Potential genetic modifiers of disease risk and age at onset in patients with frontotemporal dementia and GRN mutations: a genome-wide association study

Cyril Pottier, PhD[1]*, Xiaolai Zhou, PhD[1]*, Ralph B. Perkerson III, MS[1], Matt Baker, BSc[1], Gregory D. Jenkins, MS[2], Daniel J. Serie, MS[3], Roberta Ghidoni, PhD[4], Luisa Benussi, PhD[4], Giuliano Binetti, MD[4, 5], Prof Adolfo López de Munain, MD[6, 7, 8], Miren Zulaica[6, 8], Fermin Moreno, MD[6, 8, 9], Isabelle Le Ber, MD[10, 11], Prof Florence Pasquier, MD[12], Prof Didier Hannequin, MD[13], Raquel Sánchez-Valle, MD[14], Anna Antonell, PhD[14], Albert Lladó, MD[14], Tammee M. Parsons[1], NiCole A. Finch, MS[1], Elizabeth C. Finger, MD[15], Prof Carol F. Lippa, MD[16], Edward D. Huey, MD[17], Prof Manuela Neumann, MD[18, 19], Prof Peter Heutink, PhD[20, 21], Matthis Synofzik, MD[20, 21], Carlo Wilke, MD[20, 21], Robert A. Rissman, PhD[22, 23], Prof Jaroslaw Slawek, MD[24], Emilia Sitek, PhD[24], Peter Johannsen, MD[25], Jørgen E. Nielsen, MD[25], Yingxue Ren, PhD[3], Marka van Blitterswijk, PhD[1], Mariely DeJesus-Hernandez, BSc[1], Elizabeth Christopher, MBA[1], Melissa E. Murray, PhD[1], Kevin F. Bieniek, PhD[1], Bret M. Evers, MD[26], Camilla Ferrari, PhD[27], Sara Rollinson, PhD[28], Anna Richardson, MD[29], Prof Elio Scarpini, MD[30], Giorgio G. Fumagalli, MD[30, 31], Prof Alessandro Padovani, MD[32], Prof John Hardy, PhD[33], Parastoo Momeni, PhD[34], Raffaele Ferrari, PhD[33], Francesca Frangipane, MD[35], Raffaele Maletta, MD[35], Maria Anfossi, PhD[35], Maura Gallo, PhD[35], Prof Leonard Petrucelli, PhD[1], EunRan Suh, PhD[36], Prof Oscar L. Lopez, MD[37], Tsz H. Wong, MD[38], Jeroen G. J. van Rooij, BSc[38], Harro Seelaar, MD[38], Prof Simon Mead, PhD[39], Prof Richard J. Caselli, MD[40], Prof Eric M. Reiman, MD[41], Prof Marwan Noel Sabbagh, MD[42], Mads Kjolby, MD[43], Prof Anders Nykjaer, MD[43], Anna M. Karydas[44], Prof Adam L. Boxer, MD[44], Lea T. Grinberg, MD[44], Prof Jordan Grafman, PhD[45], Salvatore Spina, MD[46, 47], Adrian Oblak, PhD[47], Prof M-Marsel Mesulam, MD[48], Prof Sandra Weintraub, PhD[48, 49], Prof Changiz Geula, PhD[48], Prof John R. Hodges, FRCP[50, 51], Prof Olivier Piguet, PhD[50, 52], William S. Brooks, MBBS[53, 54], David J. Irwin, MD[36, 55], Prof John Q. Trojanowski, MD[36], Edward B. Lee, MD[36], Prof Keith A. Josephs, MD[56], Prof Joseph E. Parisi, MD[57], Prof Nilüfer Ertekin-Taner, MD[58, 1], Prof David S. Knopman, MD[56], Benedetta Nacmias, PhD[31], Irene Piaceri, PhD[31], Silvia Bagnoli, PhD[31], Prof Sandro Sorbi, MD[31, 27], Marla Gearing, PhD[59], Prof Jonathan Glass, MD[59], Thomas G. Beach, MD[60], Prof Sandra E. Black, MD[61], Mario Masellis, MD[61], Prof Ekaterina Rogaeva, PhD[62], Prof Jean-

1

Paul Vonsattel, MD[17, 63], Prof Lawrence S. Honig, MD[17, 64], Julia Kofler, MD[65], Prof Amalia C. Bruni, MD[35], Prof Julie Snowden, PhD[29], Prof David Mann, PhD[66], Prof Stuart Pickering-Brown, PhD[28], Janine Diehl-Schmid, MD[67], Prof Juliane Winkelmann, MD[68], Daniela Galimberti, PhD[30], Prof Caroline Graff, MD[69, 70], Linn Öijerstedt, MD[69, 70], Claire Troakes, PhD[71], Prof Safa Al-Sarraj, FRCPath[71, 72], Carlos Cruchaga, PhD[73, 74], Prof Nigel J. Cairns, PhD[75], Jonathan D. Rohrer, PhD[76], Prof Glenda M. Halliday, PhD[50, 51], John B. Kwok, PhD[50], Prof John C. van Swieten, MD[38, 77], Prof Charles L. White III, MD[26], Prof Bernardino Ghetti, MD[47], Jill R. Murell, PhD[47], Prof Ian R. A. Mackenzie, MD[78], Ging-Yuek R. Hsiung, MD[79], Barbara Borroni, MD[32], Giacomina Rossi, PhD[80], Fabrizio Tagliavini, MD[81], Prof Zbigniew K. Wszolek, MD[58], Prof Ronald C. Petersen, MD[56], Prof Eileen H. Bigio, MD[48], Prof Murray Grossman, MD[36, 55], Prof Vivianna M Van Deerlin, MD[36], Prof William W. Seeley, MD[44], Prof Bruce L. Miller, BM[44], Prof Neill R. Graff-Radford, MBBCh[58], Prof Bradley F. Boeve, MD[56], Prof Dennis W. Dickson, MD[1], Prof Joanna M. Biernacka, PhD[2], Prof Rosa Rademakers, PhD[1#]

* These authors contributed equally to this study
1. Department of Neuroscience, Mayo Clinic, Jacksonville FL, USA
2. Department of Health Sciences Research, Mayo Clinic, Rochester, MN, USA
3. Department of Health Sciences Research, Mayo Clinic, Jacksonville FL, USA
4. Molecular Markers Laboratory, IRCCS Istituto Centro San Giovanni di Dio-Fatebenefratelli, Brescia, Italy
5. MAC Memory Center, IRCCS Istituto Centro San Giovanni di Dio-Fatebenefratelli, Brescia, Italy
6. Biodonostia Health Research Institute, Basque, Spain
7. Hospital Universitario Donostia - UPV/EHU, Neurology, San Sebastian, Spain
8. CIBERNED (Center for Networked Biomedical Research on Neurodegenerative Diseases), Institute of Health Carlos III, ISCIII, Spain
9. Hospital Universitario Donostia, Neurology, San Sebastian, Spain
10. Reference Center for Rare and Young Dementias, Institute of Memory and Alzheimer's Disease (IM2A), Department of Neurology, Hopital Pitié-Salpêtrière, Paris, France
11. Sorbonne Universités, UPMC Univ Paris 06, Inserm U1127, CNRS UMR 7225, Institut du Cerveau et la Moelle épinière (ICM), Hôpital Pitié-Salpêtrière, Paris, France

12. Université de Lille, Inserm U1171, Labex DISTALZ, CHU, CNR-MAJ, Lille, France

13. Centre National de Référence pour les Malades Alzheimer Jeunes, CNR-MAJ, INSERM 1245, Centre Hospitalier Universitaire de Rouen, Rouen, France

14. Alzheimer's disease and other cognitive disorders unit, Hospital Clínic, Institut d'Investigacions Biomèdiques August Pi I Sunyer, Barcelona, Spain

15. Department of Clinical Neurological Sciences, Schulich School of Medicine and Dentistry, University of Western Ontario London, ON, Canada

16. Cognitive Disorders and Comprehensive Alzheimer's Disease Center, Thomas Jefferson University Hospital, Philadelphia, PA, USA

17. Taub Institute for Research on Alzheimer's Disease and the Aging Brain, Columbia University Medical Center, New York, NY USA

18. German Center for Neurodegenerative Diseases (DZNE), Molecular Neuropathology of Neurodegenerative Diseases, Tübingen, Germany

19. Department of Neuropathology, University of Tübingen, Tübingen, Germany

20. Department of Neurodegenerative Diseases, Hertie-Institute for Clinical Brain Research & Center for Neurology, Tübingen, Germany

21. German Center for Neurodegenerative Diseases (DZNE), Tübingen

22. Department of Neurosciences, University of California, San Diego, La Jolla, CA, USA

23. Veterans Affairs San Diego Healthcare System, San Diego, CA, USA

24. Department of Neurological-Psychiatric Nursing, Medical University of Gdansk, Gdańsk, Poland

25. Department of Neurology, Rigshospitalet, Danish Dementia Research Centre, University of Copenhagen, Copenhagen, Denmark

26. Division of Neuropathology, University of Texas Southwestern Medical Center, Dallas, TX, USA

27. IRCCS Don Gnocchi, Florence, Italy

28. Division of Neuroscience and Experimental Psychology, School of Biological Sciences, Faculty of Biology, Medicine and Health, University of Manchester, University of Manchester, UK

29. Cerebral Function Unit, Greater Manchester Neurosciences Centre, Salford Royal Hospital, Salford, UK

30. Department of Pathophysiology and Transplantation, Neurodegenerative disease Unit, University of Milan, Centro Dino Ferrari, Fondazione Ca' Granda, IRCCS Ospedale Policlinico, Milan, Italy

31. Department of Neuroscience, Psychology, Drug Research and Child Health (NEUROFARBA), University of Florence, Florence, Italy

32. Department of Clinical and Experimental Sciences, Neurology Unit, University of Brescia, Brescia, Italy

33. Department of Molecular Neuroscience, UCL Institute of Neurology, Queen Square, London, WC1B 5EH

34. Rona Holdings, Silicon Valley, CA, USA

35. Regional Neurogenetic Centre, ASP Catanzaro, Lamezia Terme, Italy

36. Center for Neurodegenerative Disease Research, Department of Pathology and Laboratory Medicine, University of Pennsylvania Perelman School of Medicine, Philadelphia, PA, USA

37. Department of Neurology, University of Pittsburgh, Pittsburgh, PA, USA

38. Department of Neurology, Erasmus Medical Centre, Rotterdam, The Netherlands

39. MRC Prion Unit at UCL, Institute of Prion Diseases, London, UK

40. Department of Neurology, Mayo Clinic, Scottsdale, AZ, USA

41. Banner Alzheimer's Institute, Phoenix, AZ, USA

42. Alzheimer's and Memory Disorders Division, Barrow Neurological Institute and University of Arizona College of Medicine Phoenix and Creighton University School of Medicine, Phoenix, AZ, USA

43. The Lundbeck Foundation research center MIND, The Danish National Research Foundation Center of Excellence PROMEMO, DANDRITE, Department of Biomedicine, Aarhus University, Aarhus, Denmark

44. Department of Neurology, Memory and Aging Center, University of California, San Francisco, CA, USA

45. Shirley Ryan AbilityLab & Feinberg School of Medicine, Northwestern University, IL, USA

46. The Memory and Aging Center, University of California, San Francisco, CA, USA

47. Department of Pathology and Laboratory Medicine, Indiana University School of Medicine, Indianapolis, IN, USA

48. Cognitive Neurology and Alzheimer Disease Center, Northwestern University, Chicago, IL, USA

49. Department of Psychiatry and Behavioral Sciences and Department of Neurology, Northwestern University Feinberg School of Medicine, Chicago, IL, USA

50. Brain & Mind Centre, The University of Sydney, Sydney, Australia

51. Sydney Medical School, The University of Sydney, Sydney, Australia

52. School of Psychology, The University of Sydney, Sydney, Australia

53. Neuroscience Research Australia, Sydney, Australia

54. The University of New South Wales, Sydney, Australia

55. Penn Frontotemporal Degeneration Center, Department of Neurology, University of Pennsylvania, Philadelphia, PA, USA

56. Department of Neurology, Mayo Clinic, Rochester, MN, USA

57. Department of Pathology, Mayo Clinic, Rochester, MN, USA

58. Department of Neurology, Mayo Clinic, Jacksonville, FL, USA

59. Department of Pathology and Laboratory Medicine and Department of Neurology, Emory University, Atlanta, GA, USA

60. Civin Laboratory for Neuropathology, Banner Sun Health Research Institute, Sun City, AZ, USA

61. Department of Medicine (Neurology), Sunnybrook Health Sciences Centre & University of Toronto, Hurvitz Brain Sciences Research Program, Sunnybrook Research Institute, Toronto, ON, Canada

62. Department of Medicine (Neurology), Tanz Centre for Research in Neurodegenerative Disease, University of Toronto, Toronto, ON, Canada

63. Department of Pathology, Columbia University Medical Center, New York, NY, USA

64. Department of Neurology, Columbia University Medical Center, New York, NY, USA

65. Department of Pathology, University of Pittsburgh, Pittsburgh, PA, USA

66. Division of Neuroscience and Experimental Psychology, School of Biological Sciences, Faculty of Biology, Medicine and Health, University of Manchester, Salford Royal Hospital, Salford, UK

67. Department of Psychiatry and Psychotherapy, Technische Universität München, Munich, Germany

68. Institute of Neurogenomics, Helmholtz Zentrum München; Neurologische Klinik und Poliklinik und Institut für Humangenetik, Klinikum rechts der Isar, Technical University of Munich; Munich Cluster for Systems Neurology, SyNergy, München, Germany

69. Division of Neurogeriatrics, Alzheimer Research Center, Karolinska Institutet, Solna, Sweden

70. Genetics Unit, Theme Aging, Karolinska University Hospital, Stockholm, Sweden

71. London Neurodegenerative Diseases Brain Bank; Department of Basic and Clinical Neuroscience; Institute of Psychiatry, Psychology and Neuroscience, King's College London, UK

72. Department of Clinical Neuropathology, King's College Hospital, NHS Foundation Trust, London, UK

73. Department of Psychiatry, Washington University School of Medicine, St Louis, MO, USA

74. Hope Center for Neurological Disorders, Washington University School of Medicine, St Louis, MO, USA

75. Department of Neurology, Knight Alzheimer Disease Research Center, Washington University School of Medicine, Saint Louis, MO, USA

76. Dementia Research Centre, Department of Neurodegenerative Disease, UCL Institute of Neurology, London, UK

77. Department of Neurology, VU Medical Centre, Amsterdam, The Netherlands

78. Department of Pathology and Laboratory Medicine, University of British Columbia, Vancouver, BC, Canada

79. Division of Neurology, Department of Medicine, University of British Columbia, Vancouver, BC, Canada

80. Division of Neurology V and Neuropathology, Fondazione IRCCS Istituto Neurologico Carlo Besta, Milano, Italy

81. Scientific Directorate, Fondazione IRCCS Istituto Neurologico Carlo Besta, Milano, Italy

82. Department of Pathology Memory and Aging Center, University of California, San Francisco, CA, USA

Corresponding author:

Rosa Rademakers, Ph.D.

Department of Neuroscience, Mayo Clinic, Jacksonville

4500 San Pablo Road, Jacksonville, FL 32224

Phone: (904) 953-6279

Fax: (904) 953-7370

E-mail: Rademakers.rosa@mayo.edu

ABSTRACT

Background

Loss-of-function mutations in progranulin (*GRN*) cause frontotemporal dementia. Patients with *GRN* mutations present with a uniform subtype of TDP-43 pathology at autopsy (FTLD-TDP type A); however, age at onset and clinical presentation are variable, even within families. We aimed at identifying potential genetic factors modifying disease onset and disease risk in *GRN* mutation carriers.

Methods

In the discovery stage, genome-wide logistic and linear regression analyses were performed to test association of genetic variants with disease risk (case/control status) and age at onset. Suggestive loci ($p<10^{-5}$) were genotyped in a replication cohort, followed by a meta-analysis. The effect of genome-wide significant variants at the novel *GFRA2* locus on expression of *GFRA2* was assessed using mRNA expression studies in cerebellar tissue samples from the Mayo Clinic brain bank. The effect of the *GFRA2* locus on progranulin protein (PGRN) levels was studied using previously generated ELISA-based expression data. Co-immunoprecipitation experiments in HEK293T cells were performed to test for a direct interaction between GFRA2 and PGRN

Findings

Previously ascertained patients and controls were enrolled in the current study between October 2014 and October 2017. After quality control measures, statistical analyses in the discovery stage included 382 unrelated symptomatic *GRN* mutation carriers and 1,146 controls free of neurodegenerative disorders collected from 34 research centers located in North America,

8

Australia and Europe. In the replication stage, 210 patients, including 67 symptomatic *GRN* mutation carriers and 143 pathologically-confirmed non-*GRN* FTLD-TDP type A patients, and 1,798 controls free of neurodegenerative diseases were recruited from 26 sites, of which 20 sites overlapped with the discovery stage. No genome-wide significant association with age at onset was identified in the discovery, replication or meta-analysis. However, in the case/control analysis, we replicated the previously reported *TMEM106B* association (meta-analysis: rs1990622, p=$3·54 \times 10^{-16}$, OR=0·54, 95% CI: 0·46 – 0·63), and identified a novel genome-wide significant locus at *GFRA2* on chromosome 8p21.3 associated with disease risk (meta-analysis: rs36196656, p=$1·58 \times 10^{-8}$, OR=1·49, 95% CI: 1·30 – 1·71). Expression analyses showed that the risk-associated allele at rs36196656 decreased *GFRA2* mRNA levels in cerebellar tissue. No effect of rs36196656 on plasma and cerebrospinal fluid PGRN levels was detected by ELISA; however, co-immunoprecipitation experiments in HEK cells did suggest a direct binding of PGRN and GFRA2.

Interpretation

The identification of *TMEM106B* and *GFRA2* as potential modifiers of disease risk in *GRN* carriers raises the possibility that TMEM106B and GFRA2-related pathways are targets for therapies; yet, the biological interaction between PGRN and these disease modifiers requires further study. These potential genetic modifiers might also provide opportunities to select and stratify patients for future clinical trials and, when more is known about their potential effects, to inform genetic counselling,especially in the context of asymptomatic individuals.

Funding

INTRODUCTION

Frontotemporal lobar degeneration (FTLD) represents a collection of neurodegenerative diseases accounting for 5-10% of all dementia patients and 10-20% of patients with an onset of dementia before 65 years.[1] Three clinical variants have been described: the behavioral variant of frontotemporal dementia (bvFTD), and two language variants of FTLD including the non-fluent and the semantic variant of primary progressive aphasia (PPA). The most common pathological subtype of FTLD is characterized by aggregates of the TAR DNA-binding protein 43, TDP-43 (FTLD-TDP).[2,3] Four different FTLD-TDP pathological subtypes have been defined based on the morphology and anatomical distribution of the TDP-43 pathology (A to D).[2]

Mutations in progranulin (*GRN)* are the second most common genetic cause of FTLD-TDP, accounting for 5-20% of FTLD with positive family history.[4-6] All currently known heterozygous pathogenic *GRN* mutations cause disease through a uniform disease mechanism, i.e. the loss of 50% functional progranulin protein (PGRN), leading to haploinsufficiency.[4] Additionally, all patients with *GRN* mutations present with FTLD-TDP type A at autopsy.[2] Despite this uniform disease mechanism and pathological presentation, clinical research has made clear that the age at symptom onset and clinical phenotype associated with *GRN* mutations are highly variable, even within the same family, and the penetrance of *GRN* mutations is not complete, even at old age.[7,8] Importantly, a genome-wide association study performed in 2010 reported variants in the transmembrane protein 106 B locus (*TMEM106B*) as a risk factor for FTLD-TDP and subsequent studies established *TMEM106B* as a modifier of disease risk in individuals with *GRN* mutations.[9-11] Identification of additional genetic modifiers of *GRN*-associated frontotemporal dementia could lead to improved genetic counselling, and could suggest potential new targets for disease-modifying therapies. We therefore aimed to identify

additional genetic modifiers in *GRN* mutation carriers through genome-wide association analyses

in the largest collection of unrelated symptomatic *GRN* patients ascertained to date.

METHODS

Participants

Participants for this study were all Caucasian and recruited at 40 international clinical and/or pathological research centers in Italy, US, France, Spain, UK, Canada, The Netherlands, Sweden, Australia, Denmark, Poland and Germany (appendix p.3, **Supplementary Table 1**). No restriction in terms of age, sex or race was applied to the initial selection; however statistical analysis only included white individuals (appendix p.3). Identification of *GRN* mutations, and assessment of TDP-43 pathological subtype, was performed at each individual site. For the discovery stage we obtained DNA from a total of 33 centers from 493 symptomatic *GRN* carriers from North America, Europe and Australia, and 505 controls from Italy and Spain (**Table 1**). We also obtained genetic data from 1,986 controls free from neurodegenerative diseases from the Genome-wide association study of Parkinson disease: Genes and Environment from the CIDR consortium (NCBI dbGaP phs000196.v3.p1 NINDS CIDR PD Environment; hereinafter referred to as CIDR dataset and considered one site, **Table 1**, appendix p.3, **Supplementary Table 1** and **Supplementary Figure 1**). Additional and non-overlapping patients (n=210) and controls free from neurodegenerative diseases (n=1,798) for the replication stage were recruited from 26 centers, 20 overlapping with the discovery stage and 6 newly identified centers (**Table 1**; **Supplementary Table 1**). The 210 replication-stage cases included 67 patients with *GRN* mutations unrelated and independent from the discovery stage and 143 *GRN*-negative patients with pathologically confirmed FTLD-TDP type A.

Age at onset was defined as the age at which first disease symptoms appeared, including initial cognitive dysfunction in judgment, language, memory, or changes in behavior or personality.

Informed consent for genetic studies was given by patients and controls during life, or by next of kin at time of death for autopsy material, with approval of each institution's Institutional Review Board.

Procedures and statistical analysis

Genotyping and quality control (QC) procedures for the discovery stage are described in detail in appendix (p.3-4). Genome-wide association analyses, using logistic and linear regressions, were performed to test the association of genetic variants with patient/control status (disease risk) and age at onset, respectively, under an additive model for allele effects and adjusting for age, sex, and the first two principal components of genetic variation (PCs) when appropriate (appendix p.4). As exploratory analyses, association of variants with absence or presence of specific first clinical symptoms (memory, behavior or language impairment) or presence of parkinsonism at any time during the course of the disease was tested among patients using logistic regression adjusting for age, sex, and first two PCs (appendix p.4; **Supplementary Results**). Association of previously reported putative genetic modifier variants in known neurodegenerative diseases genes with disease presentation and age at onset were also determined and reported.

Lead variants or a proxy associated at $p<10^{-5}$ with disease risk or age at onset in the discovery stage were selected for the replication stage. Genotyping and quality control measures for this stage are described in detail in appendix (p.4-5). Association analyses were performed using logistic or linear regressions to replicate association of genetic variants suggestively associated with disease risk or age at onset, adjusting for age and sex when appropriate under an additive model. Thirty-six variants at 34 loci were analyzed in the replication stage, and thus a Bonferroni-corrected significance threshold of $p<1\cdot5\times10^{-3}$ was employed in this stage. Meta-

analyses of the discovery and replication results were performed under a fixed effects model. We also calculated I^2 heterogeneity statistics to evaluate the degree of heterogeneity of the effects in the discovery and replication stages, and for SNPs with I^2 suggesting moderate or high heterogeneity ($I^2>0.3$) we also performed a random effects meta-analysis, to verify that conclusions regarding association would not change under this model. Using the discovery data, a test of interaction was performed for the genome-wide significant loci found to modify disease risk in *GRN* mutation carriers. Specifically, using the top variants from the *TMEM106B* and *GFRA2*, a logistic regression model was fit with both variant genotypes and their multiplicative effect as predictors of risk, and a likelihood ratio test of the multiplicative term was performed to assess the effect of the variant interaction on disease risk.

To determine the effect of the lead variant at the *GFRA2* locus (rs36196656) on brain *GFRA2* mRNA expression levels, quantitative real-time PCR was performed in cerebellar tissue samples of AA and CC carriers (appendix p.5). Effect of rs36196656 on progranulin protein (PGRN) levels in plasma and cerebrospinal fluid (CSF) was assessed by Taqman genotyping of 345 individuals for which levels of PGRN were previously determined by ELISA[12], using linear regression adjusting for age and sex. Whole-genome sequence data from 959 control individuals from the Mayo Clinic biobank was used to estimate linkage disequilibrium measures (D' and r^2) between all variants at the *GFRA2* locus and rs36196656.

To study the direct interaction between PGRN and GFRA2, HEK293T cells were co-transfected with GFRA2 and PGRN. Cell lysates were collected and subjected to immunoprecipitation (appendix p.6).

Role of the funding source

The funders of the study had no role in study design, data collection, data analysis, data interpretation, or writing of the report. The corresponding author had full access to all the data in the study and had final responsibility for the decision to submit for publication.

RESULTS

In the discovery stage of our study we obtained DNA samples from 493 patients carrying 120 different loss-of-function mutations in *GRN* (appendix p.3; **Supplementary Table 2**). Three mutations were identified in more than 20 patients: p.Thr272Serfs*10 (n=97), p.Arg493* (n=35) and c.709-1G> (n=31). Patients had a median age at onset of 60·0 years (interquartile range, IQR 55·0 – 66·0) and 55·2% (n=211) were female (**Table 1**). Large variability in the age at onset was detected even among patients with the same mutation. Indeed, among patients with the most frequent mutation p.Thr272Serfs*10, ages at onset ranged from 39 to 82 years with a median age at onset at 62·0 years (IQR 56·0 – 66·0). To identify genetic modifiers of disease risk and disease onset in this unique cohort of patients with *GRN* mutations, we performed a two-stage genome-wide association study. After QC, the discovery stage included 382 unrelated symptomatic *GRN* mutation carriers and 1,146 unrelated controls. Genome-wide logistic regression analysis identified an expected highly significant association with variants at the *GRN* locus on chr17q21 (**Figure 1**). Haplotype analyses using 16 variants around *GRN* showed that this association was driven by distantly related individuals sharing founder haplotypes corresponding to the most common mutations in our cohort. We estimated the presence of a shared haplotype in 100% (n=22) of patients carrying the p.709-1G>A mutation and in 63 (80·8%) of patients carrying the p.Thr272Serfs*10 mutation, whereas 18 patients with p.Arg493* (60·0%) were estimated to carry one of two founder haplotypes. We also detected the known *TMEM106B* locus including 93 variants with genome-wide significant association and in strong linkage disequilibrium (LD; D'>0·8, r^2>0·6) with the lead variant rs7791726 (p=1·53×10^{-10}, OR=0·53, 95% confidence interval CI: 0·44–0·64; **Figure 1**; **Supplementary Figures 2 and 3**). In particular, the lead variant rs7791726 is in strong LD with the previously reported *TMEM106B* variants rs1990622, rs3173615 and rs1990620 (D'=1, r^2>0·8). No additional

genome-wide significant association signals were detected throughout the genome; however, 29 additional loci showed suggestive association at $p<10^{-5}$ (**Figure 1**, **Supplementary Table 3**). After adjustment with the lead variant on chr17q21 (rs141568868), these suggestive associations did not change substantially suggesting that they are independent events from the chr17q21 locus. In a separate analysis, genome-wide linear regression analysis of onset age within the patient cohort did not identify any genome-wide significant association signals; however, 14 loci showed suggestive association ($p<10^{-5}$) (**Figure 1**, **Table 3**; **Supplementary Figure 3** and **Supplementary Table 4**). Since only the wild-type copy of *GRN* is expressed in patients with *GRN* mutations, we analyzed the effect of rs5848 located in the 3'UTR of *GRN* comparing patients homozygous for the common (C) and rare (T) alleles at this marker; however, no significant association with onset age was observed (p=0·36).

The replication stage of the association study, which included 210 patients (67 symptomatic *GRN* mutation carriers and 143 patients with pathologically confirmed FTLD-TDP type A without known mutations) and 1,798 controls (**Table 1**), identified significant association at the Bonferroni-corrected level of $p<1\cdot5\times10^{-3}$ for two loci nominated by the case-control discovery GWAS (**Table 2**). None of the loci nominated through the discovery GWAS of age at disease onset withstood Bonferroni correction (**Table 3**). The strongest signal in the case-control analysis was at the *TMEM106B* locus with marker rs3173615 ($p=8\cdot97\times10^{-8}$, OR=0·53, 95% CI: 0·47 − 0·63). The lead variant at the second locus was rs36196656 located within intron 3 of the gene encoding GDNF family receptor alpha 2 (*GFRA2*; $MAF_{patients}=0\cdot44$, $MAF_{controls}=0\cdot35$ $p=4\cdot35\times10^{-4}$, OR=1·46, 95% CI: 1·18 − 1·80). In the meta-analysis of discovery and replication stages, both the *TMEM106B* and *GFRA2* loci reached genome-wide significance (*TMEM106B*, rs3173615, $p=3\cdot78\times10^{-16}$, OR=0·54, 95% CI: 0·47 − 0·63; *GFRA2*, $p=1\cdot58\times10^{-8}$, rs36196656,

OR=1·49, 95% CI: 1·30–1·71, **Table 2**). No other loci showed $p<5\times10^{-8}$ in the meta-analysis. Conditional analysis adjusted for the *TMEM106B* variant rs3173615 in the discovery stage had no effect on the association at the *GFRA2* variant rs36196656 ($p=5·80\times10^{-6}$, OR=1·54, 95% CI: 1·28–1·85). Moreover, tests of interactions between these variants provided no evidence for interaction effects on disease risk (interaction $p>0·1$), indicating that the effect of the *GFRA2* variant on disease risk is not modified by the *TMEM106B* genotype that a person carries, and vice versa. These results suggest that the associations at *TMEM106B* and *GFRA2* are independent.

At the putative novel *GFRA2* locus both patients with *GRN* mutations and FTLD-TDP type A without known mutations contributed to the observed association in the replication stage (**Supplementary Results**). While more significant association was detected when only *GRN* patients were included ($p=3·11\times10^{-3}$, OR=1·69, 95% CI: 1·19–2·40; **Supplementary Table 5**), the FTLD-TDP type A patients showed a comparable allele frequency and odds ratio at rs36196656 ($p=1·08\times10^{-2}$, OR 1·40, 95% CI: 1·08–1·82; **Supplementary Table 6**).

To identify possible functional variants at the newly identified putative *GFRA2* locus, we queried publicly available data and whole-genome sequence data from 959 control individuals from the Mayo Clinic biobank which showed two single nucleotide polymorphisms (SNP, rs144692383 and rs150047054) and a 3-bp deletion (rs36144451) in strong linkage disequilibrium ($r^2>0·8$) with the lead variant rs36196656 (**Figure 2A**, **Supplementary Table 7**). All four variants are located in close proximity within *GFRA2* intronic regions: intron 3 of *GFRA2* transcript variant A (NM_001495), intron 2 of *GFRA2* transcript variant B (NM_001165038) and intron 1 of *GFRA2* transcript variant C (NM_001165039) depending on alternative splicing at the *GFRA2* locus (**Figure 2A**). Several of these variants are predicted to

affect transcription factor binding sites and histone marks and they all are expression quantitative loci (eQTL) for *GFRA2* in testis (p=1·80×10^{-14}; www.gtexportal.org). Indeed, *GFRA2* RNA expression analyses in cerebellar tissue samples from individuals with rs36196656 'CC' (n=24) and 'AA' (n=24) genotypes available from the Mayo Clinic brain bank showed substantial variability in expression among individuals but confirmed a 40% reduction in all *GFRA2* transcripts in brains of homozygous carriers of the risk allele (AA) compared to CC carriers, which reached significance when analyzing all *GFRA2* variants (p=0·04) or variant A individually (p=0·01) (**Figure 2B**). *GFRA2* transcript variant A was consistently the predominant transcript expressed in cerebellum (**Supplementary Figure 4A, B**) and no significant difference in the ratio of *GFRA2* transcripts (A, B, and C) was observed between AA and CC carriers (data not shown). Since the potential functional variant(s) underlying the observed association could also be less frequent than the lead variant, we further identified all variants with D'>0·8, which resulted in an additional 130 single nucleotide variants, none of which were coding (data not shown).

In order to assess a potential direct effect of *GFRA2* markers on PGRN expression levels in plasma and CSF, we performed a linear regression adjusting for age and sex, which showed that rs36196656 is not associated with PGRN levels in both plasma and CSF in 345 individuals (p=0·61 and p=0·67 respectively; **Supplementary Figure 5A and B**). We next hypothesized that GFRA2 might directly interact with PGRN and serve as a receptor for PGRN. Indeed, using transient overexpression of untagged PGRN and GFRA2 in HEK293T cells, immunoprecipitation of GFRA2 pulled down PGRN in cell lysates. Reciprocally, immunoprecipitation of PGRN pulled down GFRA2 (**Figure 3A and B**).

DISCUSSION

Using an unbiased two-stage genome-wide association study in the largest available collection of unrelated FTLD patients with pathogenic *GRN* mutations, we identified two association signals, one at the known *TMEM106B* locus and one at a novel putative locus encompassing *GFRA2*. *GRN* mutations are a relatively rare cause of FTLD and despite the international nature of our collaboration we were limited by the number of *GRN* carriers we were able to identify. In the discovery stage, we therefore relied on the uniform loss-of-function disease mechanism associated with pathogenic *GRN* mutations and combined genetic analysis of patients with 120 distinct mutations. In the replication stage, newly identified *GRN* mutation carriers were combined with FTLD-TDP type A patients with unknown genetic etiology which are pathologically indistinguishable from *GRN* carriers and possibly share common pathomechanisms. Using this approach, genome-wide significant associations were detected when symptomatic patients were compared to healthy controls, suggesting that *TMEM106B* and *GFRA2* are able to modify disease risk. Moreover, the allele at the lead *GFRA2* variant (rs36196656) associated with reduced disease risk was shown to correlate with increased brain mRNA expression of *GFRA2* transcripts.

Our study confirms *TMEM106B* as the strongest modifier of disease risk in *GRN* mutation carriers and *GRN*-negative FTLD-TDP type A patients. Published studies already established that variants associated with the *TMEM106B* risk haplotype correlate with increased expression of *TMEM106B*[11] and increases in the amount of TMEM106B have been reported to be detrimental to lysosomal health and function.[13-15] Among the variants in strong LD, several functional candidates have been reported including rs3173615 encoding TMEM106B p.Thr185Ser and the non-coding variant rs1990620 suggested to affected higher-order chromatin

architecture at the *TMEM106B* locus.[15,16] We estimated that *GRN* carriers of the *TMEM106B* protective haplotype (tagged by the 'G' allele of rs3173615) have 50% lower odds to develop disease symptoms as compared to non-protective haplotype carriers. Indeed, despite a population frequency of 14·2% in our control cohort, only 4 out of 382 (1·0%) unrelated symptomatic patients were homozygous rs3173615 'GG' carriers, suggesting that many *GRN* mutation carriers who are also homozygous for the protective *TMEM106B* haplotype never develop symptoms. This is a remarkable finding for a disease gene once thought to be nearly fully penetrant and prompts the important question as to whether *TMEM106B* genotyping should be performed routinely when *GRN* genetic testing is requested or should at least be discussed as a crucial component of predictive *GRN* genetic testing and counselling protocols, especially in asymptomatic individuals.

The *GFRA2* locus was identified as a second independent potential modifier of disease risk, which reached significance in the meta-analysis of our combined discovery and replication stages. Both *GRN* carriers and FTLD-TDP type A patients without mutations contributed to the observed association. Expression data points to a potential disease mechanism in which risk-associated variants at the *GFRA2* locus decrease brain mRNA expression of *GFRA2*. Whether these variants similarly affect GFRA2 protein expression, remains to be tested. GFRA2 is the preferential co-receptor for neurturin (NRTN), one of four members of the glial cell line-derived neurotrophic factor (GDNF) family ligands (GFLs) with an important role in neuronal differentiation, proliferation and surviva.l[17] NRTN further requires the transmembrane signaling receptor tyrosine kinase RET to assemble as a multi-component receptor system. Upon binding of NRTN to GFRA2, RET activates downstream signaling pathways including mitogen activated protein kinase (MAPK), extracellular signal-regulated kinase 1/2 (ERK1/2) and AKT. *In-vitro,*

we obtained evidence of a direct binding of PGRN to GFRA2 which could suggest that GFRA2 may be a signaling receptor for PGRN; however, future experiments both *in vitro* and *in vivo* will be needed to determine the functional consequences of this interaction. If it is confirmed that GFRA2 indeed serves as a receptor for PGRN, one possible future therapeutic avenue could be to enhance their binding, e.g. by using small molecules or compounds. Another possibility, which is not mutually exclusive, is that PGRN and GFRA2 are part of independent neurotrophic signaling pathways. In this scenario, reduced neurotrophic signaling in *GFRA2* risk allele carriers may facilitate the development of symptoms in *GRN* mutation carriers, which are already vulnerable as a result of reduced neurotrophic PGRN signaling. A loss of neurotrophic GFRA2 signaling may also affect FTLD-TDP type A patients without *GRN* mutations, especially since *GFRA2* expression appears to be enriched in the frontal and motor cortex, highly vulnerable regions in FTLD (**Supplementary Figure 4C-E**). The observation of impaired behavior and memory deficits in *GFRA2* knock-out mice further supports this.[18] Excitingly, GDNF (another GFL with preferential binding to GFRA1) and NRTN have already been extensively studied for their neuroprotective potential in Parkinson's disease (PD) models and clinical trials in PD patients have been performed by delivery of GDNF and NRTN as purified proteins or by means of viral vector mediated gene delivery to the brain.[19-21] While none of these studies have yet shown efficacy in clinical trials, the brain delivery of GFLs was found to be safe and provides hope that modified gene-therapy approaches to boost GFRA2/NRTN signaling could be developed and tested in the context of sporadic FTLD and *GRN* patients.

Our study did not identify genome-wide significant associations with age at disease onset. Variability in the clinical presentation of FTLD and the subjective nature of defining disease onset may have contributed to this, especially since 40 clinical centers contributed data to

this study. The focus on unrelated symptomatic patients as opposed to extended families where a more limited number of genetic factors are expected to contribute to disease onset may have further limited our ability to observe significant association. One previous study in 4 large families reported a 13 year decrease in onset age for carriers of the *TMEM106B* risk allele[10]; however, no association with age at onset was observed for *TMEM106B* in our study (rs3173615, p=0·87, Beta=-0·12, 95% CI -1·59–1·35).

Our study also has limitations. First, only symptomatic unrelated *GRN* mutation carriers were included in the analysis. Individual *GRN* families were generally small with limited numbers of symptomatic and informative asymptomatic carriers available, limiting the ability to perform family-based studies. Second, since patient samples were collected in various countries, population stratification could bias the results. To address this issue, we combined publically available control genotype data with newly generated genotypes from control individuals ascertained in Italy and Spain, allowing each patient to be matched to 3 geographical controls, followed by standard methodology to correct for any remaining bias. Importantly, detailed analysis at the newly identified putative *GFRA2* locus across geographical populations, showed consistent ORs associated with the lead variant (rs36196656) (**Supplementary Table 10**). Third, FTLD-TDP type A patients without *GRN* mutations were included in the replication stage. While this broadens the potential impact of *TMEM106B* and *GFRA2* associations to sporadic FTLD patients, our approach likely discounted a number of genetic modifiers specific to *GRN* mutation carriers. Finally, our functional studies were limited to GFRA2 and thus it remains possible that other genes in addition to *GFRA2* may contribute to the observed association on chromosome 8.

In conclusion, this is the first large-scale genome-wide association study focused on genetic modifiers in patients with *GRN* mutations and the first study in a homogenous cohort of

genetically defined FTLD patients. Two loci - *TMEM106B* and *GFRA2* - were shown to harbor genetic variants able to modify the disease risk. These modifiers may inform genetic counselling in families and could aid in future clinical trial designs. More importantly, identification of these modifiers in human subjects supports TMEM106B and GFRA2-related pathways as potential targets for therapies. Accordingly, improving lysosomal function and/or increasing GFRA2 expression or signaling in FTLD-relevant brain areas may be viable treatment options and important areas for future research which could complement the current translational research efforts focused on increasing GRN levels. [22-24]

CONTRIBUTORS

RR designed and oversaw the study. RR, CP, XZ and JB did primary interpretation of the data. RR, CP and XZ wrote the paper, and JB contributed substantial edits. RP generated and CP analyzed the genotypes for the replication stage. JB supervised and CP, GJ and DS participated in quality control and statistical analysis of the GWAS, replication and meta-analysis. MB performed the GFRA2 mRNA expression analyses and CP performed statistical analysis of the data. CP, MvB and YR performed bioinformatic analyses of the GFRA2 locus. XZ led and AN, TP, NF, MD-H and RP assisted in the cell biological analysis of GFRA2 and PGRN. EC was responsible for sample organization and data curation. All other authors recruited and/or clinically and/or neuropathologically characterized patients and controls for the GWAS and replication stages of the study. RR acquired funding for the GWAS, replication study and functional characterization of candidate genes. All authors contributed and critically reviewed the final version of the manuscript.

DECLARATION OF INTEREST

ACKNOWLEDGMENTS

RESEARCH IN CONTEXT

Evidence before this study

Mutations in the progranulin gene (*GRN*) are an important cause of frontotemporal lobar degeneration with TDP-43 pathology (FTLD-TDP). Pathogenic mutations are heterozygous and cause disease through a uniform mechanism leading to 50% loss of functional progranulin protein (PGRN). We searched for the terms "GRN" OR "PGRN" AND "onset age variability" in PubMed on January 30th 2018 including all publications from the database inception and identified seven publications reporting large age at onset variability among *GRN* mutation carriers, suggesting that genetic modifiers may be in part responsible for the phenotypic presentation. We also searched PubMed with the terms "GRN" OR "PGRN" AND "Genome-wide association study" for reports published on January 30th 2018, without restriction on language of publication and including all publications from the database inception and identified one previous study focused on FTLD-TDP which included 80 *GRN* mutation carriers in a genome-wide association analyses. That study identified *TMEM106B* as a risk factor in FTLD-TDP patients, with a particular strong effect in *GRN* mutation carriers, suggesting an effect of *TMEM106B* variants on disease penetrance in individuals with *GRN* mutations. No other genome-wide association studies in *GRN* patients have been performed prior to the current study.

Added value of this study

Through international collaborations we were able to use a 5-fold larger cohort of patients with *GRN* mutations compared to the previous genome-wide association study. Importantly, using a two-stage association study, we confirmed the *TMEM106B* locus as the most important modifier of disease risk in *GRN* mutation carriers and we were able to estimate that *GRN* carriers of the

TMEM106B protective haplotype (tagged by the 'G' allele of rs3173615) have 50% lower odds to develop disease symptoms as compared to non-protective haplotype carriers. We also newly identified the *GFRA2* locus on chromosome 8p21.3 as a potential genome-wide significant modifier of disease risk in patients with *GRN* mutations. The lead variant at the *GFRA2* locus (rs36196656) is located within *GFRA2* intron 3 and was shown to affect the expression profile of *GFRA2*.

Functional studies also showed that PGRN binds to GFRA2 in vitro.

Implications of all available evidence

The identification of genetic variants in *TMEM106B* and *GFRA2* as modifiers of the disease risk in patients with *GRN* mutations provides new avenues towards biomarker discovery and the development of therapeutic approaches for FTLD patients. These genetic variants might further inform genetic counselling in families and could aid in future clinical trial designs.

REFERENCES

1.   Graff-Radford NR, Woodruff BK. Frontotemporal dementia. *Semin Neurol* 2007; **27**(1): 48-57.

2.   Mackenzie IR, Neumann M, Baborie A, et al. A harmonized classification system for FTLD-TDP pathology. *Acta Neuropathol* 2011; **122**(1): 111-3.

3.   Neumann M, Sampathu DM, Kwong LK, et al. Ubiquitinated TDP-43 in frontotemporal lobar degeneration and amyotrophic lateral sclerosis. *Science* 2006; **314**(5796): 130-3.

4.   Rademakers R, Neumann M, Mackenzie IR. Advances in understanding the molecular basis of frontotemporal dementia. *Nat Rev Neurol* 2012; **8**(8): 423-34.

5.   Baker M, Mackenzie IR, Pickering-Brown SM, et al. Mutations in progranulin cause tau-negative frontotemporal dementia linked to chromosome 17. *Nature* 2006; **442**(7105): 916-9.

6.   Cruts M, Gijselinck I, van der Zee J, et al. Null mutations in progranulin cause ubiquitin-positive frontotemporal dementia linked to chromosome 17q21. *Nature* 2006; **442**(7105): 920-4.

7.   Rademakers R, Baker M, Gass J, et al. Phenotypic variability associated with progranulin haploinsufficiency in patients with the common 1477C-->T (Arg493X) mutation: an international initiative. *Lancet Neurol* 2007; **6**(10): 857-68.

8.   Rademakers R, Rovelet-Lecrux A. Recent insights into the molecular genetics of dementia. *Trends Neurosci* 2009; **32**(8): 451-61.

9.   Finch N, Carrasquillo MM, Baker M, et al. TMEM106B regulates progranulin levels and the penetrance of FTLD in GRN mutation carriers. *Neurology* 2011; **76**(5): 467-74.

10.   Cruchaga C, Graff C, Chiang HH, et al. Association of TMEM106B gene polymorphism with age at onset in granulin mutation carriers and plasma granulin protein levels. *Arch Neurol* 2011; **68**(5): 581-6.

11.   Van Deerlin VM, Sleiman PM, Martinez-Lage M, et al. Common variants at 7p21 are associated with frontotemporal lobar degeneration with TDP-43 inclusions. *Nat Genet* 2010; **42**(3): 234-9.

12.   Nicholson AM, Finch NA, Thomas CS, et al. Progranulin protein levels are differently regulated in plasma and CSF. *Neurology* 2014; **82**(21): 1871-8.

13.   Brady OA, Zheng Y, Murphy K, Huang M, Hu F. The frontotemporal lobar degeneration risk factor, TMEM106B, regulates lysosomal morphology and function. *Hum Mol Genet* 2013; **22**(4): 685-95.

14.   Chen-Plotkin AS, Unger TL, Gallagher MD, et al. TMEM106B, the risk gene for frontotemporal dementia, is regulated by the microRNA-132/212 cluster and affects progranulin pathways. *J Neurosci* 2012; **32**(33): 11213-27.

15.   Nicholson AM, Rademakers R. What we know about TMEM106B in neurodegeneration. *Acta Neuropathol* 2016; **132**(5): 639-51.

16.   Gallagher MD, Posavi M, Huang P, et al. A Dementia-Associated Risk Variant near TMEM106B Alters Chromatin Architecture and Gene Expression. *Am J Hum Genet* 2017; **101**(5): 643-63.

17.   Airaksinen MS, Saarma M. The GDNF family: signalling, biological functions and therapeutic value. *Nat Rev Neurosci* 2002; **3**(5): 383-94.

18.   Voikar V, Rossi J, Rauvala H, Airaksinen MS. Impaired behavioural flexibility and memory in mice lacking GDNF family receptor alpha2. *Eur J Neurosci* 2004; **20**(1): 308-12.

19.   Bartus RT, Weinberg MS, Samulski RJ. Parkinson's disease gene therapy: success by design meets failure by efficacy. *Mol Ther* 2014; **22**(3): 487-97.

20.   Lindholm D, Makela J, Di Liberto V, et al. Current disease modifying approaches to treat Parkinson's disease. *Cell Mol Life Sci* 2016; **73**(7): 1365-79.

21.   Kirik D, Cederfjall E, Halliday G, Petersen A. Gene therapy for Parkinson's disease: Disease modification by GDNF family of ligands. *Neurobiol Dis* 2017; **97**(Pt B): 179-88.

22.   Cenik B, Sephton CF, Dewey CM, et al. Suberoylanilide hydroxamic acid (vorinostat) up-regulates progranulin transcription: rational therapeutic approach to frontotemporal dementia. *J Biol Chem* 2011; **286**(18): 16101-8.

23.   Sha SJ, Miller ZA, Min SW, et al. An 8-week, open-label, dose-finding study of nimodipine for the treatment of progranulin insufficiency from GRN gene mutations. *Alzheimers Dement (N Y)* 2017; **3**(4): 507-12.

24.   Capell A, Liebscher S, Fellerer K, et al. Rescue of progranulin deficiency associated with

frontotemporal lobar degeneration by alkalizing reagents and inhibition of vacuolar ATPase. *J Neurosci*

2011; **31**(5): 1885-94.

FIGURE LEGENDS

Figure 1: Manhattan plots of the case/control and age at onset analyses. Negative $\log_{10}$-transformed p-values are shown for each variant genotyped on the y axis in function of the chromosomal position on the x axis. The red line represents the genome-wide significant threshold ($p=5\times10^{-8}$). The blue line denotes suggestive associations with $p<10^{-5}$. Green dots represent the variants that were included in the design for follow-up in the replication stage. (**A**) case/controls analysis. (**B**) Age at onset analysis. Please note that at some loci a proxy of the top variant was selected for genotyping in the replication stage.

Figure 2: *GFRA2* genetic locus and expression studies. (**A**) The *GFRA2* locus zoom plot is presented on the top panel . Each dot represents a genotyped (triangle) or imputed (circle) variant. The purple dot is the most significant variant (rs36196656) among variants in the region. Dots are colored from red to blue according to the r^2 showing their degree of linkage disequilibrium with rs36196656 (grey color indicates an r^2 of zero). The blue line shows the estimated recombination rate. The bottom panel presents the *GFRA2* gene and its three *GFRA2* transcripts. Exons are represented as small black boxes and non-coding regions as straight line. The location of three variants in strong linkage disequilibrium (black arrows) with rs36196656 (red arrow) are represented as blue stars across the different *GFRA2* transcripts. (**B**) Cerebellar mRNA expression level of *GFRA2* transcripts stratified by rs36196656 genotype. All values are normalized to two reference genes and within each assay, expression levels are shown normalized to homozygous rs36196656-CC carriers. cM=centimorgan, Mb=megabase.

Figure 3: Interaction of PGRN and GFRA2. GFRA2 and PGRN immunoblots are displayed after immunoprecipitation with anti-GFRA2 antibody of cell lysates (**A**) of HEK293T co-transfected with untagged PGRN and untagged GFRA2 or vector control. Similarly, GFRA2 and

PGRN immunoblots are displayed after immunoprecipitation with anti-PGRN antibody of cell lysates **(B)** of HEK293T co-transfected with untagged GFRA2 and untagged PGRN or vector control. IP=immunoprecipitation; IB=immunoblotting; 5% input=5% of the total amount of cell lysates used for immunoprecipitation.

TABLES

Table 1. Demographics of patients and controls included in the study. The median age at onset, age at death and age at last healthy visit of patients and controls included in the discovery and replication stage are presented. N=number of individuals; IQR=interquartile range. NA=not applicable.

	Discovery					Replication				
Group	Age at onset (IQR)	Age at death (IQR)	Age at last healthy visit (IQR)	% female (N)	Total	Age at onset (IQR)	Age at death (IQR)	Age at last healthy visit (IQR)	% female (N)	Total
GRN mutation Carriers	60·0 (55·0 − 66·0)	66·0 (61·0 − 73·0)	NA	55·2% (211)	382	59·0 (55·0 − 65·0)	65·0 (60·8 − 71·0)	NA	52·2% (35)	67
Controls	NA	NA	62·0 (56·0 − 67·0)	55·0% (630)	1146	NA	77·0 (64·0 − 81·0)	62·0 (53·0 − 71·0)	47·5% (853)	1798
GRN-negative FTLD-TDP Type A	NA	NA	NA	NA	NA	70·0 (62·0 − 76·8)	79·0 (68·0 − 85·0)	NA	42·7% (61)	143

Table 2. Loci identified in case/control analysis aimed at identifying modifiers of disease risk. Suggestive variants identified in the discovery stage (p<10^{-5}) and followed-up in the replication stage, as well the meta-analyses are presented. Variant p-values and odds ratio were calculated using an additive genetic model. Minor alleles were treated as effect alleles. P-values for significant loci are shown in bold. The locus name is determined by the closest gene to the significant variant. MAF=minor allele frequency; OR=odds ratio; P=p-value.

Variant	Position[a]	Major/ minor allele	Locus name	Discovery MAF patients/controls	Discovery OR (95%CI)	Discovery P	Replication MAF patients/controls	Replication OR (95%CI)	Replication P	Meta-analysis[b] OR (95%CI)	Meta-analysis P	I^2
rs13393316	2:206999339	A/G	NDUFS1	0·10/0·16	0·50 (0·38 − 0·67)	2·65×10^{-6}	0·12/0·14	0·81 (0·59 − 1·13)	2·14×10^{-1}	0·62 (0·50 − 0·77)	1·34×10^{-5}	78·5
rs4680382	3:157324261	G/A	C3orf55	0·59/0·32	1·5 (1·26 − 1·78)	4·75×10^{-6}	0·35/0·35	1·00 (0·80 − 1·24)	9·86×10^{-1}	1·28 (1·12 − 1·47)	3·46×10^{-4}	87·7
rs13072484	3:197136822	G/A	BDH1	0·29/0·21	1·54 (1·28 − 1·85)	3·79×10^{-6}	0·23/0·22	1·03 (0·81 − 1·32)	7·98×10^{-1}	1·34 (1·15 − 1·55)	1·08×10^{-4}	84·5
rs79095029	5:108855306	C/G	PJA2	0·03/0·08	0·35 (0·23 − 0·55)	5·72×10^{-6}	0·07/0·08	0·99 (0·66 − 1·49)	9·64×10^{-1}	0·62 (0·46 − 0·84)	2·03×10^{-3}	91·0
rs146261599	5:123600139	T/G	ZNF608	0·05/0·02	2·91 (1·82 − 4·64)	7·64×10^{-6}	0·02/0·03	1·09 (0·54 − 2·17)	8·14×10^{-1}	2·13 (1·45 − 3·15)	1·24×10^{-4}	81·3
rs181675566	5:168651912	T/C	SLIT3	0·04/0·01	3·86 (2·15 − 6·90)	5·72×10^{-6}	0·01/0·02	0·60 (0·24 − 1·53)	2·88×10^{-1}	2·29 (1·40 − 3·76)	1·02×10^{-3}	90·8
rs6904835[c]	6:17810195	T/C	KIF13A	0·32/0·24	1·50 (1·25 − 1·80)	9·67×10^{-6}	0·29/0·27	1·08 (0·86 − 1·36)	5·08×10^{-1}	1·32 (1·15 − 1·53)	9·94×10^{-5}	79·5
rs3173615[cd]	7:12269417	C/G	TMEM106B	0·27/0·39	0·55 (0·45 − 0·66)	**7·81×10^{-10}**	0·27/0·42	0·53 (0·42 − 0·67)	8·97×10^{-8}	0·54 (0·47 − 0·63)	**3·78×10^{-16}**	0
rs7791726[cd]	7:12283329	G/C	TMEM106B	0·26/0·39	0·53 (0·44 − 0·64)	**1·53×10^{-10}**	0·28/0·42	0·55 (0·44 − 0·70)	4·71×10^{-7}	0·54 (0·46 − 0·63)	**3·80×10^{-16}**	0
rs1990622[cd]	7:12283787	A/G	TMEM106B	0·26/0·39	0·53 (0·44 − 0·65)	**1·61×10^{-10}**	0·28/0·42	0·55 (0·44 − 0·70)	4·09×10^{-7}	0·54 (0·46 − 0·63)	**3·54×10^{-16}**	0
rs62443267	7:38153313	C/T	STARD3NL	0·19/0·19	0·62 (0·50 − 0·76)	6·83×10^{-6}	0·25/0·25	0·93 (0·73 − 1·20)	5·91×10^{-1}	0·74 (0·63 − 0·86)	1·64×10^{-4}	84·1
rs141226303	7:104251213	A/G	LHFPL3	0·04/0·01	3·73 (2·11 − 6·59)	5·61×10^{-6}	0·02/0·01	1·06 (0·47 − 2·38)	8·92×10^{-1}	2·46 (1·55 − 3·93)	1·47×10^{-4}	83·9
rs3110811[c]	7:135402648	A/G	SLC13A4	0·29/0·20	1·55 (1·29 − 1·87)	3·50×10^{-6}	0·21/0·23	0·82 (0·64 − 1·06)	1·37×10^{-1}	1·25 (1·07 − 1·45)	3·91×10^{-3}	93·5
rs10101195[c]	8:11623212	C/A	NEIL2	0·18/0·26	0·62 (0·51 − 0·77)	7·50×10^{-6}	0·20/0·23	0·79 (0·61 − 1·02)	7·06×10^{-2}	0·68 (0·58 − 0·80)	3·71×10^{-6}	47·9

SNP	Position	Alleles	Gene	Freq	OR (95% CI)	p-value	Freq	OR (95% CI)	p-value	OR (95% CI)	p-value	I^2
rs36196656[c][d]	8:21621247	C/A	GFRA2	0·46/0·37	1·51 (1·26 − 1·82)	9.44×10^{-6}	0·44/0·35	1·46 (1·18 − 1·80)	$\mathbf{4.35 \times 10^{-4}}$	1·49 (1·30 − 1·71)	$\mathbf{1.58 \times 10^{-8}}$	0
rs10816848	9:112421435	T/A	PALM2	0·42/0·49	0·68 (0·57 − 0·80)	8.74×10^{-6}	0·46/0·49	0·87 (0·70 − 1·07)	1.90×10^{-1}	0·69 (0·65 − 0·85)	6.37×10^{-6}	69·4
rs78781776	11:36466533	A/G	PRR5L	0·10/0·05	2 (1·47 − 2·72)	8.88×10^{-06}	0·09/0·07	1·27 (0·86 − 1·86)	2.28×10^{-1}	1·68 (1·32 − 2·13)	2.37×10^{-5}	69·8
rs10791882[c]	11:66319313	G/A	ACTN3	0·46/0·37	1·49 (1·26 − 1·77)	5.01×10^{-06}	0·40/0·39	1·06 (0·85 − 1·31)	6.17×10^{-1}	1·30 (1·14 − 1·49)	1.06×10^{-4}	83·5
rs10860097	12:97199656	A/T	NEDD1	0·05/0·02	3·43 (2·14 − 5·50)	2.88×10^{-07}	0·03/0·02	1·29 (0·70 − 2·37)	4.12×10^{-1}	2·38 (1·64 − 3·45)	5.15×10^{-6}	83·9
rs61965655	13:74712915	T/A	KLF12	0·07/0·04	2·33 (1·61 − 3·39)	8.52×10^{-06}	0·04/0·05	0·91 (0·55 − 1·52)	7.31×10^{-1}	1·71 (1·24 − 2·27)	4.17×10^{-4}	88·2
rs847358	14:72780521	G/A	RGS6	0·53/0·44	1·46 (1·24 − 1·73)	7.43×10^{-06}	0·45/0·46	0·97 (0·79 − 1·20)	7.76×10^{-1}	1·25 (1·10 − 1·42)	8.39×10^{-4}	88·9
rs12605286	18:41150167	G/A	SYT4	0·23/0·31	0·6 (0·48 − 0·74)	2.37×10^{-06}	0·29/0·26	1·20 (0·95 − 1·51)	1.28×10^{-1}	0·82 (0·70 − 0·96)	1.41×10^{-2}	94·6
rs7240419[c]	18:76928989	G/A	ATP9B	0·31/0·22	1·62 (1·34 − 1·94)	3.80×10^{-07}	0·25/0·23	1·10 (0·86 − 1·41)	4.37×10^{-1}	1·41 (1·21 − 1·63)	5.96×10^{-6}	83·0
rs6076187	20:24082578	G/A	FLJ33581	0·07/0·03	2·47 (1·71 − 3·57)	1.53×10^{-06}	0·04/0·04	0·87 (0·50 − 1·53)	6.39×10^{-1}	1·80 (1·32 − 2·45)	1.74×10^{-4}	89·2

[a]Positions are based on the Human Genome version 38 (hg38). [b]At the 4 SNPs for which association was replicated, the I^2 heterogeneity statistic is 0, showing no heterogeneity of effects between the two stages, and suggesting that a fixed effects meta-analysis is appropriate. For SNPs with $I^2 > 0.3$, a random effects meta-analysis was also performed. The p-values were generally larger in the random effects meta-analysis, and the results were consistent with the fixed effects, showing that none of these SNPs were significantly associated with the outcome. [c]Variants annotated as eQTL in the GTex database. [d]Variants that are study-wide significant at the replication stage after Bonferroni correction.

Table 3 Loci identified in age at onset analysis. Suggestive variants identified in the discovery stage (p<10^{-5}) and followed-up in the replication stage, as well as the meta-analyses are represented. Variant p-values and beta values were calculated using an additive genetic model. Minor alleles were treated as effect alleles. The locus name is determined by the closest gene to the significant variant. MAF=minor allele frequency; P=p-value.

Variant	Position[a]	Major/minor allele	Locus name	Discovery			Replication			Meta-analysis[b]		
				MAF patients	Association		MAF patients	Association		Beta (95% CI)	P	I²
					Beta (95% CI)	P		Beta (95% CI)	P			
rs116316277	2:185834886	C/T	ZNF804A	0·03	8·09 (4·72 − 11·46)	3·58×10^{-6}	0·08	-1·03 (-6·79 − 4·72)	7·26 × 10^{-1}	5·76 (2·85 − 8·67)	1·04×10^{-4}	86·1
rs6809184	3:170888198	C/T	TNIK	0·05	-6·78 (-9·24 − -4·32)	1·22×10^{-7}	0·09	-0·54 (-5·29 − 4·21)	8·24 × 10^{-1}	-5·46 (-7·64 − -3·27)	1·01×10^{-6}	80·9
rs12189587	6:165332257	C/T	C6orf11	0·11	-4·05 (-5·76 − -2·34)	4·83×10^{-6}	0·13	1·4 (-2·32 − 5·11)	4·62 × 10^{-1}	-3·1 (-4·65 − -1·54)	9·44×10^{-5}	85·3
rs6962939	7:7524226	T/A	COL28A1	0·04	-6·02 (-8·61 − -3·43)	7·00×10^{-6}	0·06	-6·15 (-12·56 − 0·25)	6·13 × 10^{-2}	-6·04 (-8·43 − -3·64)	8·18×10^{-7}	0
rs2922921	7:96398079	G/A	SHFM1	0·02	9·65 (5·58 − 13·72)	4·65×10^{-6}	0·06	-0·54 (-7·77 − 6·7)	8·84 × 10^{-1}	7·20 (3·65 − 10·75)	6·93×10^{-5}	82·7
rs77466830	7:151529171	C/A	PRKAG2	0·32	2·91 (1·64 − 4·18)	9·49×10^{-6}	0·43	-0·13 (-2·36 − 2·11)	9·12 × 10^{-1}	2·17 (1·06 − 3·27)	1·18×10^{-4}	81·3
rs9792144	8:53081551	C/G	ST18	0·12	3·99 (2·30 − 5·68)	4·88×10^{-6}	0·18	2·99 (-0·26 − 6·24)	7·28 × 10^{-2}	3·78 (2·28 − 5·28)	7·55×10^{-7}	0
rs3922636	8:80383502	G/A	STMN2	0·19	3·28 (1·89 − 4·67)	5·08×10^{-6}	0·31	0·49 (-2·23 − 3·21)	7·23 × 10^{-1}	2·70 (1·47 − 3·94)	1·83×10^{-5}	68·4
rs12943707	17:73317510	C/G	GRB2	0·29	-2·8 (-4·00 − -1·6)	6·40×10^{-6}	0·4	-0·41 (-2·80 − 1·98)	7·38 × 10^{-1}	-2·32 (-3·39 − -1·25)	2·22×10^{-5}	67·5
rs1561819	18:2712629	G/A	SMCHD1	0·49	-2·41 (-3·46 − -1·36)	8·96×10^{-6}	0·51	-0·81 (-2·97 − 1·35)	4·61 × 10^{-1}	-2·11 (-3·05 − -1·16)	1·23×10^{-5}	41·5
rs6108746	20:10902771	T/C	JAG1	0·19	3·54 (2·19 − 4·89)	4·23×10^{-7}	0·25	1·69 (-1·11 − 4·48)	2·38 × 10^{-1}	3·19 (1·98 − 4·41)	2·59×10^{-7}	27·4
rs6111609	20:17664546	C/A	RRBP1	0·22	2·86 (1·61 − 4·11)	9·83×10^{-6}	0·22	2·88 (-0·03 − 5·8)	5·41 × 10^{-2}	2·86 (1·71 − 4·01)	1·05×10^{-6}	0

[a]Positions are based on the Human Genome version 38 (hg38). [b]For SNPs with I²>0.3, a random effects meta-analysis was also performed. The p-values were generally larger in the random effects meta-analysis, and the results were consistent with the fixed effects, showing that none of these SNPs were significantly associated with the outcome.