Brief Report

Heritability Estimates of Endophenotypes of Long and Health Life: The Long Life Family Study

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Background. Identification of gene variants that contribute to exceptional survival may provide critical biologic information that informs optimal health across the life span.

Methods. As part of phenotype development efforts for the Long Life Family Study, endophenotypes that represent exceptional survival were identified and heritability estimates were calculated. Principal components (PCs) analysis was carried out using 28 physiologic measurements from five trait domains (cardiovascular, cognition, physical function, pulmonary, and metabolic).

Results. The five most dominant PCs accounted for 50% of underlying trait variance. The first PC (PC1), which consisted primarily of poor pulmonary and physical function, represented 14.3% of the total variance and had an estimated heritability of 39%. PC2 consisted of measures of good metabolic and cardiovascular function with an estimated heritability of 27%. PC3 was made up of cognitive measures ($h^2 = 36\%$). PC4 and PC5 contained measures of blood pressure and cholesterol, respectively ($h^2 = 25\%$ and 16%).

Conclusions. These PCs analysis—derived endophenotypes may be used in genetic association studies to help identify underlying genetic mechanisms that drive exceptional survival in this and other populations.

Key Words: Heritability—Longevity—Endophenotypes.

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Longevity and preservation of high levels of function with relative lack of disability are complex heritable traits and careful endophenotype development is necessary to maximize the ability to detect meaningful genetic signals (1,2). Endophenotypes comprising linear combinations of correlated physiologic measures may (a) better characterize exceptional survival than single measure traits and (b) improve detection of genes associated with high physical and cognitive function. Furthermore, such endophenotypes may be more useful measures of long life for other areas of clinical epidemiology aiming to identify nongenetic biomarkers or risk factors (3). The goal of this study is to develop heritable endophenotypes in the Long Life Family Study, a National Institute on Aging sponsored

multicentered study of highly functional adults older than 90 years, their siblings, and their offspring.

METHODS

The Long Life Family Study is a family-based cohort study designed to characterize exceptional health well beyond what is expected in the general population. Families were recruited by four collection sites across the United States and Denmark. Family eligibility and ascertainment has been previously described (4,5). At the time of analysis, 480 families, consisting of 3,224 participants (1,228 siblings and 1,996 offspring) from all sites were collected. Spousal controls of the offspring generation were not used

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Table 1. PCA Results for Five Most Dominant Components

	PC1	PC2	PC3	PC4	PC5
	Eigenvalue (% variance explained)				
Domain	4.01 (14.3)	3.33 (11.9)	2.50 (8.9)	2.31 (8.3)	1.73 (6.2)
Cognition					
Animal recall	0.17	-0.07	0.56	-0.09	0.08
Vegetable recall	-0.14	-0.12	0.60	-0.09	0.07
Digit forward	0.06	0.04	0.46	-0.04	-0.20
Digit backward	0.04	0.03	0.56	-0.01	-0.14
Immediate memory	0.00	0.01	0.78	0.06	0.05
Delayed memory	0.01	-0.01	0.78	0.03	0.08
Cardiovascular					
Presence of hypertension	-0.09	0.11	-0.07	0.79	-0.06
Systolic BP	-0.06	0.05	-0.06	0.86	0.08
Diastolic BP	0.14	-0.01	0.00	0.81	0.13
Pulse pressure	-0.17	0.08	0.03	0.17	0.20
Total cholesterol	-0.09	-0.14	-0.04	0.12	0.93
HDL cholesterol	-0.29	-0.56	0.10	0.06	0.15
LDL cholesterol	0.02	-0.07	-0.07	0.10	0.91
Triglycerides	0.05	0.52	-0.08	0.06	0.41
Metabolic					
Presence of diabetes	-0.17	0.59	0.02	-0.04	-0.04
Estimated BMI	0.20	0.66	0.00	0.20	-0.04
Creatinine	0.35	0.21	-0.16	-0.04	-0.05
Glucose	-0.07	0.67	-0.01	0.02	0.05
Glycosylated hemoglobin	-0.19	0.68	0.03	-0.06	-0.02
Waist circumference	0.17	0.68	-0.08	0.14	-0.02
Physical activity					
Average grip strength	0.88	0.14	-0.02	0.09	-0.09
Maximum grip strength	0.88	0.14	-0.02	0.09	-0.09
Gait speed	0.42	-0.20	0.31	-0.03	0.10
Total physical activity	0.42	-0.15	0.31	0.01	0.14
Pulmonary					
Presence of lung disease	-0.15	0.10	-0.02	0.07	-0.11
FEV1	0.85	0.00	0.08	-0.09	0.05
FEV6	0.86	-0.02	0.07	-0.06	0.00
FEV1/FEV6 ratio	0.10	0.07	0.05	-0.14	0.19

Note: Loading variables per PC are presented for each variable. Values in bold indicate the strongest correlations to that particular PC. BMI = body mass index; BP = blood pressure; FEV = forced expiratory volume; HDL = high-density lipoprotein; LDL = low-density lipoprotein; PCs = principal components.

to estimate principal components (PCs) but were included in heritability estimates.

For endophenotype development, 28 measures were chosen based on availability across collection sites and on hypothesized physiologic significance to exceptional survival. Measures included (a) cognitive function: immediate memory, delayed memory, category fluency, and digit substitution forward and backward (6,7); (2) cardiovascular health: presence of hypertension, total cholesterol (milligrams per deciliter), high-density lipoprotein cholesterol (milligrams per deciliter), low-density lipoprotein cholesterol (milligrams per deciliter), triglycerides (milligrams per deciliter), systolic blood pressure (millimeter of mercury), diastolic blood pressure (millimeter of mercury), and pulse pressure (millimeter of mercury); (c) metabolic health: presence of diabetes, blood glucose (milligrams per deciliter), glycosylated hemoglobin, creatinine, body mass index (kg/m²), and waist circumference; (d) pulmonary health: presence of lung disease, forced expiratory volumes (FEV1 and FEV6, milliliters), and FEV1/ FEV6 ratio; and (e) physical functioning: average and maximal grip strength (kilograms), walking speed (meter per second), and total physical activity (8). Variables were continuous and transformed to be normally distributed when necessary. Each variable was adjusted for family generation, which aimed to adjust for the large differences in means and standard deviations between generations, yet retain covariation among variables.

PCs analysis was used to develop endophenotypes of exceptional longevity (9). Simple random sampling of one person per family was repeated 1,000 times, and a matrix of the average correlations across iterations was used to perform factor analysis with principle component factor extraction and varimax rotation (10). The number of dominant PCs was assessed via (a) biologic relevance, (b) percent variance explained, and (c) scree plot evaluation. Biplots were plotted to assess orthogonality. Diagnostic regression analyses were used to assess if variable missingness accounted for any significant component loadings.

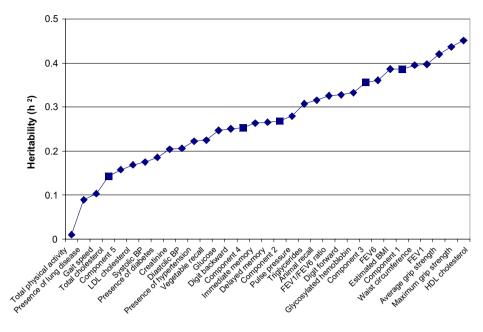


Figure 1. Heritability estimates for individual variables and for five principal components analysis—derived endophenotypes. Diamonds represent heritability estimates for individual trait variables, whereas squares represent heritability estimates for the five most dominant endophenotypes. BMI = body mass index; BP = blood pressure; FEV = forced expiratory volume; HDL = high-density lipoprotein; LDL = low-density lipoprotein.

For subsequent heritability estimation, five component scores were calculated per individual to correspond to each observed dominant PC by standardizing each person's generation-adjusted predictor values and multiplying them by the corresponding eigenvector for each PC.

Heritability scores were then estimated using the ASSOC program in the S.A.G.E. (Statistical Analysis in Genetic Epidemiology, version 5.4.1) statistical package, which calculates the amount of variance due to additive genetic effects divided by the total trait variance. Heritability analyses were adjusted for age, gender, and recruitment site (11).

RESULTS

Eigenvalues and eigenvectors for the five most dominant components are shown in Table 1. Combinations of measures across physiologic domains characterized the most significant PCs. However, as the percent variance decreased, PCs were more likely to be characterized by a single physiologic domain. The most dominant PC consisted of measures of pulmonary, physical function, and metabolic health accounting for 14.3% of the variability in the data set. The second component included metabolic and cardiovascular measures and accounted for 11.9% of variability. The third component was defined solely by cognitive measures and accounted for 8.9% of variability. The fourth component included cardiovascular, specifically blood pressure-related measures, accounting for 8.3% of the variability. Lastly, the fifth component included cardiovascular (lipid-related) measures and accounted for 6.2% of the variance. Missingness for any particular predictor did not seem to significantly affect loadings.

Heritability estimates for 28 individual predictor variables and for the five dominant PC-derived endophenotypes exhibited wide variability (Figure 1). High-density lipoprotein cholesterol, grip strength, FEV1, and waist circumference exhibited the highest heritabilities ($h^2 \ge 0.40$). Overall, individual variables that loaded into any particular PC demonstrated wide ranges of heritabilities; despite these ranges, four of the five derived PCs showed modestly high heritability compared with its components. For example, the seven variables that loaded into PC1 had heritabilities ranging from 0.01 to 0.44. Construction of an endophenotype (PC1) to characterize these variables resulted in a heritability estimate (h_{PC1}^2) of 0.39. Likewise, PC2 was estimated to have a heritability of 0.27, yet was characterized by variables with heritabilities ranging from 0.19 to 0.45. Heritability estimates for PC3 and PC4 were higher than any single loading variable, possibly due to the fact that loading variables for these PCs had more narrow ranges of heritability (h_{PC3}^2 = 0.36 with single variable h_s^2 ranging 0.22–0.33 and $h_{\rm PC4}^2 = 0.25$ with single variable $h_{\rm S}^2$ ranging 0.17–0.22, respectively). Although loadings were strong for PC5, this component demonstrated low heritability ($h_{PC5}^2 = 0.16$).

DISCUSSION

The most dominant PC, made up of pulmonary physical function measures, accounted for 14.3% of the variance and was moderately heritable ($h^2 = 0.39$). Physical function and

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pulmonary health are highly associated at older ages, possibly due to a significant decline in skeletal muscle strength (12). Physically active older adults have reportedly better overall and cardiovascular-related survival compared with sedentary counterparts (13). Respiratory muscle strength has been associated with reduced walking capacity, whereas active older adults have been shown to have greater diaphragm thickness and greater maximal inspiratory and expiratory pressures, suggesting that genes that help maintain muscle function later in life may influence both traits (14–16). Physical function and pulmonary health may also be associated via shared pathways of chronic inflammation (17–19).

The second most dominant PC, characterized by metabolic and cholesterol-related traits, accounted for 11.9% of the variance and had modest heritability ($h^2 = 0.25$). Heritable metabolic phenotypes such as low insulin resistance, absence of obesity, and hyperglycemia have previously been associated with longevity, suggesting that they play an important role in the reduction of overall disease burden (20–22).

PC3 was related to global cognition, accounting for 8.9% of the underlying variance with heritability of 0.36. Reports have estimated that 50%–60% of the variance in cognitive function can be accounted for by genetic differences (23,24). Apolipoprotein E and cholesterol ester transfer protein have been proposed as candidate genes consistently associated with both longevity and memory function (25,26).

Lastly, PC4 was mainly characterized by blood pressure measures, accounting for 8.3% of the variance with an estimated heritability of 0.25. A study of cardiovascular-related risk factors estimated a derived "blood pressure" factors to have heritabilities ranging 0.15–0.27, similar to our estimates (27). Gene variants related to blood pressure regulation, including some in the angiotensin-converting enzyme gene, have emerged as potentially valuable candidates that may influence aging processes (28,29). Genome-wide association studies of blood pressure have identified additional candidate genes that may influence hypertension.

The ability to maintain health and functional status well into older ages is most likely related to interconnected biologic mechanisms that preserve functionality across domains. Findings from these analyses have broader implications. Endophenotypes developed in this study show that combined measures of pulmonary and physical function and of metabolic and Cardiovascular function are important for functional longevity. This preliminary finding may be an indication of pleiotropic effects of combined genotypes among disparate biologic pathways. Validation of these PC-derived endophenotypes to other populations would help further clarify their utility for genetic association analysis of long and healthy life.

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