

Unraveling Genetic Origin of Aging-Related Traits: Evolving Concepts

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Abstract

Discovering the genetic origin of aging-related traits could greatly advance strategies aiming to extend health span. The results of genome-wide association studies (GWAS) addressing this problem are controversial, and new genetic concepts have been fostered to advance the progress in the field. A limitation of GWAS and new genetic concepts is that they do not thoroughly address specifics of aging-related traits. Integration of theoretical concepts in genetics and aging research with empirical evidence from different disciplines highlights the conceptual problems in studies of genetic origin of aging-related traits. To address these problems, novel approaches of systemic nature are required. These approaches should adopt the non-deterministic nature of linkage of genes with aging-related traits and, consequently, reinforce research strategies for improving our understanding of mechanisms shaping genetic effects on these traits. Investigation of mechanisms will help determine conditions that activate specific genetic variants or profiles and explore to what extent these conditions that shape genetic effects are conserved across human lives and generations.

Introduction

THE INCREASES IN LIFE EXPECTANCY in humans worldwide require effective strategies to reduce the burdens of morbidity and extend years of healthy life.^{1–3} Studies of health in long-living people indicate that it is possible to avoid major diseases for long periods of life.^{4–9} Studies of heritability also show that health at old ages and life span can have a genetic origin.^{10–18} Accordingly, yielding insights into genetic predisposition to aging-related traits could be a major breakthrough in addressing the problem of extending health span. Aging-related traits are referred to phenotypes that are characteristic for the post-reproductive period (*e.g.*, diseases of heart, cancer, type 2 diabetes, Alzheimer disease).

Genome-wide association studies (GWAS) have been thought as a breakthrough compared to candidate gene studies to foster progress in the field. Although GWAS indeed have pinpointed genes associated with aging-related traits, the views on GWAS progress¹⁹ range from exciting²⁰ to disappointing,^{21,22} making the picture on the role of genes in health span elusive.

Controversial discussion of GWAS findings is motivated by two major concerns. One is that, unlike the original expectations, GWAS suggest that complex traits are likely controlled by a large number of genes (see, *e.g.*, refs. 20, 21), many of which are of tiny effect.²³ The other is that even a large number of genetic variants discovered by GWAS ex-

plain only a small portion of the genetic variance in a complex trait.^{24,25} Taken together, both of these concerns constitute a serious problem of “missing genetic variance.”²⁶

Different genetic strategies to address this problem are fostered including a more prominent role of rare variants compared to common variants, epigenetics, structural diversity of genome, epistasis, pleiotropy, interactions through different layers of genomic complexity, etc.^{19,23,26–28} It is also suggested that the problem of missing genetic variance can be overblown because standard GWAS strategies have important limitations.^{26,27}

These genetic strategies, however, do not typically address a fundamental problem in genetic susceptibility to aging-related traits—the lack of direct, evolutionary programmed mechanisms linking genes to such traits. This problem implies that genetic determinism (in evolutionary context) in the case of aging-related traits is an implausible concept. The latter becomes particularly important given numerous GWAS evidence on the highly polygenic origin of complex traits, *i.e.*, that such traits can be influenced by a large number of common and/or rare variants.²⁹ This evidence questions the original GWAS hypothesis of common disease–common variants (CDCV)^{30,31} and strengthen the “risk” hypothesis. Unlike the CDCV hypothesis, the risk hypothesis emphasizes the quantitative nature of common traits in the sense that genes rather confer the risks of common traits than cause them³² (originally proposed by Fisher³³).

Paired together, the risk hypothesis and the lack of direct, evolutionary programmed mechanisms highlight four inter-related aspects of the problem of genetic susceptibility to aging-related traits not commonly discussed in genetic literature, including (1) inheritance, (2) evolutionary selection, (3) life-course-related processes, and (4) etiologic complexity.

Inheritance of the Aging-Related Traits

The most plausible explanation of inheritance of common aging-related traits within the framework of Mendelian genetics is when these traits are controlled by a few common variants. In this case, these traits will segregate as in an ordinary case of Mendelian genetics. Having a large number of unlinked disease alleles poses theoretical challenges. Fisher³³ provided a theoretical basis for inheritance of polygenic phenotypes, suggesting that they could be inherited through a mechanism of inheritance of quantitative traits. A key of this mechanism is the concept of allelic equivalence, *i.e.*, that different alleles confer risk of, rather than cause, the same trait.^{33,34} In this sense, common traits are considered as non-Mendelian, whereas the risk alleles still follow Mendelian segregation.³³

The problem is that this basis is plausible mostly for common genetic variants.³² The CDCV hypothesis, however, becomes discouraging²¹ whereas the role of rare variants is promoted.^{35–37} For rare variants there is a fundamental problem of explaining individualized risks of aging-related traits in the context of their inheritance.

Rare variants and individualized risks of aging-related traits

Individualized risks of aging-related traits in a population can be very high. For example, the risk of cardiovascular disease (CVD) in men with an unfavorable risk profile from 45 to 80 years is about 50%,³⁸ *i.e.*, every other man in such a population will develop CVD over 35 years. Similarly, according to the Surveillance Epidemiology and End Results (SEER) Cancer Statistics Review, 1975–2009 (<http://seer.cancer.gov>), men have a 45% lifetime risk of cancer. High-risk groups can have 16% risk of developing type 2 diabetes.³⁹ High individualized risks imply that the person's genome has an adequate number of the rare risk variants. This number will depend on how strong the effect of an individual allele is; the weaker effect is, the larger number of the risk alleles is required to collectively explain high disease risk in a given person.^{35,39–41}

Analyses of biomolecular mechanisms involved in regulation of aging-related traits suggest that these mechanisms are likely associated with genome-wide networks.^{42,43} This implies that the risks of such traits in a given individual should be explained by multiple variants spread throughout the entire genome. Indirectly, this conclusion is supported by the results of recent GWAS. For example, Teslovich et al.²⁰ showed that single-nucleotide polymorphisms (SNPs) at 95 loci spread throughout the entire genome can be involved in regulation of blood lipids and, potentially, diseases of heart.

If individualized risks are conferred by a large number of rare variants spread throughout the entire genome, then we face a principal problem in the framework of Mendelian genetics provided that these variants are not in either genetic or functional linkage. Indeed, suppose we have n rare risk

alleles with minor allele frequency (MAF) of 1%. Following the Hardy–Weinberg principle, the frequency of the minor allele homozygotes in a population is MAF-squared, *i.e.*, 1 of 10,000 individuals will carry both risk alleles. One copy of this allele is carried by 198 of 10,000 heterozygous individuals. Therefore, the most common mode of transmittance of rare risk alleles to progeny in a population is through mating of major allele homozygous and heterozygous parents. In the case of Mendelian segregation, this crossing implies that the number of the risk (minor) alleles in progeny declines in a power law fashion, *i.e.*, 0.5^n , where the base is the Mendelian expectation in this type of crossing. For example, in the case of four alleles, only 6.25% of children of major allele homozygous and heterozygous parents inherit the parental rare risk alleles. This implies that if a large number of rare alleles confer risks of aging-related traits, heritability of these traits should be tiny. This does not comply either with clustering of aging-related traits in families or with large narrow-sense heritability estimates for such traits (*e.g.*, 40% for type 2 diabetes³⁹).⁴⁴

Do rare variants really matter for common aging-related traits?

Thus, transmittance of rare variants in families implies that unless (1) there is a large pool of rare variants in a population with exceptionally strong effects when one or two variants from this pool explain high individualized risks of highly prevalent (*e.g.*, about 30% of all deaths in the United States in 2008 were attributed to diseases of heart and stroke combined and about 23% to cancers⁴⁵) aging-related traits (that essentially resembles the case of Mendelian traits) or (2) the rare variants do not demonstrate “clear Mendelian segregation,”⁴⁰ the leading role of rare variants in common aging-related traits appears to be elusive. Accordingly, common genetic variants should play a more fundamental role in the etiology of aging-related traits. Then, the question is: Why have GWAS results not been so encouraging? The following three sections help in addressing this question.

Genes, Aging-Related Traits, and Evolutionary Selection

Evolutionary constraints are a major theoretical challenge for explaining linkage of genes with aging-related traits. For example, classical evolutionary hypothesis assumes that aging processes and the related traits are a result of a decline in the force of natural selection with age that results in accumulation of mutations.⁴⁶ According to this hypothesis, aging-related traits should be non-adaptive and subject to stochastic variation.⁴⁷ Another widespread hypothesis views aging and its related traits as a result of antagonistic pleiotropy, where the same gene can be favorable for fitness but can confer risks of traits in late life.^{48,49} Aging and the related traits are also viewed as a side effect of the evolutionary programmed mechanism of an organism's development⁵⁰ when genes that are optimized for development become deleterious or fade in the post-maturational period. It is also hypothesized that parents' life span can be an evolutionary factor improving the fitness of children of reproductive age (the so-called grandmother hypothesis⁵¹). Kirkwood and Austad⁴⁷ review other evolutionary hypotheses of aging-related processes.

Neither one of these hypotheses supports deterministic linkage of genes with aging-related traits, including longevity, which could be established by direct evolutionary selection against or in favor of these traits as, *e.g.*, in the case of the program of an organism's development.¹⁷ The word "direct" in this context means that aging-related traits are irrelevant for reproductive success of the same organism. This linkage can, however, be a side effect of evolutionary programmed mechanisms, for example, when fitness factors coincide with the risk factors for diseases. Furthermore, although longevity can indirectly be relevant to the evolutionary advantage of children of long-living parents, life span constraints in the history of humans are an important factor to consider. Indeed, the world record life expectancy (*i.e.*, essentially mean life span) in 1840 was about 45 years for women.⁵² Accordingly, aging-related traits could not even theoretically be a major contributor to mortality, even relatively recently; a major non-violent player during those times was infectious diseases. This poses theoretical constraints on aging-related traits as the driving force of evolutionary programming of their mechanisms. The lack of evolutionary programmed linkage of genes with aging-related traits is a source of issues discussed in the next two sections.

Life Course and Genetics of Aging-Related Traits

A fundamental problem of genetic susceptibility to aging-related traits is two-fold. First, a genetic profile is transmitted from parents to offspring at inception, whereas the risks of these traits sharply increase in late life, *i.e.*, genes and aging-related traits are separated by a large portion of life of an organism (called life course). Second, evolutionary selection did not directly program deterministic mechanisms linking genes with those traits. This two-fold problem, which is typically not in the focus of genetic strategies, implies that processes associated with life course appear to be a key in understanding the effect of genes on aging-related traits (Fig.

1). These processes are a superposition of two major inter-related processes, *i.e.*, the process of intrinsic biological aging (senescence) and dynamic environmental exposures (Fig. 1B). Both of these processes act at the level of individual genes and the level of phenotypes, which are eventually defined by sets of genes.

Senescence primarily contributes to intra-individual variability of genetic effects. This contribution is indirectly seen as a variation of phenotypes with aging, *i.e.*, during an organism's life. For example, decades of biodemographic and gerontological studies provided evidence on changes in various endophenotypes (*e.g.*, the levels of physiological markers,⁵³⁻⁵⁵ bone mineral density⁵⁶), and risks of diseases⁵⁷ and death with age. As long as one believes that aging-related traits have a genetic basis, the observed changes in phenotypic expression over the life course imply that the effects of genes on these phenotypes inevitably have to change with aging. Candidate gene studies support this conclusion by showing the differential role of genes in complex traits at different periods of life.⁵⁸⁻⁶³

An organism's life is accompanied by varying environmental exposures that primarily contribute to inter-individual variability, diversifying genetic heterogeneity at different ages. However, known exposures may not necessarily explain all heterogeneity in genetic susceptibility to aging-related traits. For example, life span of even genetically identical species in an environment controlled for known exposures (*e.g.*, diet, collective behavior, temperature) can still vary dramatically (*e.g.*, see refs. 64, 65). Such evidence is a basis of a hypothesis on a stochastic origin of aging-related traits.⁶⁶ However, stochasticity in this context should be interpreted with great caution because unless we know its fundamental laws (such as, *e.g.*, the Heisenberg uncertainty principle in physics), it can be simply a measure of insufficient knowledge about the mechanisms linking genes to aging-related traits.

The complex role of genes in aging-related traits is one of sources of missing genetic variance. A classical example is

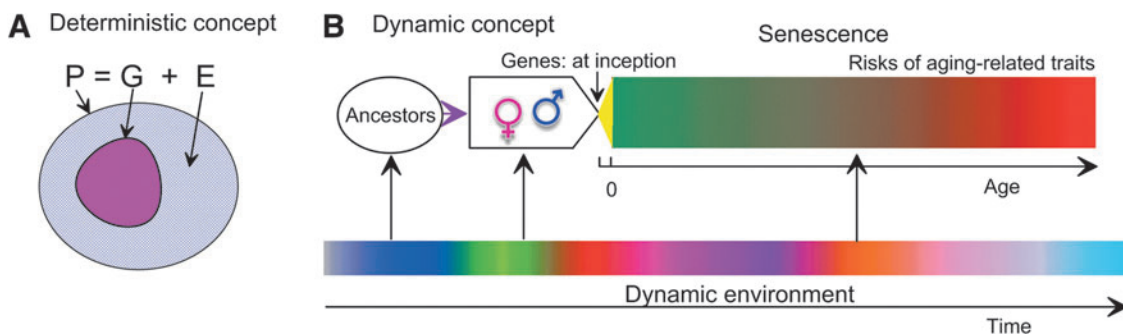


FIG. 1. The role of genes in aging-related traits: Deterministic and dynamic concepts. Currently prevailing strategies traditionally consider genetic susceptibility to aging-related traits in framework of a concept of heritability. This concept assumes that a phenotype (P) can be represented as an additive superposition of genetic (G) and environmental (E) effects (A). Linkage of genes to a phenotype within this concept is implicitly assumed to be of deterministic nature. This concept, however, was developed for reproduction-related phenotypes used in breeding experiments with plants and referred to "the genetic contribution to variance within a population and in a specific environment."¹¹² Extension of this concept to aging-related human traits is, therefore, at best problematic because of: (1) Lack of directly programmed deterministic mechanisms linking genes with those traits and (2) uncontrolled changes in environmental exposures for humans. Given these constraints, B illustrates the dynamic concept when the effects of genes on aging-related traits have to be inevitably shaped by aging-related processes (senescence) in dynamic environment. The role of environment in this concept is through activation of genes at different periods of life and modulation of gene actions over the life course and across generations. Color images available online at www.liebertpub.com/rej

antagonistic pleiotropy (postulated by Williams⁴⁹; examples are provided in refs. 48, 67–71), which can result in underestimation of effects because gene function can be different at different ages (see also the Pleiotropy section, below).

Dynamic concept of genetic susceptibility to aging-related traits and its clinical relevance

The clinical relevance of the dynamic concept (Fig. 1B) is supported by epidemiological and clinical studies showing that aging-related traits develop during a substantial period of life.⁷² This evidence implies that the dynamic component in the effect of genes on aging-related traits should be relatively sustainable, *i.e.*, it should be on a long timescale, comparable with aging-related changes in an organism. Long-term dynamics make this concept feasible for practical implications.

Analysis of the role of life course in genetic susceptibility to aging-related traits addresses an important problem of personalization of medicine and diminishing iatrogenesis (*i.e.*, unintentional harm resulting from medical treatment or advice). Iatrogenesis is a serious problem that can result in losing up to about 100,000 lives each year only in the United States.⁷³

De novo mutations and genetics of aging-related traits

Although new mutations may play a substantial role in genetic diseases,⁷⁴ they are unlikely to play a pivotal role in aging-related traits. This conclusion is based on empirical observations of the extent of recent secular changes in incidence of aging-related traits,²⁷ *e.g.*, incidence of type 2 diabetes doubled from the 1970s to 1990s in the United States,⁷⁵ that are not accompanied by adequate extensions in life span.⁷⁶ Such extensive changes in health can unlikely be explained by the modest rate of *de novo* mutations.⁷⁷ Accordingly, the observed secular changes strengthen the dynamic concept, *i.e.*, that the existing genetic variants with different roles at different periods of life in changing environment should primarily explain susceptibility to aging-related traits across human generations.

Etiologic Complexity of Aging-Related Traits

Trait-specific and systemic mechanisms of gene actions on aging-related traits

The lack of mechanisms of development of aging-related traits directly programmed by evolutionary selection implies that genes can confer risks of such traits through different mechanisms. There are at least two fundamentally different etiologic groups of such mechanisms.¹⁶ One of them is associated with the biochemical genetic basis of a specific aging-related trait (trait-specific mechanisms) and the other with systemic processes of decline in functioning of an organism with age (systemic or aging-related mechanisms).^{16,18,78–81}

Currently prevailing GWAS mostly focus on a group of trait-specific mechanisms. The inherent heterogeneity of aging-related traits is one of the key problems in these studies.^{26,40,82} GWAS typically follow a reductionist approach to overcome this problem, and the basis of this approach is to select more homogeneous sub-phenotypes. For example, one common strategy is to focus on endophenotypes that can be in

a causative pathway to a trait in question.^{83,84} The limitation of this strategy is that endophenotypes can be even more heterogeneous than the trait itself. Accordingly, alleles involved in regulation of endophenotypes may not necessarily be involved in regulation of the downstream trait. Epidemiology explicitly illustrates this limitation. For example, 30.7% of women who have two and more major physiological risk factors for CVD develop this disease between the ages of 45 and 90 years.³⁸ Accordingly, 69.3% of women do not develop this disease at those ages, even though they have those risk factors (these estimates address the problem of death as a competing risk³⁸). Therefore, genes that regulate these risk factors in 69.3% of women in this sample will not affect CVD within their current life span.

Another common GWAS strategy is to more precisely define a trait in question or select its more homogeneous components.⁸² A clear limitation of this strategy is that it does not guarantee etiologic homogeneity because of limited knowledge about etiology of aging-related traits.⁸² Current GWAS following trait-specific mechanisms do not typically address the role of life course in aging-related traits.

Existence of a group of systemic mechanisms is supported by extensive evidence from epidemiology and gerontology studies that highlight health deterioration with aging across not just one but multiple health domains, regardless of population specifics (provided the same levels of populations' development are used). Clearly, such systemic processes should have a genetic basis associated with fundamental changes in intrinsic biology with aging.^{16,18,80,81} This group of mechanisms is not commonly considered in GWAS, although genetic studies of long-living individuals (*e.g.*, centenarians) may reveal such mechanisms. Contrary to the reductionist approach adopted in the trait-specific mechanism, the aging-related mechanism requires systemic approaches to embrace the problem of heterogeneity by focusing on multiple traits. The systemic mechanism naturally accommodates the dynamic concept of genetic susceptibility to aging-related traits (Fig. 1B).

Pleiotropy

The diversity of mechanisms of gene actions on aging-related traits implies that pleiotropy (*i.e.*, the same allele affects multiple traits) should play a fundamental role in genetic susceptibility to such traits. Due to confinement of early GWAS to a specific trait, studies did not typically focus on pleiotropy—for example, quoting Frazer et al.²⁹ from a 2009 *Nature* paper: “A surprising finding of genome-wide association (GWA) studies is that over 15 loci are associated with the risk of developing two or more diseases” (*italic is by A.K.*). Currently, the fundamental role of pleiotropy is more commonly recognized.²³ However, pleiotropy in most GWAS is still considered in terms of the trait-specific mechanisms for causally related traits.⁸⁵ Systemic mechanisms of genetic susceptibility to aging-related traits suggest a more fundamental role of pleiotropy.^{42,43,67,86,87} Pleiotropy is further diversified by the life course processes shaping actions of genes on aging-related traits (Fig. 1B).

As a result of diversity of mechanisms of pleiotropy, the same direction of the effects of the same alleles on different traits may not be generally plausible. Accordingly, the same allele can confer risks to some traits but protect against the

others exhibiting genetic trade-offs.^{29,87–98} Trade-off is a broader concept than antagonistic pleiotropy⁴⁹ because it may not necessarily include fitness traits. Trade-off can be one of the sources of weak genetic signals. For example, trade-offs among upstream traits can result in tiny or no overall effect on a downstream trait, *e.g.*, the same apolipoprotein e4 allele can confer risk for CVD but show a protective effect against cancer that significantly alters estimates for life span.⁸⁷ Clearly, mishandling genetic trade-offs may contribute to iatrogenesis. This is a particularly important issue to consider in newly emerging methods of multivariate genotype–phenotype analyses.^{99,100} Abundance of antagonism in gene actions on aging-related traits is supported by evidence of antagonistic relationships at the phenotypic level (*e.g.*, see refs. 93, 101–104).

The problem of replication

Considering the CDCV hypothesis, GWAS assumed that the true effect of the same genetic variant should be replicated in different populations. However, numerous recent GWAS reports challenge the CDCV hypothesis and strengthen the risk hypothesis.^{32,33} A key concept of the risk hypothesis is a concept of allelic equivalence, *i.e.*, that different alleles confer risk of the same trait. Therefore, a basic GWAS concept of replication of the association of the same allele with the same trait becomes questioned, even in framework of the risk hypothesis. Evolutionary constraints and the derivative problem of the diversity of etiologic mechanisms of aging-related traits further challenge the traditional concept of replication of association at the same variant, with the same allele, in the same direction with the same trait in different populations.

Recognition of this problem^{22,105–107} suggests that alternative strategies are needed. One of them is to use biological evidence for validation.^{108,109} Another strategy could be to use pleiotropy. The latter is plausible because evidence on additive associations of the same genetic variant with different traits reduces the probability of false discoveries of stochastic origin, especially, in framework of systemic strategies.

Conclusions and Implications

Integration of theoretical fundamentals with empirical evidence from different disciplines, including biodemo-

graphy, epidemiology, and gerontology, highlights the inherently complex role of genes in aging-related traits (Fig. 1). Figure 2 summarizes the evolution of conceptual hypotheses of the structure of linkage of genes with such traits based on that integrative view. The complex structure of such a linkage formalized as a dynamic diseaseome (Fig. 2E) requires effective strategies beyond those adopted in currently prevailing studies using genome-wide resources that are unable “to fully describe the architecture of phenotypic variation.”²⁶ Straightforward strategies on “increasing the size of human disease cohorts is likely only to scale the heterogeneity in parallel”⁸² with unclear chances for success.

A major conclusion from the integrative discussion in this paper is that determinism in the linkage of genes with aging-related traits is not supported either by theory or by empirical evidence as a key in the strategies aiming to unravel genetic origin of these traits. As long as such genetic determinism is implausible, one inevitably concludes that the effects of genes on such traits have to be shaped by processes characteristic for the period of life between inception (when genes are transmitted from parents to their children) and expression of those traits (in post-reproductive period) (Fig. 1B). This implies that the key strategy in studies of genetic origin of aging-related traits becomes understanding the role of aging-related processes (including those *in utero*¹¹⁰) in changing environment within and across human generations. The key is to unravel mechanisms that shape genetic effects on aging-related traits but not merely report significant hits. In this regard, next-generation sequencing technologies may substantially extend the scope of the research questions about the nature of genetic mechanisms contributing to regulation of health in late life and life span by highlighting new variations in the human genome at different layers of genomic complexity.¹¹¹

Investigation of mechanisms is aimed at determining conditions that activate specific genetic variants or profiles and exploring to what extent these conditions shaping genetic effects are conserved across specific periods of human lives and across generations. Given the concept of dynamic diseaseome (Fig. 2E), these studies require systemic approaches integrating insights not just on one trait but on a major subset of them. Ideally, these studies should focus on life span, a wide array of aging-related diseases, and wide spectrum of endophenotypes characterizing health-related

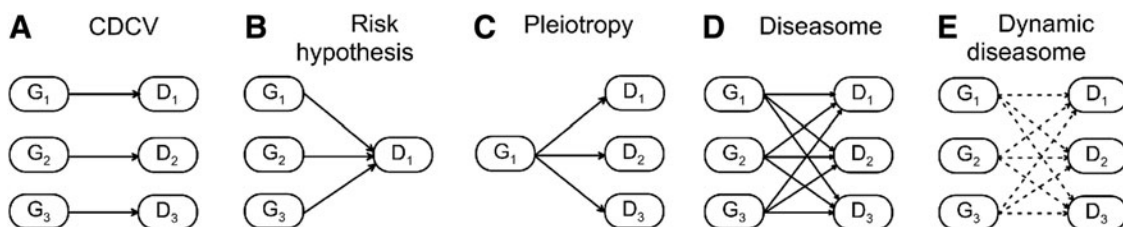


FIG. 2. Conceptual hypotheses of structure of linkage of genes (G) with aging-related traits (D). (A) The basic concept, known as the common disease–common variants (CDCV) hypothesis, adopts linear structure when few genes can influence a given trait. (B) The CDCV hypothesis becomes discouraging whereas the risk hypothesis is strengthened; the risk hypothesis emphasizes the concept of polygenicity (many genes–one phenotype). (C) Recognition of fundamental role of pleiotropy (one gene–multiple phenotypes) in aging-related traits implies that the pleiotropy concept should complement the concept of polygenicity. (D) Superposition of these two concepts constitutes qualitative transition from the linear structure to the net structure formalized as the diseaseome. (E) Recognition of the dynamic concept of genetic susceptibility to aging-related traits (Fig. 1B) leads to the concept of the dynamic diseaseome.

changes occurring over the large portion of individual's life and across different generations. Such data are already available in longitudinal studies of health and aging, including the Framingham Heart Study, the Cardiovascular Health Study, and the Long Life Family Study, among others. Despite the great promise of using rich longitudinal data for systemic analyses of mechanisms of genetic susceptibility to aging-related traits,⁶³ their potential in studies using genome-wide resources is heavily underused. Collection of new longitudinal data for systemic analyses is essential to advancing progress in the field.

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Author Disclosure Statement

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