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## Review





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# Heritability of telomere variation: it is all about the environment!

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Individual differences in telomere length have been linked to survival and senescence. Understanding the heritability of telomere length can provide important insight into individual differences and facilitate our understanding of the evolution of telomeres. However, to gain accurate and meaningful estimates of telomere heritability it is vital that the impact of the environment, and how this may vary, is understood and accounted for. The aim of this review is to raise awareness of this important, but much under-appreciated point. We outline the factors known to impact telomere length and discuss the fact that telomere length is a trait that changes with age. We highlight statistical methods that can separate genetic from environmental effects and control for confounding variables. We then review how well previous studies in vertebrate populations including humans have taken these factors into account. We argue that studies to date either use methodological techniques that confound environmental and genetic effects, or use appropriate methods but lack sufficient power to fully separate these components. We discuss potential solutions. We conclude that we need larger studies, which also span longer time periods, to account for changing environmental effects, if we are to determine meaningful estimates of the genetic component of telomere length.

This article is part of the theme issue 'Understanding diversity in telomere dynamics'.

#### 1. Introduction

Phenotypic variation is the result of both genetic and environmental effects. To understand the causes and consequences of variation in any given trait—as we must to fully appreciate its ecological, evolutionary and health implications we need to determine the contribution of these two components. This is difficult as environmental and genetic effects are complex and intertwined; they include many interacting aspects, e.g. additive, dominant or epistatic genetic effects, and environmental effects that may be variable or constant [1,2]. Quantitative genetics offers an analytical framework to investigate the causes and evolutionary consequences of phenotypic variation, particularly the genetic component. However, it is important to understand that in quantitative genetic analyses we are often measuring relative effects. For example, when determining the heritability of a trait, we are estimating the contribution of genetic effects to the total phenotypic variance observed in that trait within a population (figure 1a). Any change in the influence of the environment upon that trait will alter our estimate of heritability, even when there is no change in the underlying genetic variation. It is, therefore, important to fully understand and take into account environmental effects in any quantitative genetic study [1].

Telomere length (or dynamics) is a phenotypic trait influenced by genetic and environmental effects [3,4]. The basic function of telomeres is to act as a chromosomal cap and maintain the integrity of linear chromosomal DNA [5]. Initial telomere length is inherited [5], but telomeres typically shorten with

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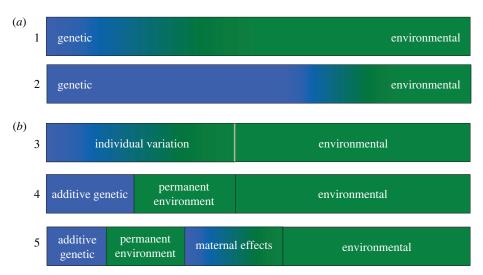


Figure 1. Hypothetical proportion of telomere length variation among individuals explained by genetic (blue) and environmental (green) effects: (a) in a population where individuals experience: (1) highly variable environments versus (2) relatively constant environments; and (b) estimated using mixed models of increasing complexity, based on repeated measures of telomere length per individual: model (3) a mixed model to separate individual variation from environmental (residual) variation, model (4) an 'animal' model where individual variation is separated into additive genetic and permanent environmental effects, and model (5) where maternal identity is included to estimate maternal effects.

age in somatic cells due to the DNA end replication problem during cell division [6] and other factors, most notably damage caused by oxidative stress [7,8]. Oxidative stress is elevated by many environmental factors [7,9] and, as a result, is thought to be why telomere attrition is accelerated by the different stresses experienced during an individual's life [10,11]. Telomere restoration can also occur due to mechanisms such as telomerase activity [12] but telomerase is thought to be downregulated in the somatic cells of many adult organisms [13]. Importantly, critically short telomeres induce cell senescence or death [14,15] and the accumulation of such cells over time has been linked to organismal senescence [14,16]. Telomere length, or rate of attrition, has now been linked to lifespan among species [17,18], and to survival probability and lifespan within many species [19-22], though the causality of this association remains unclear [23,24]. Consequently, understanding which factors determine variation in telomeres is of considerable importance.

From a quantitative genetics perspective, the goal is to determine the contribution of genetic effects to amongindividual variation in telomeres. Only by having accurate estimates of the genetic component of telomere variation can we determine its evolutionary potential [25]. However, individual telomere length at any given point is dependent on three processes: the initial length of the zygote's telomeres, the amount of attrition experienced and the amount of restoration. These processes may all be influenced by both genetic and environmental factors [4,26] and their relative contribution will differ among individuals and change throughout an organism's life. If we are to measure genetic effects accurately we need to ensure that environmental influences are carefully controlled for, either physically or statistically. Laboratory studies can reduce or isolate environmental variation. Such studies provide an excellent way to investigate how specific environmental factors influence telomere length, and provide important insights (e.g. [10,11]). However, if environmental variation is minimized then, by definition, the majority of phenotypic variation will be due to genetic effects and the heritability of the trait will approach 1 (figure 1a). Knowing the heritable component under such conditions is not, in itself, that useful. We need to be able to determine the relative contribution of genetic effects to variation in telomere length, under the conditions in which organisms live naturally, if we are to understand its consequences in terms of their health, ecology and evolution.

Determining when the environment is accelerating telomere attrition is also important in its own right [27,28]. For example, measuring effects linked to habitat quality, early-life environments or captive conditions [10,20,29,30] will provide insight into medical, veterinary, conservation and ecological issues. Such studies can be especially revealing if they allow us to measure chronic effects not detectable through immediate patterns of mortality or body condition, but which have long-term consequences, e.g. pathogen infection [31], stress [11] and environmentally dependent inbreeding [32]. Furthermore, the amount of telomere shortening caused by different environmental effects could provide researchers with a generic currency with which to measure the relative impact of different environmental stressors [30] and thus gain insight into the trade-offs that occur throughout an individual's life [24].

The importance of estimating environmental effects in any quantitative genetics study of telomeres is, therefore, clear. In the rest of the paper, we will first outline two key complications: (i) how environmental effects (and thus estimates of heritability) change over space and time, and (ii) the importance of recognizing that telomeres are not a fixed trait, but can change extensively with age. We then outline specific sources of variation that may impact telomeres, before discussing how these can be included in analyses, what has been analysed to date in vertebrate studies, what problems exist in those studies and finally, how the field can best move forward.

## 2. Genetic and environmental factors contribute to variance in telomere length

Complex phenotypic traits, such as telomere length, are rarely underpinned by a few genes of large effect; rather, they are primarily a result of the action of many genes of small effect [33]. At each locus, effects may be due to additive or dominance effects. Different genes will also impact the resulting phenotype in different ways, i.e. with additive or epistatic actions. These genetic effects could alter telomere length in various ways, such as: initial telomere length in the fertilized egg, individual resistance to telomere attrition or the extent of telomerase expression. Quantitative genetics does not require knowledge of the genes underlying telomere length, or the way in which the genes act. Rather, it assumes that phenotypic traits result from many genes which each have an infinitesimally small, additive effect on the phenotype [34,35]. From an evolutionary perspective, additive genetic variance is of particular interest as it is used to calculate the heritability of the trait, which in combination with the strength of selection on the trait will determine its evolutionary potential [34].

From an environmental perspective, telomeres may be impacted by effects from a wide variety of sources (e.g. natal, population, parental) that may differ in type (e.g. variable, constant). Environmental effects can include both common environmental effects, i.e. that affect a group of individuals experiencing the same environment, and permanent environmental effects, i.e. that have a consistent effect over an individual's lifetime [36]. Population-wide cohort effects [20,32,37] could thus represent common environment effects on individuals from a particular cohort, or permanent environment effects if the effect on a particular cohort lasts over lifetimes. Environmental effects can also include parental effects. Parental effects on telomere length [38] could arise for several reasons, such as: epigenetic effects (e.g. DNA methylation), differential contributions to an egg, parental care effects or as a direct result of local physical conditions provided by the parents. Confusingly, while parental effects act through the environment provided to offspring, they can have a genetic component. For example, provisioning variation between parents can impact offspring telomeres [39] either as a result of environmental effects, e.g. higher food abundance in good territories, or genetically determined differences in parental provisioning behaviour [40].

## 3. Environmental effects change over space and time

Under natural conditions the environment, and thus its impact on telomeres, may change considerably, both spatially and temporally within a population. The best evidence of this is provided by long-term ecological studies. For example, in Soay sheep, Ovis aries [20] and Seychelles warblers, Acrocephalus sechellensis [30] varying environmental conditions during early life generate considerable and long-lasting cohort effects on telomere length (figure 2). The effect of such spatio-temporal variation on quantitative genetic studies of telomere dynamics needs to be considered carefully. If the impact of the environment changes, then the relative amount of telomere variation due to genetic versus environmental effects will differ. This is not error but a real effect we need to understand. To add to this complexity, genotype  $\times$  environment  $(G \times E)$  interactions may occur [41]. For example, certain genetic effects may only be apparent under stressful conditions. Indeed, a recent study found evidence that lower individual heterozygosity due to

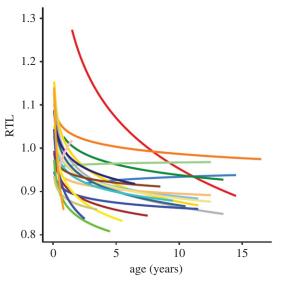


Figure 2. Relative telomere length (RTL) among cohorts in relation to age in Seychelles warblers, Acrocephalus sechellensis. Lines represent fitted values from a linear regression of RTL and log-transformed age. Colours represent birth years (1993 - 2014). Adapted from [30].

inbreeding resulted in faster telomere attrition, but only under poor environmental conditions [32]. Given the above, any estimates of genetic effects on telomere length in natural populations will depend on when and where the study takes place. With this in mind, and taking into account that studies are normally very restricted on a spatial and temporal scale, it may not be surprising if different studies, even on the same species (as seen in humans; table 1), vary greatly in their estimates of genetic effects [56].

## 4. Telomeres are not a fixed trait, but change with age

Telomeres of somatic cells shorten with age in most organisms, with the amount of shortening depending, to a considerable extent, on the stress experienced as the individual interacts with its environment [7,27]. Consequently, even if the environment remains constant the relative influence of the environment on an individual's telomere length will increase with age. Furthermore, rates of telomere attrition may differ across an individual's lifetime, e.g. attrition is normally much greater during development [30,37]. Telomere attrition may also vary considerably across time because of specific life-history events (e.g. reproduction [74]) or environmental experiences (e.g. infection [31]). Studies that have measured longitudinal changes in telomere length generally find a log-linear relationship with age, but with considerable fluctuations within individuals (figure 3), including evidence that an individual's telomere length may increase over certain periods [20,30].

Interactions with the (changing) environment will also mean that the pattern of change will be volatile, difficult to predict and may vary markedly between individuals. Such age-related variation in telomere length must be carefully controlled for-in both the focal individual and the parents-if we want to gain accurate measures of the heritability of telomere length or dynamics. However, few studies have measured telomeres at the same point in life in both offspring and parents [31]. Given that environmental

**Table 1.** Summary of studies estimating narrow-sense heritability ( $h^2$ ) of telomere length (TL) in vertebrates. qPCR, quantitative polymerase chain reaction; TRF, telomere restriction fragments; n.s., not significant; MZ, monozygotic twins; DZ, dizygotic twins.

			Parent and offspring age at	Parental age at conception				
ref.	species	method	sampling controlled for?	controlled for?	Environment controlled for?	statistics	Na	h <sup>2</sup> (95% CI) <sup>d</sup>
[42]	human	Southern blot	yes: twins sampled at 4, 17 and 44	no	yes: shared environment	MZ twins	59	0.78 (0.69 – 0.87)
	Homo sapiens		years			DZ twins	56	0.78 (0.69 – 0.87)
[43]	human	Southern blot	yes: age as a covariate	no	no	linear mixed model (twin	47	0.84
	Homo sapiens					data)		
[44]	human	Southern blot	yes: age-adjusted telomere length	no	telomere length adjusted for	father – son	34	n.s.
	Homo sapiens				smoking	father – daughter	47	1.20
						mother-son	51	0.82
						mother – daughter	71	1.18
						sister – sister	22	1.22
						sister – brother	25	1.42
						brother – brother	23	1.66
[45]	human	Southern blot	0U	no	no	MZ twins (73–79 yr)	89	0.31
	Homo sapiens					DZ twins $(73-79 \text{ yr})$	114	0.54
						MZ twins $(80-94 \text{ yr})$	39	0.34
						DZ twins $(80-94 \text{ yr})$	45	n.s.
						MZ twins $(73-94 \text{ yr})$	128	0.32
						DZ twins $(73-94 \text{ yr})$	159	0.50
			yes: age as a covariate	no	yes: non-shared environment	biometric model (twin	287	0.36 (0.22 – 0.48)
						data)		
[46]	human	Southern blot	yes: age as a covariate	no	no	not stated (sibling data)	383 adults	0.82 (0.59–1.05)
	Homo sapiens						/258 sib pairs	
[47]	human	qPCR	yes: age-adjusted telomere length	yes: adjusted for parental	no	father – offspring	42	1.13
	Homo sapiens			age at birth		father — son	20	1.08
						father – daughter	22	1.21
						mother— offspring	41	n.s.
						mother-son	18	n.s.
						mother – daughter	23	n.s.
								(Continued.)

(Continued.)

Table 1. (Continued.)

			Parent and offspring age at	Parental age at conception				
ref.	species	method	sampling controlled for?	controlled for?	Environment controlled for?	statistics	Na	h² (95% CI) <sup>d</sup>
[48]	human Homo sapiens	Southern blot	yes: age as a covariate	110	yes: shared familial environment	structural equation model (twin data)	1025	0.36 (0.18–0.48)
[49]	human Homo sapiens	₽P.G.	yes: age-adjusted telomere length	00	по	father – son father – daughter mother – son mother – daughter	62 102 63 105	1.12 0.86 n.s. n.s.
			yes: age as covariate	no	yes: environmental risk factors (e.g. age and sex)	'animal' model	907	0.44 (0.32–0.56)
[20]	human Homo sapiens	Southem blot	yes: age-adjusted telomere length	no	yes: shared and individual environment	linear mixed model (twin data)	306	n.S.
[51]	human Homo sapiens	Southem blot	no	<b>n0</b>	OU .	linear mixed model (twin data)	175	0.56 (0.42 – 0.67)
[52]	human Homo sapiens	qРСR	no	DO	OU .	parent — offspring (centenarian parents)	98	0.86
[53]	human Homo sapiens	ф <sup>С</sup> Я.	yes: age-adjusted telomere length	DO	no	father – son father – daughter mother – son mother – daughter grandparent – grandchild	51 47 57 72 85	0.93 0.97 n.s. 0.59 1.09
[54]	human Homo sapiens	фR	yes: age-adjusted telomere length	yes: adjusted for parental age	no	parent – offspring: leukocytes CD34 + cells mononuclear cells buccal cells	not stated	0.90 0.79 1.09 0.74
[55]	human Homo sapiens	фR	yes: age as covariate	00	yes: cohort as covariate	parent – offspring	41	1.32

Table 1. (Continued.)

ref.	species	method	Parent and offspring age at sampling controlled for?	Parental age at conception controlled for?	Environment controlled for?	statistics	N <sub>a</sub>	h² (95% Cl) <sup>d</sup>
[22]	. 4	9,00	den mal anamalat batariles and sour	\$	Š	14:0	1553	
[0c]	IIIIIIIIIII	r P	yes: age-aujusteu telomere rengtii	2	<b>2</b>	spilligs	cccl	0.30
	Homo sapiens					MZ twins	2534	69:0
						DZ twins	2172	1.00
						father – son	791	89.0
						father – daughter	882	99:0
						mother – son	850	0.84
						mother – daughter	1005	0.84
			yes: age as covariate	n0	no	meta-analysis (based on	19 713	0.70 (0.64-0.76)
						estimates from 6 'animal'		
						models)		
[57]	human	фR	yes: age as covariate	no	yes: education, site, smoking,	animal model: all data	4289	0.54 (0.47 – 0.61)
	Homo sapiens				alcohol consumption and	males	1927	0.60 (0.47 – 0.72)
					marital status as covariates	females	2362	0.52 (0.42-0.62)
[28]	human	фPСR	yes: age as covariate	no	no	ʻanimal' model	3587	0.56 (0.50-0.61)
	Homo sapiens							
[26]	human	фPСR	yes: age as covariate	no	no	'animal' model: all data	1079	0.63 (0.35-0.90)
	Homo sapiens					excluding haematological	949	0.76 (0.46-1.05)
						malignancies		
[09]	human	qPCR	yes: gestational age as covariate	yes: matemal age as	yes: shared and individual	structural equation model	162	0.13 (0.00-0.69)
	Homo sapiens			covariate	environment	(twin data)		
[61]	human	qPCR	no	yes: controlled for	yes: controlled for education	father—ADHD offspring	37	1.26 (0.70–1.82)
	Homo sapiens			parental age		mother—ADHD offspring	57	1.12 (0.76–1.48)
[62]	human	Southern blot	yes: age as covariate	no	yes: shared and individual	linear mixed model (twin	652	0.64 (0.39-0.83)
	Homo sapiens				environment	data)		
								(Continued.)

Table 1. (Continued.)

6   Inturnal Mono space   40 CM   10	ref.	species	method	Parent and offspring age at sampling controlled for?	Parental age at conception controlled for?	Environment controlled for?	statistics	Na	h² (95% CI) <sup>d</sup>
Figure 19   Part of the Control of		:							
State   Stat	[63]	human <i>Homo sapiens</i>	qPCR	yes: age as covariate	00	yes: education, site, smoking,	animal model: all data	3040	0.54 (0.47 - 0.61)
Exception   Southern bloot   Southern						alcohol consumption and	fathers & offspring	3404	0.67 (0.58-0.76)
Eather & male originary   1855						marital status as covariates	mothers & offspring	3568	0.61 (0.52-0.69)
Entire S   Famale   2147   Coffson   Coffson							fathers & male offspring	1855	0.65 (0.52-0.79)
Part							fathers & female	2147	0.62 (0.50-0.74)
Purple   Formacy Speins   Formation   Formacy Speins   Formation   Formacy Speins   Forma							offspring		
Puman Hamo sapiers   Precident   Precide							mothers & male offspring	2016	0.57 (0.44-0.69)
Formation   Form							mothers & female	2311	0.53 (0.42-0.63)
Fundamental Adomo Soppiers   QPCR   Yest, age-adjusted telomere length   no   percentation as covariate   vitalization   no   percentation as covariate   vitalization   no   percentation as covariate   vitalization   not stated   vitalization							offspring		
Human Hono sapient   40 Cm   1	[64]	human Homo sapiens	not stated	yes: age-adjusted telomere length	no	no	MZ twins	210	0.88
human Homo sapiers         qPGR         yes: age-adjusted telonere length         no         no         pairwise familial         1780         o           human Homo sapiers         Southern blot         no: bables < 2 week old, and no	[65]	human <i>Homo sapiens</i>	qРСR	yes: age as covariate	no	yes: education as covariate	'animal' model with SNP-	3290	0.28 (0.03-0.53)
Human Homo sapiers   9PG   1983							based relatedness		
butman Hono sopiers         Southern blot         no. babies < 2 week old, and         no         no ther-offspring with blos week and control babies were aged matched         no ther-offspring with blos with	[99]	human Homo sapiens	qPCR	yes: age-adjusted telomere length	no	no	pairwise familial	1780	0.63
human Hono sapiens         Southern blot         no: babies < 2 week old, and mother with babies with Down and nother with babies with Down syndrome (MI) babies with Down syndrome or control babies were aged matched         no babies with Down syndrome (MI) aged matched         Down syndrome (MII) aged matched         186           kakapo, Strjops         Southern blot in the norm of the mother of Spring in the proprints         no but no TL - age correlation in the norm of the mother of Spring in the proprints         no but no TL - age correlation in the proprint is the proprint of the proprint in the pr							correlations		
Monthers with babies were aged matched   Southern blot   Sou	[67]	human <i>Homo sapiens</i>	Southem blot	no: babies $<$ 2 week old, and	no	no	mother—offspring with	106	-0.12 (-0.15 to
saged matched         mother - offspring with aged matched         186           bown syndrome or control babies were aged matched aged matched         bown syndrome (MII) mother - offspring         186           kakapo, Strigops         Southern blot         no: but no TL-age correlation         no         mother - offspring         29         0           habroptilus         mother - daughter         19         10				mothers with babies with Down			Down syndrome (MI)	64	-0.09)
Akapo, Strigops         Southern blot         no: but no TL-age correlation         no         mother - offspring         29         0           habroptilus         mother - offspring         29         0         19         0           habroptilus         mother - offspring         29         0         10         10           habroptilus         mother - offspring         26         1         10				syndrome or control babies were			mother—offspring with	186	-0.13 (-0.16 to
Rakapo, Strigops   Southern blot   no: but no TL-age correlation   no   no   mother-offspring   29   (control group)				aged matched			Down syndrome (MII)		-0.11)
kakapo, <i>Strigops</i> Southern blot no: but no TL-age correlation no no no mother-offspring 29 habroptilus mother-daughter 19 mother-son 10 father-offspring 26 father-offspring 26 father-offspring 26 father-offspring 26 father-offspring 36 father-son 8 sand lizard, <i>Lacerta</i> Southern blot yes: residuals from TL-age no no father-son 40 gills regression 40 father-son 40							mother – offspring		-0.16~(-0.20~to
kakapo, Strigops         Southern blot         no: but no TL-age correlation         no         mother offspring         29           habroptilus         mother daughter         19           mother adughter         10           father offspring         26           father adughter         18           sand lizard, Lacerta         Southern blot         yes: residuals from TL-age         no         no         mother daughter         55           agilis         regression         father son         40							(control group)		-0.11)
habroptilus         mother – daughter         19           mother – son         10           father – offspring         26           father – daughter         18           sand lizard, Lacerta         Southern blot         yes: residuals from IL – age         no         8           agilis         regression         40	[89]	kakapo, S <i>trigops</i>	Southem blot	no: but no TL – age correlation	no	no	mother – offspring	29	0.84
mother – son         10           father – offspring         26           father – daughter         18           father – son         8           sand lizard, Lacerta         Southern blot         yes: residuals from IL – age         no           agilis         regression         father – son         40		habroptilus					mother – daughter	19	n.s.
father – offspring 26 father – daughter 18 father – son 8 sand lizard, Lacerta Southern blot yes: residuals from TL – age no no rother – daughter 55 agilis regression father – son 40							mother – son	10	1.53
father—daughter 18 father—son 8 sand lizard, <i>Lacerta</i> Southem blot yes: residuals from TL—age no no mother—daughter 55 agilis regression 40							father – offspring	26	n.s.
father—son 8 sand lizard, <i>Lacerta</i> Southem blot yes: residuals from TL—age no no mother—daughter 55 agilis regression 40							father – daughter	18	n.s.
sand lizard, <i>Lacerta</i> Southem blot yes: residuals from TL—age no no mother—daughter 55 agilis regression 70 regression 40							father – son	∞	n.s.
regression father – son 40	[69]	sand lizard, Lacerta	Southem blot	yes: residuals from TL – age	no	no	mother – daughter	55	0.52 (0.09-0.95)
		agilis		regression			father – son	40	1.23 (0.80–1.66)

Table 1. (Continued.)

70] collated flycatcher, qPCR yes: nestlings sampled at day 12 no Freedula albiculis   71]   71]   72]   72]   73]   74]   74]   74]   75]   74]   75]   7					Parental age at				
Collared flycatcher, qPCR yes: nestlings sampled at day 12 no Ficedula albicollis  King penguin, qPCR no: chicks measured at day 10, but no parents during brooding paragonicus great reed warbler, qPCR yes: IL measured at days 8–10 no Acrocephalus arundinaceus  zebra finch, TRF yes: log(age) as covariate no Taeniopygia guttata  Taeniopygia guttata  white-throated dipper, qPCR yes: nestling age at sampling as no Ginclus cinclus covariate	ų.	species	method	Parent and offspring age at sampling controlled for?	conception controlled for?	Environment controlled for?	statistics	Na	h² (95% CI) <sup>d</sup>
King penguin, qPGR no: chicks measured at day 10, but no Aptenodytes parents during brooding padagonicus great reed warbler, qPGR yes: TL measured at days 8–10 no Acrocephalus arundinaceus arundinaceus  Zebra finch, TRF yes: log(age) as covariate no Taeniopygia guttata  White-throated dipper, qPGR yes: nestling age at sampling as no Cinclus cinclus  Cinclus cinclus  Covariate  Covariate	0]	collared flycatcher, Ficedula albicollis	qPCR	yes: nestlings sampled at day 12	<b>0</b> U	yes: cross-foster brood triplet	'animal' model with cross-fostered siblings	359	0.09 (-0.04-0.15)
great reed warbler, qPCR yes: TL measured at days 8—10 no Acrocephalus arundinaceus  zebra finch, TRF yes: log(age) as covariate no Taeniopygia guttata  white-throated dipper, qPCR yes: nestling age at sampling as no Ginclus cinclus covariate	-	King penguin, <i>Aptenodytes</i> <i>patagonicus</i>	<b>q</b> PCR	no: chicks measured at day 10, but parents during brooding	00	no	mid-parent — offspring mother — offspring	53 53	0.2 (-0.02-0.42) 0.2 (0.01-0.39)
zebra finch, TRF yes: log(age) as covariate no Taeniopygia guttata  White-throated dipper, qPCR yes: nestling age at sampling as no Ginclus cinclus  Covariate	=	great reed warbler, Acrocephalus arundinaceus	ф <sup>Q</sup> G	yes: TL measured at days 8—10	<b>JO</b>	00	mother – mid-offspring mother – mid-daughter mother – mid-son father – mid-daughter father – mid-daughter	71	1.08 1.12 (0.34–1.90) 1.38 (0.40–2.36) n.s. n.s.
zebra finch, TRF yes: log(age) as covariate  Taeniopygia guttata  white-throated dipper, qPCR yes: nestling age at sampling as  Ginclus cinclus  covariate					yes: matemal age (patemal age had no significant effect)	yes: maternal identity <sup>b</sup>	'animal' model	193	0.48 (0.24–0.72)
white-throated dipper, qPCR yes: nestling age at sampling as  Cinclus cinclus  Covariate	2]	zebra finch, Iaeniopygia guttata	풀	yes: log(age) as covariate	D0	yes: family, matemal or paternal identity no <sup>c</sup>	full-sibling matemal half-sibling patemal half-sibling 'animal' model with cross-fostered siblings	42 8 18 125	1.18 (0.46–1.90) 1.35 (-1.04–3.74) 0.93 (-0.27–2.13) 0.999 (0.87–1.00)
	3]	white-throated dipper, Cinclus cinclus	ф.	yes: nestling age at sampling as covariate	no	no yes: nest and year of birth	mother — mid-offspring father — mid-offspring mother — mid-offspring father — mid-offspring 'animal' model	59 59 59 59	0.44 (0.048–0.83) 0.08 (-0.35-0.51) 0.44 (0.048–0.83) 0.08 (-0.35-0.51) n.s. [0.038 (-0.10-

<sup>a</sup>N: number of relative pairs in regressions or phenotyped individuals in 'animal' models. 95% CI are stated for studies providing these data, or where s.e. was provided this was multiplied by 1.96 to estimate the CI.

<sup>b,</sup>Animal' model including brood identity did not converge.

"Animal" models including parental effects did not converge.

<sup>d</sup>Heritability estimates calculated from parent—offspring regressions (as the slope divided by the coefficient of relatedness) can mathematically be greater than one, whereas heritability is bound between 0 and 1.

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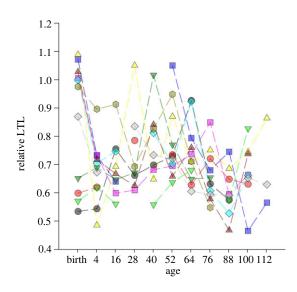


Figure 3. Leukocyte telomere length (LTL) dynamics for 11 female Soay sheep, Ovis aries, measured twice as lambs and at least six further times thereafter during their lives. Each colour and symbol combination represents a different individual. Adapted from [20].

effects are especially pronounced during early development, including prior to birth/hatching [75,76], having measures from the zygote just after conception would minimize environmental effects, but this is clearly not very feasible.

Ironically, even measuring the telomeres of newly conceived zygotes would not eliminate all age-related effects. Although the initial length of an individual's telomeres may largely be determined by genetic factors within the individual, parental effects may also play a role and cause trans-generational effects, e.g. if the age of a parent influences offspring telomere length. The effects of paternal age at conception (PAC) on offspring telomere length have been widely reported in humans, with older fathers having offspring with longer telomeres [56]. The evidence suggests that this is due to sperm from older males having longer telomeres, either because of age-related selection of germline stem cells or the elongation of telomeres because of telomerase activity [77]. Thus, zygotes produced by such sperm from older males have longer telomeres. In other vertebrates, the evidence of PAC effects are mixed, with negative effects detected [69] or not [31], along with positive maternal age effects [31]. However, many studies are cross-sectional, so selective disappearance may result in, or strengthen, positive correlations. Additionally, the environment experienced by the parent may impact on parental age patterns or influence initial offspring telomere length irrespective of parental age [38]. If such non-genetic trans-generational effects do influence initial zygote length they will also confound our measures of telomere heritability unless controlled for.

## 5. Quantitative genetic techniques

Individual variation in telomere length can be decomposed into the relative variance due to genetic and environmental factors using quantitative genetic techniques [34,35]. The extent to which phenotypes are genetically determined (i.e. heritable) is analysed by examining the phenotypic similarity between relatives. Currently, the most commonly applied technique to estimate the heritability of telomere length is univariate regression analysis [72], but key assumptions of this technique are often overlooked. For example, parent-offspring regressions do not always account for repeated measures of parents that have multiple offspring. Most importantly, relatives often live in more similar environments than non-relatives and share common environmental effects, which can result in relatives having similar telomere lengths for reasons other than genetic effects [1]. Unless this environmental similarity is partitioned from the genetic effects, this will severely confound heritability estimates and lead to overestimations. Cross-fostering is a useful tool that facilitates the separation of genetic from environmental effects. In particular, cross-fostering enables better resolution of additive genetic effects, as it allows the separation (via modelling) of the foster (early-life environmental) and natal (genetic and pre-fostering environmental effects) in addition to additive genetic effect.

More sophisticated mixed model techniques allow separation of phenotypic variance into individual and residual variance components (which allows calculation of repeatability [78]), when multiple telomere measures from the same individuals are available (figure 1b, Model 3). These mixed models can then be extended into 'animal' models that use family trees with different types of relatives (grandparentgrandoffspring, aunts-nieces, etc.) to separate the individual variance into genetic and permanent environment (environmental effects that are consistent over an individual's repeated measures) components [36] (figure 1b, Model 4). These variance components can then be used to calculate narrow-sense heritability ( $h^2$ ; the proportion of phenotypic variance due to additive genetic effects). In the simplest form,  $h^2 = V_A/V_P$ , where  $V_A$  is variance due to additive genetic effects and  $V_P$  is phenotypic variance ( $V_P = V_A +$  $V_{\rm PE} + V_{\rm R}$ , where  $V_{\rm PE}$  is permanent environment variance and  $V_R$  is the residual variance that is usually a result of other environmental effects [34,35] (figure 1b, Model 4). If permanent environment effects are not incorporated this will result in inflated heritability estimates [1]. Shared environmental effects, such as maternal, paternal, nest, cohort and spatial effects can also be confounded with other variance components (figure 1b, Model 5), such as  $V_{\rm A}$ if they are not specified separately [1,36].

Quantitative genetic 'animal' models can also be extended to calculate  $G \times E$  or Genotype by Age  $(G \times Age)$  effects, when additive genetic effects vary across environments or with age. A random regression 'animal' model [79] allows the slope of a genotype to vary across an axis of environment or age. For example, this would, when applied to repeated telomere length data over the lifetimes of individuals, allow the testing of whether telomere shortening-rates differ according to genotypes.  $G \times E$  or  $G \times Age$  models require very large sample sizes, but have been run successfully on traits in natural populations [25].

Quantitative genetic techniques primarily assume additive effects of many genes, however, dominance effects such as inbreeding can impact telomere length, as observed in the Seychelles warbler [32]. If dominant effects are not modelled, they can be confounded in other variance components, e.g. increasing both  $V_{\rm A}$  and  $V_{\rm R}$  [80]. However, very large sample sizes, 20× more than that required for estimating  $V_{\rm A}$ , are required to estimate dominance variances accurately [80,81]. Estimation of dominance variance has been undertaken by animal/plant breeders, but is also theoretically achievable in natural populations [82].

#### 6. Past studies

Here we review published studies on the heritability of telomere variation in laboratory and natural vertebrate populations, including humans (table 1). Unravelling the role of genetic and environmental effects on similarity in telomere variation in natural populations is difficult, but potentially most important from an evolutionary and ecological perspective. No clear overall patterns are yet emerging. Some studies have reported significantly higher paternal than maternal heritability of telomere length [49,53,69], the opposite effect [56], X-linked [44], no effect [63,72,73], or have found heritability from mother-offspring but not father-offspring regressions [31,68,71], or the opposite effect [47], but have not tested for a significant difference in slopes. The only clear pattern is that there is extensive variation (from 0 to 1!) in the estimates of telomere length heritability (table 1). Indeed, even within a single species (i.e. humans, the species in which most studies have been undertaken) heritability estimates vary massively. However very few, if any, of the studies undertaken so far are without considerable limitations or

The variation in estimates of telomere length heritability may, to some extent, be attributed to methodological issues. First, many studies apply basic regression analyses [72], with all of the problems that this entails, such as confounding genetic and environmental effects. Using twin studies, as often undertaken in humans (table 1) does not fully resolve this problem (see section 7). Secondly, despite the fact that telomeres change with age (see section 4) studies normally sample parents and offspring at different ages (i.e. as adults and juveniles, respectively), especially in long-lived organisms. Many human studies have attempted to statistically control for parent/offspring age, by including age as a covariate or correcting telomere length for age (but this does not allow for the expected nonlinear relationship), and very few also control for parental age at conception (but see [31,47,54,60,61]). In other species, age has also rarely been fully controlled for (table 1). Clearly, it would be better to sample parents and offspring at the same age (see section 4). One excellent study on great reed warblers that did sample both parents and offspring at the same age (8-10 days) found moderate heritability [31]. All the other non-human studies had shortcomings as they did not control for offspring and parental age at sampling, used an age-adjusted telomere length and/or only included offspring age, and sometimes parental age, as a covariate in the model (table 1). Thirdly, despite the fact that environmental effects can vary spatially and temporally (see section three), few studies have accounted for this in their analyses (table 1). The one study undertaken under controlled laboratory conditions (thus reducing environmental variation) also reduced shared environmental effects through cross-fostering and reported a heritability value of 1 [72]. The very high heritability estimate in this case is perhaps not surprising, because once environmental variation is minimized the rest of the variation must be due to genetic effects. However, heritability estimates taken under such conditions are of minimal use to biologists wanting to understand the evolutionary and ecological significance of telomere variation. Spatio-temporal variation in environmental effects may be particularly important when estimating heritability in species either with long generation times, living in rapidly changing environments, or that exist across a range of different environments. In

humans, it is interesting to consider how much of the variation in heritability estimates may be due to differences in the environments in which the subjects of each study lived. In the case of parent/offspring studies in humans, how much the environment changed between generations may also be very important. One would not expect much correlation between the telomere length of offspring and parents if the two generations developed under very different environmental conditions, even if sampled at the same age. Another important issue in estimating telomere heritability is that 'animal' models are required to separate genetic and environmental effects, and these models require large sample sizes. For example, the seven human studies that applied 'animal' models had sample sizes greater than 900 (table 1), whereas two of the four studies in non-human populations that have used 'animal' models had models that did not converge when environmental effects were included (table 1); with less than 230 phenotyped individuals and the one study that attempted more sophisticated sex-linkage models was severely underpowered [73]. The exact sample size required to separate environmental from genetic effects depends on data structure, but samples of an order of magnitude higher than the norm in previous non-human studies are probably required for meaningful results. Fourthly,  $G \times E$  effects may occur and these have not yet been tested for in any quantitative genetic analyses of telomere length in vertebrate studies. Fifthly, the technique used to assay telomere length may, or may not, include interstitial telomeres (table 1), and it is not known how this affects heritability estimates [72].

The limitations identified in these studies of telomere length will also apply to studies on the heritability of telomere shortening. Currently, the heritability of telomere attrition has only been investigated with twin data [62,84], which has methodological problems [85] (see section 7). Studies that take a  $G \times E$  approach are desperately needed to improve our understanding of the evolution of telomere dynamics.

## 7. Potential solutions and their problems

First, do not use simple parent-offspring or sibling regressions when relatives share environmental components as this will inflate heritability estimates [1]. Even in studies comparing monozygotic and dizygotic twins this can be a problem; the similarity difference between these types of twins is assumed to be attributed to greater genetic similarity of monozygotic twins, however, the environmental similarity of monozygotic and dizygotic twins is rarely the same [85]. Rather, studies carefully measuring both relatedness and environmental similarity across individuals, and then using analytical methods such as 'animal' models [36] to separate genetic from environmental variance components, should be used.

Second, control for the age at which all individuals are sampled (accounting for any measurement effects due to length of storage, extraction or batch differences). Sampling both offspring and adults at the same age will standardize the environmental exposure each party has endured prior to sampling, though clearly the environmental impact could differ for each individual. Sampling all parties as young as possible appears attractive as it should minimize environmental influence. However, there may be situations where it is of interest to measure heritability at different time points. For example, heritability estimates calculated from samples taken from offspring and parents when they are both a given adult age will include more information about the genetic basis of resistance to telomere attrition and/or telomere restoration mechanisms, not just initial telomere length. Measuring how additive genetic variance changes with age is also required to improve understanding of the evolution of senescence [86]. When to sample, therefore, depends very much on what you want to understand.

Third, both physical and analytical means can be used to separate environmental and genetic effects. Cross-fostering can create situations where relatives are raised in different environments. However, individuals will still experience similar environments from conception until cross-fostering, for example, any maternal effects in terms of prenatal investment [1]. Fortunately, in many species a female's offspring may be fertilized by multiple males, often within a single litter/ clutch [87]. Even within socially monogamous species extrapair paternity often occurs [88]. These cases result in offspring from multiple paternal origins, but with the same mother, living under the same conditions and in offspring from the same father but with different mothers, being raised in different environments. These differences provide statistical power to separate genetic and environmental variance components. Indeed, systems where polyandry is frequent and can be combined with cross-fostering at an early stage would provide the most power to resolve effects. Though clearly in some species, e.g. humans, deliberate cross-fostering is not an option!

Although 'animal' models provide analytical solutions to separate variance components, as already stated they do require large sample sizes [89]. The exact sample size required to have sufficient power to detect a given heritability value depends on many factors, including: the number of related individuals in the pedigree, the number of pedigreed individuals that have been phenotyped, the pedigree structure (e.g. pedigree depth, completeness and family sizes) and the confidence with which relationships have been assigned in the pedigree (e.g. have extra-pair paternities been accounted for? [90]). It is, therefore, not possible to provide universal guidelines on the sample size required to detect heritability. Accurate heritability estimates may, in certain cases, be estimable from a hundred individuals [2], however, in most cases, samples of an order of magnitude higher than thisand than used in previous non-human studies—are probably required. Importantly, studies must provide sample sizes of the number of phenotyped individuals in the pedigree, the number of phenotyped individuals with repeat measures and the pruned pedigree size (i.e. where uninformative individuals are removed) to allow basic comparisons between studies. Additionally, given that datasets are so variable, the statistical power with which each dataset can detect heritability of a given value [91] should always be reported. Sensitivity analyses can also be run to investigate the impact of particular errors on parameter estimates [89].

Fourthly, to detect  $G \times E$  or  $G \times Age$  effects, functionvalued trait approaches [92] can be used, or random regression 'animal' models (where the slope of the genotype is allowed to vary over environments [41]). Models need to be built in a hierarchical process, first testing for individual× environment effects and then comparing with a  $G \times E/G \times$ Age model. However, detecting  $G \times E/G \times Age$  requires data from individuals experiencing variable or different environments over their lifetimes and very large sample sizes. Currently, no published study has tested for  $G \times E$ effects of telomere length, although  $G \times E$  and  $G \times Age$ effects have been estimated for other traits in natural vertebrate populations (e.g. [25]).

Finally, a general problem with quantitative genetic studies is a lack of consistency in the way in which parameter estimates are presented [25]. Variance components need to be presented in standard hierarchical models [41] to illustrate the way in which variance components are confounded, depending on model specification (figure 1b). This then facilitates cross-species comparisons. Importantly, all variance estimates, and the confidence intervals around these, should be reported from all of the models run, so that shifts in variance components can be easily compared between models. Furthermore, the inclusion of covariates can alter heritability estimates from 'animal' models, so covariates must be clearly specified [93]. Additionally, measurement error, such as observer bias or batch effect, may need to be controlled for. For example, when measuring telomere lengths using quantitative PCR (qPCR) or telomere restriction fragment (TRF) methods plate or gel effects, respectively, can potentially affect variance components and need to be properly modelled. Once the appropriate models are run, providing a standardized estimate of the additive genetic variance, through a measure of evolvability ( $I_A$ ),  $V_A/\mu^2$ , where  $V_A$  is scaled by the population mean telomere length  $\mu$ , facilitates comparison across populations with different mean telomere lengths, given variation scales with the mean [83].

## 8. Conclusion

Having accurate estimates of the heritability of telomere variation in natural populations is fundamental to our understanding of the evolutionary and ecological importance of telomeres. Environmental effects on telomere length can be complex and extensive and contribute significantly to the lack of clarity and consensus from studies that have attempted to estimate the heritability of telomeres so far. Only by fully understanding the nature and timing of environmental effects, and then controlling for them, can we get accurate and meaningful measures of the heritability of telomere length. While there are many difficulties associated with doing this in natural populations there are potential methodological and analytical solutions. To be successful, future studies need to be carefully designed in terms of sampling individuals and ensuring sufficient power to use these solutions. Finally, future studies must present their sample sizes and results in a standard way to facilitate meta-analyses so we can gain a more universal understanding of the causes and consequences of telomere variation.

Data accessibility. This article has no data.

Competing interests. We declare we have no competing interests.

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### References

- Kruuk LEB, Hadfield JD. 2007 How to separate genetic and environmental causes of similarity between relatives. J. Evol. Biol. 20, 1890-1903. (doi:10.1111/j.1420-9101.2007.01377.x)
- Wilson AJ, Réale D, Clements MN, Morrissey MM, Postma E, Walling CA, Kruuk LEB, Nussey DH. 2010 An ecologist's guide to the animal model. J. Anim. Ecol. **79**, 13 – 26. (doi:10.1111/j.1365-2656.2009.
- Monaghan P. 2010 Telomeres and life histories: the long and the short of it. Ann. NY Acad. Sci. 1206, 130 - 142. (doi:10.1111/j.1749-6632.2010.05705.x)
- Olsson M, Wapstra E, Friesen CR. 2017 Evolutionary ecology of telomeres: a review. Ann. NY Acad. Sci. 350, 569. (doi:10.1111/nyas.13443)
- Blackburn EH. 1991 Structure and function of telomeres. Nature 350, 569-573. (doi:10.1038/ 350569a0)
- Levy MZ, Allsopp RC, Futcher AB, Greider CW, Harley CB. 1992 Telomere end-replication problem and cell aging. J. Mol. Biol. 225, 951-960. (doi:10.1016/ 0022-2836(92)90096-3)
- Zglinicki T. 2002 Oxidative stress shortens telomeres. Trends Biochem. Sci. 27, 339-344. (doi:10.1016/ S0968-0004(02)02110-2)
- Olovnikov AM. 1996 Telomeres, telomerase, and aging: origin of the theory. Exp. Geront. 31, 443 - 448. (doi:10.1016/0531-5565(96)00005-8)
- Costantini D, Marasco V, Møller AP. 2011 A metaanalysis of glucocorticoids as modulators of oxidative stress in vertebrates. J. Comp. Physiol. B **181**, 477 – 556. (doi:10.1007/s00360-011-0566-2)
- Nettle D, Monaghan P, Gillespie R, Brilot B, Bedford T, Bateson M. 2015 An experimental demonstration that early-life competitive disadvantage accelerates telomere loss. Proc. R. Soc. B 282, 20141610. (doi:10.1098/rspb.2014.1610)
- 11. Kotrschal A, Ilmonen P, Penn DJ. 2007 Stress impacts telomere dynamics. Biol. Lett. 3, 128-130. (doi:10.1098/rsbl.2006.0594)
- 12. Greider CW, Blackburn EH. 1989 A telomeric sequence in the RNA of Tetrahymena telomerase required for telomere repeat synthesis. Nature 337, 331-337. (doi:10.1038/337331a0)
- 13. Gomes NMV et al. 2011 Comparative biology of mammalian telomeres: hypotheses on ancestral states and the roles of telomeres in longevity determination. Aging Cell 10, 761-768. (doi:10. 1111/j.1474-9726.2011.00718.x)
- 14. Campisi J. 2005 Senescent cells, tumor suppression, and organismal aging: good citizens, bad neighbors. Cell 120, 513-522. (doi:10.1016/j.cell. 2005.02.003)
- Harley CB, Vaziri H, Counter CM, Allsopp RC. 1992 The telomere hypothesis of cellular aging. Exp. Geront. 27, 375-382. (doi:10.1016/0531-5565(92)90068-B)
- Wong JM, Collins K. 2003 Telomere maintenance and disease. The Lancet 362, 983-988. (doi:10. 1016/S0140-6736(03)14369-3)

- 17. Barrett ELB, Richardson DS. 2011 Sex differences in telomeres and lifespan. Aging Cell 10, 913-921. (doi:10.1111/j.1474-9726.2011.00741.x)
- Dantzer B, Fletcher QE. 2015 Telomeres shorten more slowly in slow-aging wild animals than in fast-aging ones. Exp. Geront. 71, 38-47. (doi:10. 1016/j.exger.2015.08.012)
- 19. Barrett EL. B., Burke TA, Hammers M, Komdeur J, Richardson DS. 2013 Telomere length and dynamics predict mortality in a wild longitudinal study. Mol. Ecol. 22, 249-259. (doi:10.1111/mec.12110)
- 20. Fairlie J, Holland R, Pilkington JG, Pemberton JM, Harrington L, Nussey DH. 2016 Lifelong leukocyte telomere dynamics and survival in a free-living mammal. Aging Cell 15, 140-148. (doi:10.1111/ acel.12417)
- 21. Haussmann MF, Winkler DW, Vleck CM. 2005 Longer telomeres associated with higher survival in birds. Biol. Lett. 1, 212 – 214. (doi:10.1098/rsbl.2005.0301)
- 22. Wilbourn RV, Moatt JP, Froy H, Walling CA, Nussey DH, Boonekamp JJ. 2018 The relationship between telomere length and mortality risk in non-model vertebrate systems: a meta-analysis. Phil. Trans. R. Soc. B 373, 20160447. (doi:10.1098/rstb.2016.0447)
- 23. Simons MJP. 2015 Questioning causal involvement of telomeres in aging. Ageing Res. Rev. 24, 191 - 196. (doi:10.1016/j.arr.2015.08.002)
- 24. Young AJ. 2018 The role of telomeres in the mechanisms and evolution of life-history trade-offs and ageing. Phil. Trans. R. Soc. B 373, 20160452. (doi:10.1098/rstb.2016.0452)
- 25. Charmantier A, Brommer JE, Nussey DH. 2014 The quantitative genetics of senescence in wild animals. In Quantitative genetics in the wild (eds A Charmantier, D Garant, LEB Kruuk), pp. 68-83. Oxford, UK: Oxford University Press.
- Blackburn EH, Epel ES, Lin J. 2015 Human telomere biology: a contributory and interactive factor in aging, disease risks, and protection. Science 350, 1193 – 1198. (doi:10.1126/science.aab3389)
- 27. Monaghan P. 2014 Organismal stress, telomeres and life histories. J. Exp. Biol. 217, 57-66. (doi:10. 1242/jeb.090043)
- Monaghan P, Ozanne SE. 2018 Somatic growth and telomere dynamics in vertebrates: relationships, mechanisms and consequences. Phil. Trans. R. Soc. B 373, 20160446. (doi:10.1098/rstb.2016.0446)
- Bateson M. 2015 Cumulative stress in research animals: telomere attrition as a biomarker in a welfare context? Bioessays 38, 201-212. (doi:10. 1002/bies.201500127)
- Spurgin LG, Bebbington K, Fairfield EA, Hammers M, Komdeur J, Burke T, Dugdale HL, Richardson DS. 2017 Spatio-temporal variation in lifelong telomere dynamics in a long-term ecological study. J. Anim. Ecol. **00**, 1-12. (doi:10.1111/1365-2656.12741)
- 31. Asghar M, Bensch S, Tarka M, Hansson B, Hasselquist D. 2015 Maternal and genetic factors determine early life telomere length. Proc. R. Soc. B 282, 20142263. (doi:10.1098/rspb.2014.2263)

- 32. Bebbington K, Spurgin LG, Fairfield EA, Dugdale HL, Komdeur J, Burke T, Richardson DS. 2016 Telomere length reveals cumulative individual and transgenerational inbreeding effects in a passerine bird. Mol. Ecol. 25, 2949 – 2960. (doi:10.1111/ mec.13670)
- 33. Hill WG. 2010 Understanding and using quantitative genetic variation. Phil. Trans. R. Soc. B 365, 73-85. (doi:10.1098/rstb.2009.0203)
- 34. Lynch M, Walsh B. 1998 Genetics and analysis of quantitative traits. Sunderland, MA: Sinauer Associates.
- 35. Falconer DS, Mackay TF. C. 1996 Introduction to quantitative genetics, 4th edn. Harlow, UK: Longman.
- Kruuk LEB. 2004 Estimating genetic parameters in natural populations using the 'animal model'. Phil. Trans. R. Soc. Lond. B 359, 873-890. (doi:10.1098/ rstb.2003.1437)
- 37. Watson H, Bolton M, Monaghan P. 2015 Variation in early-life telomere dynamics in a long-lived bird: links to environmental conditions and survival. J. Exp. Biol. **218**, 668 – 674. (doi:10.1242/jeb.104265)
- 38. McLennan D, Armstrong JD, Stewart DC, Mckelvey S, Boner W, Monaghan P, Metcalfe NB. 2016 Interactions between parental traits, environmental harshness and growth rate in determining telomere length in wild juvenile salmon. Mol. Ecol. 25, 5425 – 5438. (doi:10.1111/mec.13857)
- Boonekamp JJ, Mulder GA, Salomons HM, Dijkstra C, Verhulst S. 2014 Nestling telomere shortening, but not telomere length, reflects developmental stress and predicts survival in wild birds. Proc. R. Soc. B **281**, 20133287. (doi:10.1098/rspb.2013.3287)
- 40. Adams MJ, Robinson MR, Mannarelli ME, Hatchwell BJ. 2015 Social genetic and social environment effects on parental and helper care in a cooperatively breeding bird. Proc. R. Soc. B 282, 20150689. (doi:10.1098/rspb.2015.0689)
- 41. Nussey DH, Wilson AJ, Brommer JE. 2007 The evolutionary ecology of individual phenotypic plasticity in wild populations. J. Evol. Biol. 20, 831 – 844. (doi:10.1111/j.1420-9101.2007.01300.x)
- Slagboom PE, Droog S, Boomsma Dl. 1994 Genetic determination of telomere size in humans: a twin study of three age groups. Am. J. Hum. Genet. 55,
- 43. Jeanclos E, Schork NJ, Kyvik KO, Kimura M, Skurnick JH, Aviv A. 2000 Telomere length inversely correlates with pulse pressure and is highly familial. Hypertension **36**, 195 – 200. (doi:10.1161/01.HYP.36. 2.195)
- Nawrot TS, Staessen JA, Gardner JP, Aviv A. 2004 Telomere length and possible link to X chromosome. The Lancet 363, 507-510. (doi:10. 1016/S0140-6736(04)15535-9)
- Bischoff C, Graakjaer J, Petersen HC, Hjelmborg BJ, Vaupel JW, Bohr V, Koelvraa S, Christensen K. 2005 The heritability of telomere length among the elderly and oldest-old. Twin Res. Hum. Genet. 8, 433-439. (doi:10.1375/twin.8.5.433)

- Vasa-Nicotera M et al. 2005 Mapping of a major locus that determines telomere length in humans.
   Am. J. Hum. Genet. 76, 147 – 151. (doi:10.1086/ 426734)
- 47. Nordfjall K, Larefalk A, Lindgren P, Holmberg D, Roos G. 2005 Telomere length and heredity: indications of paternal inheritance. *Proc. Natl Acad. Sci. USA* **102**, 16 374–16 378. (doi:10.1073/pnas. 0501724102)
- 48. Andrew T *et al.* 2006 Mapping genetic loci that determine leukocyte telomere length in a large sample of unselected female sibling pairs. *Am. J. Hum. Genet.* **78**, 480–486. (doi:10.1086/50052)
- 49. Njajou OT *et al.* 2007 Telomere length is paternally inherited and is associated with parental lifespan. *Proc. Natl Acad. Sci. USA* **104**, 12 135–12 139. (doi:10.1073/pnas.0702703104)
- 50. Huda N, Tanaka H, Herbert B-S, Reed T, Gilley D. 2007 Shared environmental factors associated with telomere length maintenance in elderly male twins. *Aging Cell* **6**, 709–713. (doi:10.1111/j.1474-9726. 2007.00330.x)
- Bakaysa SL, Mucci LA, Slagboom PE, Boomsma DI, McClearn GE, Johansson B, Pedersen NL. 2007 Telomere length predicts survival independent of genetic influences. *Aging Cell* 6, 769 – 774. (doi:10. 1111/j.1474-9726.2007.00340.x)
- 52. Atzmon G *et al.* 2010 Genetic variation in human telomerase is associated with telomere length in Ashkenazi centenarians. *Proc. Natl Acad. Sci. USA* **107**, 1710 1717. (doi:10.1073/pnas. 0906191106)
- Nordfjall K, Svenson U, Norrback K-F, Adolfsson R, Roos G. 2010 Large-scale parent—child comparison confirms a strong paternal influence on telomere length. Eur. J. Hum. Genet. 18, 385—389. (doi:10. 1038/ejhg.2009.178)
- Wong LSM, Huzen J, de Boer RA, van Gilst WH, van Veldhuisen DJ, van der Harst P. 2011 Telomere length of circulating leukocyte subpopulations and buccal cells in patients with ischemic heart failure and their offspring. *PLoS ONE* 6, e23118. (doi:10. 1371/journal.pone.0023118)
- Al-Attas OS, Al-Daghri NM, Alokail MS, Alkharfy KM, Alfadda AA, McTernan P, Gibson GC, Sabico SB, Chrousos GP. 2012 Circulating leukocyte telomere length is highly heritable among families of Arab descent. *BMC Med. Genet.* 13, 76. (doi:10.1186/ 1471-2350-13-38)
- Broer L et al. 2013 Meta-analysis of telomere length in 19,713 subjects reveals high heritability, stronger maternal inheritance and a paternal age effect. Eur. J. Hum. Genet. 21, 1163 – 1168. (doi:10.1038/ ejhg.2012.303)
- Lee JH et al. 2014 Genome wide association and linkage analyses identified three loci—4q25, 17q23.2, and 10q11.21—associated with variation in leukocyte telomere length: the Long Life Family Study. Front. Genet. 4, 310. (doi:10.3389/fgene. 2013.00310)
- 58. Zhu Y *et al.* 2013 QTL mapping of leukocyte telomere length in American Indians: the strong

- heart family study. *Aging* **5**, 704–716. (doi:10. 18632/aging.100600)
- Blackburn N et al. 2014 A retrospective examination of mean relative telomere length in the Tasmanian familial hematological malignancies study. Oncol. Rep. 33, 25–32. (doi:10.3892/or.2014.3568)
- Bijnens E, Zeegers MP, Gielen M, Kicinski M, Hageman GJ, Pachen D, Derom C, Vlietinck R, Nawrot TS. 2015 Lower placental telomere length may be attributed to maternal residential traffic exposure; a twin study. *Environ. Int.* 79, 1–7. (doi:10.1016/j.envint.2015.02.008)
- Costa DS, Rosa DVF, Barros AGA, Romano-Silva MA, Malloy-Diniz LF, Mattos P, de Miranda DM.
   2015 Telomere length is highly inherited and associated with hyperactivity-impulsivity in children with attention deficit/hyperactivity disorder. Front Mol. Neurosci. 8, 28. (doi:10.3389/ fnmol.2015.00028)
- Hjelmborg JB, Dalgård C, Möller S, Steenstrup T, Kimura M, Christensen K, Kyvik KO, Aviv A. 2015 The heritability of leucocyte telomere length dynamics. *J. Med. Genet.* 52, 297 – 302. (doi:10.1136/ jmedgenet-2014-102736)
- 63. Honig LS *et al.* 2015 Heritability of telomere length in a study of long-lived families. *Neurobiol. Aging* **36**, 2785–2790. (doi:10.1016/j.neurobiolaging. 2015.06.017)
- 64. Sirota M *et al.* 2015 Effect of genome and environment on metabolic and inflammatory profiles. *PLoS ONE* **10**, e0120898. (doi:10.1371/journal.pone.0120898)
- Faul JD, Mitchell CM, Smith JA, Zhao W. 2016
   Estimating telomere length heritability in an unrelated sample of adults: is heritability of telomere length modified by life course socioeconomic status? *Biodemogr. Soc. Biol.* 62, 73 86. (doi:10.1080/19485565.2015.1120645)
- Kobyliansky E, Torchinsky D, Kalichman L, Karasik D. 2016 Leukocyte telomere length pattern in a Chuvash population that experienced mass famine in 1922–1923: a retrospective cohort study. *Am. J. Clin. Nutr.* **104**, 1410–1415. (doi:10.3945/ ajcn.116.138040)
- 67. Bhaumik P, Bhattacharya M, Ghosh P, Ghosh S, Dey SK. 2017 Telomere length analysis in Down syndrome birth. *Mech. Ageing Dev.* **164**, 20–26. (doi:10.1016/j.mad.2017.03.006)
- Horn T, Robertson BC, Will M, Eason DK, Elliott GP, Gemmell NJ. 2011 Inheritance of telomere length in a bird. PLoS ONE 6, e0017199. (doi:10.1371/journal. pone.0017199)
- Olsson M, Pauliny A, Wapstra E, Uller T, Schwartz T, Blomqvist D. 2011 Sex differences in sand lizard telomere inheritance: paternal epigenetic effects increases telomere heritability and offspring survival. PLoS ONE 6, e17473. (doi:10.1371/journal. pone.0017473)
- Voillemot M, Hine K, Zahn S, Criscuolo F, Gustafsson L, Doligez B, Bize P. 2012 Effects of brood size manipulation and common origin on phenotype and telomere length in nestling collared flycatchers. BMC Ecol. 12, 17. (doi:10.1186/1472-6785-12-17)

- Reichert S, Rojas ER, Zahn S, Robin J-P, Criscuolo F, Massemin S. 2014 Maternal telomere length inheritance in the king penguin. *Heredity* 114, 10–16. (doi:10.1038/hdy.2014.60)
- 72. Atema E, Mulder E, Dugdale HL, Briga M. 2015 Heritability of telomere length in the zebra finch. *J. Ornithol.* **156**, 1113–1123. (doi:10.1007/s10336-015-1212-7)
- Becker PJ. J., Reichert S, Zahn S, Hegelbach J, Massemin S, Keller LF, Postma E, Criscuolo F. 2015 Mother-offspring and nest-mate resemblance but no heritability in early-life telomere length in white-throated dippers. *Proc. R. Soc. B* 282, 20142924. (doi:10.1098/rspb.2014.2924)
- 74. Bauch C, Riechert J, Verhulst S, Becker PH. 2016
  Telomere length reflects reproductive effort indicated by corticosterone levels in a long-lived seabird. *Mol. Ecol.* **25**, 5785 5794. (doi:10.1111/mec.13874)
- Haussmann MF, Longenecker AS, Marchetto NM, Juliano SA, Bowden RM. 2012 Embryonic exposure to corticosterone modifies the juvenile stress response, oxidative stress and telomere length. *Proc. R. Soc. B* 279, 1447 – 1456. (doi:10.1098/rspb.2011.1913)
- Noguera JC, Metcalfe NB, Reichert S, Monaghan P.
   2016 Embryonic and postnatal telomere length decrease with ovulation order within clutches. Sci. Rep. 6, 232. (doi:10.1038/srep25915)
- Aviv A, Susser E. 2013 Leukocyte telomere length and the father's age enigma: implications for population health and for life course. *Int. J. Epidemiol.* 42, 457 – 462. (doi:10.1093/ije/dys236)
- 78. Nakagawa S, Schielzeth H. 2010 Repeatability for Gaussian and non-Gaussian data: a practical guide for biologists. *Biol. Rev.* **85**, 935 956. (doi:10.1111/j.1469-185X.2010.00141.x)
- Henderson CR. 1982 Analysis of covariance in the mixed model: higher-level, nonhomogeneous, and random regressions. *Biometrics* 38, 623 – 640. (doi:10.2307/2530044)
- 80. Ovaskainen O, Cano JM, Merilä, J. 2008 A Bayesian framework for comparative quantitative genetics. *Proc. R. Soc. B* **275**, 669–678. (doi:10.1098/rspb. 2007.0949)
- 81. Misztal I. 1997 Estimation of variance components with large-scale dominance models. *J. Dairy Sci.* **80**, 965–974. (doi:10.3168/jds.S0022-0302(97) 76021-1)
- 82. Wolak ME, Keller LF. 2014 Dominance genetic variance and inbreeding in natural populations. In *Quantitative genetics in the wild* (eds A Charmantier, D Garant, LEB Kruuk), pp. 104—127. Oxford, UK: Oxford University Press.
- 83. Houle D. 1992 Comparing evolvability and variability of quantitative traits. *Genetics* **130**, 195 204.
- 84. Wojcicki JM, Shiboski S, Heyman MB, Elwan D, Lin J, Blackburn E, Epel E. 2016 Telomere length change plateaus at 4 years of age in Latino children: associations with baseline length and maternal change. *Mol. Genet. Genomics* 291, 1379 1389. (doi:10.1007/s00438-016-1191-2)
- 85. Pam A, Kemker SS, Ross CA, Golden R. 2014 The 'equal environments assumption' in MZ-DZ twin

- comparisons: an untenable premise of psychiatric genetics? AMG Acta Genet. 45, 349-360. (doi:10. 1017/S0001566000000945)
- 86. Wilson AJ, Charmantier A, Hadfield JD. 2008 Evolutionary genetics of ageing in the wild: empirical patterns and future perspectives. Funct. Ecol. 22, 431-442. (doi:10.1111/j.1365-2435.2008.
- 87. Burke T, Bruford MW. 1987 DNA fingerprinting in birds. Nature **327**, 149-152. (doi:10.1038/327149a0)
- 88. Griffith SC, Owens IPF, Thuman KA. 2002 Extra pair paternity in birds: a review of interspecific

- variation and adaptive function. Mol. Ecol. 11, 2195 -2212. (doi:10.1046/j.1365-294X.2002.01613.x)
- 89. Morrissey MB, Wilson AJ, Pemberton JM, Ferguson MM. 2007 A framework for power and sensitivity analyses for quantitative genetic studies of natural populations, and case studies in Soay sheep (Ovis aries). J. Evol. Biol. 20, 2309-2321. (doi:10.1111/j. 1420-9101.2007.01412.x)
- 90. Charmantier A, Réale D. 2005 How do misassigned paternities affect the estimation of heritability in the wild? Mol. Ecol. 14, 2839 – 2850. (doi:10.1111/j. 1365-294X.2005.02619.x)
- 91. Morrissey MB, Wilson AJ. 2010 PEDANTICS: an R package for pedigree-based genetic simulation and pedigree manipulation, characterization and viewing. Mol. Ecol. Resour. 10, 711-719. (doi:10. 1111/j.1755-0998.2009.02817.x)
- 92. Stinchcombe JR, Kirkpatrick M. 2012 Genetics and evolution of function-valued traits: understanding environmentally responsive phenotypes. Trends Ecol. Evol. 27, 637-647. (doi:10.1016/j.tree.2012.07.002)
- 93. Wilson AJ. 2008 Why  $h^2$  does not always equal  $V_A$ / V<sub>P</sub>? J. Evol. Biol. 21, 647-650. (doi:10.1111/j.1420-9101.2008.01500.x)