Archival Report

Proteomic Analysis Identifies Circulating Proteins Associated With Plasma Amyloid- β and Incident Dementia

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ABSTRACT

BACKGROUND: Plasma amyloid- β (A β) (A β_{42} , A β_{40} , and A β_{42} /A β_{40}), biomarkers of the Alzheimer's form of dementia, are under consideration for clinical use. The associations of these peptides with circulating proteins may identify novel plasma biomarkers of dementia and inform peripheral factors influencing the levels of these peptides.

METHODS: We analyzed the association of these 3 plasma $A\beta$ measures with 4638 circulating proteins among a subset of the participants of the Atherosclerosis Risk in Communities (ARIC) study (midlife: n = 1955; late life: n = 2082), related the A β -associated proteins with incident dementia in the overall ARIC cohort (midlife: n = 11,069, late life: n = 4110) with external replication in the Age, Gene/Environment Susceptibility (AGES)–Reykjavik Study (n = 4973), estimated the proportion of A β variance explained, and conducted enrichment analyses to characterize the proteins associated with the plasma A β peptides.

RESULTS: At midlife, of the 296 Aβ-associated proteins, 8 were associated with incident dementia from midlife and late life in the ARIC study, and NPPB, IBSP, and THBS2 were replicated in the AGES–Reykjavik Study. At late life, of the 34 Aβ-associated proteins, none were associated with incident dementia at midlife, and kidney function explained 10%, 12%, and 0.2% of the variance of A β_{42} , A β_{40} , and A β_{42} /A β_{40} , respectively. A β 42-associated proteins at midlife were found to be enriched in the liver, and those at late life were found to be enriched in the spleen.

CONCLUSIONS: This study identifies circulating proteins associated with plasma A β levels and incident dementia and informs peripheral factors associated with plasma A β levels.

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Plasma amyloid- β (A β) peptides (A β_{42} , A β_{40} , and A β_{42} /A β_{40}) are under consideration for clinical use as biomarkers of Alzheimer's disease (AD), the most common form of dementia (1,2). While A β_{40} is the most abundant A β peptide, the accumulation of A β_{42} fibrils in the brain is an early hallmark of AD pathology (3). Lower plasma levels of A β_{42} and A β_{42} /A β_{40} have been associated with a higher risk for AD or dementia (4,5), likely reflecting lower clearance of A β_{42} from the brain (6).

A β peptides are cleaved from the protein encoded by A β precursor protein, which is expressed in a wide range of tissues (7,8). The circulating proteome consists of proteins that are secreted as messengers, tissue leakage products, immunoglobulins, and transmembrane proteins that shed from cells (9). Recently, high-throughput platforms have enabled studies of the circulating proteome with some replicated results for markers of dementia, such as natriuretic peptide B (10,11). While the utility of these new circulating markers needs further validation, identifying circulating proteins associated with plasma A β may reveal novel risk markers of dementia and

increase our knowledge of the peripheral factors associated with plasma $A\beta.$

We conducted a large-scale cross-sectional proteomic analysis of the 3 plasma A β measures using 4638 proteins at midlife and late life in a subset of the participants of the Atherosclerosis Risk in Communities (ARIC) study ($n = \sim 2000$ of 15,792) (12). We assessed the association of the A β -associated proteins with incident dementia in the overall ARIC cohort followed by replication in the Age, Gene/Environment Susceptibility (AGES)–Reykjavik Study; quantified the proportion of A β variances explained by demographic factors, kidney function, and A β -associated proteins; and characterized A β -associated protein signals using enrichment analysis.

METHODS AND MATERIALS

Study Population for the Association Analysis of Plasma $\mbox{A}\beta$

The ARIC study enrolled 15,792 middle-aged adults from 4 U.S. communities (Washington County, Maryland; Forsyth

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County, North Carolina; Minneapolis, Minnesota; and Jackson, Mississippi) in 1987–1989 (visit 1). Up to December 2017, 6 visits were completed. At visit 3 (1993–1995) and visit 5 (2011–2013), a subset of the participants ($n = \sim 2000$) had plasma A β and circulating protein available. The ARIC study was approved by each study site's institutional review board. All participants provided written informed consent.

The selection of the participants for measuring plasma $A\beta$ was reported previously (5). Briefly, at visit 5 (late life, 2011–2013; n = 6538), a subset of the participants were selected for additional cognitive assessments (n = 3976). Of these, plasma $A\beta$ measures were available among 2576 participants at midlife and 2570 participants at late life. After excluding participants with missing data and those in race-center too small for analysis, we included 1955 participants at midlife and 2082 participants in late life. The number of participants excluded in each category is reported in Figure S1 in Supplement 1 for midlife and Figure S2 in Supplement 1 for late life. The population characteristics of the participants included and excluded from the analysis in midlife and late life are reported in Table S1 in Supplement 2.

Measurement of Plasma Aβ, Circulating Proteins, and Primary Covariates

Plasma samples were collected using EDTA tubes and stored at -80 °C until assayed based on a standardized protocol (13). Plasma A β assays were performed by the Department of Molecular Pharmacology and Experimental Therapeutics at The Mayo Clinic in Jacksonville, Florida, using the INNO-BIA immunoassay (Innogenetics), which had coefficients of variation (CVs) ranging from 1.9% to 7.2% for A β_{42} and 3.0% to 7.3% for A β_{40} (14). Samples with undetectable values were imputed to the limit of detection (12 pg/mL for A β_{42} and 15 pg/mL for A β_{40}) (5).

Methods for the assay of circulating proteins at midlife and late life have been reported previously (11). Briefly, relative concentration of 5284 proteins in relative florescence units were quantified from plasma samples using SomaScan version 4, a modified aptamer-based platform, by SomaLogic, Inc. (15,16). The quality control process of SomaLogic, Inc involved normalization of the quantification levels by plate and sample followed by the protein levels from a pool of healthy control subjects (16). The median CVs from blinded duplicates were 6.3% at midlife and 4.7% at late life. We excluded aptamers having evidence for unspecific binding (n = 552, Table S2 in Supplement 2), deprecated (n = 7), or CV >50% or a variance of <0.01 on the log scale at either midlife or late life (n = 87). We included 4638 aptamers that quantified 4448 unique proteins or protein complexes.

Among the variables used as covariates, age, sex, and race were self-reported. Estimated glomerular filtration rate (eGFR) was calculated using the Chronic Kidney Disease Epidemiology Collaboration equation with calibrated and standardized serum creatinine (17,18). The ascertainment of other variables used in the reporting of demographics or sensitivity analysis are reported in Supplemental Methods in Supplement 1.

Cross-sectional Association Analysis of Plasma A β Measures and Circulating Proteins

We report the Spearman correlations between the A β measures. Population characteristics by median of the A β measures were compared using *t* test for nonskewed continuous variables, Kruskal-Wallis test for skewed continuous variables, and χ^2 test for categorical variables.

Given the lack of absolute quantification of the protein levels and the fact that it is unknown whether the correspondence between the relative unit and protein abundance at visits 3 and 5 was the same, we conducted the association analysis at midlife and late life in separate regression models. Each protein was used as the outcome with each A β measure as the predictor of interest. To reduce skewedness, we applied log₂ transformation to the A β measures. For the protein levels, inspecting the large number of proteins for appropriate transformation seemed impractical; therefore, we applied rankbased inverse normal transformation. In our primary analysis, we aimed to include variables that capture broad hidden systematic factors that may affect protein levels. In addition to age, sex, and race-center, we included eGFR, which represents the influence of renal excretion on protein levels, and 4 probabilistic estimation of expression residuals factors (19,20). A brief summary of the probabilistic estimation of expression residuals factor methods is reported in Supplemental Methods in Supplement 1.

The statistical significance level was determined using the Bonferroni method in combination with permutation test (iterations = 1 million), which were performed for proteins with linear regression *p* value < 1.078×10^{-5} (=0.05/4638, the number of proteins tested). We considered a permutation *p* value < 1.078×10^{-5} as significant. The use of permutation test was motivated by the lack of methods to assess the extent of *p* value inflation in proteomic analysis (21). The permutation test is based on the empirical null distribution from the data rather than a theoretical null distribution. For the significant Aβ-associated proteins, we also report their Spearman correlations with their associated plasma Aβ. Figure 1 presents an overview of the association and subsequent characterization analyses.

We conducted two sensitivity analyses: controlling for additional covariates related to chronic conditions and kidney function biomarkers. Details are reported in Supplemental Methods in Supplement 1. To assess whether the proteins that were associated with $A\beta_{42}$ might be associated with the severity of cognitive impairment, we evaluated the association of these proteins with the scores of the Mini-Mental State Examination among those with dementia at late life. Details are reported in Supplemental Methods in Supplement 1.

Study Population for Incident Dementia Analysis

For proteins with significant association with one or more A β measures from permutation tests in the cross-sectional analysis, we evaluated their prospective associations with incident dementia in the overall ARIC cohort, where circulating proteins and incident dementia assessments were available in the overwhelming majority of the ARIC participants (*n* = 11,069 at midlife and 4110 at late life without prevalent dementia). The



Figure 1. Analysis flowchart. First, the analysis of the cross-sectional association between the plasma amyloid- β (A β) peptides (A β_{42} , A β_{40} , and A β_{42} /A β_{40} ratio) and circulating protein was conducted in a subset of the Atherosclerosis Risk in Communities (ARIC) participants with plasma Aß data available (yellow box). Next, circulating proteins with significant association with the A β peptides were assessed for their association with incident dementia in the overall ARIC cohort at two separated baselines followed by replication in the Age. Gene/Environment Susceptibility-Reykjavik Study (AGES) (blue boxes). Finally, the variances of the plasma Aß peptides were quantified, and the results of the cross-sectional association between plasma AB and circulating proteins were further characterized using gene set and tissue enrichment analysis (orange boxes).

study population and methods used in this analysis have been reported (11). Incident dementia events were determined by an expert panel based on the criteria from the National Institute on Aging–Alzheimer's Association workgroups and the DSM-5 or International Classification Disease codes at hospital discharge and on death certificates (22). Details of dementia ascertainment and participant inclusion criteria are reported in Supplemental Methods in Supplement 1.

Association Analysis of Plasma A β -Associated Proteins With Incident Dementia

To enhance the generalizability of the results, the association analysis of incident dementia used nonoverlapping cases from the midlife and late-life baselines. For the midlife baseline, participants were followed up to visit 5 (1131 incident dementia events). For the late-life baseline (visit 5, 2011–2013), participants were followed up to visit 6 (2016–2017, 428 incident dementia events). Participants who died or without detected dementia up to the end of the follow-up were censored.

A Cox regression model was evaluated controlling for age, sex, race-center, education levels, *APOE* ε 4 carrier status, eGFR, and cardiovascular factors (current smoking status, body mass index, prevalent diabetes, and hypertension). We validated significant associations with incident dementia from midlife using the associations from late life and vice versa. The statistical significance levels were determined by the Bonferroni method (Table S3 in Supplement 2).

Replication of the Association of A β -Associated Proteins With Incident Dementia in the AGES-Reykjavik Study

The A β -associated proteins that were associated with incident dementia in ARIC (n = 8) were carried forward for replication for their association with incident dementia in AGES. Details of AGES and the AGES-Novartis SomaScan platform have been reported previously (23,24). Briefly, 5764 participants previously enrolled in the Reykjavik study were reexamined for the first wave of AGES in 2002–2006. AGES was approved by the Icelandic Nation Bioethics Committee (VSN 00-063), the Icelandic Data Protection Authority, Iceland, and the Institutional Review Board for the National Institute on Aging, National

Institutes of Health, United States. All participants provided written informed consent.

Blood samples used for this study were collected at the first wave using a standardized protocol and stored at -80 °C. A total of 5034 SOMAmers were quantified. The interassay CVs determined using a subset of 1000 SOMAmers had a median of <1% (23).

Dementia classification was in accordance with DSM-IV criteria (25) and adjudicated based on consensus during conferences that included a neurologist, geriatrician, neuropsychologist, and neuroradiologist who provided a clinical reading of available magnetic resonance images. More details are provided in Supplemental Methods in Supplement 1.

Of the 5764 participants in AGES-Reykjavik study, 4973 participants without prevalent dementia and with data for covariates were included in the analyses. Participants were followed from June 2002 to October 2015. Dementia incidence rate was 27.5 (95% CI= 25.9–29.2) cases per 1000 personyears. A Cox regression model was used to examine the association between log₂-transformed values of proteins and incident dementia controlling for baseline age, sex, education, *APOE* ε 4 carrier status, eGFR, body mass index, diabetes, hypertension, and smoking status.

Evaluation of the Variance of Plasma A β Explained by Key Variables

To quantify the variability of the 3 plasma A β measures that could be explained by demographics (age, sex, and race), eGFR, and the A β -associated proteins, we evaluated 3 linear regression models using each A β measure as the dependent variable and obtained the R^2 of these models, which can be interpreted as the proportion of the variance of the dependent variable explained by the independent variables. Model 1 included age, sex, and race-center. Model 2 added eGFR, and Model 3 added the A β -associated proteins based on permutation test.

Enrichment Analysis of Plasma A β -Associated Proteins

To characterize the protein association signals of the plasma $A\beta$ measures, we conducted enrichment analyses using gene set enrichment analysis (GSEA) in the clusterProfiler package

(version 3.16.1) (26). GSEA assesses whether members of a gene set tend to occur toward the top (or bottom) of the effect size distribution of the protein associations. The gene sets tested included those defined by Gene Ontology (GO) terms and pathways in the Kyoto Encyclopedia of Genes and Genomes and Reactome pathway databases (27–29). To summarize the enriched gene sets, we used a weighted set cover algorithm in the sumer package (version 1.1.5) to identify the smallest subset of the enriched gene sets that covers all genes in the enriched gene sets (30).

Tissue enrichment analysis was conducted using the TissueEnrich package version 1.10.1 and gene expression data of 53 human tissues from Genotype-Tissue Expression project version 8 after excluding Epstein–Barr virus–transformed lymphocytes (31). Based on a previous study on the human proteome, we defined tissue-enriched genes as those with at least 5 times higher gene expression in at least one tissue (32). The background gene list for tissue enrichment analysis consists of the intersection of the tissue-enriched genes and the encoding genes of all proteins tested. The input gene lists included the encoding genes of proteins associated with an A β measure at false discovery rate (FDR) < 0.01. *p* value was obtained using hypergeometric tests (33). We considered a gene set with an enrichment FDR < 0.05 and having at least 5 genes in the input list as significant.

Aggregate Association of A β -Associated Proteins in Enriched Gene Sets With Incident Dementia

For the proteins that were in GO terms significantly enriched for A β -association signals, we evaluated the aggregate association of these proteins with incident dementia. Enriched GO terms were separated into 3 groups: nervous system, immune system, and other (Table S4 in Supplement 2). We generated the first principal component (PC1) of the proteins to represent the overall variability using residuals of the protein levels after regressing out eGFR and the 4 probabilistic estimation of expression residuals factors. The association between PC1 and incident dementia was evaluated using the same study population and Cox regression model as in the analysis of incident dementia in ARIC reported above.

RESULTS

Summary Statistics of the Study Population and the A β Measures

At midlife, the mean age was 59 years with 46% men (Table 1). At late life, the mean age was 77 years with 45% men. At both midlife and late life, the proportion of Black participants was 19% (Table S1 in Supplement 2). Participants with higher eGFR had lower $A\beta_{42}$ or $A\beta_{40}$ levels but similar $A\beta_{42}/A\beta_{40}$ levels (Tables S5 and S6 in Supplement 2). The correlations between the $A\beta$ measures were moderate (absolute Spearman ρ ranged from 0.11 to 0.67) (Table S7 in Supplement 2).

Cross-sectional Association of Plasma A β Measures With Circulating Proteins

At midlife, 296 proteins had significant association with 1 or more plasma $A\beta$ measures based on permutation test (160 for $A\beta_{42}$, 279 for $A\beta_{40}$, and 32 for $A\beta_{42}/A\beta_{40}$) (Figure 2A; Figure S3A–C in Supplement 1 and Table S8 in Supplement 2). At late life, 34 proteins had significant association with 1 or more plasma $A\beta$ measures based on permutation test (31 for $A\beta_{42}$, 3 for $A\beta_{40}$, and 4 for $A\beta_{42}/A\beta_{40}$) (Figure 2B; Figure S4A–C in Supplement 1 and Table S9 in Supplement 2). Among the $A\beta$ -associated proteins, only 5 were associated at both midlife and late life (Table S10 in Supplement 2). Table S11 in Supplement 2 reports the quality control information of the $A\beta$ associated proteins. Some of these $A\beta$ -associated proteins have been linked to $A\beta$ pathology, for example, clusterin and TREM2 (34–36). Some have been associated with incident

Table 1. Study Population Characteristics at Midlife (Visit 3) and Late Life (Visit 5)

Variable	Midlife, <i>n</i> = 1955	Late Life, <i>n</i> = 2082
Age, Years, Mean (SD)	59.28 (5.23)	77.19 (5.29)
Male, n (%)	891 (46%)	930 (45%)
Black, <i>n</i> (%)	369 (19%)	403 (19%)
APOE ε4 Carrier, n (%)	561 (30%)	597 (30%)
\geq High School Education, <i>n</i> (%)	1677 (86%)	1788 (86%)
Body Mass Index, kg/m ² , Mean (SD)	28.26 (5.01)	28.44 (5.58)
Hypertension, n (%)	689 (35%)	1533 (75%)
Diabetes, n (%)	204 (10%)	713 (35%)
Current Smoker, n (%)	227 (12%)	87 (5%)
Total Cholesterol, mg/dL, Mean (SD)	208.38 (37.11)	179.34 (41.42)
Prevalent Stroke, n (%)	19 (1%)	102 (5%)
Prevalent Heart Failure, n (%)	54 (3%)	300 (14%)
Prevalent Coronary Heart Disease, n (%)	78 (4%)	342 (17%)
eGFR, mL/min/1.73 m ² , Mean (SD)	88.44 (13.34)	67.62 (17.27)
eGFR <60 mL/min/1.73 m ² , <i>n</i> (%)	37 (2%)	678 (33%)
Aβ ₄₂ , pg/mL, Mean (SD)	29.65 (9.72)	37.74 (11.59)
Aβ ₄₀ , pg/mL, Mean (SD)	166.15 (66.95)	239.56 (87.32)
Αβ ₄₂ /Αβ ₄₀ , Mean (SD)	0.20 (0.11)	0.17 (0.08)

A β , amyloid- β ; eGFR, estimated glomerular filtration rate.



Figure 2. Number of circulating proteins that were significantly associated with levels of the plasma amyloid- β (A β) peptides (A β_{42} [blue], A β_{40} [green], A β_{42} /A β_{40} ratio [orange]) at **(A)** midlife (*n* = 296) and **(B)** late life (*n* = 34).

dementia, for example, NPPB (11). Among the significant Aβassociated proteins, their Spearman correlations with their respective Aβ measures were moderate (median = 0.14, first and third quartile = 0.06 and 0.26) (Tables S8 and S9 in Supplement 2; Figure S5 in Supplement 1).

In the sensitivity analysis controlling for 11 additional covariates, the sample size was 1834 at midlife and 1802 at late life. Of the 296 A β -associated proteins at midlife based on permutation test, 96% (n = 284) were associated with one or more A β measures at regression *p* value < 1.078 \times 10⁻⁵ (Table S12 in Supplement 2). Of the 34 Aβ-associated proteins at late life, 24 were associated with one or more A β measures at late life at regression p value $< 1.078 \times 10^{-5}$ (Table S13 in Supplement 2). In the sensitivity analysis, controlling for additional biomarkers of kidney function, the associations were highly similar (Figures S6 and S7 in Supplement 1). Among 236 participants with dementia at late life, of the 31 A β_{42} associated proteins tested, complement C4A and C4B were associated with Mini-Mental State Examination at $p = 1.45 \times$ 10^{-2} , and 74% (n = 23) had effect estimates consistent with their association with $A\beta 42$ (Table S14 in Supplement 2).

Aβ-Associated Proteins and Incident Dementia in the ARIC Study and the AGES–Reykjavik Study

Next, to shed some light on whether the A β -associated proteins might be correlated with dementia pathogenesis, we evaluated the association of the A β -associated proteins with incident dementia in the overall ARIC cohort. At midlife, of the 296 A β -associated proteins, 33 were associated with incident dementia. Of these, 8 were also associated with incident dementia from the late-life baseline among nonoverlapping cases in ARIC (Table 2; Table S15 in Supplement 2). Higher levels of these 8 circulating proteins were associated with higher risk of incident dementia. For example, THBS2 was associated with a hazard ratio of 1.26 (95% CI = 1.14–1.40) at midlife and a hazard ratio of 1.29 (95% CI = 1.10–1.51) at late life. At late life, of the 34 A β -associated proteins, only C1QTNF3 was associated with incident dementia, and this association was not observed at midlife.

In the replication analysis in AGES (mean age = 76 years, 58% women) (Table S16 in Supplement 2), all 8 dementiaassociated proteins from ARIC had a consistent direction of effect in AGES (p = .01). Three (NPPB, IBSP, and THBS2) were significantly associated with incident dementia in AGES after Bonferroni correction ($p < 6.25 \times 10^{-3} = 0.05/8$) (Table 2; Table S17 in Supplement 2). The associations of IBSP and THBS2 were novel.

Variance of Plasma A β Measures Explained by Key Variables

Demographic variables (age, sex, and race-center) explained similar variance for A β_{42} and A β_{40} at both midlife and late life (4.1%–6.4%) (Figure 3; Table S18 in Supplement 2). Kidney function explained 1.3% of the variances of A β_{42} and A β_{40} at midlife and 9.7% and 12.0%, respectively, at late life. The A β -associated proteins explained 31.9% and 49.4% of the variances of A β_{42} and A β_{40} , respectively, at midlife and 10% or less at late life. The variance of A $\beta_{42}/A\beta_{40}$ ratio explained by demographic factors and kidney function was small (<2%).

Gene Sets Enriched With the Encoding Genes of Aβ-Associated Proteins

At midlife, GSEA detected enriched GO terms for all 3 sets of Aβ-associated signals, including GO terms related to the nervous system, e.g., neuropeptide signaling pathway, synapse organization, and neuron projection development (Figure 4A-C; Tables S19-S21 in Supplement 2). Seven GO terms related to general molecular function were common among the significant GO terms from the 3 sets of Aβ-associated signals (Table S22 in Supplement 2). At late life, the GO terms enriched for A β_{42} -associated proteins were related to the immune system and general cellular processes (Figure S8 in Supplement 1 and Table S23 in Supplement 2). No GO terms were enriched for A β_{40} - or A β_{42} /A β_{40} -associated protein signals. Among all the significant GO terms, only small molecule catabolic process was common between midlife and late life. No gene sets from Kyoto Encyclopedia of Genes and Genomes or Reactome pathways were significantly enriched in the midlife or late-life analyses.

In aggregate, the A β -associated proteins in the GO terms of the nervous system detected by GSEA were associated with incident dementia (PC1 of A β_{42} -associated proteins *p* value 3.94×10^{-2} ; PC1 of A β_{40} -associated protein *p* value 1.94×10^{-2}) (Table S24 in Supplement 2). We annotated some proteins in these gene sets that have been linked to A β pathology by summarizing evidence from the literature (Table S25 in Supplement 2). Tissue enrichment analysis revealed that A β_{42} associated protein signals were enriched in gene expression in the liver at midlife (fold change 1.81, FDR 2.95 $\times 10^{-2}$) and in

			ARIC Midlife	0	ARIC Late Lit	fe	AGES	
JniProt Protein Name	Entrez Gene Name	Seq ID	Hazard Ratio (95% CI)	<i>p</i> Value	Hazard Ratio (95% CI)	<i>p</i> Value	Hazard Ratio (95% CI)	<i>p</i> Value
Vatriuretic Peptides B ^a	NPPB	SeqId_7655_11	1.16 (1.09, 1.24)	$2.41 imes10^{-6}$	1.28 (1.18, 1.4)	$3.58 imes10^{-8}$	1.16 (1.08, 1.24)	$2.84 imes10^{-5}$
3one Sialoprotein 2ª	IBSP	SeqId_3415_61	1.22 (1.12, 1.34)	$1.77 imes 10^{-5}$	1.30 (1.14, 1.48)	$1.15 imes 10^{-4}$	1.23 (1.08, 1.40)	.002
Thrombospondin-2 ^a	THBS2	SeqId_3339_33	1.26 (1.14, 1.40)	$1.52 imes 10^{-5}$	1.29 (1.10, 1.51)	$1.41 imes 10^{-3}$	1.16 (1.05, 1.28)	.003
RNA-Binding Protein EWS	EWSR1	SeqId_12988_49	1.41 (1.21, 1.63)	$8.26 imes 10^{-6}$	1.69 (1.32, 2.16)	$3.70 imes10^{-5}$	1.24 (1.03, 1.49)	.024
Calsyntenin-3	CLSTN3	SeqId_6291_55	1.42 (1.27, 1.58)	5.51×10^{-10}	1.38 (1.18, 1.62)	$7.01 imes 10^{-5}$	1.18 (0.97, 1.42)	.092
Protein ABHD14A	ABHD14A	SeqId_5715_4	1.45 (1.26, 1.67)	$2.44 imes 10^{-7}$	1.48 (1.17, 1.87)	$9.83 imes10^{-4}$	1.15 (0.96, 1.36)	.122
3 Melanoma Antigen 2	BAGE2	SeqId_6294_11	1.43 (1.24, 1.65)	$1.11 imes 10^{-6}$	1.73 (1.37, 2.19)	$5.32 imes10^{-6}$	1.15 (0.96, 1.38)	.127
INF Receptor Superfamily Member 1B	TNFRSF1B	SeqId_8368_102	1.48 (1.22, 1.79)	$7.33 imes10^{-5}$	1.56 (1.24, 1.95)	$1.24 imes 10^{-4}$	1.15 (0.95, 1.39)	.139
Of the 296 proteins asso	ociated with at least on	e Aß measure (Aß	. Aßin, Aßin/Aßin) based o	on permutation	test at midlife (visit 3). 33 w	vere associated	with incident dementia w	ith the midlife

Table 2. Association Between Aeta-Associated Proteins in Midlife and Incident Dementia

Of the 230 proteins associated with a reast one Aprilement of Ap42: Ap4 doubling of the protein levels in RFU.

Aβ, amyloid-B; AGES, Age, Gene/Environment Susceptibility-Reykjavik Study; ARIC, Atherosclerosis Risk in Communities Study; RFU, relative fluorescence unit ^aReplicated in the AGES Study.

Midlife Late life В Α 9.0 0.6 Demographics Kidney function Associated proteins 0.4 0.4 **R**2 **R**2 0.2 0.2 0.0 0.0 **AB42** AB40 AB42/AB40 **AB40** AB42/AB40 **AB42** Plasma amvloid beta measure Plasma amvloid beta measure

Figure 3. Variance of plasma amyloid β (AB) explained by demographic factors, kidney function, and associated proteins at midlife **(A)** and late life **(B)**. Numerical values are reported in Table S18 in Supplement 2.

the spleen at late life (fold change 9.65, FDR 3.95×10^{-4}). The enrichment in the liver was driven by genes involved in lipid metabolism and coagulation and in the spleen by genes related to antibody and antigen function (Table S26 in Supplement 2). No enriched tissues were detected for the A β_{40} - or A β_{42} /A β_{40} -associated proteins at midlife or late life.

DISCUSSION

In this large-scale proteomic analysis of circulating proteins, we identified associated proteins of plasma A β at midlife and late life. Some A β -associated proteins are emerging plasma biomarkers of dementia, including NPPB, clusterin, and TREM2 (11,34,36). Of the 3 A β -associated proteins with replicated evidence for their associations with incident dementia, two (THBS2 and IBSP) were novel. Demographic and peripheral factors, such as kidney function, explained a substantial proportion of the variance of A β_{42} and A β_{40} at late life. Our results extend our knowledge on the associated factors of plasma A β and circulating protein association with incident dementia.

While the clinical use of the plasma A β measures as biomarkers of cerebral amyloidosis is under consideration (2,4,37,38), studies on the peripheral factors associated with plasma Aß are still limited (8,39). In our results, the Aß-associated proteins in midlife and late life had few overlaps. A study on the associations between circulating proteins and cognitive function also reported different associations in midlife versus late life (40). These differences in associations between age groups may be a result of changes in circulating protein levels from midlife to late life (41). The enrichment of tissue gene expression at midlife and late life for the AB42-associated proteins is consistent with the important role of the liver in circulating protein production and lipid regulation and the spleen in immune function (42,43). These results suggest the large number of Aβ-associated proteins at midlife might be partly driven by liver function, which has been reported to influence A β clearance (44,45). The A β -associations during late life might be partly driven by immune response, which is an implicated pathway underlying AD and may be related to chronic inflammation in older age (46).

The proportions of the variance of plasma $A\beta_{42}$ and $A\beta_{40}$ explained by kidney function were substantial in late life. Recently, plasma $A\beta_{42}$ levels were reported to be 1 standard



Figure 4. Gene Ontology terms significantly enriched for amyloid- β (A β)-associated protein signals at midlife based on gene set enrichment analysis. (A) A β_{42} associations. (B) A β_{40} associations. (C) A $\beta_{42}/A\beta_{40}$ associations. Details are reported in Tables S19–S21 in Supplement 2. BP, biological process; CC, cellular component; MF, molecular function.

deviation higher among older adults with chronic kidney disease than those without chronic kidney disease (47). Renal filtration and excretion have been implicated as an organ for the peripheral clearance of A β_{42} and A β_{40} (48). In contrast, the variability of plasma A $\beta_{42}/A\beta_{40}$ in both midlife and late life appeared to have little association with demographic factors and kidney function, which provides an advantage for plasma A $\beta_{42}/A\beta_{40}$ as a biomarker of AD. Our results suggest the need for large studies with diverse populations to evaluate the extent that performance characteristics of the tests using plasma A β might be affected by functions of peripheral organs.

The 3 replicated A β -associated proteins for incident dementia have been linked to vascular risk factors of dementia. NPPB, a hormone mainly expressed by heart muscle, is an established biomarker of heart failure and has been associated with stroke and atrial fibrillation, both risk factors of dementia (49–51). IBSP is a major structural protein of the bone matrix. Its encoding gene was found to be upregulated in stenotic human aortic valves and carotid plaques (52,53). THBS2 is believed to have a role in regulating angiogenesis. Its encoding gene has higher expression in stenotic aortic valves (54). Circulating THBS2 has been reported to be higher among patients with stroke (55). Aberrant angiogenesis has been linked to AD pathology (11,56,57).

Our study has several strengths. We identified a large number of circulating Aβ-associated proteins at midlife and late life. The associations of the Aβ-associated proteins with incident dementia were validated at two time points using nonoverlapping cases in ARIC with some protein associations replicated in AGES. Some limitations warrant mentioning. For characterizing the peripheral influence on $A\beta$ levels, we focused on the kidney and did not have measures of liver function, an important determinant of circulating protein levels. The levels of the circulating proteins were relative measures, which limited our ability to assess changes in protein levels between midlife and late life. The A β assay was not as sensitive as the more recent assays and might have limited our ability to detect associations (37). As a cross-sectional association study of circulating proteins and the A^β peptides, our results cannot infer a causal relationship between the Aβ-associated proteins and A β pathology in the brain. Studies using protein levels in cerebrospinal fluid would likely be more informative of AD pathologies. Our cross-sectional study cannot infer whether any chronic conditions, such as high body mass index, might be upstream factors or consequences of certain circulating protein levels. We did not have the relevant variables to accurately classify subtypes of dementia, such as AD and vascular dementia, to further characterize the association of the A β -associated proteins with dementia. Although the A β measures, particularly $A\beta_{42/40}$, are established biomarkers of AD, these biomarkers are not surrogates for AD diagnosis.

In summary, this cross-sectional association analysis of the plasma A β peptides and circulating proteins identified a large number of A β -associated proteins in midlife and late life and extended our knowledge of the associated proteins of the plasma A β peptides and incident dementia.

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