

Review





## Individual differences in adolescent self-control: The role of gene-environment interplay

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Self-control – the ability to alter unwanted impulses and behavior to bring them into agreement with goal-driven responses – is key during adolescence. It helps young people navigate through the myriad challenges they encounter while transitioning into adulthood. We review empirical milestones in our understanding of how individual differences in adolescent self-control exist and develop. We show how the use of molecular genetic measures allows us to move beyond nature versus nurture, and actually investigate how both nature *and* nurture explain individual differences in self-control. By highlighting the role of gene-environment correlations and geneenvironment interactions, this paper aims to enthuse fellow researchers, with or without a background in genetics, to apply genetically sensitive designs too.

#### Addresses

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### Introduction

Adolescence presents a variety of self-control challenges. For instance, adolescents must complete their homework while resisting the lure of social media. They

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need to adhere to rules set by parents, schools, and society, even as they seek greater autonomy. They might face temptations to experiment with alcohol or cigarettes, despite understanding the risks of addiction. Additionally, they must manage their emotions while navigating uncertainties about their future, including concerns about climate change [1–4]. Self-control helps adolescents navigate such challenges. Self-control is an umbrella construct that contains many facets, such as the ability to regulate thoughts, emotions, and behavior to reach a certain goal [5].

Adolescents differ in their self-control capacities. These individual differences, in turn, have been associated with myriad behavioral and relational outcomes throughout adolescence and beyond. For example, studies investigating between- and within-person differences in self-control across adolescence show that lower self-control is associated with deviance [6], mental health problems [7], educational attainment [8], and problematic social media and phone use [4,9]. The association between self-control and (mental)health extends into middle and later adulthood, with adolescents with lower self-control being less able to cope with the range of later-life health, financial, and social demands of adulthood [10-12].

Across disciplines, researchers focus on identifying factors and mechanisms that explain how individual differences in self-control exist and develop during childhood and adolescence. On the one hand, individual differences in self-control arise through interactions with adolescents' proximal environments such as with their families, peers and teachers at school [13]. Positive parenting strategies (e.g. warmth, autonomy, consistent discipline) help adolescents internalize social rules and develop self-control. In contrast, negative parenting strategies (e.g. inconsistent discipline, conflict, negative control) deprive youths of the opportunity to develop self-control independently and may create stressful environments that hinder their ability to self-regulate. A meta-analysis of 191 studies showed that a wide array of parenting dimensions are associated with adolescents' self-control [see Table 1 in Ref. 13]. Chen and colleagues applied cross-lagged models to longitudinal meta-analytic data and found that parenting is longitudinally associated with adolescent self-control, and adolescent self-control is also longitudinally associated with parenting, showing that adolescents are active agents in their own self-control development as they also steer the way they are being parented [14].

On the other hand, individual differences in adolescent self-control are explained by their genetic make-up. Recently, a longitudinal study showed that the heritability of self-control increases from 48% in early adolescence to 76% in young adulthood [15]. This indicates that genetic factors increasingly play a role in explaining the individual differences in adolescent's self-control.

Individual differences in self-control arise from the intricate interplay *between* genetic and environmental factors rather than solely attributed to one *or* the other. Failure to account for gene-environment interplay results in misestimation and misinterpretation of any main effect, whether conceptualized as "genetic" or "environmental" [16]. Until recently, studying gene-environment interplay was limited to family studies. While these designs are powerful, they require access to specific data (e.g., twin studies). Rapid innovations in molecular genetic techniques and the ever-decreasing cost of genotyping are enabling various social scientists interested in self-control (e.g., psychologists, economists, criminologists) to study gene-environment interplay by incorporating molecular genetic measures into their studies [17].

As a result of these technical developments, we are at a new crossroads in science, moving beyond the "nature *versus* nurture" debate by integrating genetic data into social sciences. In this paper, we therefore focus on gene-environment interplay perspectives as they allow us to investigate how "nature *and* nurture" influence individual differences in behavior, transcending many developmental models (e.g., ecological systems theory, general theory of crime, social learning theory [5,16]). In Box 1 we provide an overview of key terms used in this paper.

## Molecular genetic studies of self-control

While twin studies offer insights into estimates of genetic contributions to phenotypic variance (heritability), molecular studies examine the specific genetic variants associated with an outcome of interest. Genome-wide association studies (GWAS) have become the preferred method for scrutinizing the genetic landscape because they look at associations between a multitude of genes and outcomes across the genome, considering the complexity of the trait [17].

Recently, numerous GWAS have been published for traits, behaviors, or abilities that underlie self-control

capacities such as self-regulation, impulsive personality, attention-deficit/hyperactivity disorder (ADHD), risk-taking, delay discounting, non-cognitive skills, and executive functioning [18–24]. The nomenclature and interest in specific self-control capacities vary across disciplines, which is also reflected in the inclusion of different or overlapping traits in GWAS. Despite these variations, there is genetic overlap among divergent measures, suggesting that albeit conceptually distinct, genetic scores based on GWASs of self-control traits are broadly applicable across different conceptualizations and measures of self-control [25–27].

These GWAS can in turn be used to create polygenic scores which summarize the association across a multitude of genetic variants into a single genetic score for each individual. This score is not something innate or unchangeable, it rather says something about someone's genetic propensity for a certain trait. The strong push for open access data within genomic research and initiatives such as the Polygenic Index Repository have made these polygenic scores available in a wide range of publicly available datasets [28]. Accordingly, more and more social scientists are investigating geneenvironment interplay in adolescence including such polygenic scores. This particularly opens up broad opportunities to understand adolescent self-control, as adolescence is a crucial period where self-control differences become increasingly apparent and potentially have a lasting impact on later life.

# Gene-environment interplay: gene-environment correlation

One way to understand the interplay between genes and environment is through gene-environment correlations (rGE; often categorized as passive, evocative and active gene-environment correlation). Passive geneenvironment correlation occurs when parental genotype correlates with the genotype of their child and the environment they create. For example, parental genetic propensity for self-control partly explains the way they parent (path b, Figure 1) and individual differences in their adolescent self-control because of the genetic propensity they transmit to their children (path a, Figure 1). As such, the observed association between certain parenting styles and self-control (path d, Figure 1) during adolescence is not 'purely environmental', as it is influenced by the genetic make-up of parents which influences their environment and their children's genetic make-up. Via this 'double (dis) advantage' the genotype and environment are correlated [29].

Agnew-Blais and colleagues found evidence for such passive-gene environment correlations in a longitudinal adolescent cohort including polygenic scores [30]. They found that mothers' polygenic score for ADHD was

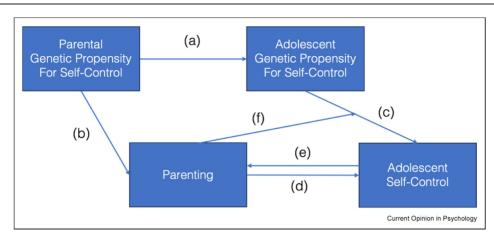
Box 1	. Overview of	some of th	e kev terms	used in	this paper
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Concept	Explanation
Gene-environment correlation	Gene-environment correlation occurs when an individual's genetic
	predispositions is correlated to certain environments. This is often categorized as:
	Passive gene-environment correlation occurs when a child's environment is
	influenced by their parents' own genetic characteristics, which the child also
	inherits. Since the parents provide both the genes and the environment, the
	child passively receives environments that are correlated with their genetic
	predispositions. For example, parents who are genetically disposed to low
	self-control may create a more chaotic household. The child inherits the
	genes that predispose them to have low self-control, and they also grow up in
	an environment that hampers their self-control development, leading to a
	correlation between their genetic disposition and their environment.
	Evocative gene-environment correlation occurs when an individual's genetic
	disposed trait elicits specific responses or reactions from their environment
	For example, an adolescent with a genetic predisposition for low self-control
	might evoke more family conflict, which can further influence their self-contro development.
	Active gene-environment correlation occurs when individuals seek out or
	create environments that match their genetic predispositions. For example
	an adolescent with a genetic predisposition for low self-control might active
	choose to engage with people who have the tendency for risk taking
	behavior, thereby shaping their own environment in a way that reinforces
	their self-control abilities.
Gene-environment	Gene-environment interaction refers to the phenomenon where the effect of
interaction	a person's genetic make-up on a trait is influenced by their environmental
	context. In other words, the impact of genetic factors on a trait can vary
	depending on environmental conditions, and the influence of the
	environment can depend on an individual's genetic predisposition.
GWAS	A GWAS, or Genome-Wide Association Study, is a research method used to
	find genetic variants linked to specific traits (such as self-control).
	Researchers compare genetic differences between people with and without
	the trait or condition, aiming to find variations like single nucleotide
	polymorphisms (SNPs) related to this trait. GWAS have become the
	preferred method for scrutinizing the genetic landscape, because they look a associations between genes and outcome across the genome, taking into
	account the complexity of the trait (cf. a multitude of genes associated with
	trait rather than a specific number of genes in candidate gene studies).
Genotype	A genotype refers to the genetic makeup of a person.
Phenotype	A phenotype is a trait or characteristic, like self-control. It's not something that
	comes directly from your genes or from your environment alone. Instead, i
	results from how your genes and environment interact with each other.
Polygenic score	A polygenic score summarizes the association across a multitude of geneti
	variants with a trait based on a GWAS into a single genetic score for each
	individual.

significantly associated with more chaos in the household (see path b, Figure 1), which in turn was associated with more self-control problems in their adolescents (path d, Figure 1). This suggests that the environment associated with adolescent self-control problems (household chaos) is partly influenced by parents' own genetic propensity for lower self-control, which they also transmit to their children because they share half of their genes (path a, Figure 1). The association between certain parenting styles and adolescent self-control is thereby not necessarily causal, as both can be influenced by parent and children sharing the same genes that influence both the home environment (e.g., household chaos) and behavior (e.g., low self-control). Claims of causal effects of parenting on adolescent outcomes are clouded by failure to account for this genetic transmission [29].

Evocative gene-environment correlation occurs when adolescent genetically predisposed self-control evokes certain environmental influences. For example, Ksinan and colleagues showed that genetic scores for risk taking





Simplified schematic overview of possible pathways of gene-environment correlations (rGE) and gene-environment interactions (G × E).

**Passive gene-environment correlation** occurs when a parent's genetic propensity is transmitted to their adolescent child (*path a*) and influences the way they parent (*path b*) which simultaneously influences the adolescent's actual level of self-control (*path c* and *d*).

Evocative gene-environment correlation occurs when an adolescent's genetic propensity for self-control influences their actual level of self-control (*path c*) which in turn evokes specific parenting responses (*path e*).

Gene × Environment interaction occurs when adolescent genetic risk is associated with lower self-control, and this effect is moderated by home environment (e.g., parenting, see path f).

*Note:* This is a simplified and schematic model which, for illustration purposes, does not include active rGE nor other possible gene-environment interplay mechanisms such as dynastic effects [45] or genetic nurture effects [46].

and impulsivity were associated with more self-control problems in adolescents (path c, Figure 1) which were also associated with less maternal closeness (path e, Figure 1) [31]. Similarly, de la Paz and Agnew-Blais and colleagues showed that polygenic risks for ADHD were associated with lower self-control (path c, Figure 1) and predicted lower levels of parental involvement and higher levels of poor supervision, inconsistent discipline and household chaos across adolescence (path e, Figure 1) [30,32]. Additionally, Kretschmer and colleagues found that polygenic risk for self-regulation problems was associated with adolescent self-control problems (path c, Figure 1), which was associated with family dysfunction (path e, Figure 1) [33]. Together, this suggests that adolescents with a genetic propensity of lower self-control are more likely to elicit certain environments, which in turn could exacerbate individual differences in self-control. For example, an adolescent who is genetically predisposed to show lower selfcontrol is more likely to elicit less parental warmth, which in turn may hamper the possibility to further learn how to regulate impulses, emotions, and thoughts. This illustrates how genetic and environmental factors can buffer or amplify each other's effects, influencing the development of self-control over time [16].

Active gene-environment correlation describes the association between a person's genetically influenced trait and the environment they select. Adolescents with higher genetic scores for impulsivity or risk-taking are potentially more likely to select certain jobs over others (e.g., become entrepreneurs, [34]), choose specific friends or partners, which may shape their levels of impulsivity and risk-taking later in life [35,36], or choose certain life experiences to develop themselves (e.g., going on a world trip or moving to a different city, instead of staying in their hometown). More research is needed to investigate this in genetically sensitive designs, especially for more positive life trajectories as most studies focus on negative outcomes and trajectories.

## Gene-environment interplay: gene-environment interaction

Another way to understand the intrinsic interplay between genes and environment is through geneenvironment interaction (G x E). This describes the process where certain people with different genotypes vary in their sensitivity to the environment (e.g., differential susceptibility model [37]). It is hypothesized that adolescents with genetic propensity for lower selfcontrol who experienced a high number of environmental risks (e.g., family violence or maltreatment) may be at the highest risk of actually developing lower selfcontrol (see path f in Figure 1, and Figure 2).

Leffa and colleagues found evidence for G x E. They showed that a composite of environmental risks (family socio-economic conditions and prenatal stressors) and polygenic score for ADHD are predictive of lower selfcontrol, respectively [38]. Additionally, they found a significant interaction effect, suggesting that those who

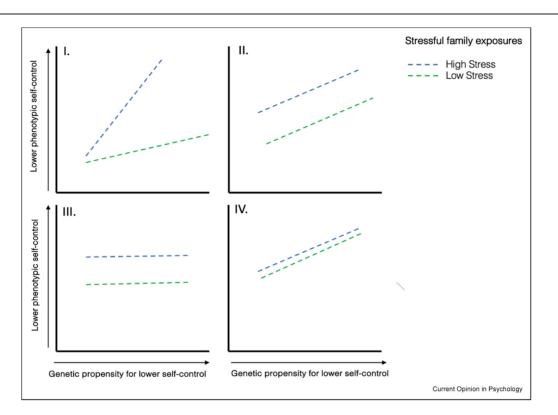


Illustration of different patterns on the relationship between genetic propensity for self-control problems and stressful family exposures on individual differences in adolescent self-control [47].

Panel I shows one possible type of gene-environment interaction as posited differential susceptibility model [37], where those who both experienced stressful family exposure and have a higher polygenic score show elevated self-control problems. Panel II shows a significant effect of both stressful family exposure and genetic propensity on self-control. Those who experienced more stressful family exposure show lower self-control, and those who have higher polygenic scores show lower self-control. This does not indicate an interaction effect, as the joint effects of genetic and environmental risk factors are not significantly greater than the sum of the separate effects. Panel III shows a significant effect of stressful family exposure on adolescent self-control, with individuals who experienced more stress showing lower self-control. There are no effects of genetic propensity for low self-control on actual self-control. Panel IV shows a significant effect of genetic propensity on self-control. There are no effects of stressful family exposure on self-control. There are no effects of stressful family exposure on self-control.

Note: Other gene-environment interactions are possible, e.g. buffering effect which are not illustrated here.

have genetic propensity for low self-control *and* experienced a high number of environmental risks are at an amplified risk of actually developing low self-control in adolescence (support for panel I, Figure 2).

Other studies focusing on G x E on self-control in adolescents do find main effects of family stress and genetic propensity, but do not find evidence for G x E effects (support for panel II, Figure 2). For example, He and Li, and Ksinan showed that maltreatment and polygenic score for impulsivity independently predicted lower self-control in adolescents [31,39]. However, no interaction effect between maltreatment and genetic risk was found. Similarly, Mooney and colleagues looked at the effect of family conflict and polygenic scores of ADHD on self-control problems in adolescents, not finding consistent G x E effects across cohorts [40]. Østergaard and colleagues looked at parental unemployment, finding main effects but no significant G x E effects when including polygenic scores [41]. Together, these findings show that genetic risk and environmental risk explain low self-control, but there is no amplifying effect of the environment on this genetic risk. This mirrors the null effects for G x E on self-control in adults [42].

#### **Opportunities for future research**

More social scientists are encouraged to incorporate molecular measures to study how nature and nurture shape behavior. So far, most studies focus on crosssectional data or data over short developmental periods, with little consideration of how polygenic scores may longitudinally contribute to self-control via accumulating mechanisms [16]. One way forward would be to investigate how polygenic scores predict self-control from early to late adolescence, something that is more commonly applied in educational sciences [43]. Research on rGE and G x E has typically focused on family-level environments, but broader sociocultural interactions are also important for shaping self-control. The null findings of G x E could perhaps be explained by its effect being dependent on larger societal processes, such as economic shocks or the COVID-19 pandemic, rather than just family-level effects. Recent research shows G x E effects on polygenic scores for educational attainment in individuals growing up in former East versus West Germany [44]. Applying similar studies to self-control would be interesting and feasible.

Integrating gene-environment designs into social science research offers the exciting opportunity to 1) understand how genetic and environmental factors shape self-control over the lifespan, and 2) investigate causality by identifying true environmental impacts on selfcontrol. Gene-environment research is developing rapidly which will benefit researchers, with or without a genetic background, in understanding of individual differences in self-control.

## Conclusion

Gene-environment interplay is a challenging yet stimulating direction to facilitate nuanced understanding of the etiological sources of adolescent self-control. Examining the causes of self-control differences while taking gene-environment interplay into account remains an intriguing yet challenging area of research, which we expect to blossom in the years to come.

## Credit author statement

YW conceptualized, prepared and wrote the original draft. JL, MB and CW reviewed and edited the original draft. YW, JL, MB and CW reviewed and agreed on the submitted manuscript.

## **Declaration of competing interest**

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

## Data availability

No data was used for the research described in the article.

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## References

References of particular interest have been highlighted as:

- of special interest
- \*\* of outstanding interest

- Acar IH, Avcõlar G, Yazõcõ G, Bostancõ S: The roles of adolescents' emotional problems and social media addiction on their self-esteem. *Curr Psychol* 2022, 41:6838–6847, https:// doi.org/10.1080/03004430.2017.1365362.
- Silvers JA: Adolescence as a pivotal period for emotion regulation development. Curr Opin Psychol 2022, 1: 44258–44263, https://doi.org/10.1016/j.copsyc.2021.09.023.
- Thomaes S, Grapsas S, van de Wetering J, Spitzer J, Poorthuis A: Green teens: understanding and promoting adolescents' sustainable engagement. One Earth 2023, 21: 352–361, https://doi.org/10.1016/j.oneear.2023.02.006.
- Finkenauer C, Willems YE, Weise M, Bartels M: The social context of adolescent relationships. OECD; 2019, https://doi.org/ 10.1787/b7f33425-en.
- Hirschi T, Gottfredson M: Commentary: testing the general theory of crime. J Res Crime Delinquen 1993, 1:47–54, https:// doi.org/10.1177/0022427893030001004.
- Billen E, Garofalo C, Weller JA, Kirisci L, Reynolds M, Tarter RE, et al.: Bidirectional associations between self-regulation and deviance from adolescence to adulthood. *Dev Psychopathol* 2022, 34:335–344, https://doi.org/10.1017/S0954579420000656.
- Kim Y, Richards JS, Oldehinkel JA: Self-control, mental health problems, and family functioning in adolescence and young adulthood: between-person differences and within-person effects. J Youth Adolesc 2022, 51:1181–1195, https://doi.org/ 10.1007/s10964-021-01564-3.
- Johnson SB, Voegtline KM, Ialongo N, Hill KG, Musci R: Selfcontrol in first grade predicts success in the transition to adulthood. Dev Psychopathol 2023, 35:1358–1370, https:// doi.org/10.1017/S0954579421001255.
- Bağatarhan T, Siyez DM, Vazsonyi AT: Parenting and internet addiction among youth: the mediating role of adolescent selfcontrol. J Child Fam Stud 2023, 32:10–20, https://doi.org/ 10.1007/s10826-022-02341-x.
- Fakkel M, Branje S, M Vollebergh WA, Stevens GWJM, Peeters M: Intergenerational upward and downward social mobility: the role of intelligence, effortful control, assertiveness, and peer competence in early adolescence. *Emerg Adulthood* 2024, 29, https://doi.org/10.1177/2167696824125758.
- Richmond-Rakerd LS, Caspi A, Ambler A, d'Arbeloff T, de
   Bruine M, Elliott M, *et al.*: Childhood self-control forecasts the pace of midlife aging and preparedness for old age. *Proc Natl Acad Sci USA* 2021, 118, https://doi.org/10.1073/ pnas.2010211118.

This study investigated the relationship between childhood self-control and midlife aging using data from the Dunedin Study, which tracked individuals from birth to age 45. Results showed that higher self-control in childhood was linked to slower biological and brain aging, as well as better preparedness for health, financial, and social challenges in later life.

- Willems YE, deSteiguer A, Tanksley PT, Vinnik L, Fraemke D, Okbay A, et al.: Self-control is associated with health-relevant disparities in buccal DNA-methylation measures of biological aging in older adults. *Clin Epigenet* 2024, 22, https://doi.org/ 10.1186/s13148-024-01637-7.
- Li JB, Willems YE, Stok FM, Deković M, Bartels M, Finkenauer C:
   \*\* Parenting and self-control across early to late adolescence: a three-level meta-analysis. Perspect Psychol Sci 2019, 14: 967–1005, https://doi.org/10.1177/1745691619863046.

this study provides a comprehensive overview and meta-analysis on studies investigating the link between parenting and self-control

- Chen C, Dang J: The Longitudinal Relationship Between Parenting and Self-Control Needs Reconsideration: A Commentary on Li et al. (2019). Perspect Psychol Sci 2023, 18: 1488–1491, https://doi.org/10.1177/17456916231177704.
- Mueller IM, Spinath FM, Friese M, Hahn E: Genetics, parenting,
   and family functioning—what drives the development of selfcontrol from adolescence to adulthood? J Pers 2023, 91: 332–353.

this study provides a comprehensive insight into the heritability of self-control across adolescence

 Elam KK, Lemery-Chalfant K, Chassin L: A gene-environment cascade theoretical framework of developmental psychopa- thology. J Psychopathol Clin Sci 2023 Apr, 132:287–296, https:// doi.org/10.1037/abn0000546.

This study proposes an integrative framework for understanding how genetic predispositions for behavior interact with social information processing and environmental factors to influence developmental outcomes.

 Pingault JB, Allegrini A, Odigie T, Frach L, Baldwin J, Rijsdijk F F, *et al.*: Research Review: how to interpret associations between polygenic scores, environmental risks, and phenotypes. *J Child Psychol Psychiatry* 2022, 63, https://doi.org/ 10.1111/jcpp.13607.

This study examines the complexities and potential biases in interpreting associations between polygenic scores, environmental exposures, and phenotypes. The importance of this study lies in its call for interdisciplinary expertise in genetic and epidemiological methods to properly conduct and interpret polygenic score research, thereby ensuring more accurate and meaningful findings in child psychology and psychiatry.

- Demange PA, Malanchini M, Mallard TT, Biroli P, Cox SR, Grotzinger AD, et al.: Investigating the genetic architecture of noncognitive skills using GWAS-by-subtraction. Nat Genet 2021, 53:35–44, https://doi.org/10.1038/s41588-020-00754-2.
- Demontis D, Walters GB, Athanasiadis G, Walters R, Therrien K, Nielsen TT, *et al.*: Genome-wide analyses of ADHD identify 27 risk loci, refine the genetic architecture and implicate several cognitive domains. *Nat Genet* 2023, 55:198–208, https:// doi.org/10.1111/jopy.12723.

So far, this is the GWAS with the largest sample size to date for selfcontrol related traits (for ADHD) which is why this is most widely used when incorporating genetic scores in self-control research.

- Hatoum AS, Morrison CL, Mitchell EC, Lam M, Benca-Bachman CE, Reineberg AE, et al.: Genome-wide association study shows that executive functioning is influenced by GABAergic processes and is a neurocognitive genetic correlate of psychiatric disorders. *Biol Psychiatr* 2023 Jan 1, 93:59–70, https://doi.org/10.1016/j.biopsych.2022.06.034.
- Karlsson Linnér R, Biroli P, Kong E, Meddens SFW, Wedow R, Fontana MA, et al.: Genome-wide association analyses of risk tolerance and risky behaviors in over 1 million individuals identify hundreds of loci and shared genetic influences. Nat Genet 2019, 51:245–257, https://doi.org/10.1038/s41588-018-0309-3.
- Karlsson Linnér R, Mallard TT, Barr PB, Sanchez-Roige S, Madole JW, Driver MN, *et al.*: Multivariate analysis of 1.5 million people identifies genetic associations with traits related to self-regulation and addiction. *Nat Neurosci* 2021, 24: 1367–1376, https://doi.org/10.1038/s41593-021-00908-3.
- Sanchez-Roige S, Fontanillas P, Elson SL, , 23andMe Research Team, Pandit A, Schmidt EM, et al.: Genome-wide association study of delay discounting in 23,217 adult research participants of European ancestry. Nat Neurosci 2018, 21:16–18, https://doi.org/10.1038/s41593-017-0032-x.
- Sanchez-Roige S, Jennings MV, Thorpe HHA, Mallari JE, van der Werf Lc LC, Bianchi SB, *et al.*: CADM2 is implicated in impulsive personality and numerous other traits by genome- and phenome-wide association studies in humans and mice. *Transl Psychiatry* 2023, 13, https://doi.org/10.1038/s41398-023-02453-y.
- Chen Y, Liu P, Yi S, Fan C, Zhao W, Liu J: Investigating the shared genetic architecture between attention-deficit/ hyperactivity disorder and risk taking behavior: a large-scale genomewide cross-trait analysis. J Affect Disord 2024, 356: 22–31, https://doi.org/10.1016/j.jad.2024.03.107.
- Horwitz TB, Zorina-Lichtenwalter K, Gustavson DE, Grotzinger AD, Stallings MC: Partitioning the genomic components of behavioral disinhibition and substance use (disorder) using genomic structural equation modeling. *medRxiv* 2024. https://www.medrxiv.org/content/10.1101/2024.02.20. 24303036v1; 2024.
- 27. Miller AP, Gizer IR: Dual-systems models of the genetic architecture of impulsive personality traits: neurogenetic

evidence of distinct but related factors. *Psychol Med* 2023, **29**: 1–11, https://doi.org/10.1017/S0033291723003367.

- Becker J, Burik CAP, Goldman G, Wang N, Jayashankar H,
   \*\* Bennett M, et al.: Resource profile and user guide of the polygenic Index repository. Nat Human Behav 2021, 5: 1744–1758, https://doi.org/10.1038/s41562-021-01119-3.
- this provides practical guidelines how to create polygenic scores.
- Hart SA, Little C, van Bergen E: Nurture might be nature:
  \*\* cautionary tales and proposed solutions. Npj Sci Learn 2021, 6:1–12, https://doi.org/10.1038/s41539-020-00079-z.

this study illustrates the importance of integrating genetically informed designs to understand causality in developmental science.

 Agnew-Blais JC, Wertz J, Arseneault L, Belsky DW, Danese A, Pingault JB, et al.: Mother's and children's ADHD genetic risk, household chaos and children's ADHD symptoms: a gene–environment correlation study. J Child Psychol Psychi-atry 2022, 63:1153–1163, https://doi.org/10.1111/jcpp.13659.

This study shows how to integrate polygenic scores in studying the interplay between genetics and environment on individual differences in adolescent self-control problems, specifically focussing on gene-environment correlations.

- Ksinan AJ, Smith RL, Barr PB, Vazsonyi AT: The associations of polygenic scores for risky behaviors and parenting behaviors with adolescent externalizing problems. *Behav Genet* 2022, 52:26–37, https://doi.org/10.1007/s10519-021-10079-3.
- de la Paz L, Mooney MA, Ryabinin P, Neighbor C, Antovich D, Nigg JT, et al.: Youth polygenic scores, youth ADHD symptoms, and parenting dimensions: an evocative geneenvironment correlation study. Res Child Adolesc Psychopathol 2023, 51:665–677, https://doi.org/10.1007/s10802-023-01024-5.

(PGS) on parenting behaviors, examining both direct genetic effects and evocative effects influence parenting. The study is important because it underscores the bidirectional relationship between youth genetic predisposition for self-control problems and parenting practices, highlighting the need to consider genetic factors in family dynamics.

- Kretschmer T, Vrijen C, Nolte IM, Wertz J, Hartman CA: Geneenvironment interplay in externalizing behavior from childhood through adulthood. J Child Psychol Psychiatry 2022, 63: 1206–1213, https://doi.org/10.1111/jcpp.13652.
- Neale RN, Sahaym A, Noack D, Juasrikul S: The kids are all right: adolescent deviance, innovativeness, proactiveness and risk-taking. Int J Entrep Innov. 2024, 25:32–44, https:// doi.org/10.1177/14657503221092965.
- Kübel SL, Deitzer JR, Frankenhuis WE, Ribeaud D, Eisner MP, van Gelder JL: Beyond the situation: hanging out with peers now is associated with short-term mindsets later. J Dev Life-Course Criminol 2024, 10:51–72, https://doi.org/10.1007/s40865-024-00249-2.
- Willems YE, Raffington L: Trait correlations in human couples. Nat Human Behav 2023, 7:1420–4121, https://doi.org/10.1038/ s41562-023-01673-y.
- Belsky J, Pluess M: Beyond diathesis stress: differential susceptibility to environmental influences. *Psychol Bull* 2009, 135:885–908, https://doi.org/10.1037/a0017376.
- Leffa DT, Caye A, Belangero SI, Gadelha A, Pan PM, Salum GA, et al.: The synergistic effect of genetic and environmental factors in the development of attention-deficit/hyperactivity disorder symptoms in children and adolescents. *Dev Psychopathol* 2023, 24:1–11, https://doi.org/10.1017/ S0954579423000366.
- He Q, Li JJ: A gene-environment interaction study of polygenic scores and maltreatment on childhood ADHD. *Res Child Adolesc Psychopathol.* 2022, 50:309–319, https://doi.org/ 10.1007/s10802-021-00873-2.
- Mooney MA, Ryabinin P, Morton H, Selah K, Gonoud R, Kozlowski M, *et al.*: Joint polygenic and environmental risks for childhood attention-deficit/hyperactivity disorder (ADHD) and ADHD symptom dimensions. *JCPP Adv* 2023, 3, e12152, https://doi.org/10.1002/jcv2.12152.

This study is an example of an investigation how genes and environment (G x E) potentially interact in explaining individual differences in self-control.

- Østergaard SD, Trabjerg BB, Als TD, Climent CA, Privé F, Vilhjálmsson BJ, et al.: Polygenic risk score, psychosocial environment and the risk of attention-deficit/hyperactivity disorder. Transl Psychiatry 2020, 2:1–11, https://doi.org/ 10.1038/s41398-020-01019-6.
- Willems YE, Raffington L, Ligthart L, Pool R, Hottenga JJ, Finkenauer C, et al.: No gene by stressful life events interaction on individual differences in adults' self-control. Front Psychiatr 2024, 15, https://doi.org/10.3389/fpsyt.2024.1388264.
- Harden KP, Domingue BW, Belsky DW, Boardman JD, Crosnoe R, Malanchini M, et al.: Genetic associations with mathematics tracking and persistence in secondary school. Npj Sci Learn. 2020, 5:1–8, https://doi.org/10.1038/s41539-020-0060-2.
- 44. Fraemke D, Willems YE, Okbay A, Wagner G, Tucker-Drob EM, Harden KP, et al.: Differences in polygenic associations with

educational attainment between West and East Germany before and after reunification bioRxiv. 2024. https://www.biorxiv.org/ content/10.1101/2024.03.21.585839v1.

- Nivard MG, Belsky DW, Harden KP, Baier T, Andreassen OA, Ystrom E, *et al.*: More than nature and nurture, indirect genetic effects on children's academic achievement are consequences of dynastic social processes. *Nat Human Behav* 2024, 8:771–778, https://doi.org/10.1038/s41562-023-01796-2.
- B Pingault J, Barkhuizen W, Wang B, Hannigan LJ, Eilertsen EM, Corfield E, *et al.*: Genetic nurture versus genetic transmission of risk for ADHD traits in the Norwegian mother, father and child cohort study. *Mol Psychiatr* 2023, 28:1731–1738, https:// doi.org/10.1038/s41380-022-01863-6.
- Ghirardi G, Bernardi F: Compensating or boosting genetic propensities? Gene-family socioeconomic status interactions by educational outcome selectivity. OSF; 2023. https://osf.io/2xny7.