Biological Risk for the Development of Problem Behavior in Adolescence: Integrating Insights From Behavioral Genetics and Neuroscience

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ABSTRACT_Adolescence is a time of increasing engagement in a variety of problem behaviors, including substance use and delinguency. Genetic risk for problem behavior increases over adolescence, is mediated partially by individual differences in sensation seeking, and is exacerbated by involvement with deviant peers. In this article, we describe how findings from behavioral genetic research on problem behavior intersect with research from developmental neuroscience. In particular, the incentiveprocessing system, including the ventral striatum, responds increasingly to rewards in adolescence, particularly in peer contexts. This developmental shift may be influenced by hormonal changes at puberty. Individual differences in the structure and function of reward-responsive brain regions may be intermediary phenotypes that mediate adolescents' genetic risk for problem behavior. The study of problem behavior can be enriched by interdisciplinary research that integrates measures of brain structure and function into genetically informed studies.

KEYWORDS—gene-environment interaction; behavior genetics; delinquency; substance use; problem behavior; risk-taking; externalizing; dual systems model; adolescence

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Adolescents engage disproportionately in problem behaviors, such as delinquency and substance use, that violate social norms and endanger their own and others' well-being (1-3).¹ In this article, we describe research from behavioral genetics and developmental neuroscience that advances understanding of biological risk for problem behavior. We scaffold our review around three findings from behavioral genetic research: Genetic influences on problem behavior increase with age and puberty, are mediated partially by genetic influences on sensation seeking, and are moderated by peer contexts. We integrate these findings with research on how neurobiological changes during adolescence contribute to teenagers' propensity for problem behaviors. We focus on developmental changes in the incentiveprocessing system, including the ventral striatum (VS), the amygdala, and other subcortical areas that respond to rewards and threats. Like genetic risk for problem behavior, the incentive-processing system changes with age and puberty, is linked with sensation seeking, and is activated by peer contexts. These parallels suggest that findings from behavioral genetics and developmental neuroscience can be integrated to formulate

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¹Following Jessor and Jessor's (4) formulation, we use the term *problem behavior* here, but other research traditions use different nomenclatures. Clinical psychologists have typically emphasized behaviors that are symptoms of Diagnostic and Statistical Manual of Mental Disorders-defined externalizing disorders, including oppositional defiant disorder, conduct disorder, and substance use disorder. Epidemiologists and neuroscientists are often more interested in *risk-taking behavior*. such as cigarette smoking, sex without condoms, and reckless driving, which may be dangerous without necessarily indicating clinical pathology. The tradition of developmental psychopathology frequently operationalizes externalizing to include normal-range behaviors, such as lying to parents, which are neither clinical-level symptoms nor necessarily risky. Finally, criminologists have focused on *delinquent* or criminal behaviors that violate laws. The term problem behavior is intended to imply a broad conceptualization of the focal construct, including health-risk behaviors (e.g., sex without condoms), delinquent behaviors (e.g., shoplifting, drinking alcohol), and clinical symptoms. Certainly, each individual problem behavior has unique causes; for example, adolescent cigarette smoking has decreased in recent historical periods (5), whereas marijuana use has increased (6). Yet these behaviors are united by the fact that they are, in fact, problems (for the adolescent or for society); they show similar developmental trends, increasing in prevalence in adolescence and early adulthood; they are highly intercorrelated; and they share common underlying causes (7).

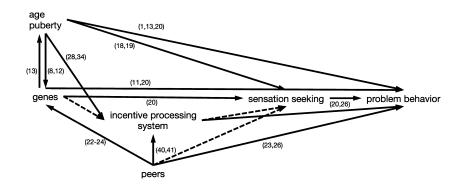


Figure 1. Overview of pathways from genes to problem behavior. Solid arrows represent empirically supported pathways. Dashed arrows represent hypothesized pathways.

Note. Numbers in parentheses refer to studies cited in the references.

hypotheses that can be addressed with interdisciplinary research (see Figure 1).

THREE FINDINGS FROM BEHAVIOR GENETIC RESEARCH ON PROBLEM BEHAVIOR

Genetic Influences on Problem Behavior Increase With Age and Puberty

Average levels of problem behavior increase from childhood to adolescence (1, 3) and genetic influences on problem behavior also increase during this time. Genetic influences on *rule-breaking* behavior (e.g., property crime) increase from approximately 20% at age 10 to 80% at age 15 (8), a finding that has been replicated in four independent studies (9, 10). In late adolescence, many forms of problem behavior are highly heritable, with genes accounting for more than 80% of the variance in a common latent factor linking antisocial behaviors, drug and alcohol use, and personality disinhibition (11).

The age span during which genetic influences on problem behavior increase most rapidly (10–15 years) coincides with puberty, suggesting that genetic influences on problem behavior may be activated by pubertal development rather than (or in addition to) chronological age. Supporting this hypothesis, we recently found that genetic influences on rule-breaking forms of delinquency were moderated by pubertal status, even after controlling for age (12). In contrast, age did not moderate genetic influence on delinquency after controlling for pubertal status.

How might genetic risk for problem behavior be influenced by puberty? One possibility is that the relevant genes influence the timing or tempo of pubertal development itself. In a nationally representative study of adolescent twin girls (13), genetic predispositions toward earlier pubertal development contributed to higher risk for delinquency. Moreover, hormonal changes associated with puberty may activate genes that were not expressed in childhood. During puberty, average levels of gonadal (testosterone, progesterone, estradiol) and adrenal dehydroepiandrosterone and dehydroepiandrosterone-sulfate. (DHEA and DHEA-S) hormones increase in males and females. These hormones bind to DNA-transcription factors that are distributed throughout the central nervous system and can thus affect gene expression directly (14). Finally, genetic influences on problem behavior may be amplified via transactions with environmental contexts (15). For example, regardless of age, adolescents who are more physically developed affiliate with older and more deviant peers (16). These peer influences, in turn, might influence problem behavior reciprocally, setting up a positive feedback loop that amplifies initial genetically influenced differences.

Genetic Influences on Problem Behavior Are Mediated by Sensation Seeking

Genetic influences on problem behavior increase during adolescence, but it is unclear which genes are involved or how these genetic differences translate into differences in problem behavior. One way to parse the causal chain between genotype and a complex phenotype, such as problem behavior, is to conduct a behavior genetic study that tests whether genetic influences on the complex phenotype are accounted for by genetic influences on a more basic, biologically proximate phenotype that is hypothesized to be intermediary. This study design can delineate complex pathways between genes and behavior by testing intermediary phenotypes at varying levels of analysis, from brain structure (e.g., white matter density) to brain function (e.g., VS activity) to component psychological process (e.g., selective attention) to personality trait (e.g., novelty seeking) and, finally, to behavior.

In studies using this type of behavioral genetic design, the personality trait of *sensation seeking* is a key psychological mediator of genetic influences on problem behavior. Sensation seeking the tendency to prefer and seek novel and thrilling sensations and experiences—correlates phenotypically with many forms of problem behavior (17). At the population level, average levels of sensation seeking increase from childhood to middle adolescence (i.e., around 16 years old), a developmental trend that mirrors increases in problem behavior at this time (18). In some studies, average levels of sensation seeking are associated more closely with pubertal development than with chronological age (19). Moreover, twin and family studies suggest that the same genes that influence sensation seeking also influence problem behavior. In a nationally representative study of adolescent twins and siblings ages 10 to 16, individual differences in the rate of increase in sensation seeking were due overwhelmingly to genetic differences $(h^2 \sim 80\%)$. These genetic influences on sensation seeking accounted for nearly half (43%) of the genetic variance in change in adolescents' delinguent behavior (20). Finally, research using measured DNA (21) provides convergent evidence that genes influencing problem behavior are also relevant for sensation seeking. In this study (21), a polygenic risk score that was constructed from a genome-wide association study of externalizing disorders in adults predicted a small but significant percentage of variance in self-reported impulse control and sensation seeking in adolescents.

Genetic Influences on Problem Behavior Are Moderated by Peer Relationships

Genes account for approximately 80% of the variation in problem behavior by late adolescence. However, this heritability estimate is a population average that masks potential variability in the strength of genetic influences on problem behavior in different environmental contexts-a Gene × Environment interaction. One of the most consistently replicated Gene \times Environment interaction effects is the moderating effect of peer contexts: Genetic influences on problem behavior are amplified among teenagers who have more deviant peers. This pattern is evident whether examining best friends or peer groups; whether using adolescents' perceptions of their peers or peers' own self-report behavior; and whether the key outcome is nonsubstance-related delinquent behavior, alcohol use, or other forms of substance use (22–24). Convergent evidence for the importance of Gene × Peer interactions has been found using diverse methods, including twin/family studies (e.g., 23), candidate genes (e.g., 24, 25), and polygene methods that aggregate measured genetic risk across the entire genome (e.g., 21). Consistent with the hypothesis that part of the genetic risk for problem behavior is mediated through sensation seeking, the correlation between peer deviance and one's own delinquent behavior is amplified among adolescents who report high levels of sensation seeking (26).

ADOLESCENT NEURODEVELOPMENT AND THE EMERGENCE OF PROBLEM BEHAVIOR

As we have described, genetic influences on problem behavior increase with age and puberty, are partially mediated by sensation seeking, and are moderated by peer relationships. At the same time, neuroscience research has begun to elucidate how adolescent-typical patterns of neurodevelopment may heighten teenagers' propensity for problem behavior. Behavioral genetic research and neuroscience research intersect at several points, particularly on the roles of puberty and peers.

The Dual Systems Model

According to the *dual systems model* of adolescent neurodevelopment (27), the escalation of risk-taking behavior in adolescence results from asynchronous development in two brain systems. First, the *incentive-processing* system, including the VS, amygdala, and orbitofrontal cortex, undergirds processing of motivational and affective information, including information about potential rewards. Second, the cognitive control system, including the prefrontal cortex and anterior cingulate cortex, is involved in self-regulation, planning, and impulse control. The cognitive control system undergoes protracted development through adolescence and young adulthood, whereas the incentive-processing system becomes more responsive in early and middle adolescence. For example, white matter volume—which reflects increasing myelination, a process that allows signals to be conducted through the brain more rapidly and reliably-continues to increase throughout adolescence and young adulthood, particularly in tracts relevant for high-level cognitive control (28). At the same time, adolescents show stronger VS activation in a variety of reward paradigms than children or adults, and VS activation correlates positively with risk-taking and preference for immediate rewards in laboratory tasks, as well as with self-reported problem behavior (reviewed in 28, 29). This neurobiological maturity gap may underlie age group differences in risky and socially deviant behavior, with adolescents more prone to problem behavior than either children (for whom the incentive-processing system is less active, so they are less sensitive to the potential rewards of problem behavior) or adults (for whom the cognitive control system is more mature, so they can more effectively anticipate the potential adverse consequences of problem behavior).

Puberty and the Incentive-Processing System

The hormonal changes of puberty may be particularly important for the development of the incentive-processing system. Among young adults, both naturally occurring individual differences in testosterone and experimental administrations of testosterone correlate with reward seeking on the Iowa Gambling Task (IGT; 30, 31); performance on the IGT, in turn, is associated with sensation seeking (32, 33). Higher testosterone levels are also associated with greater reward-related VS activation in both adolescent boys and girls (34), and testosterone administration causes higher VS activation in response to rewards among adults (35). Longitudinal increases in testosterone in early adolescence are also associated with increased activation in response to *threat* cues in both the amygdala and the striatum, which may contribute to adolescents finding ostensibly dangerous situations thrilling and rewarding (36).

Peers and the Incentive-Processing System

The incentive-processing system in adolescents is sensitive to peer environments. Adolescents prefer smaller, more immediate monetary rewards to larger, delayed rewards when they are with peers of the same age (37). The same brain regions (including the VS) that respond to monetary rewards also respond to social stimuli, such as attaining higher social status, receiving positive social feedback, or viewing attractive faces (38, 39). Among adolescents, the presence of peers increases responsiveness of the VS to reward (40, 41). This effect of peer presence is not observed among adults, consistent with the idea that adolescence is a distinct developmental period of elevated sensitivity to social stimuli (40). Moreover, this neural peer effect correlates with risk-taking on a simulated driving task and with selfreported resistance to peer influence (40). Neural responses to peers vary by age and gender, with older female adolescents showing pronounced activity in the VS when they think about being evaluated by socially desirable peers (42). Thus, peer contexts both exacerbate genetic risk for problem behavior and activate neurobiological systems implicated in the rise of problem behavior typical for this age group.

Intersections Between Behavioral Genetic and Neuroscience Research

In summary, based on the behavior genetic and neuroscience findings we have reviewed thus far, average levels of problem behavior, sensation seeking, and reactivity of the incentive-processing system increase during adolescence and are linked with pubertal development. In addition, genetic influences on problem behavior increase with adolescents' age and pubertal development, and are mediated by sensation seeking. Finally, peer relationships moderate the influence of genes and of sensation seeking on problem behavior, and activate the incentive-processing system. Considering these findings together, we propose a model (see Figure 1) in which genetically influenced individual differences in the structure and function of the incentive-processing system emerge at puberty and widen over adolescence. According to our model, these individual differences in neurodevelopment are also predicted to mediate genetic influences on sensation seeking and ultimately on problem behavior.

Although the studies we have described are consistent with our model, testing these hypotheses directly requires studies that simultaneously examine the links among genes, individual differences in brain structure and function, psychological functioning, and actual behavior. At least one candidate gene study has attempted to link measured genetic polymorphisms, imaging measures of brain activity, and problem behavior (43). In that study, adolescents who used illicit substances had significantly greater activity in the right insula and right anterior cingulate when successfully inhibiting responses on a stop-signal task; this right frontal network, in turn, was significantly associated with a polymorphism in *SLC6A2*, which codes for the norepinephrine transporter. However, the effect size for this single polymorphism was small ($R^2 \sim 1\%$) and has not yet been replicated. Additional interdisciplinary research that integrates measures of neurobiology into genetic studies (including both quantitative and molecular genetic designs) is needed.

LOOKING AHEAD AT INTERDISCIPLINARY RESEARCH

Researchers are increasingly interested in interdisciplinary studies that combine genetic and neuroimaging data (e.g., 44). Although quite demanding in terms of sample size, twin and family designs that incorporate measures of brain structure and function (e.g., 45) may be particularly valuable. In initial results from twin studies, some individual differences in brain structure and function are highly heritable. For example, gray matter density in the amygdala (which is involved in the incentive-processing system) is substantially heritable ($h^2 = .80$) at the onset of puberty (46), and by adulthood, the heritability of frontal lobe volumes (which are involved in cognitive control) exceeds 90% (47). However, these studies have examined the heritability of phenotypes at a single level of analysis (e.g., brain structure); multivariate twin designs that measure phenotypes that traverse many levels of analysis (e.g., VS activity, sensation seeking, and problem behavior) are needed to test whether these phenotypes are influenced by the same underlying genetic polymorphisms.

Additionally, *longitudinal* genetically informative designs can answer critical questions about the direction of causation between neurobiological correlates and problem behaviors. Such questions are salient given that problem behavior often involves substance use, and cross-sectional designs provide little information about whether a structural or functional correlate represents an endogenous risk or is a consequence of exposure to substances. More generally, although ostensibly focused on understanding the development of problem behaviors in adolescence, much of the research we have described has been cross-sectional rather than longitudinal. As Loth and colleagues (48) commented, "adolescence-specific maturational growth curves, rather than adult norms, need to be considered when assessing individual differences" (p. 437).

Researchers should take a multivariate approach that considers both unity and diversity in the neurobiological and genetic underpinnings of problem behaviors. Illustrating the utility of a multivariate approach, a recent imaging study of 14- to 16-yearolds examined correlates of a general factor representing common variance across attention deficit hyperactivity disorder, conduct disorder, and symptoms of substance use, as well as unique correlates of behavioral subtypes. Sensation seeking and neural activity while anticipating a reward were associated uniquely with substance use, whereas the general factor was associated with impulsivity and neural activity during response inhibition (49). However, no study has yet investigated this topic using a longitudinal design that can test whether individual differences in neurobiological *change* are associated uniquely with some forms of problem behavior but not others.

Finally, even rats show heritable individual differences in risk-taking behavior (50). This cross-species consistency suggests that the biological changes characteristic of adolescence have evolved to serve an adaptive purpose—to motivate exploration and separation from caregivers. Adolescents with genetic or neurobiological characteristics associated with problem behavior could engage in forms of risk-taking that are socially sanctioned or even prosocial. Yet the positive trajectories of biologically "at risk" teenagers, as well as the environmental opportunities and individual characteristics that foster prosocial risk-taking, are poorly understood. Addressing this question will stimulate a broader consideration of how the unique characteristics of teenagers can be leveraged to maximize healthy outcomes for themselves and for society as a whole.

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