     | Tools for Reproducible Research ( <i>new</i> )<br>Statistical Methods in Molecular Biology<br>(jointly with Drs. Newton, Kendziorski, Larget, Ané,<br>Yandell, Wang, and Keles) |  |
| Fall, 2012   | BMI 826-001                                       | Statistical Methods for QTL Mapping   |  |
| Spring, 2012   | Statistics 877                                    | Statistical Methods in Molecular Biology<br>(jointly with Drs. Newton, Kendziorski, Larget, Ané,<br>Yandell, Wang, and Keles)   |  |
| Spring, 2011   | Statistics 992-001                                | Statistical Methods for QTL Mapping (new)   |  |
| Summer, 2010   | Population Health 904-003                         | Analytic Methods in Genetic Epidemiology (jointly with Drs. Engelman, Payseur, and Meyers)  |  |
| Spring, 2010   | Statistics 877                                    | Statistical Methods in Molecular Biology<br>(jointly with Drs. Newton, Kendziorski, Larget, Ané,<br>Yandell, Wang, and Keles)   |  |
| Fall, 2008   | Statistics 371-003                                | Introductory Applied Statistics for the Life Sciences   |  |
| Summer, 2008   | Population Health 904-003                         | Analytic Methods in Genetic Epidemiology (jointly with Drs. Engelman, Payseur, and Skinner)   |  |
| Spring, 2008   | Statistics 992-002                                | Statistical Methods in Molecular Biology ( <i>new</i> ) (jointly with Drs. Newton, Kendziorski, Larget, Ané, Yandell, and Keles)  |  |
| Classroom Instruction, Johns Hopkins University  |   |   |  |
| 2006 – 2007  | Biostatistics 140.668                             | Special Topics in Genetics and Genomics   |  |
| 2005 – 2006  | Biostatistics 140.615–616<br>Epidemiology 340.631 | Statistics for Laboratory Scientists<br>Methods in Genetic Epidemiology I<br>(jointly with Dr. Beaty)   |  |
| 2004 - 2005  | Biostatistics 140.776                             | Statistical Computing   |  |
|  | Biostatistics 140.668                             | (jointly with Drs. Caffo, Irizarry, and Ruczinski) Special Topics in Genetics and Genomics  |  |
|  | Biostatistics 140.615–616                         | (jointly with Dr. Ruczinksi)<br>Statistics for Laboratory Scientists  |  |

|   | Epidemiology 340.631  | Methods in Genetic Epidemiology I<br>(jointly with Dr. Beaty)                              |
|---|---|--|
| 2003 – 2004   | Biostatistics 140.776   | Statistical Computing (new) (jointly with Drs. Caffo, Irizarry, and Ruczinski)             |
|   | Biostatistics 140.615–616   | Statistics for Laboratory Scientists   |
| 2002 – 2003   | Biostatistics 140.668   | Special Topics in Genetics and Genomics ( <i>new</i> ) (jointly with Dr. Parmigiani)       |
|   | Biostatistics 140.615–616   | Statistics for Laboratory Scientists   |
| 2001 – 2002   | Biostatistics 140.615   | Statistics for Laboratory Scientists (new)   |
| 2000 – 2001   | Biostatistics 140.667<br>Biostatistics 140.667<br>Biostatistics 140.668 | Advanced Statistical Computing (new)<br>Genetics for Statisticians<br>Statistical Genetics |
| 1999 – 2000   | Biostatistics 140.846<br>Biostatistics 140.668                          | Genetics for Statisticians (new)<br>Statistical Genetics (new)                             |
| sroom Instruction, University of California, Berkeley |   |  |

# Classi

Introductory Statistics for Social and Life Scientists Summer, 1994 Statistics 131A

Basic Algebra

# Classroom Instruction, University of Wisconsin-Milwaukee

Mathematics 095

1991 - 1992

| Other teaching |   |  |
|----------------|---|--|
| 2016 – 2018    | Instructor, Data Carpentry workshops, Advanced Computing Initiative, University of Wisconsin–Madison  |  |
| 2017 – 2018    | Workshop on Reproducible Research, Summer Institute in Statistics for Big Data, Seattle, Washington   |  |
| 2013 – 2018    | Lecture on "Creating effective figures and tables" to MD/PhD students, School of Medicine and Public Health, University of Wisconsin–Madison                    |  |
| 2018           | Instructor, Workshop on Advanced R and R/qtl, ICRISAT, Hyderabad, India   |  |
| 2018           | Lecture on "Steps toward reproducible research" for the Cellular and Molecular Pathology Graduate Program, University of Wisconsin–Madison                      |  |
| 2017           | Instructor, Data Carpentry workshop, National Society of Black Engineers Professional Development Conference, Chicago, Illinois                                 |  |
| 2017           | Workshop on Systems Genetics of Neurodegeneration, Frauenchiemsee, Germany  |  |
| 2017           | Workshop on R/qtl and R/qtl2 software, Complex Trait Community meeting, Memphis, Tennessee $\label{eq:complex}$   |  |
| 2017           | Workshop on "Steps toward reproducible research" as part of a Data Science and Plant Breeding Simulation Workshop, University of Minnesota, St. Paul, Minnesota |  |
| 2017           | Lecture to AP Statistics students, Madison East High School, Madison, Wisconsin   |  |
| 2008 – 2017    | Periodic seminars on "Creating effective figures and tables" in the Department of Pathology and Laboratory Medicine, University of Wisconsin–Madison            |  |

| 2008 – 2017 | Lecture on my consulting experiences in Statistical Consulting (Stat 998), Department of Statistics, University of Wisconsin–Madison  |
|-------------|---|
| 2008 – 2016 | Instructor and co-organizer, Short Course on Systems Genetics, The Jackson Laboratory, Bar Harbor, Maine  |
| 2016        | Lecture on "Creating effective figures and tables" at the Demography Training Seminar, Center for Demography of Health and Aging, University of Wisconsin–Madison                                     |
| 2015        | R/qtl workshop, Texas A&M, College Station, Texas   |
| 2015        | Lecture on "Reproducible Research" for undergraduate researchers in the Summer Institute for Training in Biostatistics (SIBS), University of Wisconsin–Madison  |
| 2014 – 2015 | Instructor, Software Carpentry workshops, Advanced Computing Initiative, University of Wisconsin–Madison  |
| 2015        | Instructor, Software Carpentry workshop, Washington State University, Pullman, Washington   |
| 2014        | Lecture on "Creating effective figures and tables" in a manuscript writing workshop, Institute for Clinical and Translational Research, University of Wisconsin–Madison                               |
| 2013        | Lecture on "A brief introduction to git and GitHub" to graduate students, Department of Statistics, University of Wisconsin–Madison   |
| 2013        | Lecture on "Why aren't all of our graphs interactive?" to graduate students in the Biostatistics Training Program, Department of Biostatistics & Medical Informatics, University of Wisconsin–Madison |
| 2012        | Instructor, Training Course on Field Trials & QTL Analysis using R and R/qtl, ICRISAT, Hyderabad, India   |
| 2012        | Lecture on "Introduction to QTL mapping in model organisms" for undergraduate researchers in the Summer Institute for Training in Biostatistics (SIBS), University of Wisconsin–Madison               |
| 2012        | Lecture on "Programming style" to graduate students in the Biostatistics Training Program, Department of Biostatistics & Medical Informatics, University of Wisconsin–Madison                         |
| 2010        | Lecture on "How to give a scientific presentation" to graduate students in the Biostatistics Training Program, Department of Biostatistics & Medical Informatics, University of Wisconsin–Madison     |
| 2008        | Lecture on "Recombination and linkage" in Human Emphasis Group Graduate Student Seminar (NS 881, Schoeller), Nutritional Sciences, University of Wisconsin–Madison                                    |
| 2008        | Lecture on "Recombination and linkage" in Genetic Epidemiology (PHS 904, Engelman), Population Health Sciences, University of Wisconsin–Madison   |
| 2007        | Instructor, NeuroproMiSe Training Course in Genetic Analysis and Bioinformatics, Lund University, Lund, Sweden  |
| 2001 – 2007 | Instructor and co-organizer, Short Course on Complex Trait Analysis, The Jackson Laboratory, Bar Harbor, Maine  |
| 2000 – 2007 | Lecture on quantitative genetics in Advanced Topics in Human Genetics (Reeves and Feinberg) Human Genetics, Johns Hopkins School of Medicine  |

| 2004 – 2006 | Lecture on "Statistical epigenomics" in Epigenetics (ME260.710, Feinberg), Johns Hopkins University School of Medicine  |
|-------------|---|
| 2003 – 2006 | Lecture on "Experimental design and sample size determination for animal-based research", Johns Hopkins University Animal Care and Use Committee seminar series             |
| 2002 – 2006 | Instructor, QTL Mapping II module, Summer Institute in Statistical Genetics, formerly at North Carolina State University, now held at the University of Washington, Seattle |
| 2003 – 2005 | Lecture on "Perl for human linkage analysis" in Biocomputing I: Perl for Biocomputing (140.636, Pineda), Johns Hopkins Bloomberg School of Public Health                    |
| 2004        | Lecture on experimental design, statistics, and sample size determination, as part of an on-line course on Enhancing Humane Science—Improving Animal Research               |
| 1999 – 2000 | Special studies course in longitudinal data analysis for Xin Liu, PhD candidate,<br>Epidemiology  |

# ACADEMIC LEADERSHIP AND PROGRAM DEVELOPMENT

| 2017 – present | Director, Biomedical Data Science PhD Program, University of Wisconsin–Madison   |
|----------------|--|
| 2004 – 2007    | Co-Director, MHS Program in Bioinformatics, Department of Biostatistics, Johns Hopkins Bloomberg School of Public Health |

# **SERVICE ACTIVITIES**

2016

# International and National

|            | 2017           | Program Committee, Complex Trait Community 15 <sup>th</sup> Annual Meeting (Memphis, Tennessee)                                     |
|------------|----------------|---|
|            | 2016 – 2017    | John M. Chambers Statistical Software Award Committee, Statistical Computing Section,<br>American Statistical Association           |
|            | 2013 – 2014    | Personalized Medicine Research Project (PMRP) Oversight Committee, Marshfield Clinic Research Foundation, Marshfield, Wisconsin     |
|            | 2013           | Co-organizer, Complex Trait Community 12 <sup>th</sup> Annual Meeting (Madison, Wisconsin)  |
|            | 2003 – 2004    | ENAR Distinguished Student Paper Awards Committee   |
|            | 2003           | IMS Contributed Papers Chair, ENAR/IMS Annual Meeting (Tampa, Florida)  |
| University |                |   |
|            | 2017 – present | Faculty Senator, University of Wisconsin–Madison  |
|            | 2012 – present | Steering Committee, Medical Scientist Training Program, School of Medicine and Public Health, University of Wisconsin–Madison       |
|            | 2018           | Review Committee for Biometry Master of Science Program, College of Agricultural and Life Sciences, University of Wisconsin–Madison |

Genomics Advisory Committee, School of Medicine and Public Health, University of Wisconsin–Madison

| 2012 – 201   | Faculty Advisory Committee, School of Medicine and Public Health, University of Wisconsin–Madison  |
|--|--|
| 2011 – 201   | 5 University Library Committee, University of Wisconsin–Madison ( <i>Chair</i> , 2014 – 2015)  |
| 2009 – 201   | 2 Master of Public Health Program Curriculum Committee, School of Medicine and Public Health, University of Wisconsin–Madison  |
| 2009 – 201   | 2 Curriculum Planning Committee, Biological Sciences Division, University of Wisconsin–<br>Madison   |
| 2008 – 201   | 2 Faculty Senator, University of Wisconsin–Madison   |
| 2002 – 200   | Maintainer of the Faculty Senate web site, Johns Hopkins Bloomberg School of Public Health   |
| 2001 – 200   | Faculty Senate representative to the Committee on Information Technology, Johns Hopkins Bloomberg School of Public Health  |
| 2001 – 200   | Organizer of a monthly discussion forum for junior faculty, Johns Hopkins Bloomberg School of Public Health  |
| 2001 – 200   | 2 Secretary of the Faculty Senate, Johns Hopkins Bloomberg School of Public Health   |
| 2000 – 200   | 2 Faculty Senator, Johns Hopkins Bloomberg School of Public Health   |
| 2000 – 200   | Biochemistry and Molecular Biology Strategic Plan Committee, Johns Hopkins<br>Bloomberg School of Public Health  |
|  |  |
| Departmental   |  |
| -  | sent Chair, Education and Curriculum Committee, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison   |
| -  | Informatics, University of Wisconsin–Madison   |
| 2010 – pre   | Informatics, University of Wisconsin–Madison  sent Scientific Advisory and Steering Committee, Biostatistics Computing Group, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison   |
| 2010 – pre<br>2015 – pre   | Informatics, University of Wisconsin–Madison  Scientific Advisory and Steering Committee, Biostatistics Computing Group, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  Co-chair, Faculty Search Committee, Biostatistics and Medical Informatics, University of Wisconsin–Madison  |
| 2010 – pre<br>2015 – pre<br>2015 – 201                                     | Informatics, University of Wisconsin–Madison  Scientific Advisory and Steering Committee, Biostatistics Computing Group, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  Co-chair, Faculty Search Committee, Biostatistics and Medical Informatics, University of Wisconsin–Madison  Seminar organizer, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison   |
| 2010 – pre<br>2015 – pre<br>2015 – 201<br>2010 – 201                       | Informatics, University of Wisconsin–Madison  Scientific Advisory and Steering Committee, Biostatistics Computing Group, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  Co-chair, Faculty Search Committee, Biostatistics and Medical Informatics, University of Wisconsin–Madison  Seminar organizer, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  Steering Committee, Biomedical Computing Group, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  Committee for Information Technology Assessment, Department of Biostatistics and   |
| 2010 – pre<br>2015 – pre<br>2015 – 201<br>2010 – 201<br>2010 – 201         | Informatics, University of Wisconsin–Madison  Scientific Advisory and Steering Committee, Biostatistics Computing Group, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  Co-chair, Faculty Search Committee, Biostatistics and Medical Informatics, University of Wisconsin–Madison  Seminar organizer, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  Steering Committee, Biomedical Computing Group, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  Committee for Information Technology Assessment, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  |
| 2010 – pre<br>2015 – pre<br>2015 – 201<br>2010 – 201<br>2010 – 201<br>2008 | Informatics, University of Wisconsin–Madison  Scientific Advisory and Steering Committee, Biostatistics Computing Group, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  Co-chair, Faculty Search Committee, Biostatistics and Medical Informatics, University of Wisconsin–Madison  Seminar organizer, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  Steering Committee, Biomedical Computing Group, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  Committee for Information Technology Assessment, Department of Biostatistics and Medical Informatics, University of Wisconsin–Madison  Intellectual and Social Environment Committee, Department of Biostatistics, Johns Hopkins Bloomberg School of Public Health |

# **GRANT SUPPORT**

# **Current Grant Support**

System Genetic Analysis of Multi-Parent Crosses

NIH/NIGMS

co-PI with Gary Churchill (Jackson Laboratory)

07/01/15 - 03/31/19

(25%)

Develop statistical methods and software for the analysis of multi-parent crosses, such as the mouse Diversity Outcross population and the Collaborative Cross.

Role: Co-Principal investigator

NIAID Centers of Excellence for Influenza Research and Surveillance

NIH/NIAID

Yoshihiro Kawaoka, PI

04/01/14 - 03/31/19

(8%)

In a genetics study with Diversity Outbred (DO) mice, identify host genes that, in the context of a functional Mx1 gene, affect the outcome of H5N1 influenza virus infections.

Role: Co-investigator

Alexander Disease: Mechanisms, Modifiers, and Therapeutics

NIH/NIHD

Albee Messing, PI

09/20/14 - 07/31/19

(5%)

*Identify genomic regions, and ultimately specific genes, that contribute to GFAP accumulation and toxicity in a mouse model of Alexander disease.* 

Role: Ćo-investigator

A Program of Research in Population Cytogenetics

NIH/NICHD

Terry Hassold (Washington State), PI

12/01/10 - 7/31/20

(8%)

Study meiosis in human oocytes and spermatocytes to examine the way in which homologous chromosomes find and synapse with each other and how these processes relate to the formation of crossovers, and to compare the recombination processes between human males and females, including the contribution of chromatin structure and interference to sex-specific differences in recombination rates.

Role: Co-investigator

Collaborative Cross of the Microbiome and Metabolic Disease

NIH/NIDDK

Federico Rev, PI

09/23/15 - 08/31/20

(5%)

Identify genes and pathways that modulate gut microbial composition and abundance, and their association to disease, in the mouse Diversity Outcross.

Role: Co-investigator

Genetics of the Island Rule

NIH/NIGMS

Bret Payseur, PI

09/10/12 - 02/28/21

(5%)

This project aims to functionally characterize and fine-map quantitative trait loci (QTL) for body size in Gough Island mice and map QTL for extreme body size evolution in a second island population from Papa Westray.

Role: Co-investigator

Evolution of the Genome-wide Recombination Rate in Mice

NIH/NIGMS

Bret Payseur, PI

05/15/17 - 03/31/21

(5%)

Develop a portrait of natural genetic variation in recombination rate across multiple evolutionary scales by measuring polymorphism and divergence in genome-wide recombination rate during oogenesis and spermatogenesis, and by profiling natural genetic variation in molecular processes that lead to crossovers, including the generation of double-strand breaks. Role: Co-investigator

A Unified High-Performance Web Service for Systems Genetics and Precision Medicine

NIH/NIGMS

Robert W. Williams and Saunak Sen, PIs

04/15/17 - 03/31/21

(10%)

Develop and improve the web services framework GeneNetwork 2, a modular high-performance computational resource that provides statistical and genetic tools to analyze and integrate massive omics datasets jointly with information on disease risk and severity.

Role: Co-investigator

# **Previous Grant Support**

The Collaborative Cross Project of Diabetes

NIH/NIDDK

Alan Attie, PI

04/01/14 - 01/31/19

(5%)

Identify genes involved in type 2 diabetes using two mouse populations derived from the same set of eight founder strains: the Diversity Outcross and the Collaborative Cross. The project includes detailed phenotyping to identify genes and pathways associated with beta cell functions.

Role: Co-investigator

Genome Dynamics: Evolution, Organization, and Function

NIH/NIGMS

Gary Churchill (Jackson Laboratory), PI

04/01/06 - 06/30/16

(9%)

In a project led by Petko Petkov and Ken Paigen, characterize recombination by detailed mapping of recombination events on a single chromosome in a larger mouse backcross.

Role: Co-Investigator

Statistical Methods for Analysis and Integration in Genomic Studies of Disease

NIH/NIGMS

Christina Kendziorski, PI

08/01/12 - 04/30/16

(7%)

This project aims to develop and disseminate statistical methods to address challenges that arise in genomic based studies of disease, with particular focus on methods that integrate data across multiple platforms and scales to both identify as well as comprehensively characterize genomic features affecting an individual's disease course and/or likelihood of response to treatment.

Role: Co-investigator

Systems Genetic Analysis of Methamphetamine's Motivational Effects in Mouse AIL

NIH/NIDA

Ábraham Palmer (U Ćhicago), PI

07/01/11 - 12/31/15

(10%)

Investigate the genetic underpinnings of the methamphetamine preference in mouse advanced intercross lines (AIL) and develop improved statistical methods and software for system genetics analysis in AIL.

Role: Co-investigator

Statistical Methods and Software for QTL Mapping

NIH/NIGMS

Karl Broman, PI

06/01/05 - 05/31/15

(30%)

Develop improved model selection methods of multiple QTL mapping in experimental crosses, develop improved methods for the analysis of recombinant inbred lines and related strains, develop and disseminate the R/qtl software for QTL mapping. Role: Principal Investigator

Genes and Gene Networks Associated with Obesity and Diabetes

NIH/NIDDK

Alan Attie (UW-Madison), PI

12/01/09 – 11/30/14

(5%)

Identify genes and gene networks that play a role in the development of obesity-induced type 2 diabetes in a large mouse intercross with detailed clinical phenotypes and gene expression data on multiple tissues.

Role: Co-investigator

Genetic Complexity and Modifiers of Hirschsprung Disease

NIH/NIDDK

Michelle Southard-Smith (Vanderbilt University), PI

07/01/07 - 06/30/12

(8%)

The goal of the proposed studies is to identify additional genes and gene interactions that impact aganglionosis in the Sox10 and all model.

Role: Co-Investigator

Statistical Methods for Experimental Genome Populations

NIH/NIGMS

Saunak Sen (UCSF), PI

07/01/07 - 06/30/12

(10%)

The goal of this proposed research is to develop statistical design and analysis methods that will reduce experimental cost, make efficient use of existing resources, and better infer causation when we have incomplete control over the assignment of genetic factors to individual organisms.

Role: Co-Investigator

Genetic Basis of WNV Competence in *Culex tarsalis* 

NIH/NIAID

Jason Rasgon (Johns Hopkins University), PI

07/01/07 - 10/31/11

(2%)

Identify genetic loci contributing to variation in West Nile virus vector competence in susceptible and refractory colonis of Culex tarsalis.

Role: Co-Investigator

Genetic Basis of Nanophthalmos and Axial Hyperopia

NIH/NEI

Olof Sundin (Texas Tech), PI

09/01/09 - 08/31/11

(10%)

Investigate the genetic and phenotypic diversity of extreme hyperopia, and identify common hypomorphic alleles of MFRP, the gene that causes nanophthalmos, and determine their effect on ocular structure.

Role: Co-investigator

Mechanism of Inflammation-Induced Airway Hyperactivity

NIH/NHLBI

Wayne Mitzner (Johns Hopkins University), PI

12/01/04 - 6/30/07

(3%)

Identify genetic loci contributing to variation in inflammation-induced airway hyperactivity in mice.

Role: Co-Investigator

Center for Epigenetics of Common Human Diseases

NIH/NHGRI

Andrew Feinberg, PI

04/01/04 - 06/30/07

(10%)

Develop tools for medical epigenetics, including epigenome discovery, its quantitative analysis, and its application to medicine.

Role: Co-Investigator

Epigenetic Variation and its Determinants in Depression

NIH/NIMH

James Potash, PI

04/01/05 - 06/30/07

(10%)

Establish the connection between genetic, environmental, and epigenetic factors and susceptibility to depression.

Role: Co-Investigator

Genetic Mechanisms of Autoimmune Myocarditis

NIH/NHLBI

Noel Rose, PI

07/01/04 - 06/30/07

(4%)

Identify genetic loci contributing to susceptibility to autoimmune myocarditis in mice.

Role: Co-Investigator

Catecol-O-methyltransferase and Breast Cancer

NIH/NCI

James Yager, PI

09/21/04 - 06/30/07

(2.5%)

The goal of this project is to conduct a rigorous experimental investigation of the hypothesis that decreased COMT activity results in increased DNA damage that contributes to increased cell transformation and breast cancer.

Role: Co-Investigator

Core Center Grant: Biostatistical Center

NIH/NEI

Sheila West, PI

07/01/04 - 06/30/07

(5%)

Provide biostatistics support for epidemiological research in ophthalmology.

Role: Senior Biostatistician

Older Americans Independence Center

NIH/NIA

Linda Fried, PI

06/01/03 - 06/30/07

(1.5%)

The Center is dedicated to developing the next generation of research to determine the causes and treatments for frailty in older adults.

Role: Advisory Board Member

Statistical Methods for Genetic Epidemiology

NIH/NIGMS

Kung-Yee Liang, PI; Karl Broman, acting PI

12/01/00 - 11/30/05

(25%)

Develop and implement new statistical methodology useful for genetic epidemiologic studies of complex chronic diseases. Role: Co-Investigator

Portable Software for Mapping Quantitative Traits

NIH/NHGRI

Ken Manly, PI

09/24/04 - 08/31/05

(5%)

Design and test a graphical user interface for software R/qtl and ensure that the GUI makes the proper connections with the core program.

Role: Co-Investigator

Center for Craniofacial Development and Disorders

NIH/NIDR

Terri Beaty, PI

08/01/01 - 08/01/04

(5%)

Biostatistical Core for program project on the genetics of craniofacial disorders.

Role: Co-Investigator

Mouse QTL in Endotoxic Shock NIH Roger Reeves, PI 08/01/01-07/30/05 (10%)

Identify genomic regions contributing to susceptibility to endotoxic shock in mice.

Role: Co-Investigator

Genetic Basis of Nanophthalmos NIH/NEI Olof Sundin, PI 08/15/01 – 06/30/04 (10%)

Identify the gene responsible for nanophthalmos in a single large pedigree.

Role: Co-Investigator

Center for Craniofacial Development and Disorders NIH/NIDR

Ethylin Jabs, PI 08/01/99 - 04/30/04 (10%)

Map and identify genes contributing to susceptibility to craniofacial disorders by linkage in multiplex families.

Role: Co-Investigator

The Genetics of Age Related Cataract in Salisbury

NIH/NIA

Nathan Congdon, PI 09/30/00 – 08/31/03 (10%)

*Identify genes contributing to susceptibility to cataract* 

Role: Co-Investigator

JHSPH Faculty Innovation Fund grant JHSPH

Karl Broman, PI 05/01/01 – 04/30/02 (30%)

Applications of tree-based models to identify epistatic interactions between QTLs in model organisms.

Role: Principal Investigator

### **INVITED PRESENTATIONS**

### Scientific Meetings

2019 RStudio Conference, Austin, Texas American Association for the Advancement of Science (AAAS) annual meeting, Washington, DC

2018 Complex Trait Community meeting, Glasgow, Scotland Purdue Symposium on Statistics, West Lafayette, Indiana

- 2017 Complex Trait Community meeting, Memphis, Tennessee
- Genome and Gene Mapping Satellite, Queenstown Research Week, Nelson, New Zealand
   Joint Statistical Meetings, Chicago, Illinois
   Conference on Learning Tools to Promote Reproducible Research and Open Science, Chicago Chapter,
   American Statistical Association, Chicago, Illinois
- 2015 Plant breeding symposium, Texas A&M, College Station, Texas

Joint Statistical Meetings, Seattle, Washington

BioC 2015 (Bioconductor annual meeting), Seattle, Washington

Complex Trait Community annual meeting, Portland, Oregon

The Challenge of Inference from Genome to Phenome, CSIRO Chief Executive Cutting Edge Symposium, Brisbane, Australia

American Association for the Advancement of Science (AAAS) annual meeting, San Jose, California

- 2014 Fourth Symposium on Biological Data Visualization, Boston, Massachusetts Scholarly Publishing Symposium, University of Wisconsin–Madison
- 2013 Open Access, Open Data @ UW, University of Wisconsin–Madison Workshop on MAGIC-type populations, Cambridge, United Kingdom Kansas State University Plant Breeding and Genetics Symposium, Manhattan, Kansas International Biometric Society/ENAR Annual Meeting, Orlando, Florida

| EvoSysBio meeting, Wisconsin Institutes for Discovery, University of Wisconsin – Madison EURATRANS annual meeting, Tutzing, Germany   |
|---|
| Quantitative Biology and Bioinformatics in Modern Medicine, Dublin, Ireland   |
| Fourteenth QTL-MAS Workshop, Poznań, Poland   |
| Emerging Statistical Challenges in Genome and Translational Research, Banff, Canada   |
| Systems Medicine Workshop, NHLBI, Bethesda, Maryland  |
| Fifth Australiasian Human Gene Mapping Conference, Mt. Buller, Australia<br>Joint Statistical Meetings, Minneapolis, Minnesota<br>CSPS/IMS Joint Meeting, Beijing, China  |
| Taipei Symposium on Statistical Genomics, Academia Sinica, Taipei, Taiwan<br>Seventh Annual Conference on Computational Genomics, Reston, Virginia<br>Complex Trait Consortium Third Annual Meeting, Bar Harbor, Maine<br>Nobel Symposium on Epigenetic Reprogramming in Development and Disease, Stockholm, Sweden<br>Workshop on the Analysis of Complex Genetic Traits, Mathematical Sciences Research Institute,<br>Berkeley, California  |
| Royal Statistical Society, London, England  |
| Classification Society of North America meeting, St. Louis, Missouri<br>Modifier Analysis in Cancer Genetics of Experimental Mammals Workshop, Madison, Wisconsin   |
| WNAR/IMS Western Regional Conference, Pullman, Washington   |
| ars   |
| Department of Statistics, Colorado State University, Fort Collins, Colorado qBio seminar series, Wisconsin Institute for Discovery, University of Wisconsin–Madison BBC seminar series, University of California, San Francisco   |
| Department of Bioinformatics and Genomics, University of North Carolina at Charlotte<br>Berkeley Institute for Data Science, University of California, Berkeley<br>Genetics Program, North Carolina State University, Raleigh, North Carolina   |
| Department of Genetics, Genomics, and Informatics, University of Tennessee Health Science Center, Memphis, Tennessee Department of Statistics, University of Auckland, Auckland, New Zealand Department of Biological Statistics and Computational Biology, Cornell University, Ithaca, New York Graduate Researchers interested in Data (GRiD), University of Massachusetts, Amherst, Massachusetts Bioinformatics and Computational Biology, Genentech, South San Francisco, California |
| Holz Series in Research Data Management, University of Wisconsin–Madison<br>Division of Biostatistics, Department of Preventive Medicine, University of Tennessee Health Science<br>Center, Memphis, Tennessee<br>Bioinformatics Division, Walter & Eliza Hall Institute for Medical Research, Melbourne, Australia   |
| Delta Program, University of Wisconsin–Madison<br>Department of Biostatistics, Harvard School of Public Health, Boston, Massachusetts<br>Danforth Plant Science Center, St. Louis, Missouri   |
| Graphics Working Group, Department of Statistics, Iowa State University, Ames, Iowa   |
| Department of Biostatistics, Johns Hopkins Bloomberg School of Public Health, Baltimore, Maryland   |
|   |

Department of Biostatistics, University of Washington, Seattle
 Department of Statistics, George Mason University, Fairfax, Virginia
 Groningen Bioinformatics Centre, University of Groningen, Groningen, The Netherlands
 Department of Biostatistics, Columbia University, New York

2010 Institute of Mathematics and Computer Sciences, Wrocław University of Technology, Wrocław, Poland Department of Genetics and Animal Breeding, Wrocław University of Environmental and Life Sciences, Wrocław, Poland

Quantitative Biology and Modeling Initiative Program, Michigan State University, East Lansing, Michigan

Integrative Genomics Seminar Series, Vanderbilt University, Nashville, Tennessee

Evolution Seminar Series, University of Wisconsin–Madison

Curriculum in Genetics and Molecular Biology, University of North Carolina at Chapel Hill

2009 Department of Human Genetics, University of California, Los Angeles

Laboratory of Genetics, University of Wisconsin-Madison

Department of Statistics, University of Wisconsin-Madison

Department of Biostatistics & Medical Informatics, University of Wisconsin-Madison

Groningen Bioinformatics Centre, University of Groningen, Groningen, The Netherlands

Wellcome Trust Centre for Human Genetics, Oxford, United Kingdom

2008 Annual Retreat, Genomic Sciences Training Program, University of Wisconsin–Madison

Division of Human Genetics, Cincinnati Children's Hospital, Cincinnati, Ohio

Computation and Informatics in Biology and Medicine (CIBM), University of Wisconsin-Madison

Evolution Seminar Series, University of Wisconsin-Madison

Department of Animal Sciences, University of Wisconsin-Madison

2007 Department of Human Genetics, University of Chicago

Department of Biostatistics, Johns Hopkins Bloomberg School of Public Health, Baltimore, Maryland

Statistics Program, St. Olaf College, Northfield, Minnesota

Center for Interdisciplinary Research, St. Olaf College, Northfield, Minnesota

Annual Retreat, Laboratory of Genetics, University of Wisconsin-Madison

Division of Statistics, Northern Illinois University, DeKalb, Illinois

Department of Biostatistics and Medical Informatics, University of Wisconsin-Madison

Department of Human Genetics, University of California, Los Angeles

Department of Statistics, University of California, Berkeley

The Jackson Laboratory, Bar Harbor, Maine

Department of Biostatistics, University of Michigan, Ann Arbor

2006 Institute of Genetic Medicine, Johns Hopkins University School of Medicine, Baltimore, Maryland

Department of Biostatistics, University of Michigan, Ann Arbor

Laboratory of Genetics, University of Wisconsin-Madison

Department of Biostatistics, University of Washington, Seattle

2005 Department of Statistics, University of California, Davis

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