

Association between α -synuclein blood transcripts and early, neuroimaging-supported Parkinson's disease

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There are no cures for neurodegenerative diseases and this is partially due to the difficulty of monitoring pathogenic molecules in patients during life. The Parkinson's disease gene α -synuclein (*SNCA*) is selectively expressed in blood cells and neurons. Here we show that *SNCA* transcripts in circulating blood cells are paradoxically reduced in early stage, untreated and dopamine transporter neuroimaging-supported Parkinson's disease in three independent regional, national, and international populations representing 500 cases and 363 controls and on three analogue and digital platforms with $P < 0.0001$ in meta-analysis. Individuals with *SNCA* transcripts in the lowest quartile of counts had an odds ratio for Parkinson's disease of 2.45 compared to individuals in the highest quartile. Disease-relevant transcript isoforms were low even near disease onset. Importantly, low *SNCA* transcript abundance predicted cognitive decline in patients with Parkinson's disease during up to 5 years of longitudinal follow-up. This study reveals a consistent association of reduced *SNCA* transcripts in accessible peripheral blood and early-stage Parkinson's disease in 863 participants and suggests a clinical role as potential predictor of cognitive decline. Moreover, the three independent biobank cohorts provide a generally useful platform for rapidly validating any biological marker of this common disease.

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Abbreviations: DAT = dopamine transporter; HBS = Harvard Biomarker Study; MMSE = Mini-Mental State Examination; PPMI = Parkinson's Progression Markers Initiative; PROBE = Prognostic Biomarkers in Parkinson's Disease Study

Introduction

Nearly 5 million people have Parkinson's disease, a sporadic, progressive neurodegenerative disorder linked to a complex genetic architecture and environmental exposures. Over the next 15 years, this number will almost double to 9 million patients worldwide (Dorsey *et al.*, 2007). Already today, the costs to public health are enormous—estimated at \$10.8 billion annually in the USA alone (O'Brien *et al.*, 2009). There are no cures or disease-modifying therapies for Parkinson's disease, and this may be due in part to our inability to monitor biological markers of early disease. Currently, patients with Parkinson's disease are diagnosed, cared for, and assigned to clinical trials based on medical history and physical exam.

To translate research progress into the clinic, simple, dynamic biomarkers are needed that are rooted in genetic discoveries. Traditionally, Parkinson's disease has been approached from a clinical perspective, as a homogeneous movement disorder typified by the triad of resting tremor, bradykinesia and rigidity. Based on this clinical view of the disease, it was postulated that a single laboratory or imaging biomarker for Parkinson's disease would be developed to serve as a universal diagnostic. This goal has been elusive. More recently, a human genome-inspired view of Parkinson's disease has provided unequivocal evidence for a diversity of genetic variants, each exacting a small, but definitive effect, underlying the clinical phenotype (Nalls *et al.*, 2014). It is becoming clearer that Parkinson's disease is aetiologically, genetically, pathologically and even clinically more heterogeneous than previously implied (Scherzer and Feany, 2004; Scherzer *et al.*, 2004; Forman *et al.*, 2005). In light of this diversity the traditional expectation of a 'one size fits all' laboratory diagnostic that can detect all patients and answer all clinical questions may need to be revised. Personalized biomarkers, tailored to patient endophenotypes and specific clinical applications, are likely to emerge. They may more appropriately describe the molecular architecture of the disease.

What are the practical applications that such biomarkers may serve, if they cannot be used as a universal diagnostic? Prognostic and mechanism-directed biomarkers will help to stratify patients for clinical trials. Risk markers are required for identifying high-risk individuals prior to the onset of overt clinical symptoms, when disease-modifying interventions will be most effective. Pharmacodynamic markers are required to determine whether an investigational drug

engages the intended target. In cancer drug development, biomarker use has increased average phase III trial success by 34% (Hayashi *et al.*, 2013) and shortened total drug development timelines (Chin *et al.*, 2011). Emerging CSF tests for Parkinson's disease (Mollenhauer *et al.*, 2011) and dopamine transporter imaging are relatively invasive or time-consuming and expensive. Blood-based tests are attractive, but no disease-causing molecule has been rigorously validated.

Accumulation of α -synuclein protein (encoded by the *SNCA* gene) in the brain is a hallmark of Parkinson's disease (Braak *et al.*, 2002). For nearly two decades since its characterization as an electric ray protein, the Parkinson's disease gene α -synuclein was thought of as 'neuron-specific' (Maroteaux *et al.*, 1988), but this view was disproven with the discovery of high levels of α -synuclein expression in blood cells, particularly those of erythroid lineage (Nakai *et al.*, 2007; Scherzer *et al.*, 2008; Maitta *et al.*, 2011). Here we tested whether levels of *SNCA* transcripts (mRNAs) in circulating blood cells might serve to identify individuals with increased risk of Parkinson's disease. We evaluated whether levels of α -synuclein gene (*SNCA*) transcripts are associated with the presence of early-stage, clinically and neuroradiologically confirmed Parkinson's disease in a platform of three independent biomarker study cohorts.

Materials and methods

Brief methods are summarized below. See the online Supplementary material for detailed clinical, laboratory and statistical experimental methods for the Harvard Biomarker Study (HBS), Prognostic Biomarkers in Parkinson's Disease Study (PROBE) and Parkinson's Progression Markers Initiative (PPMI), respectively, and for the meta-analysis across three studies.

Biospecimen collections

Briefly, the studies were designed to minimize bias from sample processing by collecting, handling and analysing specimens of cases and controls in a standardized manner following defined operating procedures and according to rules of evidence (Ransohoff, 2004, 2005; Hennecke and Scherzer, 2008). Cases and controls were processed in parallel by technicians blinded to diagnosis to avoid bias due to 'run order' of samples. Venous whole blood was collected in PAXgeneTM tubes.

Blood and PAXgene™ reagents were mixed by gently inverting 8–10 times.

RNA isolation and quality control

RNA was extracted according to the PAXgene™ Blood RNA kit manual extraction protocol including DNase treatment. RNA quality was determined with the RNA 6000 Nano Chip on an Agilent 2100 Bioanalyzer (Agilent Technologies) and the RNA Integrity Number package (Imbeaud *et al.*, 2005).

Quantitative PCR and microarray expression analyses

Quantitative PCR was performed similar to Scherzer *et al.* (2008). Microarray procedures were performed as described (Zheng *et al.*, 2010) using Illumina HumanHT-12v3 Expression BeadChips. The PROBE microarray data set has been submitted to the GEO database (accession number GSE57475).

NanoString assay performance

Probes were designed according to the manufacturer's design principles (Geiss *et al.*, 2008), including screening for inter- and intra-reporter and capture probe interactions, and selection for probes with optimal melting temperatures (Geiss *et al.*, 2008). Direct counts of the target RNAs were measured in 125 ng of RNA by digital expression analysis based on NanoString technology (without reverse transcription into cDNA). Probes for the target and control RNAs were multiplexed and assayed on the nCounter Digital Analyzer. The laboratory running the assay was blinded to the diagnosis. No-template (negative) controls containing water substituted for template were run and no signal was detected. To avoid run-order bias, samples of cases or controls were randomly assigned to plates. To control for plate-to-plate variation and drift, equal amounts of Human Universal Reference RNA were included at the beginning, within, and at the end of the entire experiment. Transcript counts (excluding SNCA-007) measured in reference RNA were highly correlated with $R^2 > 0.999$ both within one plate and in-between different plates, thus excluding drift as a potential source of bias in the experiment. Furthermore, 5% of participants' samples were randomly resampled to verify the retest reliability (technical precision). The average R^2 was 0.98 for these correlations. The NanoString data are accessible through the PPMI website (<http://www.ppmi-info.org>).

Results

Harvard Biomarker Study: SNCA mRNA abundance in early-stage Parkinson's disease

We first evaluated relative SNCA mRNA abundance in a case-control study nested in the HBS using precise, kinetic, quantitative PCR based on fluorogenic 5' nuclease chemistry (quantitative PCR). We specifically designed the HBS as

Table 1 The HBS: patient characteristics

	Patients with Parkinson's disease (n = 222)	Controls (n = 183)	P-value
Age at phlebotomy (years, SD)	67.05 (9.53)	68.44 (10.23)	0.16
Gender			
Male (n, %)	130 (58.6)	74 (40.4)	0.0003
Female (n, %)	92 (41.4)	109 (59.6)	
Clinical findings (n, %)			
UKPDBBS ^a	207 (93.2)		
Resting tremor	164 (73.87)		
Bradykinesia	221 (99.59)		
Rigidity	219 (98.65)		
Postural imbalance	109 (49.10)		
Asymmetric onset	175 (78.83)		
Medications (n, %)			
Levodopa	170 (76.58)		
Dopamine replacement medications	201 (90.5)		
De novo	21 (9.5%)		
Disease severity			
Disease duration (years) (mean, SD)	4.8 (4.5)		
Hoehn and Yahr (mean, SD)	2.1 (0.6)		
UPDRS Part I: mentation, behaviour, mood	1.5 (1.5)		
UPDRS Part II: ADLs	8.7 (5.2)		
UPDRS Part III: motor examination	18.5 (9.0)		
UPDRS total score	30.9 (13.6)		

^aUnited Kingdom Parkinson's Disease Brain Bank Society diagnostic criteria. ADL = activities of daily living.

a clinical biomarker study with rigorous, predefined collection and processing protocols. Cases and controls had similar ages, but patients with Parkinson's disease were more likely to be males (Table 1). Cases were at an early stage of the disease, with a mean modified Hoehn and Yahr stage of 2.1. A large majority of cases (201 of 222, 90.5%) were on medications that ameliorate the dopamine deficiency caused by the degeneration of neurons in the substantia nigra, while 9.5% (21 of 222) were untreated, *de novo* patients. The controls were recruited from the same source population. Case and control samples were collected, processed, and analysed in parallel. Samples were required to meet stringent quality control criteria in order to enter the study including a RNA Integrity Number (RIN) (Auer *et al.*, 2003) threshold of ≥ 7.3 indicating high RNA quality. The two groups had excellent RNA quality with mean RINs of 8 ± 0.4 versus 8.05 ± 0.4 [mean \pm standard deviation (SD)], respectively.

Relative SNCA transcript abundance in venous blood was significantly lower for patients with Parkinson's disease than for controls (difference of 20%; P -value = 0.0004;

Table 2 Blood SNCA expression is associated with early-stage clinical and DAT-neuroimaging supported Parkinson's disease in three independent populations and on three independent assay platforms

	Cases	Controls	Difference of means	P-value*
HBS				
Quantitative PCR platform ^c				
<i>n</i> (total <i>n</i> = 405)	222	183		
Unadjusted relative SNCA expression (mean, SD)	51.5 (1.97)	64.2 (1.8)	−20 ^e	0.0004
Adjusted relative SNCA expression ^d (mean, 95% CI)	49 (45–54)	61 (55–68)	−17 ^e	0.003
PROBE				
Quantitative PCR platform ^c				
<i>n</i> (total <i>n</i> = 118)	76	42		
Unadjusted relative SNCA expression (mean, SD)	75.6 (2.27)	96.3 (1.7)	−22 ^e	0.025
Adjusted relative SNCA expression ^d (mean, 95% CI)	72 (61–85)	96 (76–122)	−25 ^e	0.046
Microarray platform				
<i>n</i> (total <i>n</i> = 142)	93	49		
ILMN-PROBE1 ^a Unadjusted SNCA expression (mean, SD)	2846 (1962)	3469 (1622)	−18	0.01
ILMN-PROBE1 ^a Adjusted SNCA expression ^d (mean, 95% CI)	2452 (2167–2775)	3098 (2635–3644)	−21	0.02
ILMN-PROBE2 ^b Unadjusted SNCA expression (mean, SD)	681 (473)	823 (432)	−17	0.02
ILMN-PROBE2 ^b Adjusted SNCA expression ^d (mean, 95% CI)	578 (508–657)	730 (616–864)	−21	0.03
PPMI				
Digital gene expression platform				
<i>n</i> (total <i>n</i> = 340)	202	138		
Unadjusted analyses				
E3E4-SNCA transcript counts (mean, SD)	13 458 (7812)	15 959 (12 576)	−16	0.08
E4E6-SNCA transcript counts (mean, SD)	2826 (1860)	3496 (3,119)	−19	0.04
Long 3'UTR-SNCA transcript counts (mean, SD)	573 (387)	781 (1013)	−27	0.007
SNCA-007 transcript counts (mean, SD)	23 (16)	25 (21)	−8	0.6
Adjusted models ^d				
Adjusted E4E6-SNCA transcript counts (mean, 95% CI)	2409 (2196–2643)	2784 (2495–3107)	−13	0.046
Adjusted long 3'UTR-SNCA transcript counts (mean, 95% CI)	485 (440–534)	578 (515–647)	−16	0.02

^aILMN-PROBE1 indicates Illumina probe ILMN1701933 that targets the 3'UTR of SNCA.

^bILMN-PROBE2 indicates Illumina probe ILMN1766165 that targets exon 5 of SNCA.

^cAll statistical analyses for quantitative PCR assays were conducted using the natural logarithm of Δ CT values. For presentation purposes in Table 2 and Figs 1 and 2, a linearizing transformation of mean Δ CTs was performed. Values shown are in arbitrary units.

^dAdjusted for covariates of gender, and white and red blood cell counts.

^eIndicates per cent reduction in expression in cases compared to controls determined using the comparative CT method.

*Indicates significance analysis for all measurement values was performed on log-transformed data.

Table 2 and Fig. 1A). *Post hoc* analysis of the subgroup of untreated, *de novo* cases showed consistent results with a >20% lower mean relative SNCA transcript abundance in the *de novo* cases compared to the controls (P -value = 0.01). Counts of the four endogenous reference genes (Fig. 1B) and their geometric mean (that was used to normalize for input RNA) were virtually identical in cases and controls (Fig. 1C). Importantly, complete blood counts in cases and controls could not account for the reduction in relative SNCA mRNA abundance in patients consistent with previous reports by others (Kasten *et al.*, 2010). Specifically, white blood cell counts (Fig. 1D) and platelet counts (Fig. 1F) were unchanged between cases and controls, while red blood cell counts were marginally higher in cases than in controls (P = 0.03; Fig. 1E).

General linear model analysis was performed adjusting for the covariates of counts of white and red blood cells, and gender. In this covariate-adjusted analysis the mean relative abundance of SNCA expression was 17% lower in cases than in controls with P = 0.003.

Odds ratios (OR) for the lowest (first) quartile relative to the highest (fourth) quartile for blood SNCA transcript abundance were associated with Parkinson's disease status in the unadjusted analysis and remained associated following adjustments for the covariates of age, hours at 4°C, red and white blood cells, and platelets (Model 1) or for gender (Model 2) with odds ratios ranging from 2.14 (95% CI, 1.10–4.14) to 2.15 (95% CI, 1.2–3.82) (Table 3).

PROBE study

Replication of low SNCA mRNA abundance in dopamine transporter imaging-supported Parkinson's disease

To be of use in clinical trials, it must be feasible to measure a biomarker in a multicentre study design. We thus further evaluated SNCA mRNA levels in the USA-wide, multicentre PROBE study (Supplementary Table 1). There were no significant baseline inequalities for age, gender, and white and red blood cell counts. Cases had a mean

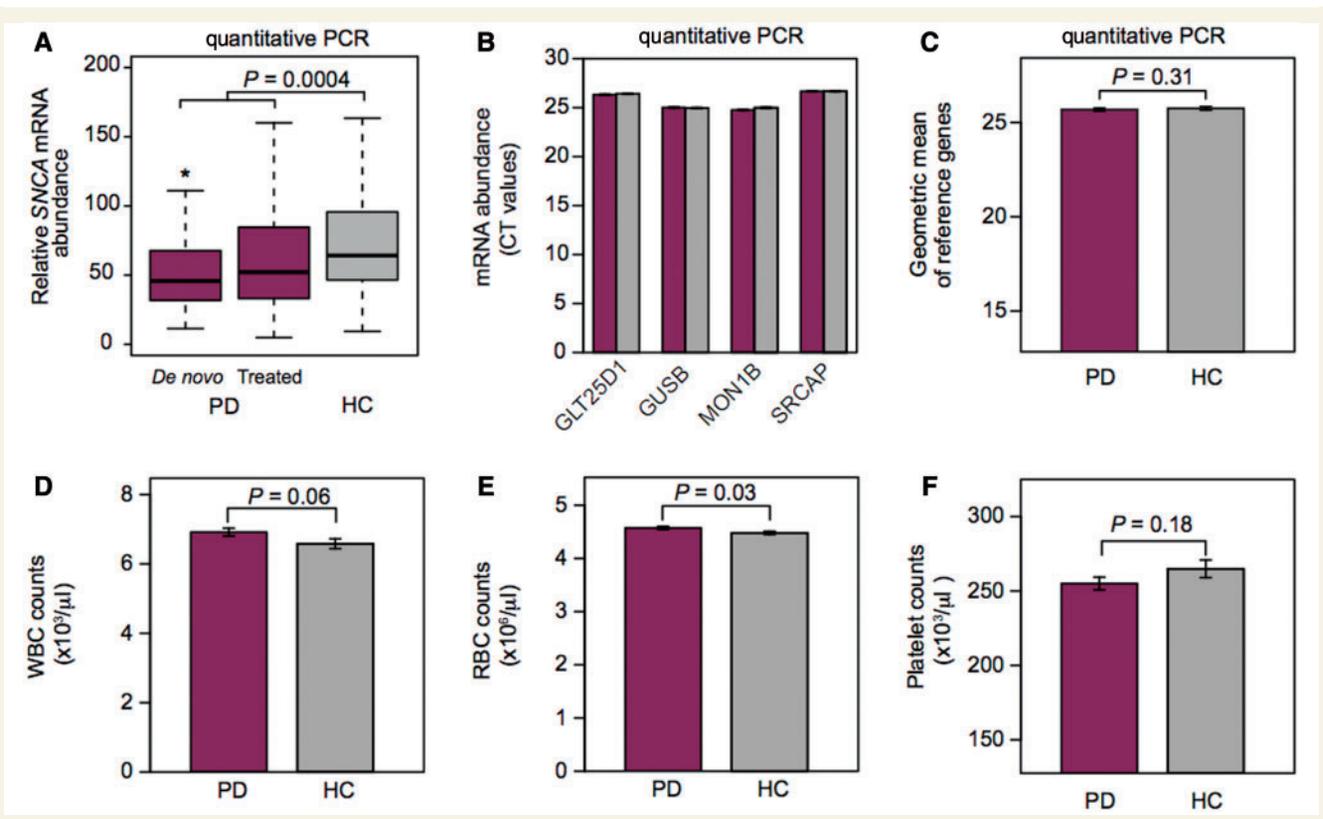


Figure 1 HBS: reduced SNCA mRNA abundance in early-stage Parkinson's disease. (A) Mean SNCA expression was significantly lower in 222 patients with early-stage clinical Parkinson's disease (PD) compared to 183 controls (HC) without neurologic disease enrolled in the HBS using precise, quantitative PCR (unadjusted difference of 20%; P -value of 0.0004). * P -value = 0.01 for untreated, *de novo* cases versus controls. Box plots visualize first, third quartiles and means; the ends of the whiskers represent the lowest (or highest) value still within 1.5-times the interquartile range. (B) Expression values of the four endogenous reference genes used in the HBS were virtually identical in cases and controls. Cycle threshold (CT) values (standard error) are shown for cases (crimson bars) and controls (grey bars). (C) The geometric mean of these four endogenous reference genes was used to normalize for input RNA. (D–F) Importantly, complete blood counts in cases and controls could not account for the reduction in relative SNCA mRNA abundance in patients. Specifically, white blood cell counts (D, WBC) and platelet counts (F) did not significantly differ between cases and controls, while red blood cell counts (RBC) were marginally higher in cases than in controls (E; mean red blood cell, 4.6 versus 4.5, $P = 0.03$). Bar graphs show means and standard errors.

Hoehn and Yahr stage of 2.0, a mean total UPDRS score of 30.6, and mean disease duration of 5.5 years. The clinical diagnosis was supported by dopamine transporter (DAT) imaging with ^{123}I -β-CIT. A subset of 76 cases with Parkinson's disease and 42 controls with available high-quality RNA were analysed by quantitative PCR. The mean relative abundance of SNCA expression was 22% lower in cases than in controls with $P = 0.025$ in the unadjusted analysis (Table 2 and Fig. 2A). This remained significant after adjusting for the covariates of white and red blood cells, and gender with $P = 0.046$. Quantitative PCR allows for precise relative, but not absolute quantification. Thus, the difference in SNCA mRNA abundance in cases relative to controls found in PROBE was comparable to the 20% difference seen in HBS (i.e. in Figs 1A and 2A), while the absolute expression values (in arbitrary units) were not directly comparable due to different calibrators.

We confirmed these expression changes using two SNCA probes represented on a secondary, microarray expression platform. Results for both probes were available for 93

cases and 49 controls enrolled in PROBE and confirmed that relative blood SNCA expression was lower in cases compared to controls (Table 2 and Fig. 2B and C). Results for ILMN-PROBE1 confirmed an association between SNCA expression and Parkinson's disease adjusting for the covariates of white and red blood cell counts, and gender with $P = 0.02$. The association was further confirmed by ILMN-PROBE2 with $P = 0.03$, again adjusting for the same covariates.

Individuals with SNCA transcript abundance in the lowest quartile of values had an OR for Parkinson's disease of 4.5 (95% CI, 1.3–15.0) compared to individuals in the highest quartile of values (Table 3). The corresponding odds ratios for the two microarray probes were 4.4 (95% CI, 1.4–14.5) and 4.6 (95% CI, 1.5–13.7), respectively. Thus, measuring blood SNCA expression was feasible in a multicentre study and reduced blood SNCA expression in Parkinson's disease was confirmed in this independent population on two distinct analysis platforms.

Table 3 The odds ratio for Parkinson's disease prevalence is increased in individuals with blood SNCA expression in the lowest quartile of values compared to individuals with SNCA expression in the highest quartile of values in three study populations

	Quartile			
	1	2	3	4
HBS				
Relative SNCA mRNA abundance	5–37 ^a	37–60 ^a	60–91 ^a	91–294 ^a
Parkinson's disease (n = 222), n/total (%)	67/222 (30)	58/222 (26)	50/222 (23)	47/222 (21)
Healthy control (n = 183), n/total (%)	34/183 (18.6)	43/183 (23.5)	51/183 (27.9)	55/183 (30)
Unadjusted OR, (95% CI) ^b	2.31 (1.31–4.1)	1.58 (0.91–2.75)	1.15 (0.66–1.99)	1
P-value	0.0036	0.11	0.63	
Model 1, OR (95% CI) ^c	2.14 (1.10–4.14)	1.86 (1.01–3.42)	1.07 (0.6–1.92)	1
P-value	0.024	0.046	0.82	
Model 2, OR (95% CI) ^d	2.15 (1.2–3.82)	1.61 (0.92–2.83)	1.12 (0.64–1.96)	1
P-value	0.0096	0.098	0.69	
PROBE^e				
Relative SNCA mRNA abundance	16–52 ^a	56–79 ^a	84–119 ^a	119–2702 ^a
Parkinson's disease (n = 76), n/total (%)	24/76 (32)	20/76 (26)	17/76 (22)	15/76 (20)
Healthy control (n = 42), n/total (%)	5/42 (12)	10/42 (24)	13/42 (31)	14/42 (33)
OR (95% CI) ^{b,f}	4.5 (1.3–15.0)	1.9 (0.7–5.3)	1.2 (0.4–3.4)	1
P-value	0.02	0.90	0.25	
PPMI				
Long-3'UTR-SNCA transcript counts	59–328	335–497	505–786	796–10861
Parkinson's disease (n = 202), n/total (%)	58/202 (29)	48/202 (24)	55/202 (27)	41/202 (20)
Healthy control (n = 138), n/total (%)	27/138 (19.6)	37/138 (26.8)	30/138 (21.7)	44/138 (31.9)
Unadjusted OR, 95% CI) ^b	2.3 (1.2–4.3)	1.4 (0.8–2.5)	1.97 (1.1–3.6)	1
P-value	0.009	0.28	0.03	
Adjusted OR (95% CI) ^g	2.1 (1.1–4.0)	1.4 (0.8–2.6)	2.1 (1.1–3.9)	1
P-value	0.02	0.25	0.02	

^aAll statistical analyses for quantitative PCR assays were conducted using Δ CT values. For presentation purposes the ranges of each quartile of values shown were linearly transformed, e.g. 2^{-lowest Δ CT} and 2^{-highest Δ CT}.

^bUnadjusted odds ratio (OR) and confidence intervals (CI) were calculated using logistic regression models comparing the risk of each of quartiles 1 to 3 to the reference quartile 4 (highest relative SNCA transcript abundance).

^cModel 1 consists of covariates age, hours in 4°C, red blood cells, platelets, and white blood cells in addition to the SNCA quartiles.

^dModel 2 consists of covariate sex in addition to the SNCA quartiles.

^ePROBE results on quantitative PCR platform are shown, similar results were obtained on the microarray platform.

^fNo adjustments were indicated.

^gModel consists of the covariate white blood cells in addition to the quartiles of long 3'UTR-SNCA counts.

PPMI

Reduced abundance of disease-relevant SNCA isoforms already near disease onset

These associations prompted us to further extend and verify our findings in patients near disease onset, when individual motor symptoms are just beginning to manifest. Two hundred and two cases with *de novo* motor Parkinson's disease, with less than 2 years of disease and with confirmed loss of dopaminergic substantia nigra terminals by DAT imaging and 138 age- and sex-matched controls without neurologic disease and with normal DAT imaging, who met stringent RNA quality-control criteria (RIN \geq 7.3) were included. Key eligibility criteria for PPMI require the presence of asymmetric resting tremor or asymmetric bradykinesia, a supportive DAT scan, and a diagnosis of Parkinson's disease for 2 years or less, without current dopamine replacement medication (Parkinson Progression Marker Initiative, 2011). Patients therefore

were clinically at a very early stage and did not yet necessarily fulfil the standard, full clinical diagnostic criteria of the UK Parkinson's Disease Society Brain Bank that require bradykinesia and a second mandatory clinical cardinal sign and three supportive clinical criteria to be present for diagnosis (Hughes *et al.*, 1992). Cases and controls were frequency matched for age and gender (Supplementary Table 2). The PPMI population was remarkable for the virtual absence of Parkinson's disease medications, and the equal distribution of potentially confounding variables of age, gender, and blood cell counts among cases and controls (Supplementary Table 2 and Fig. 3G–I).

The advent of digital expression analysis with molecular barcodes (Geiss *et al.*, 2008; Malkov *et al.*, 2009) allowed us to count the abundance of SNCA transcripts directly in RNA from blood cells, without the need for reverse transcription or PCR amplification. No signal was detected in controls lacking template. To avoid run-order bias, samples of cases or controls were randomly assigned to plates.

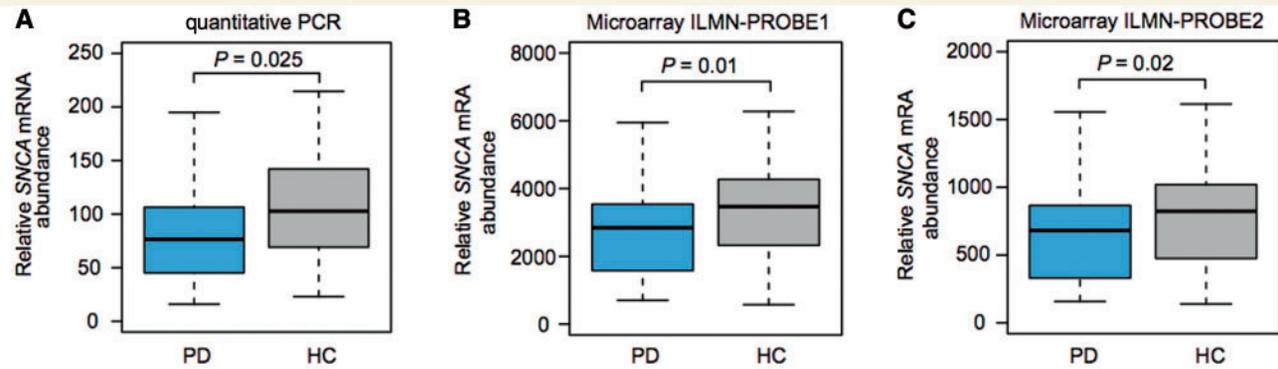


Figure 2 USA-wide, multicentre PROBE study: replication of low SNCA mRNA abundance in DAT imaging-confirmed Parkinson's disease. (A) We further evaluated this association in 76 cases with DAT imaging-confirmed Parkinson's disease and 42 controls enrolled in the PROBE study. A 22% reduction in levels of blood-SNCA expression was seen in cases compared to controls on the quantitative PCR platform ($P = 0.025$). (B and C) These results were technically replicated on a second, independent microarray expression platform that includes two distinct probes for SNCA. Results for each of the two probes confirmed that relative blood-SNCA expression was lower in cases compared to controls. Box plots visualize first, third quartiles and means; the ends of the whiskers represent the lowest (or highest) value still within 1.5-times the interquartile range.

Transcript counts (excluding SNCA-007) measured in reference RNA were highly correlated with $R^2 > 0.999$ both within one plate and in-between different plates, thus excluding drift as a potential source of bias. Furthermore, 5% of participants' samples were randomly resampled to verify the retest reliability (technical precision). The average R^2 was 0.98 for these correlations.

Alternative SNCA transcript isoform usage has been suggested as a potential convergent mechanism in Parkinson's disease pathology (Rhinn *et al.*, 2012). We therefore designed multiple probes (Supplementary Fig. 1) to target the boundaries of exon 3 and exon 4 (henceforth termed E3E4-SNCA transcript isoform), transcripts specifically with a long 3'UTR region (which may redirect α -synuclein towards mitochondria; Rhinn *et al.*, 2012), transcripts that skip exon 5 (termed E4E6-SNCA transcript isoform) and are translated into a truncated, aggregation-prone 112 amino acid protein (Murray *et al.*, 2003), or the rare short SNCA-007 transcript isoform that comprises exons 1–4. Relative counts of long 3'UTR-SNCA transcripts were reduced by 27% in cases with Parkinson's disease compared to controls in the unadjusted analysis with $P = 0.007$ (Table 2 and Fig. 3A). This was confirmed with a second digital molecular probe directed at a different target sequence in long-3'UTR-SNCA transcripts. The relation between long-3'UTR-SNCA transcripts and Parkinson's disease remained significant with a P -value of 0.02 after adjusting for the covariates of white blood cell, red blood cell, and gender (Table 2). Counts of exon 5-skipping transcripts were also associated with Parkinson's disease in unadjusted and adjusted analyses with P -values of 0.04 and 0.046, respectively (Table 2 and Fig. 3B). Counts for E3E4-SNCA transcripts were 16% lower in cases compared to controls but did not reach significance. Counts of the rare SNCA-007 transcript did not significantly differ between cases and controls. To estimate

whether SNCA expression is specially associated with Parkinson's disease or whether Parkinson's disease-linked transcripts are generally perturbed in circulating blood cells of patients with Parkinson's disease, we examined the expression of loci linked to familial Parkinson's disease [*PARK7* (also known as *DJ-1*) and *PARK15* (also known as *FBXO7*)] and *ZNF746* (implicated in mediating the effects of mutant *PARK2*; Shin *et al.*, 2011). Furthermore, the *QDPR* gene produces an essential cofactor for dopamine biosynthesis and was also evaluated. These Parkinson's disease-linked transcripts were similarly expressed in cases and controls with no or minimal fold-changes of $<5\%$ and non-significant P -values [although one of five *PARK15/FBXO7* isoforms tested (*FBXO7-001*) showed a marginal trend with $P = 0.06$]. For example, mean counts for *PARK7* mRNAs were 1144 in *de novo* cases and 1160 in controls (1.5% change, $P = 0.4$; Fig. 3C). Counts (Fig. 3D and E) and geometric mean (Fig. 3F) of the six endogenous reference genes (used to normalize for input RNA) were nearly identical in cases and controls. Cases and controls did not significantly differ in white cells, red cells, and platelets counts (Fig. 3G–I).

Individuals with long-3'UTR-SNCA transcript counts in the lowest quartile of values had an OR > 2 for Parkinson's disease compared to individuals in the highest quartile of values in both the unadjusted analysis and analyses adjusted for white blood cell count, the only covariate retained in a step-wise backward elimination procedure (Table 3).

Risk of Parkinson's disease associated with relative SNCA transcript abundance

Clinically useful biological markers of complex diseases can have modest areas under the curve (AUC) and a wide range

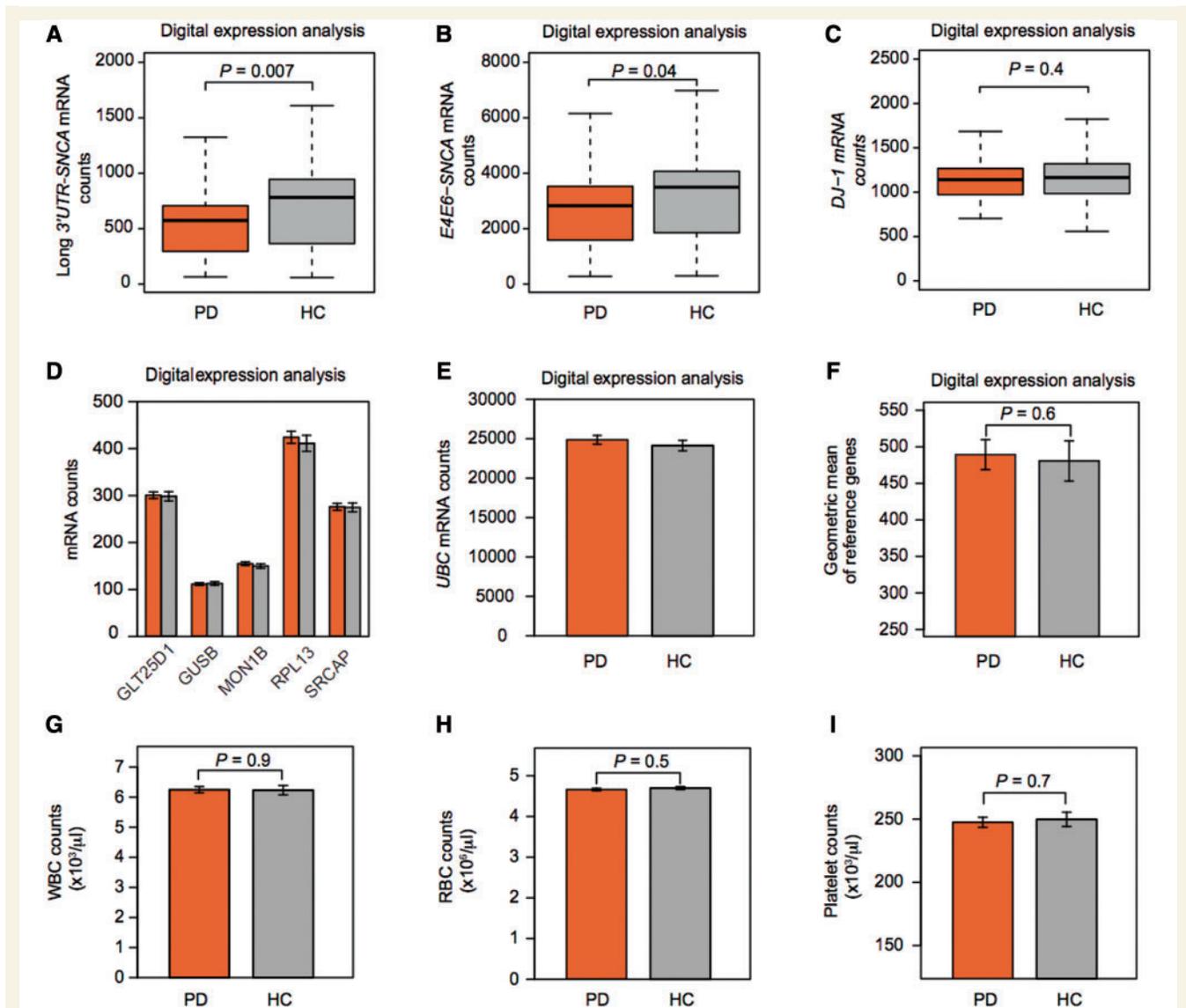


Figure 3 PPMI: disease-relevant *SNCA* isoforms are already reduced near disease onset. (A and B) *SNCA* isoforms were probed on a highly robust digital expression platform in 202 cases with *de novo* motor Parkinson's disease (PD), with less than 2 years of disease and with confirmed loss of dopaminergic substantia nigra terminals by DAT imaging and 138 age- and sex-matched controls (HC) without neurological disease and normal DAT imaging participating in PPMI. Unadjusted counts of disease-relevant *SNCA* transcript isoforms with long 3' UTR (A) or skipping exon 5 (B), were reduced by 27% and 19%, respectively, in *de novo* cases compared to controls ($P = 0.007$ and 0.04 , respectively). (C) By contrast mean counts for the gene *PARK7* (*DJ-1*) mutated in rare autosomal recessive Parkinson's disease were not significantly different in *de novo* cases with sporadic Parkinson's disease compared to controls (difference of 1.5%). Box plots visualize first, third quartiles and means; the ends of the whiskers represent the lowest (or highest) value still within 1.5-times the interquartile range. (D–F) Reference genes were stably expressed in blood cells of cases compared to controls. Counts of the six endogenous reference genes used in PPMI (D and E) were virtually identical in the 202 cases and 138 controls. Mean counts (standard error) are shown for cases (orange bars) and controls (grey bars). (F) The geometric mean of these six endogenous reference genes was used to normalize for input RNA. It was nearly identical in cases and controls. (G–I) White (WBC) and red (RBC) blood cell, and platelet counts did not differ significantly between cases and controls. Bar graphs show means and standard errors.

of values that overlap in subjects with a clinical disease and in those without it (Manolio, 2003). Consistent with this notion, *SNCA* transcripts showed AUCs for Parkinson's disease in the range of a possible risk marker. The AUC for *SNCA* transcripts as a predictor of Parkinson's disease was 0.6 in HBS, ranged from 0.63 to 0.66 in PROBE (for quantitative PCR and microarray probes, respectively), and was 0.58 in PPMI.

A meta-analysis was made possible by the similar collection protocols between the cohorts and allowed for powerfully combining the three studies to estimate the association between *SNCA* transcript abundance and risk of early-stage Parkinson's disease. It increased the sample size to 500 cases and 363 controls (total of 863). *SNCA* variables estimated on quantitative PCR and digital expression platforms were standardized and ranked. The covariates of

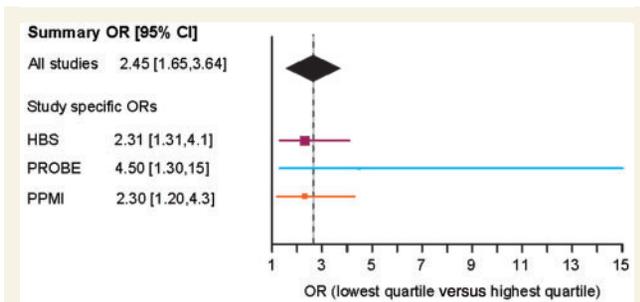


Figure 4 Risk of Parkinson's is associated with relative SNCA transcript abundance. Individuals with *SNCA* transcript levels in the lowest quartile of values had a summary odds ratio for Parkinson's disease of 2.45 (1.65, 3.64) compared to individuals with levels in the highest quartile in a meta-analysis across the three studies. In the Forrest plot squares represent the estimate of effect, i.e. the OR for each individual study, the size of the square corresponds to the size of the study, and bars around the square represent the 95% CI of the odds ratio. The diamond indicates the summary estimate; the width (the horizontal tips) of the diamond represents the 95% CI of the summary OR.

white and red blood cell count, gender, and age were adjusted for in the meta-analysis. For PPMI we first conservatively included expression measures for the generic probe (E3E4-*SNCA*) that targets most *SNCA* transcripts. In a second iteration, we included the specific probe targeting long 3'UTR-*SNCA*. In both scenarios the association between *SNCA* blood transcripts and early Parkinson's disease was highly significant with $P = 0.0001$ and $P < 0.0001$, respectively. Overall, individuals with *SNCA* transcript levels in the lowest quartile had a highly significant OR for Parkinson's disease of 2.18 (96% CI, 1.47–3.22) and 2.45 (96% CI, 1.65–3.64; Fig. 4) for each of the two scenarios, respectively. Cochran's Q statistic equalled 2.67 ($P = 0.26$), giving no evidence of heterogeneity among the three studies.

Taken together these results indicate that reduced *SNCA* mRNA levels in circulating cells are associated with Parkinson's disease, even near disease onset and in patients with DAT-imaging supported loss of dopaminergic nigral projections. Exploration of specific transcript isoforms using digital transcript counting indicated that *SNCA* transcripts containing a long 3'UTR may be particularly relevant for this association.

SNCA transcript abundance predicts cognitive decline

Predictors of cognitive decline would be valuable for stratifying clinical trials and for advancing clinical care (Chen-Plotkin, 2014). We have tracked Mini-Mental State Examination (MMSE) scores in the HBS and the PROBE populations during multiple longitudinal in-person follow-up visits for ~5 years. To evaluate whether *SNCA* transcript levels measured at enrolment can longitudinally

predict cognitive prognosis in Parkinson's disease, we analysed the 222 patients with Parkinson's disease that were longitudinally followed in the HBS. In HBS, MMSE scores were obtained during in-person study visits at enrolment, after 12, 24, and 60 months in the study. There was overall a significant relation between *SNCA* transcript abundance at enrolment and MMSE scores during the longitudinal follow-up period with $P = 0.0007$. We then tested whether low versus high *SNCA* expression status measured at enrolment could predict longitudinal cognitive decline in these patients. The 25% of patients with Parkinson's disease with the highest *SNCA* transcript levels at enrolment ($n = 55$; termed henceforth 'SNCA high expressors') and the 25% of patients with the lowest *SNCA* transcript levels at enrolment ($n = 55$; termed 'SNCA low expressors') were compared (Fig. 5). Notably, at enrolment high and low *SNCA* expressors had nearly identical mean (SD) MMSE scores of 28.37 (1.95) versus 28.53 (2.28) ($P = 0.3$). Moreover, the two groups showed no statistically significant differences in other clinical characteristics at enrolment, including gender, age, disease duration, total Unified Parkinson's Disease Rating Scale (UPDRS) score, Hoehn and Yahr stage, medications, and years of education (Supplementary Table 3). Notably, low *SNCA* expressors showed accelerated longitudinal cognitive decline compared to high expressors with $P = 0.01$ in the longitudinal mixed random and fixed effects model analysis (Locascio and Atri, 2011) adjusting for age, gender, disease duration upon enrolment, and years of education (Fig. 5A).

We then asked whether low and high expressor status can also predict cognitive decline in PROBE. Prospective longitudinal clinical data were available for 65 of the 76 patients in PROBE with relative *SNCA* abundance measured by quantitative PCR at enrolment. Again, the 25% of patients with Parkinson's disease with the highest *SNCA* transcript levels at enrolment into PROBE ($n = 16$ in PROBE) and the 25% of patients with the lowest *SNCA* transcript levels at enrolment ($n = 16$ in PROBE) were tested. High and low *SNCA* expressors had similar MMSE scores of 29.19 (0.98) versus 28.44 (2.78) at enrolment ($P = 0.95$) (Supplementary Table 2). Mixed effects analysis adjusting for the covariates of age, gender, disease duration upon enrolment, and years of education indicated a similar trend as observed in the larger HBS population, but this did not reach statistical significance, likely because of insufficient power (Fig. 5B). PPMI was not included in the longitudinal analysis because the multi-year longitudinal follow-up data needed are not yet available. Finally, to increase power, we performed a mixed random and fixed effects meta-analysis across the low and high expressors from each of the HBS and PROBE populations. The combined analysis robustly confirmed *SNCA* expression status as predictor of longitudinal cognitive decline in Parkinson's disease with $P = 0.005$ after adjusting for pertinent covariates and for study (Fig. 5C). Similar analyses were performed to evaluate whether *SNCA* expression can also predict decline in longitudinal total UPDRS scores.

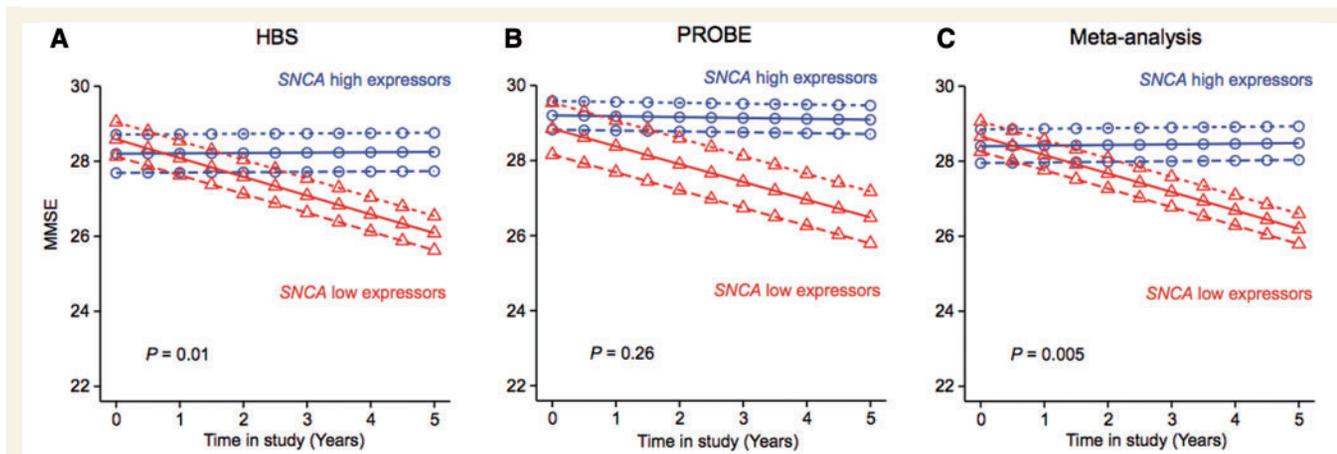


Figure 5 *SNCA* transcript abundance predicts cognitive decline in patients with Parkinson's disease during longitudinal follow-up. **(A)** The 25% patients with Parkinson's disease with the highest *SNCA* transcript levels at enrolment into HBS ($n = 55$; 'SNCA high expressors') and the 25% of patients with the lowest *SNCA* transcript levels at enrolment in HBS ($n = 55$; 'low SNCA expressors') were compared. Illustrative mean scores on the MMSE across time predicted from the estimated fixed effect parameters in the mixed random and fixed effects model analysis (Locascio and Atri, 2011) are shown for SNCA high expressors and SNCA low expressors. Low SNCA expressors showed accelerated longitudinal cognitive decline compared to high expressors with $P = 0.01$ adjusting for age, gender, disease duration upon enrolment, and years of education. **(B)** Mixed effects model analysis for the 25% SNCA high expressors ($n = 16$) versus the 25% low expressors in PROBE ($n = 16$) adjusting for covariates indicated a similar, but non-significant trend. **(C)** In the combined analysis, *SNCA* expression status was robustly confirmed as a predictor of longitudinal cognitive decline in Parkinson's disease with $P = 0.005$ after adjusting for pertinent covariates and study. Illustrative mean scores on the MMSE across time predicted by the fitted model in the longitudinal analysis for Parkinson's disease patients in the lowest quartile of *SNCA* expression levels are shown as red triangles; values for Parkinson's disease patients in the highest quartile of *SNCA* expression levels are represented as blue circles (solid lines indicate predicted values for subjects with a mean value of disease duration at enrolment; large-dashed lines indicate those for individuals with 1 SD longer disease duration at enrolment; and short-dashed lines indicate those for subjects with 1 SD shorter disease duration at enrolment).

These analyses were inconclusive and will require further evaluation in larger, longitudinally followed patient populations.

Discussion

We show here that *SNCA* transcript counts in circulating blood cells are reduced in early Parkinson's disease—even in the landmark PPMI study that enrolled patients before they met standard clinical diagnostic criteria. The association between *SNCA* expression and Parkinson's disease was generalizable across platforms and across populations (Table 2 and Figs 1–3). It was observed in studies from a single health care system (HBS), from 22 USA sites (PROBE), and from 24 USA and international sites (PPMI). This association remained significant when adjusted for confounding variables such as age, gender, white and red blood cell counts, Parkinson's disease medications, or sample handling.

Biological markers of processes that lead to complex diseases such as Parkinson's disease are not simply present or absent, but have a wide range of values that overlap in subjects with a clinical disease and in those without it (Manolio, 2003). For example, total cholesterol has modest specificity and sensitivity for predicting cardiovascular disease (with an area under the receiver operating

curve of 0.59 in the Women's Health Study; Ridker *et al.*, 2000)—well short of the >90% specificity required for a *bona fide* diagnostic test. Nonetheless, biological markers of complex diseases can have powerful clinical applications. Cholesterol metabolism-related biomarkers have transformed cardiology. They enable early intervention with cholesterol-lowering medications because of the favourable risk/benefit ratio (low side-effect profile combined with clear benefits for reducing debilitating cardiovascular events). Levels of these commonly used biomarkers are also valuable in tracking therapeutic response and patient stratification. Thus, if confirmed in prospective studies, *SNCA* blood transcripts could be developed into future markers of risk, of patient stratification for clinical trials, and of response to novel therapeutics (particularly those targeting α -synuclein production or clearance).

We have begun to explore a clinical application for this biological marker as a predictor of cognitive decline. Cognitive decline is one of the most debilitating manifestations of disease progression in Parkinson's and is closely correlated with the presence of α -synuclein protein-positive Lewy body burden throughout the neocortex (Braak *et al.*, 2002). Predictors of cognitive decline would be valuable for stratifying clinical trials and for advancing clinical care (Chen-Plotkin, 2014). Several previous studies have examined the association between cognitive decline and biological markers in cross-sectional studies (Mollenhauer *et al.*,

2014) or with a single longitudinal follow-up after 1–2 years (Siderowf *et al.*, 2010; Chen-Plotkin *et al.*, 2011). Longitudinal studies with repeated measurements provide more independent information than a single measurement (Hedeker and Gibbons, 2006; Locascio and Atri, 2011). In our study low *SNCA* transcript abundance at enrolment predicted cognitive decline in patients with Parkinson's disease that were cognitively reassessed during multiple longitudinal visits over up to 5 years of follow-up with a *P*-value of 0.005 in the combined analysis of HBS and PROBE studies.

Beyond these translational implications, the association here observed offers an immediate clue towards unravelling the biological function of α -synuclein in health and disease. α -Synuclein had been thought of as a neuron-specific gene for decades, but this view was turned on its head with the discovery of high levels of α -synuclein present in blood cells, particularly in reticulocytes (circulating immature red blood cells) and during terminal erythroid differentiation and in megakaryocytes (Scherzer *et al.*, 2008; Maitta *et al.*, 2011), with low or no expression in other tissues (Maroteaux *et al.*, 1988). In erythroid cells *SNCA* expression is regulated by the GATA-1 transcription factor in synchrony with machinery essential for incorporating iron into heme within mitochondria (Scherzer *et al.*, 2008) thereby pointing at a biological link between three nodes of Parkinson's disease: α -synuclein, mitochondria (Zheng *et al.*, 2010), and iron (Rhodes and Ritz, 2008). Our study suggests that this link might be perturbed in early disease stages. Alternative α -synuclein transcript isoform usage has been suggested as a potential convergent mechanism in Parkinson's disease pathology (Rhinn *et al.*, 2012). 3'UTR ends of mRNAs are critical for targeting transcripts to specific subcellular compartments and for translational control (Andreassi and Riccio, 2009). Specific transcript isoforms of *SNCA* with an extended 3'UTR impact accumulation of α -synuclein protein, which appears redirected away from synaptic terminals and towards mitochondria (Rhinn *et al.*, 2012). This might be relevant to disease processes as mitochondrial dysfunction is implicated in the onset of Parkinson's disease neuropathology (Zheng *et al.*, 2010). By contrast, deletion of exon 5 of the *SNCA* gene results in the translation of a truncated 112 amino acid protein that is prone to aggregation and increases seeding efficiency (Murray *et al.*, 2003).

In sporadic Parkinson's disease, α -synuclein protein (and iron) accumulates in the brain and peripherally α -synuclein aggregates are found in skin, glands, intestines and epicardium (reviewed in Jellinger, 2011). In a few dozen patients a triplication of the *SNCA* locus causes monogenic familial Parkinson's disease. The direction of the change observed here was therefore surprising, even paradoxical, at first glance. How can it be that *SNCA* blood transcript levels are consistently reduced in each of the three studies? Ample precedent exists for paradoxical changes in peripheral markers of neurological diseases. In Parkinson's disease, extracellular α -synuclein protein levels are reduced in CSF for

reasons unknown (Mollenhauer *et al.*, 2011). In Wilson's disease, copper accumulates in the basal ganglia, but serum levels are paradoxically low. In Alzheimer's disease, amyloid- β_{42} levels are reduced in CSF (Hansson *et al.*, 2006). We hypothesize that intracellular *SNCA* transcript levels in clinically manifest, sporadic Parkinson's disease may be reduced as a consequence of intracellular α -synuclein protein accumulation (due to impaired clearance or other mechanisms) that leads to a feedback repression of transcription—in a homeostatic effort to ameliorate the 'log jam' of excessive α -synuclein protein products. In an alternate view, because *SNCA* is so highly expressed in reticulocytes, reduced *SNCA* expression could be a marker of generally abnormal reticulocyte biogenesis or function in early-stage Parkinson's disease. We performed association studies that do not imply causality and that were not designed to distinguish between these alternative hypotheses. However, neither ours nor previous studies (Kasten *et al.*, 2010) found evidence for an association between anaemia and Parkinson's disease. By contrast, anaemia during early life, preceding disease onset by up to 20–29 years (Savica *et al.*, 2009), and multiple recent blood donations have been correlated to increased risk of Parkinson's disease (Logroschino *et al.*, 2006).

The ease and non-invasiveness of an α -synuclein blood test is appealing. Previous attempts to search for α -synuclein blood tests centred on α -synuclein plasma protein, involved small cohorts, and were inconclusive (for review see Chahine *et al.*, 2014). That approach poses considerable technical challenges as plasma can be easily contaminated with α -synuclein released from erythrocytes ruptured during sample transport and centrifugation. Our studies leapfrogged this technical challenge. Patient blood was directly collected into an FDA-approved system for preserving 'intracellular RNA from whole blood for RT-PCR used in molecular diagnostic testing' (without a need for plasma separation) where chemicals immediately stabilize the *in vivo* gene transcription profile by reducing *in vitro* RNA degradation and minimizing gene induction (Pahl and Brune, 2002a, b; Rainen *et al.*, 2002; Kim *et al.*, 2014). The HBS, PROBE and PPMI studies were purposefully designed to minimize the threats of bias from sample collection, processing and storage (Ransohoff, 2004). Case and control samples for HBS and PPMI were collected, processed and analysed in parallel using standardized procedures for each step. In contrast to other studies, RNA integrity, complete blood counts, and several processing and quality indicators were carefully measured for all three studies.

Although each of the three biomarker studies here presented has limitations when taken on its own, these individual constraints are compensated for by the collective strengths. For example, while the PROBE and HBS study could not completely rule out an undue influence of Parkinson's disease medications on *SNCA* expression, this question was fully addressed by exclusively recruiting *de novo* cases in PPMI. We clearly show that this is not simply a marker of sick patients; instead, the association

is already detectable in individuals who are very early in the disease course and highly functional. Clinical diagnostic certainty was enhanced through DAT neuroimaging.

Beyond revealing an association between lowered *SNCA* expression and Parkinson's disease, this study presents a generally useful resource of three purpose-designed biobanks and linked clinical data. This platform of biobanks can now be used for accelerating the exploration of nearly any biofluid marker for Parkinson's disease by decreasing the time from discovery to replication from multiple years down to the assay run-time.

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PROBE Study. PROBE Steering Committee: Voyager Therapeutics: Bernard Ravina; Brigham and Women's Hospital: Clemens Scherzer, University of Ottawa: Michael Schlossmacher, Avid Radiopharmaceuticals: Andrew Siderowf, University of Rochester: David Oakes; Institute for Neurodegenerative Disorders: Kenneth Marek; Georgetown University: Ira Shoulson. The investigators who contributed to the PROBE cohort and collection of clinical data and blood samples are listed in the Appendix of Ravina et al., *A Longitudinal Program for Biomarker Development in Parkinson's Disease: A Feasibility Study, Movement Disorders*, Vol. 24, No. 14, 2009, pp. 2081–2090.

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Supplementary material

Supplementary material is available at *Brain* online.

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