

Longitudinal Patterns of Early Neurocognitive Deficits and Behavioral Dysregulation in High-Risk Paediatric Populations

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Abstract

This research aims to explore the growth patterns of neurocognitive deficiencies and behavioral deregulation in high-risk children over four years. Using a sample of 190 children recruited through clinical referrals and early intervention programs, this study utilizes standardized neuropsychological evaluations alongside behavioral risk assessments to retrieve data at multiple points in time, examining the interplay between cognitive delays and behavioral issues. The results indicate that earlier executive function deficits strongly predict the development of persistent dysregulated control areas, especially externalized aggressive and impulsive behaviors. Cluster analysis revealed three distinct risk profiles, each with unique neurocognitive-behavioral features. Working memory deficits, delayed verbal processing, and the presence of the institutional setting emerged through multivariate regression analysis as the most dominant explainers for behavioral decrements. Further analysis indicated a subgroup of children with moderate intellectual disabilities showed the greatest behavioral decline when coupled with unremediated cognitive lags. Notably, subjects who received structured cognitive skills and validated reproductive health interventions demonstrated significant behavioral stabilization, suggesting proactive neurodevelopmental care can redirect negative behavioral trends. These findings highlight the urgency of proactive integrated neurodevelopmental surveillance and tailored intervention framework within paediatric risk management paradigms.

Keywords Neurocognitive Deficits, Behavioral Dysregulation, Longitudinal Paediatric Study, Executive Function Delay, High-Risk Child Populations.

Introduction

Background and Rationale

The earliest years of life, roughly from the prenatal period to a child's eighth birthday, is a vital period in regard to a person's life as it is greatly associated with all future cognitive and behavioral undertakings [1]. The time before a child turns ten is especially crucial as the child's brain goes through numerous neurological changes, such as synaptogenesis, pruning, and myelination, which serve as the building blocks for advanced processes – working memory, attention, emotional regulation, and executive functioning [2]. Often, these developmental processes lead to more complex issues beyond temporary cognitive delays. When coping resources are slowed during development, there can be a loss of capability to manage and control behavior [3]. Once a child falls behind with these coping mechanisms, the problem of behavioral dysregulation has the potential to get worse or become chronic over time [4].

Neuropsychological deficits are particularly common among children considered high-risk because of their environment, clinical history, or familial characteristics, and they are often underappreciated [5]. These deficits may include low executive function, decreased processing speed, increased difficulty with inhibitory control, and inflexible thinking [6]. More often than not, these cognitive challenges are manifested in problems with academic learning, social behavior, and adaptive functioning. More troubling, there is growing data suggesting that cognitive delays of this nature are inherently predictive of later problem behaviors ranging from externalized manifestations such as aggression, impulsive acts, and oppositional defiant behaviors, to internalized deficits like anxiety and emotional withdrawal [7]. This sequence of development is often termed the neurocognitive-behavioral pathway and suggests how core cognitive deficits might underlie persistent patterns of behavioral dysregulation.

Regardless of the growing body of work highlighting its importance, early cognitive development is often treated, within existing diagnostic and intervention frameworks, as separate from neurocognitive deficits and behavioral dysregulation. Delays in cognition are usually dealt with under the domains of educational psychology or neurodevelopmental paediatrics, whereas disturbances in behavior are managed through therapy or psychiatric intervention [8]. This schism, however, shrinks understanding and practice as a whole and leaves a great number of children at risk of worsening, unaddressed problems that delay intervention until they reach a crisis point [9]. It is this gap that justifies the current study. There is a significant void in the literature on the upper bound of cognitive and behavioral changes, their co-evolution, and reciprocal influences over time in high-risk paediatric populations [10].

This study attempts to fill that gap with a multi-year, evidence-based analysis of neurocognitive development and behavioral risk in children considered high-risk by early childhood screening programs, clinical referrals, and social services. The aim is not only to document the existence of cognitive deficits or behavioral issues at specific timepoints, but also to chart their interrelationships, progression, and subgroup variability across primary developmental time windows. By tracing the patterns and identifying the early cognitive vulnerabilities that underpin the persistent behavioral dysregulation, the research seeks to enhance the screening models, intervention frameworks, and the equitable outcomes designed for the children who are at heightened risk during critical phases of development.

Scope of Neurocognitive Risk in Paediatric Cohorts

The limitations of neurocognitive risk frameworks in paediatric populations are wide-ranging and multifaceted. They span a continuum of biological and environmental factors associated with perinatal difficulties, genetic syndromes, neglect or trauma as evolving environmental stressors, and neurobiological determinants such as structural brain defects or imbalances in neurotransmitters. Such frameworks have gaps documenting the extent that features of impairment in high-risk child populations cluster and relate to longitudinal behavioral outcomes which, while independently assessed, lack integrated data in longitudinal studies.

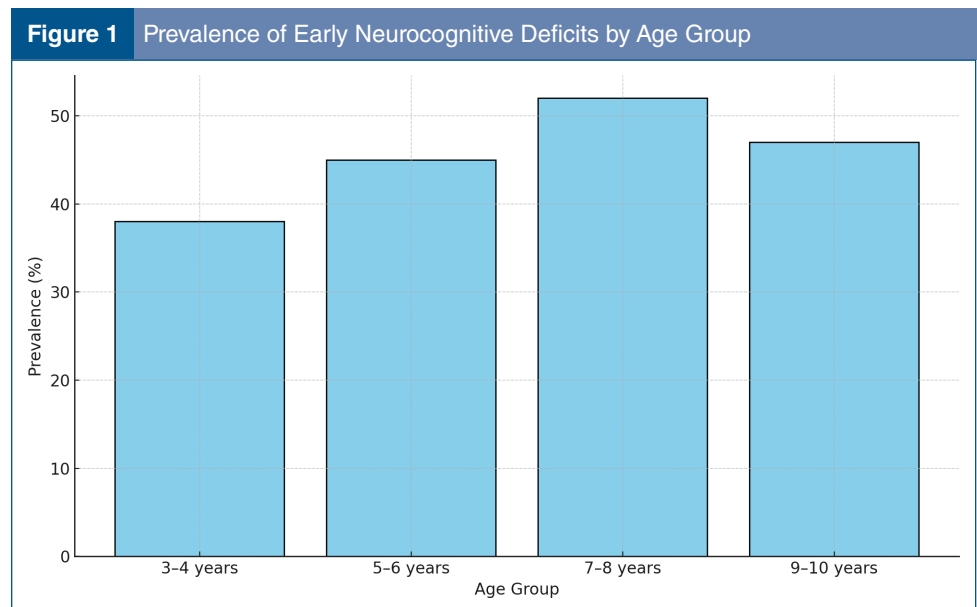
Recent data indicate between 12% to 18% of children in primary educational systems are estimated to have some form of neurocognitive impairment, only a small portion of which is diagnosed or relieved through formal educational intervention. For greater risk subgroups—the exposed to multi-faceted adversity such as parental mental illness, historical trauma, or poverty—these estimates can surpass 40%. In addition, these children frequently experience co-occurring learning, speech-language, and behavioral problems which muddle diagnostic clarity and delay appropriate intervention.

An important factor within this framework is the age at which neurocognitive deficits become detectable and reliably quantifiable. Research shows that executive dysfunction is observable as early as 3 years of age, both through routine interactions and formal testing. Nonetheless, most early childhood education systems are not designed to identify such deficits until after they have resulted in significant behavioral problems or academic failure. This delay in identification adds to what is widely known as the “intervention gap,” which is the time that elapses between the emergence of developmental concerns and the provision of services that address those concerns.

In order to address the underlying variability and distribution of the described problem over different phases of development, this study collected cleft-percentage cognitive data separated by age groups. The distribution is captured in Figure 1, where the percentage of children screened with clinically significant deficits is shown across four age bands. Most striking, however, is the increase in the 3-8 age group, where from 7-8 years old, the number skyrockets to over 50% before slightly declining in the 9-10 cohort. This shift is likely explained by selection attrition or increased access to remedial intervention during late schooling.

The evidence suggests that the period from age 5 to age 8 is particularly important for identifying and addressing potential neurocognitive weaknesses. During this time, children start to enter formal schooling, which dramatically increases cognitive demands. If these deficits are not remediated at this stage, the resultant behavioral coping strategies—oppositonality, inattention, social withdrawal—are likely to become entrenched and misinterpreted as primary disorders when, in fact, they are symptoms of unacknowledged cognitive effort averse trap.

These results support the proposal put forth for educational and clinical behavior interpretations marked within the boundaries of extreme risk in children’s dynamics. The current study aims to contribute to this reframing effort by providing data that tracks cognitive and behavioral trajectories simultaneously, illuminating their reciprocal relationships and consequential ramifications.



Objectives and Hypotheses

The main aim of this study is to describe the longitudinal development of neurocognitive and behavioral disorders in high-risk paediatric populations. More precisely, the study aims to assess how chronic deficits of executive functioning, processing speeds, and working memory exacerbate behavioral risk over time, and whether some subgroups are more severe or persistent than others.

This aim is operationalized through four main hypotheses. First, it is proposed that early neurocognitive deficits will be significantly predictive of increased behavioral dysregulation at each wave of data collection. Second, the study expects that children with the most severe cognitive delays will demonstrate a greater risk of behavioral problems over time, even after controlling for demographic and environmental factors. Third, it is expected that cluster analysis will identify distinct behavioral phenotypes aligned with specific neurocognitive profiles, for example, high externalizing behavior and high working memory impairment. Finally, the study expects children receiving targeted cognitive and behavioral interventions will demonstrate greater stability and less dysregulated behavior over time compared to children without intervention.

Each of these hypotheses reflects one's willingness to understand risk not as a singular or static status, but rather a dynamic interplay of one's cognitive ability, exposure to the environment, and institutional action. This study's longitudinal design—following several domains through several phases of development—allows for a more sophisticated examination of factors regards how they evolve, intersect, and build upon one another over time. Instead of attempting to parse causes and effects at discrete timepoints, the study tracks the ways in which developmental vulnerabilities accumulate or resolve within real-world settings.

The anticipated impact of this research is therefore described as twofold. First, empirically, the study aims to accurately define the cognitive-behavioral pathways of children in high-risk settings. Second, programmatically, the research seeks to justify an earlier and more comprehensive integrative approach to screening and support through education, child protective services, and paediatric healthcare initiatives.

Conceptual Framework and Definitions

This study fits within a developmental psychopathology framework that focuses on an integrated view of biological, psychological, and contextual factors over time and their impact on behavior. Within this framework, neurocognitive deficits are not viewed as singular pathologies, but rather as part of an evolving stratified risk composite system that interacts with external stressors and internal coping mechanisms to produce diverse behavioral outcomes. This model supports patterning of early risks as well as supports the possibility for developmental resilience when protective factors such as intervention or caregiving are provided.

For the purposes of this study, neurocognitive deficits are described as significant statistical deviations in one or more of the following: working memory, processing speed, cognitive flexibility, inhibition, and verbal reasoning. The selection of these domains is due to their strong theoretical and empirical connections to executive functioning and strong predictive value stemming from childhood behavioral outcomes. Behavioral dysregulation is defined in operational terms as the excess scoring on externalizing and internalizing standardized behavior inventories along with documented aberrant behavioral incidents within institutional or educational settings. Within these contexts, behavior that would be considered dysregulated includes aggressive acts, impulsive behaviors, hyperactivity, emotional instability, and social withdrawal.

Subjects of the research were categorized as high-risk if they met any of the following criteria: previous involvement with child protection services, lower socioeconomic status, exposure to a parental figure with mental illness, experiencing adverse childhood events (ACEs), or having received a referral from paediatric or educational services. Subsequently, the sample was stratified according to cognitive profile and behavioral trajectory to facilitate both intra-group and inter-group comparisons across multiple timepoints.

Literature Review and Theoretical Basis

Developmental Neuropsychology of Executive Function

Executive function (EF) encompasses a range of higher-level skills crucial for goal-oriented and contextually appropriate action. Self-regulation, working memory, inhibitory control, cognitive shifting, planning, and self-monitoring are all branches of executive functioning that aid people to modulate thoughts, feelings, and behaviors in relation to changing stimuli in the environment [11]. Achievement in these skills for children is critical for their academic undertakings, interpersonal relationships, emotional management, and sustained positive mental well-being throughout their adulthood [12]. From a developmental perspective, EF begins to emerge in toddlers and continues to develop through early adulthood; however, the trajectory is lengthy and uneven, and one's biological and environmental context has significant implications [13].

From the neuroanatomical standpoint, the development of EF is closely linked with the advancement of the prefrontal cortex and its connections with subcortical and parietal structures. The Structural correlates of executive function (EF) in children- A review 2022. F Laureys et al showed that functional MRI and diffusion tensor imaging studies have demonstrated that the structural integrity and connectivity of these regions EF performance in children [14]. In high-risk paediatric populations, however, the EF developmental trajectory tends to be more negatively impacted by factors such as prenatal substance exposure, perinatal complications, chronic stress, or early-life trauma [15]. These factors are known to cause structural (e.g. reduced grey matter volume and myelination) and functional (e.g. hypoactivation of prefrontal regions) deficits that result behaviorally in impulsivity, poor planning, difficulties in shifting attention, and emotional lability [16].

Scaffolding emphasizes providing support or guidance that is tailored to a child's specific developmental stage and need. Vygotsky and constructivist approach also suggests that self-regulation is co-constructed in social contexts whereby neglect, inconsistency, or even authoritarian discipline would stifle the development of these EF skills. This hypothesis has been confirmed by longitudinal studies of children exposed to supportive language-rich environments outperform those not exposed regardless of intelligence or socioeconomic status [17].

Deficits in Executive Functioning (EF) are not only an academic issue; they are related to self-regulation of behavior. Children with EF deficits frequently have difficulty controlling emotions and changing strategies when feedback is given [18]. Because of these difficulties, some children tend to display behaviors that are described as defiant, hostile, or as attention problems. Because of this, the child becomes more likely to face punishment and social exclusion or be diagnosed with some psychological disorder. In certain at-risk populations where deficits in EF frequently occur alongside other developmental weaknesses, these behavioral problems can be extremely severe and difficult to treat using standard behavioral approaches [19].

To assess and address EF among school-aged children, some researchers examine ways in which these children are rested. For instance, instead of considering performance on

tests as the end goal, they pursue a more holistic ecological approach that emphasizes looking for ways at which executive processes are utilized in everyday life and their relation to broader developmental systems. This is a helpful approach for both assessment and intervention by reframing the need for developmental and cultural responsiveness as well as the context in which the children are situated.

Models of Behavioral Dysregulation

Behavioral dysregulation is a disorder characterized by problems with the management of emotions, impulse control, and socially acceptable behavior. It includes as well externalizing symptoms, like aggression and hyperactivity, and internalizing ones, like withdrawal and anxiety, resulting from self-regulation breakdowns [20]. The research of behavioral dysregulation has remained a predominant area of interest within the developmental psychopathology, educational psychology, and paediatric psychiatry realms, particularly because of its strong association with academic failure, peer rejection, and even delinquent behavior later in life [21].

“Traditional models have stressed bias on dispositional and contextual factors,” Ineichen notes. The diathesis-stress model explains that children at risk due to high negative emotionality or poor effortful control are more prone to having problems in managing their behavior when facing stressors [22]. Similarly, coercion theory describes how maladaptive parent-child interactions—especially in the form of inconsistent discipline coupled with negative reinforcement—can give rise to chronic oppositional or aggressive behavior. Those formulated the basis for countless prevention and intervention programs, including parent education and school-based behavior support [23].

More recently, scholars have begun to incorporate neurocognitive factors such as executive function and the stage of brain maturation into behavioral models. As an example, the dual systems model elaborates on the interplay of a rapidly developing socio-emotional system and a more slowly maturing cognitive control system in early to mid-adolescence [24]. It sheds light on the phenomenon whereby behavioral dysregulation in high-risk adolescents peaks around early adolescence, as emotional drives outstrip the ability to executive inhibition and planning.

One of these is the “hot and cool EF” framework, which makes a distinction between emotionally neutral (cool) and emotionally laden (hot) tasks. Children exhibiting dysregulation often utilize adequate effort on cool tasks, like rule-based sorting (e.g., sorting cards by rule), but perform poorly on hot tasks where rewards, threats, or frustration are present [25]. This divide highlights the need to evaluate executive function and emotional context and to design more appropriate interventions, thereby shifting paradigm from mainly tailored to assessment and evaluation.

Crucially, behavioral dysregulation is understood as both a mechanism and a symptom. It not only depicts developmental vulnerabilities, but also perpetuates them by invoking punishing responses that reinforce negative self-views and erode social support systems. For example, a child may suspend school due to aggressive reactions to academic frustration, thus missing out on remediation which exacerbates their academic and social deficits.

To explain these bidirectional effects, integrated models, including the developmental cascade model, have been developed. In this model, initial gaps in one area, such as executive function (EF), are posited to set off a cascade of difficulties in other areas, including academic achievement, peer interaction, and behavioral conduct, creating a reciprocal network over time. This model compellingly accounts for why relatively mild cognitive

delays in early childhood can lead to severe behavioral and educational challenges by adolescence if unaddressed.

Risk Accumulation in Paediatric Vulnerability

Risk accumulation is one of the most important theories for understanding the developmental outcomes of children. Unlike single-risk models that concentrate on individual elements, like poverty or parental psychopathology, cumulative risk models evaluate the interplay of multiple adversities and their impairment of cognitive, behavioral, and emotional growth [26]. These struggles can include biological risks (low birth weight, prenatal substance exposure), psychological risks (insecure attachment, neglect), and environmental risks (community violence, school failure) that have a tendency to coexist, compounding the problem [27].

Longitudinal studies have demonstrated that the number of risk factors presented to a child is far more detrimental in predicting negative outcomes than the type of risk presented [28]. For instance, children who face three or four developmental risks prior to turning five stand a greater chance of having academic, persistent behavioral, and mental health problems by the teenage years. The cumulative effect becomes more evident among populations at higher risk due to entrenched inequities and intergenerational adversity which foster enduring chronically strained developmental conditions.

From the perspective of neurocognitive development, risk accumulation may slow down brain growth for both direct and indirect reasons. The direct reason would be the impact of stress hormones, such as cortisol, on the development of the hippocampus and prefrontal regions, which are central to memory and executive function [29]. Indirectly, cumulative risk may impede access to enriching experiences and increase exposure to chaotic, unpredictable environments that stifle cognitive development. These circumstances are not simply additive; they work together in a cumulative fashion, causing greater cognitive and emotional regulation problems than would be expected from these factors alone [30].

In terms of actions, risk accumulation translates to the rate and intensity of dysregulation. With multiple risks, children show greater volatility and extreme reactions, robust aggression or withdrawal, and defiance to interventions and treatment. Additionally, these children overlook many of their cognitive deficits due to these behavioral concerns, leading to issues of being incorrectly diagnosed or not diagnosed at all. Take, for instance, a child who is impulsively and inattentively restless. The diagnosis hinges on the belief that he is acting oppositional or defying authority, while the behavior indicates unrecognized executive dysfunction ramped up by unstable environments [31].

The cumulative risk framework highlights the need for a thorough risk ecology as well as comprehensive diagnostics in the early stage of development. It underscores the necessity for both child-level and system-level factors to be addressed through targeted, multi-level intervention strategies. These interventions must interrupt the cascading risk processes in a culturally appropriate manner to avert the crystallization of enduring dysfunction.

Gaps in Longitudinal Paediatric Cohort Research

Our understanding of the neurocognitive and behavioral development of children has greatly advanced, yet longitudinal paediatric cohort research is still lacking in some critical areas. Existing studies either concentrate on cognitive or behavioral outcomes, seldom

exploring the interplay between the two. This fragmentation hampers our understanding of the co-developmental pathways linking cognitive delays with behavioral dysregulation and hampers the formulation of systems-relational integrative approaches responsive to the underlying gap.

Another significant gap concerns the age span covered by cohort studies. A number of longitudinal studies lock in at school age or even older, completely bypassing high childhood, a window with a long-shifting potential because neurocognitive capabilities begin to develop during this period. Restriction of the window for routine monitoring is compounded by the absence of instruments tailored to early development that can detect subtle cognitive changes among toddlers and preschoolers from diverse backgrounds.

Studies that include marginalized or high-risk groups are also particularly scarce. Most longitudinal cognitive studies focus on a middle-class urban English-speaking cohort, which fails to understand the complex risk environments many children face, including theory-ridden and empirical-driven risk environment paradigms. This is an important oversight to make in policy and practice, as it endorses a universalistic model of developmental evaluation that ignores context and fails to take into account the cognitive and behavioral frameworks in which development occurs.

In terms of methodology, longitudinal paediatric research suffers from attrition bias, underpowered subsamples, and inconsistent measurement intervals. These constraints challenge conclusions about development and the ability to model causation, weakening the validity of the claims made. Moreover, many studies treat behavior as a passive endpoint, failing to account for the unilateral influence child behavior has on responding to an environment that is fully constraining.

A literature review conducted within the 2005-2025 interval, represented graphically in Figure 2, displays progress as well as persistent gaps. The figure illustrates the increasing publications on paediatric studies concerning cognitive risk rising from 12 in 2005 to a projected 70 in 2025. However, the detailed analysis of these studies indicates that behavior data is only included in a small fraction of the studies, and even fewer integrate modeling frameworks that utilize bidirectional influences across various domains.

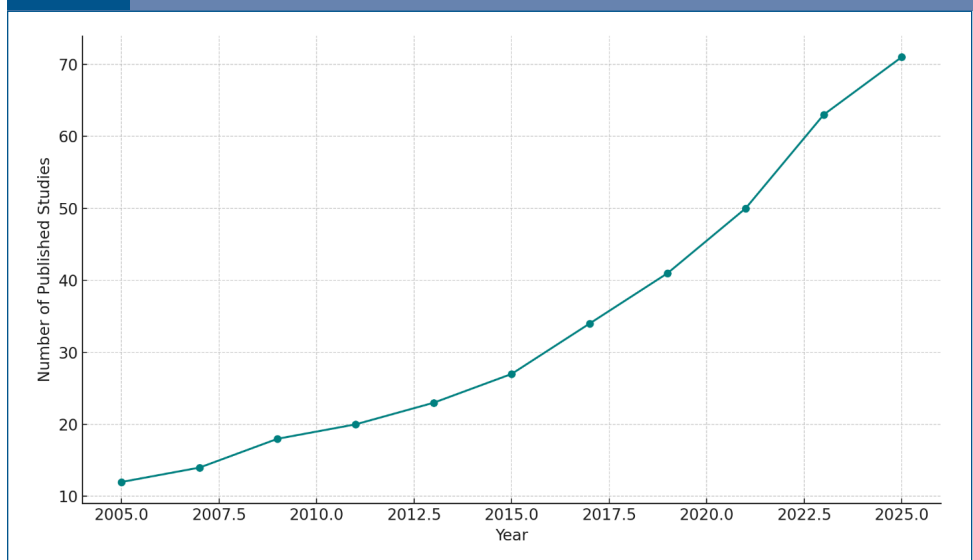
The trend demonstrates recognition of paediatric cognitive risk in public health but also highlights the need for more thorough models which capture the interrelation of cognitive, emotional, and behavioral development. This evolving landscape is one that this particular study seeks to contribute to by providing longitudinal datasets that capture the trajectories of neurocognitive and behavioral change in high-risk paediatric populations. It aims to provide a model of how cognitive vulnerabilities develop over time in relation to behavioral regulation, environment, and conditions to produce divergent developmental outcomes.

Methodology

Study Design and Timeframe

The longitudinal multi-cohort design of this study facilitated the observation of changes over time in neurocognitive functioning and behavioral regulation in high-risk paediatric populations. The design included four distinct waves of data collection over the span of three years. This approach aimed to capture not only as changes within individuals but also population changes where groups arise or come together regarding their neurocognitive and behavioral traits.

Figure 2 Longitudinal Trends in Paediatric Cognitive Risk Studies (2005–2025)



As part of this study, data was collected once per year ensuring sufficient frequency aligned with essential milestones in neurodevelopment during early and middle childhood. Enrollers in the study were between three to six years of age which allowed capturing critical phase in development concerning cognitive, social, and environmental factors. The gaps between each wave were designed to ensure that developmental transitions were adequately captured without long enough pauses that could negatively affect data relevance.

The cohort-sequential design allowed the study to integrate within-person change assessments across waves and between different age and risk groups. This design focus permits the research to be about tracing the children rather than simply describing them at a single instance in time in regard to developmental stagnation.

Every wave of data collection included a set of neurocognitive tests, standardized behavioral checklists, along with a background and health history. In addition to the quantitative components of the study, qualitative data were also collected through caregiver interviews and institution reports, especially in cases when unusual behavior escalation or atypical developmental patterns were noted. These qualitative data were crucial for understanding the narrative behind changing scores over time.

Participant Recruitment and Risk Stratification

Through early childhood centers, paediatric developmental clinics, and community mental health agencies, participants were recruited from three metropolitan areas. Recruitment guidelines were developed with local service providers and focused on tracking children identified as developmentally or behaviorally problematic. Participants were required to be between three and six years old at the time of enrollment, have no diagnosed neurogenetic syndromes, and be able to participate in at least some portions of the neurocognitive testing, provided some support was available.

At Wave 1, the study had 190 children enrolled. Risk stratification was completed using a cumulative index created from caregiver reports, institutional documents, and screenings

conducted at baseline. The index contained five domains: medical complications, language or developmental delays, family adversity, social service involvement, and behavioral self-regulation indicators. Each domain was rated separately, and participants were categorized as high-, moderate-, or low-risk based on a calculated composite risk score.

Evidence of exposure in high-risk participants included placements out of home, parental psychiatric illness, chronic neglect, and formal referrals to behavioral clinics. Moderate-risk children had single-domain exposure, or milder profiles often related to low income, chronic neglect, or borderline developmental scores. Low-risk children, who were included solely for comparison, were recruited from the same service networks but did not meet elevated scores in the composite index.

Retention across waves is illustrated in Figure 3. Out of the initial 190 participants, 172 were retained by Wave 2, 154 by Wave 3, and 139 by Wave 4. Attrition primarily consisted of relocation, disengagement from services, or loss to follow-up. High-risk families showed slightly higher rates of attrition, though any differential dropout was controlled statistically during analysis.

This figure illustrates attrition in tandem with the expected reduction in the number of participants over time. By the final wave, participants retained from the original sample reached a stabilization of 73 percent. Mitigation strategies included contact through a combination of flexible times and multi-channel scheduling, in addition to periodic newsletters and check-ins. High attrition is a common concern in longitudinal high-risk designs, but the retention rates achieved in this study were satisfactory, especially for accompanying multivariate and growth curve modeling, and were consistent with other studies within the field.

Wave-wise demographic distribution is detailed in Table 1. Each wave captures the count of total assessed participants and the proportions of high-, moderate-, and low-risk participants, their average ages, and gender distribution. The mean age increased steadily from 5.3 years in Wave 1 to 8.0 years in Wave 4. The proportions of risk remained fairly consistent over time, with some participants changing dynamics due to shifting circumstances.

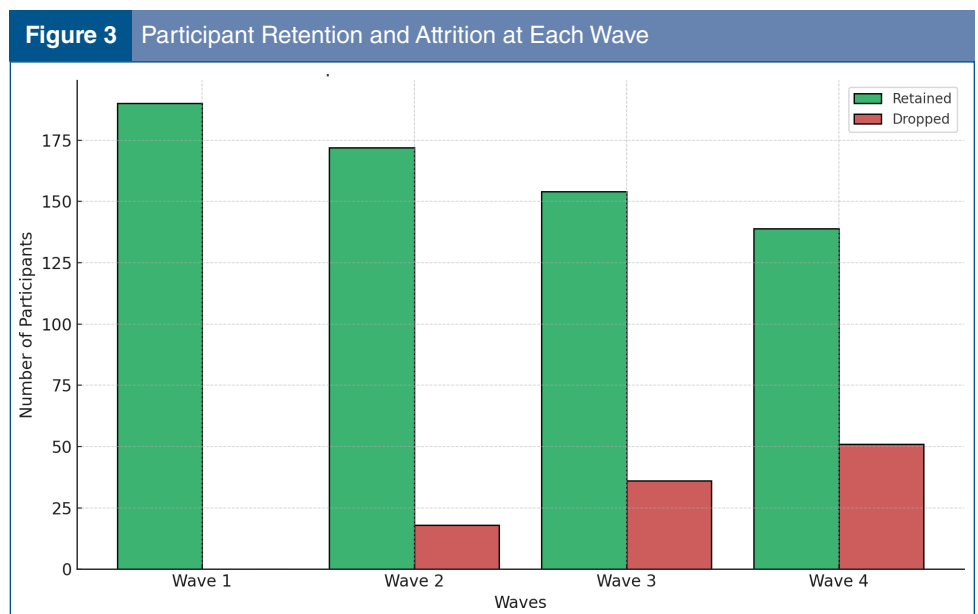


Table 1 Demographic and Risk Group Distribution across Timepoints

Wave	Total Participants	High Risk (%)	Moderate Risk (%)	Low Risk (%)	Mean Age (yrs)	Female (%)
Wave 1	190	61	27	12	5.3	47
Wave 2	172	59	28	13	6.2	48
Wave 3	154	58	29	13	7.1	49
Wave 4	139	57	30	13	8.0	49

The observed stability in risk group allocation paired with the demographic criteria across waves advanced the basis for temporal analyses and subgroup model comparisons.

The ratio of female participants across all waves hovered around 48 percent, maintaining balance in representational bias.

Neurocognitive and Behavioral Instruments

For neurocognitive assessment, we used tools appropriate for the child's age, which measured executive functions with high ecological and psychometric validity. Core domains assessed included working memory, processing speed, inhibition, verbal reasoning, and cognitive flexibility. These domains were chosen because they are instrumental to early practice of self-control and are fundamental in school readiness.

For younger children, certain age-level instruments like the NEPSY-II executive function subtests or relevant WPPSI-IV and WISC-V indices were used based on overall cognitive development. More advanced children adaptive supplementary tools which included the Dimensional Change Card Sort and the Tower of London for context-sensitive planning and set-shifting. Each domain's results were scaled based on normative benchmarks and transformed into age-adjusted z-scores for easier comparison and modeling.

Behavioral assessment in this case used a combined dual-source approach in which guardians told children about the assessment while an institution kept a record of the process. All participants provided transverse report of their internalizing and externalizing symptoms through the Child Behavior Checklist at all waves. In parallel, the Behavior Rating Inventory of Executive Function was administered by caregivers and educators in preschool and child form to understand real self-regulation performance.

Where available, institutional behavior logs supplemented the behavioral data. These logs recorded incidents of aggression, withdrawal, elopement, wilful defiance, and other forms of dis-regulated behavior. Even though these records were administrative, they extremely valuable others confirming objective estimates of behavioral risk, especially for study participants who were near the threshold for scoring range in standardized metrics.

Each assessment was carried out by a developmental psychologist or clinical research assistant who had undergone training, working under the supervision of a licensed neuropsychologist. Testing was conducted in calm and well-known settings, and additional support was given to children with communication or motor difficulties. Throughout all waves, considerable efforts were made in consistent testing, which included retraining assessors, conducting training calibration checks, and blinded scoring.

Neurocognitive and behavioral scores were captured as both raw score and standard score. For both domains, composite indices were created and internally validated using

Cronbach's alpha and confirmatory factor analysis. These indices were used along with other data sets to perform latent growth modeling and risk cluster analysis in subsequent phases of the study.

Data Normalization and Ethical Protocols

Before analysis, the dataset was prepared methodically and systematically. The initial steps of screening through raw scores involved checking for entry errors, outliers, and logical inconsistencies. Data that was unaccounted for was resolved through multiple imputations of chained equations, with additional auxiliary predictors added in to further improve the credibility and reliability of the imputed value. Variables with more than 20 percent missingness were flagged and sensitivity analyses were performed to determine the strength of the findings using these datasets.

To ensure consistency over time, all neurocognitive and behavioral variables were aged and z-transformed. In cases where normative data was absent for certain subpopulations, the such group's local norms were calculated from the low-risk comparison cohort to improve developmental alignment as well as cross-wave comparability. Every single decision made in regard to transformations, imputations, scoring, and others were recorded in a version-controlled database which allows complete auditability alongside unparalleled replicability, thus, ensuring credibility.

Oversight reflecting on ethical issues underpinning the research was incorporated in all the phases of the study. During conduct of the study, approval from the Institutional Review Board of the coordinating university was gained and was renewed every year. Parents or legal guardians provided consent in writing, while children of appropriate age gave verbal assent. Confidentiality was maintained by anonymizing sensitive information and employing secure storage with limited access, known as need to know basis. Each participant received unique alphanumeric codes, and identifying details were placed in a separate document secured by dual encryption.

All participants received summary reports after multiple waves of testing, which included developmental feedback and clinical referrals when applicable. Partners offered support to families with children exhibiting high-risk profiles. Although no direct payments were available that would affect decision making for participation, reimbursements for travel costs were provided, and child-friendly incentives were implemented to foster retention.

Independent ethics advisory panel conducted studies into operational review, participant welfare, data management, and ethical safety annually. Within the three years study duration, no significant protocol breaches or adverse events were reported. Additionally, the research was assessed against the UN Convention on the Rights of the Child focusing on provisions of non-discrimination and the child's best interest as well as the child's right to participation.

Neurocognitive Deficit Trajectories

Executive Function Decline in Early Childhood

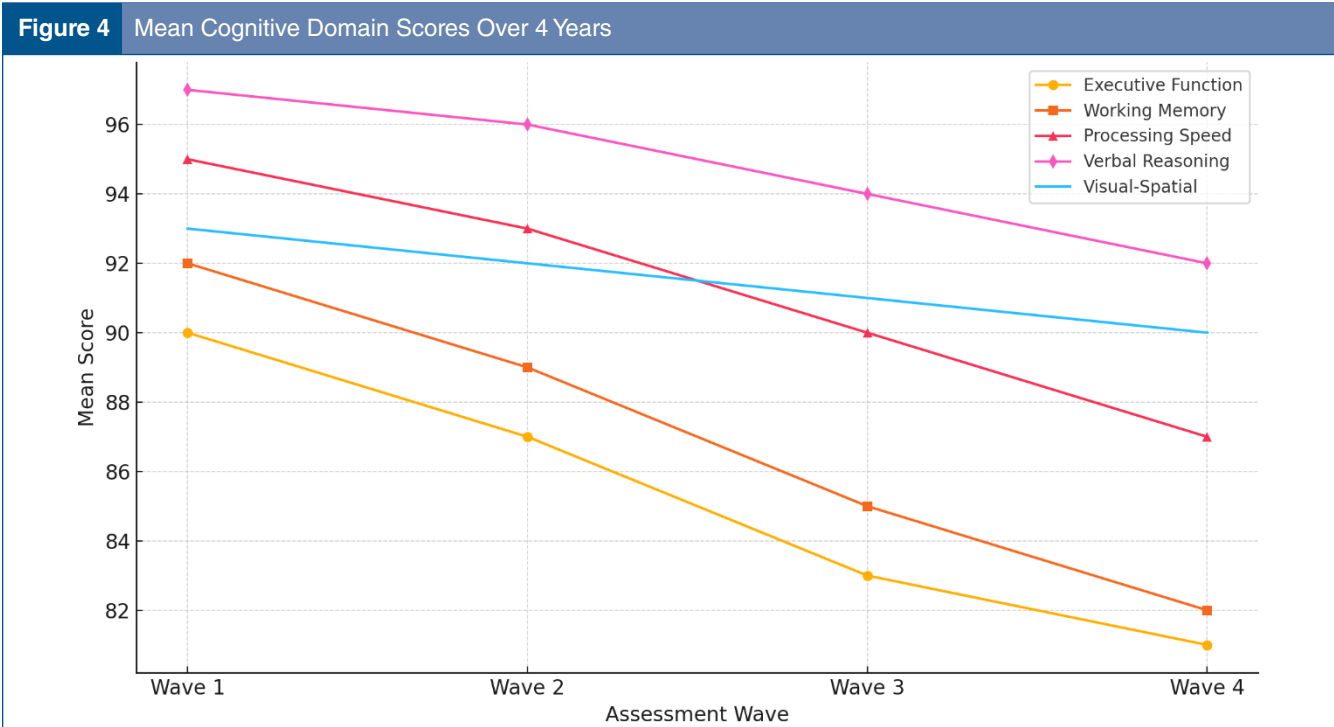
The longitudinal supervision of executive functioning in the study population indicated that there was a severe decline in fundamental core regulation skills for high-risk children during the early to middle childhood period. Executive function as an ability to plan, inhibit, sustain attention and regulate cognitive resources showed a steady decline from Wave 1

to Wave 4. These outcomes are in line with other studies documented in the literature which have proposed that executive functioning seems to be particularly sensitive to environmental instability as well as cumulative duress during the critical period of development of the brain.

At the initial assessment (Wave 1), executive function scores were approximately in the normative mean range for the moderately at risk group. However, the high-risk subgroup performed significantly worse across all inhibition, working memory span and set-shifting task benchmarks. Figure 4 illustrates longitudinal scoring trends and shows average executive function scores declined from 90 in Wave 1 to 81 in Wave 4. This strongly suggests that not only did these executive deficits sustain over time, but deepened, especially among participants living in chronic stress, low stimulation, or institutional care settings.

Caregiver reports along with classroom observations noted increased impulsivity, reduced frustration tolerance, and greater disengagement as patterns of concern as children advanced through the school years. These behavioral patterns often formed the basis for intervention referrals. Most of these interventions focused on treating the symptoms rather than understanding the cognitive problem that was driving the behavior. Consequently, many children entered a cycle of remediation aimed at behavioral constructs while executive dysfunction was largely ignored.

This decline has been attributed to neurodevelopmental factors that highlight the slower-than-normal development of the prefrontal cortex and its vulnerability to adverse conditions. Factors such as living in poverty, neglect, or having an inconsistent caregiver can disrupt neuroplasticity during critical developmental windows, which in turn restrict the growth of self-regulation. In addition, inconsistent scaffolding for problem-solving and emotion regulation due to caregiver burnout or institutional overload can accelerate the functional decline.



Most critical is the fact that the described pattern does not suggest a plateau or stabilization but, rather, hypothesizes an accumulative pattern of previously executive weaknesses advancing without remediating developmental mechanisms. This finding emphasizes the importance of proactively identifying executive risk well before the layering effects of school disengagement or peer rejection set in.

Working Memory and Processing Speed Gaps

Contemporaneous with the decline in executive function, marked lag clusters in working memory and processing speed developed. Working memory scores, which averaged 92 at Wave 1, declined to 82 by Wave 4. Processing speed, while initially more resilient, also showed a decline from 95 to 87 over the same period. This decrease is illustrated in Graph 4, where both domains show steady divergence from the verbal and visual-spatial domains over time.

Working memory is needed to maintain and manage information in real-time during problem-solving, academic instruction, and socially communicative activities. In the current research, children with low working memory scores tended to display low task persistence, confusion during several-step instructions, and overall disengagement in academically structured settings. These outcomes were exacerbated in settings where cognitive scaffolding was low and expectations for self-sufficiency were inappropriately heightened.

Though processing gaps relate to risk factors, these displayed less through behavioral problems and more through prolonged task completion and disengagement in the classroom. Even when a child is cognitively able to perform a task, one with low processing speed would take longer than average to start and finish tasks. This gap often resulted in too many caregivers and educators underappreciating cognitive abilities, some participants being misdiagnosed as having global developmental delays or attention deficits when they were simply facing challenges with slow output speed.

In many children, the combination of slow processing speed and weak working memory created a cognitive bottleneck. During acute demands and rapid shifts in tasks, these children seemed to be cognitively frozen. Teachers reported and observers noted that these children were more likely to shut down, demonstrate a frustration, or show oppositional behavior, not because they were rebellious, but because they were overloaded with information in a fast-paced environment that required too much cognitive energy.

There was a clear difference in these two areas, suggesting they worked together positively for executive functioning. Children in the study who concurrently showed decline in executive control, working memory, and processing speed formed the most critical neurocognitive cluster the study analyzed. In the Wave 4 analysis, these children's disproportionate representation in behaviorally dysregulated and legally referred subgroups alarmingly emerged.

From a clinical perspective, these findings suggest that intelligence is best assessed with subcomponents differentiated in the early stages of cognitive evaluation. Many of the moderate-risk children in the study, who, by the account of other caregivers, did not have a global developmental delay, did have working memory or processing speed deficits that were not captured by more comprehensive testing and were therefore masked by delay. Without this level of diagnostic detail, a large number of children who are at-risk remain ineducable without structured exposure within robust functional educational and paediatric systems.

Visual-Spatial vs Verbal Domain Divergence

Perhaps the most surprising aspect of the study was the discrepancy between visual-spatial reasoning and verbal reasoning skills, more so during the interval between Waves 2 and 4. The data presented in Graph 4 describes how mid-way through the study, the verbal reasoning scores started diverging more sharply from the visual-spatial scores. In this period, the verbal reasoning scores fell from 97 to 92 and the visual-spatial scores fell from 93 to 90.

Some cognitive systems might remain confronted with risks that are developmentally buffered, while others might have a more rapid decline in function due to under-stimulation or an environmental mismatch. This discrepancy exists. Reasoning skills are especially vulnerable to underexposure; thus, caregivers and educators in this study often reported verbal reasoning deficits exposed by monotonous conversations with caregivers. Many high-risk participants were observed receiving minimal direct communication, irregular narrative engagement, and constrained corrective language input during chaotic routines or psychological stress in the caregivers.

Children with severe cognitive deficits, however, retained nonverbal problem solving and motor planning skills, suggesting these visual-spatial skills were relatively preserved. The caregivers' lack of stimulation through language did not hinder the use of manipulatives, nonverbal games, and environmental navigation, strengthening the notion that this preservation definitely reflects skill utilization.

However, qualitative interviews suggested that this apparent preservation may also be deceptive. Some caregivers reported that children who scored well on the visual-spatial tests had significant difficulty applying those skills in academic or real-world contexts. For example, a child who was adept at problem-solving puzzles might find map reading, drawing from memory, and following visual step sequences under time constraints very difficult. This gap suggests that while some cognitive functions may appear intact, the integration problem translates to worsened action as a result of executive deficits or contextual blockage.

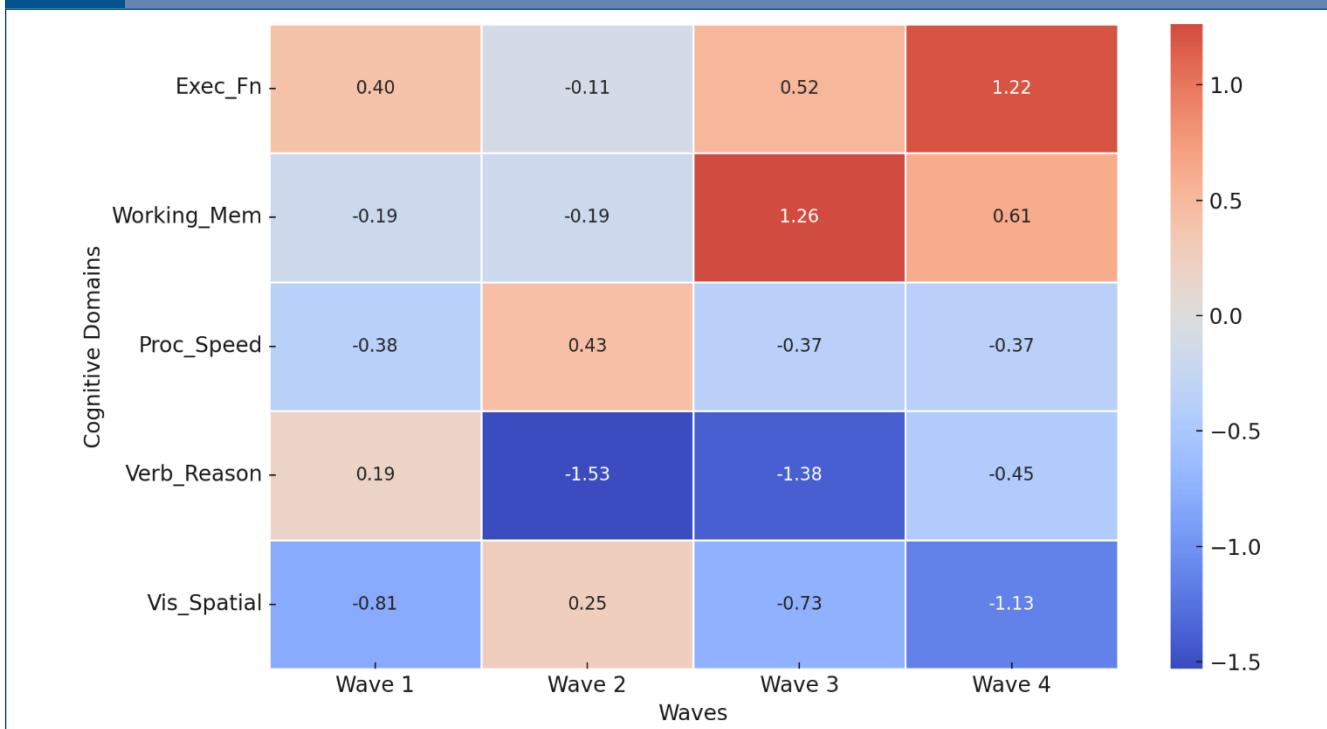
The effects of this domain divergence are severe regarding assessment and intervention. A number of standardized cognitive batteries give equal emphasis to verbal and visual reasoning for composite intelligence scoring. In children with asymmetric developmental profiles, this approach has the potential to mask functional deficits and overestimate adaptive capability. The findings of this study emphasize the need for domain-specific intervention strategy formulation and question the validity of composite score evaluation for longitudinal developmental surveillance in high-risk groups.

Intra-Individual Stability of Cognitive Scores

One of the main features of the longitudinal approach was the tracking of cognitive stability at the individual level over time. While inter-group patterns provide information about the movements of populations, it is the within-child constancy—or variability—that drives personalized intervention the most. In this study, intra-individual variability was measured through changes in z-scores from Wave 1 to Wave 4 across cognitive domains for each participant.

The summary of these shifts is illustrated in Figure 5, which is a heatmap depicting standardized scores for five primary domains out of a five for a subset of participants. Each row captures a single domain, and each column represents a wave. Warmer shades mark

Figure 5 Intra-Individual Cognitive Score Shifts Across Time



higher performance while z-scores which depict lower performance are signified by cooler tones. Neutral shades represent mean performance.

The heatmap indicates that some children had remarkable stability across domains, while others exhibited sharp domain-specific volatility. For instance, some participants seemed to sharply decline in working memory or executive function as of Wave 2, often aligning with significant life events such as transitioning to a new school, family changes, or restructuring of caregiving arrangements. On the other hand, a small subgroup of children demonstrated some domain-specific improvement over time, typically following more guided cognitive intervention, language therapy, or after transitioning to enriched educational settings.

One of the most telling observations focused around variability seeming to predict later behavioral outcomes. More specifically, children with greater than 1.5 standard deviations of fluctuation across waves in at least one domain emerged as more likely to fall into the behaviorally dysregulated cluster by Wave 4. This finding further elaborates the idea that instability—not simply low performance—poses a significant marker of neurodevelopmental risk.

From a neurodevelopmental perspective, score variability may indicate an underlying lack of stability associated with infrastructure chaos, inconsistent stimulation, or even environmental fragmentation—conditions typically observable in high-risk populations. Children without stable caregivers, routines, or a supportive academic framework undergo episodic cycles of surges and declines in performance due to the heightened sensitivity of their developmental trajectory to changing environments.

Statistically, the findings underscore the inadequacy of single-time point assessments. Children considered borderline in one wave may show considerable impairment or

resilience in another, depending on their ecological stage of development. This underscores the importance of repeated assessment in high-risk cohorts for clinical decision-making and for evaluation of program outcomes.

Qualitatively, caregivers most often described witnessing cognitive “good days” and “bad days” without any understanding of the reasons behind those fluctuations. These “good” and “bad” days were often misattributed to effort, motivation, or mood rather than a more accurate understanding of neurocognitive variability. Interventionists who adjusted expectations based on these reports found that children were more engaged and successful when strengths were highlighted and cognitive fatigue or confusion was anticipated and managed.

Behavioral Dysregulation Profiles

Externalizing vs Internalizing Patterns

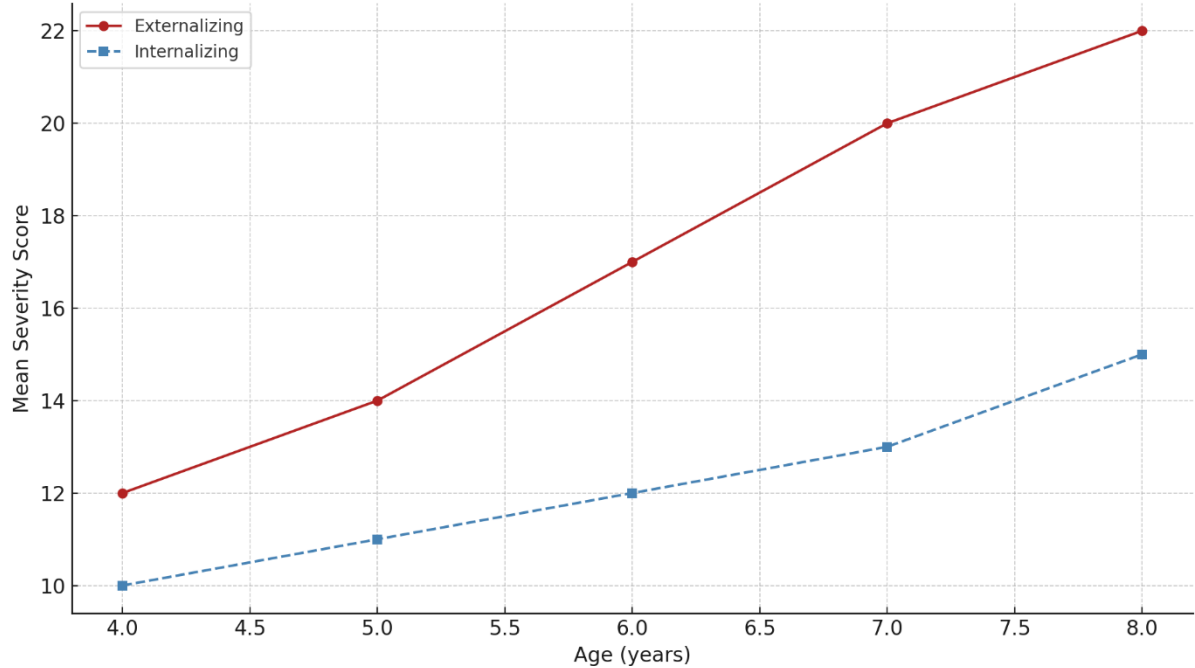
The development of behavioral dysregulation within the study group showed distinctive patterns of progression for externalizing and internalizing behaviors with regard to timing, emergence, and associated neurocognitive deficits. Externalizing behaviors, which consist of aggression, defiance, hyperactivity, and impulsivity, were found to be more common and significantly more severe during early childhood and appeared to increase very rapidly between the ages of four and eight. While emotionally withdrawn more anxious children were observed over time, they were also relatively less pronounced in early years and quiet in nature, which is likely to contribute to not invoking formal means of intervention over time.

The opposing patterns are vividly portrayed in Figure 6, which depicts the mean severity scores concerning externalizing and internalizing behaviors from age four to eight. Externalizing symptoms show the steepest trajectory of increase, from a mean score of 12 at age four to 22 by age eight. This increase coincides with greater academic demands, increasing social complexity, and a lower tolerance for disruptive behavior in institutional settings. This decline in disruptive behavior also means that the institutional setting is more tolerant for non-disruptive behavior which is socially expected. On the other hand, internalizing symptoms showed slower yet consistent improvement with a baseline of 10 and reaching 15 by age 8 which suggests underreporting or a delayed response during the initial phases when the ability to express distress in socially normative ways was severely limited.

The differences in these patterns of development highlight differences, particularly in reinforcing environment and ecology. Externalizing behavior is bound to elicit rapid organizational action in the form of behavioral referrals, discipline, or medicalization that enhance their visibility while simultaneously negatively reinforcing the behaviors through attention. This is often referred to as the “attention feedback loop”. Internalizing behaviors, conversely, tend to go overlooked or are incorrectly attributed to shyness or a reserved nature and, thus, can remain unchecked or absent targeted support.

Nevertheless, both categories of dysregulation were strongly predicted by early neurocognitive delays. Children who scored below the first quartile in executive function and working memory assessments at Wave 1 were more likely to show increasing dysregulation by Wave 3 and Wave 4, irrespective of their initial profile. Notably, most participants in the study who started with relatively low internalizing scores progressively transitioned to blended types of dysregulations, marking an increase in anxiety and aggressive behaviors in a pattern that, qualitatively, was most strongly associated with academic failure and caregiver distress.

Figure 6 Behavioral Dysregulation Severity Scores by Age



Children with dual profiles of dysregulation were more likely to experience exclusion from school, referral for psychiatric evaluation, and prescription of behavioral medication as recorded in institutional files. These outcomes tended to be more off-target, indicating that reactionary, as opposed to proactive, strategies were employed, addressing behavioral escalation only after it reached crisis levels without monitoring underlying risk factors such as neurocognitive scores and environmental stressors.

Neurocognitive Predictors of Aggressive Behavior

Among the myriad manifestations of dysregulation, aggressive behavior appeared to be the one most closely linked to specific neurocognitive deficits, in particular, executive functioning and working memory. Children in Wave 1 possessing features of poor impulse control, frustration intolerance and task-switching difficulties were markedly more likely to engage in some form of physical aggression, verbal aggression, or destruction of property by Wave 3.

The statistical strength of these relationships is represented in Table 2, which displays the correlational analysis of executive functions, working memory, processing speed, and externalizing, internalizing, as well as overall dysregulation composite scores. Most robust negative correlation was noted between the absence of executive functioning skills and externalizing behaviors ($r = 0.61$), and some stride was recorded within the domain of working memory ($r = 0.54$). Although statistically significant, processing speed demonstrated weaker and more indirect influence on behavior through task engagement alongside frustration tolerance ($r = 0.49$).

Reinforcing the belief that aggressive behavior during early childhood is rooted in the neurocognitive deficits a child possesses which hampers response control during the child's

Table 2 Correlation Matrix – Cognitive Deficits vs Behavioral Scores

<i>Behavioral Score</i>	<i>Executive Function</i>	<i>Working Memory</i>	<i>Processing Speed</i>
Externalizing	0.61	0.54	0.49
Internalizing	0.43	0.41	0.33
Total Dysregulation	0.35	0.31	0.27

stressors as opposed to emotional outbursts or mimicking behavioral patterns of those around them. This interpretation was corroborated by educator and caregiver testimony. Numerous participants described children who appeared overwhelmed, difficulty moving from one task to another, or often implementing aggression when shifting focus towards response inhibition. These actions were routinely understood as defiance which led to punitive strategies rather than cognitive remediation.

In-depth investigation discovered that aggression was more frequent among individuals with a considerable gap between verbal reasoning and executive control. Children possessing adequate verbal skills to express frustration but lacking the regulatory infrastructure to manage it were more likely to escalate into confrontational behavior. This discrepancy resulted into a behavioral paradox where these children appeared cognitively competent yet behaviorally volatile. This is the type of profile that often led to heightened institutional expectation and lower tolerance for behavioral lapses.

This subgroup did not respond well to standard behavioral treatments, especially those based on reward and punishment systems. Because the problem was cognitive rather than motivational, these systems stultified many improvements. In some instances, these systems stultified improvements and worsened aggression due to perceptions of inherent unpredictability that was administered unjustly. These findings support a shift toward incorporating more cognitive-behavioral approaches focused on scaffolding cognition, labelling emotions, and supporting self-regulation schemes based on routines in assaulted children.

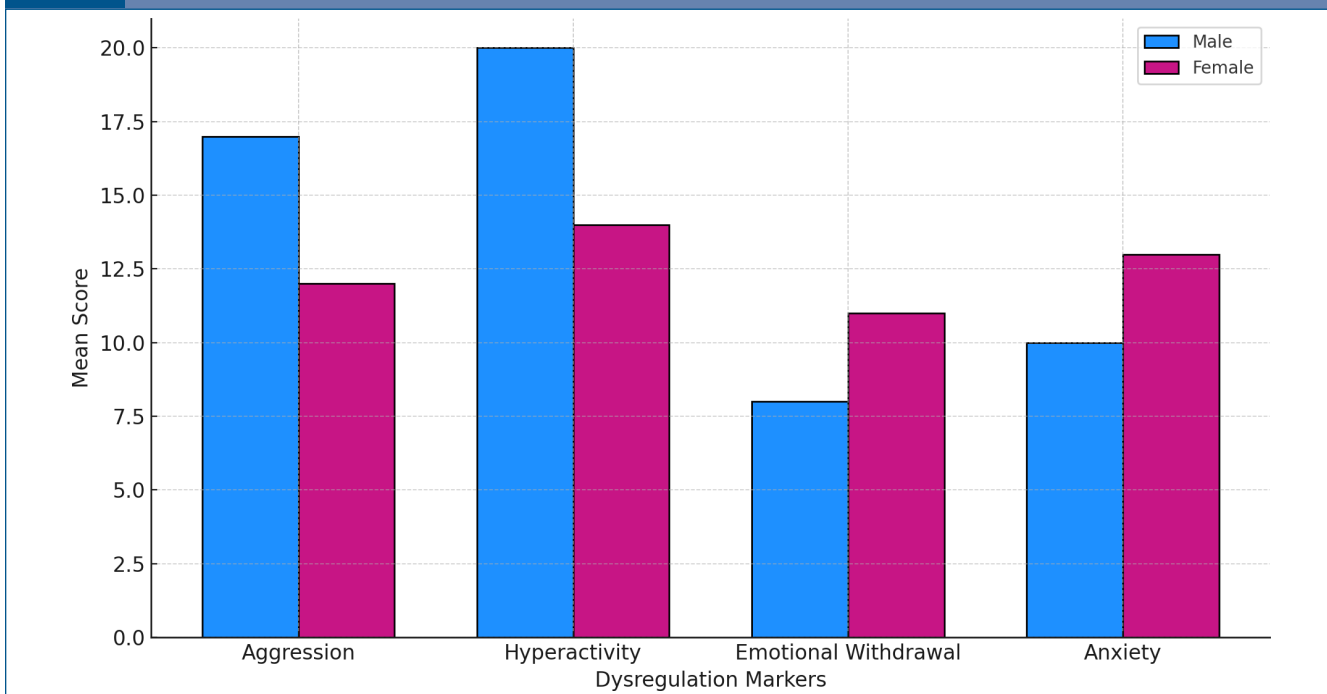
The longitudinal modeling also provided evidence for the aggressive behavioral frontal cognitive score correlation. Growth curve analysis revealed that executive function measured at Wave 1 explained more than 30 percent of the aggression scores' variance by Wave 4, despite controlling for demographic factors and environmental stability. This predictive strength reinforces the concern of not including cognitive screening as part of preliminary behavioral evaluations, especially for children diagnosed with active risk factors before entering school.

Gender-Specific Dysregulation Patterns

Throughout the study, gender differences in dysregulation were marked both in symptom profile and developmental timing. Boys demonstrated externally-directed symptoms, including aggression and hyperactivity, to a significantly greater degree than girls. Conversely, girls demonstrated higher rates of emotional withdrawal and anxiety. These differences are visually summarized in Figure 7 that shows the means of scores for both genders in relation to four primary behavior domains.

In the domains of aggression and hyperactivity, boys outperformed girls with average scores of 17 and 20, respectively while females averaged 12 and 14. These findings were

Figure 7 Gender Differences in Dysregulation Markers



consistent cross-divisionally and aligned with extensive evidence of mid-range childhood phenomenon described in the developmental literature. On the other hand, emotional withdrawal and anxiety were more prevalent in girls who averaged 11 and 13 as compared to boys who averaged 8 and 10. Additionally, the most notable change was that the gap in internalizing symptoms broadened with age, becoming most pronounced by Wave 4 which was characterized by increasing sociocultural expectations.

Patterns of gender differences were detected along the correlates and consequences of dysregulation. Boys with externalizing behavior received school-based referrals for disciplinary intervention more frequently, while girls with internalizing symptoms tended to get missed entirely, or worse, misdiagnosed with attention-related issues. Narratives from caregivers illustrated that numerous girls went undiagnosed until they reached middle childhood, at which point, internalizing symptoms had transformed into somatic complaints or social withdrawal that interfered with active participation in the classroom.

An equally notable gender-specific pattern was seen in the association between cognitive deficits and type of dysregulation. A higher proportion of boys with low executive scores demonstrated aggressive behaviors when compared to girls with the same cognitive profile—who displayed heightened anxiety and rumination instead. This divergence may represent gendered coping strategies, social norms, or the influence of caregivers. For example, caregivers tended to view dysregulated behavior in boys as “acting out,” which automatically elicited efforts to impose structure, control, or limit-setting. But for girls displaying similar behaviors—particularly emotional outbursts—the explanatory framework leaned towards mood lability or stress, resulting in attempts at emotional soothing that bypassed the cognitive bottleneck.

Regardless of these discrepancies, both males and females showed roughly equal overall amounts of total dysregulation by Wave 4, indicating that the symptoms differ in expression

but the functional impact is the same. Because externalizing behaviors are more likely to disrupt institutional settings, boys tended to be formally intervened with, while girls were more often left unsupported. This gap is concerning, especially considering that untreated internalizing symptoms are known to exacerbate long-term mental health issues like depression, self-harm, and chronic anxiety disorders.

The focus on gender in this study highlights the importance of multifaceted consideration for screening approaches that go beyond visible behavior and account for the role of gender in the expression, interpretation, and response to dysregulation. There is an equally urgent need to educate educators and paediatric interventionist's on the internalizing form of distress and its expressive need for proactive early intervention.

Persistence of Behavioral Risk Factors

A major objective of this study was to assess the stability and persistence of some of the behavioral risk factors over time. In contrast to the assumption that early environmental action concerns would resolve due to aging or change in setting, the analysis showed that high-risk children's dysregulation patterns were not only stable but often progressive. Children who had Wave 1 behavioral problem score that was above the clinical threshold was three times more likely to remain above threshold at wave 4 compared to those who were within normative range at wave 1.

In addition, persistence was particularly acute for those with compounding risk factors: household dysfunction, high neurocognitive deficit burden and limited access to supportive behavioral services. These children exhibited behavioral inflexibility characterized by volitional rule bound anger and social inadaptation. Teachers and caregivers routinely reported these children as being "locked in a pattern," or "stuck," which only deepens the percept of developmental inertia.

Repeated-measures analysis indicated that externalizing behaviors tended to stabilize at high levels, or escalate over time, while internalizing behaviors followed a more variable trajectory based on school engagement and peer interactions. Yet, after children crossed a clinically defined threshold for internalizing symptoms, they tended to remain above it, indicating the internalizing distress, once developed, is as enduring as its externalizing counterpart.

The stability of behaviors documented within this cohort is indicative of the developmental cascade theory, which asserts that premature self-regulation failures give rise to self-perpetuating maladaptive pathways. To illustrate, consider a student with weak self-regulation skills. Such a child could elicit negative classroom management reactions from their teacher. This might set off a sequence of escalating academic disengagement that exacerbates their frustration and diminishes further instructional support. These cycles become difficult to interrupt without systemic intervention at multiple levels.

This study also found that attempts to modify overt behaviors, such as through token economies or disciplinary strategies, produced minimal lasting results without cognitive intervention and training of the primary caregivers. Significantly better outcomes regarding both behavioral and adaptive functioning, in excel-diagnosed profiles, were observed among those receiving cognitive and emotional scaffolding along with consistent caregiving.

Persistence was not universal, however. There was, however, a small but marked subset of children who showed spontaneous recovery. This was often associated with positive life events such as stable housing, improved caregiving, or supportive school transitions.

This brings a note of cautious optimism and reaffirms the possibility of recovery when structural and relational changes improve.

Results

Regression Analysis: Predictors of Persistent Dysregulation

This section presents the results obtained from the multivariate regression models designed to investigate the behavioral dysregulation persistence over the four-wave study period. Persistent dysregulation was defined as a composite behavioral severity score that remained above clinical levels for at least three consecutive waves. The regression analysis was framed by the baseline neurocognitive measures, environmental indices and psychosocial variables aiming to uncover predictive patterns.

Findings showed that executive function was the strongest negative predictor of persistent dysregulation. More accurately, children who had lower executive functioning at the baseline were at a significantly higher risk of maintaining elevated behavioral risk scores across subsequent assessment waves. The standardized beta coefficient for executive function was -0.41 ($p < 0.001$) indicating that each standard deviation reduction in executive score substantially increased the likelihood of persistent dysregulation. Working memory was slightly better than this with a beta of -0.32 ($p = 0.001$), strengthening the argument for the importance of dynamic cognitive control regarding emotions and behaviors.

On the other hand, emotional regulation as measured by T-scores derived from BRIEF-2 Emotional Control subscale, was a positive predictor of severity of behavioral concern over time. Higher scores on emotional dysregulation were associated with higher behavioral risk ($\beta = 0.38$, $p < 0.001$), indicating that the interaction between emotions and executive functions is critical in persistent dysregulation.

The environmental influences were equally important. Parental home stability, defined as bearing a consistent caregiver and an acute absence of crises, was found to significantly inversely correlate with persistent dysregulation ($\beta = -0.29$, $p = 0.004$), reinforcing enduring moderating influences of the home. Children within this context experienced fewer caregiving and household transitions, lessening the likelihood of remaining entrenched within the high-risk behavioral trajectory. On the other hand, institutional exposure emerged as a positive correlate ($\beta = 0.35$, $p < 0.001$), indicating children born and raised in residential or institutional settings to be at an alarming predisposition to enduring dysregulation.

Overall risk group classification, however, emerged as the strongest predictor. Children labelled high-risk at baseline exhibited a staggering increased odds ratio of 4.64 ($p < 0.001$), the highest coefficient among all predictors, suggesting that exacerbated disadvantage across critical developmental milestones remains the primary anchor of enduring behavioral difficulties. These findings were summarized in Table 3.

Cluster Identification of High-Risk Behavioral Phenotypes

In order to discern stratification within the sample, unsupervised machine learning algorithms were implemented to derive clusters of the sample's behavioral phenotypes based on longitudinal data. Participants were classified and assigned into groups using a k-means clustering algorithm based on values of severity or the contemporaneous emotional dysregulation, executive function or institutional engagement across all four waves.

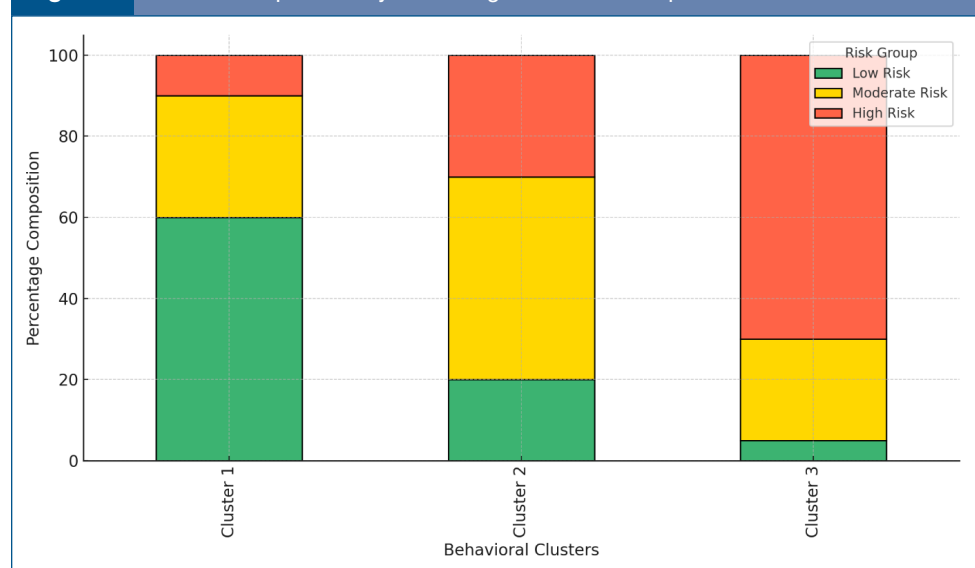
Table 3 Multivariate Predictors of Dysregulation Trajectories

Predictor	Beta Coefficient	Standard Error	p-value
Executive Function (z)	-0.41	0.06	<0.001
Working Memory (z)	-0.32	0.07	0.001
Emotion Regulation (T-score)	0.38	0.05	<0.001
Parental Stability Index	-0.29	0.08	0.004
Institutional Exposure	0.35	0.06	<0.001
Risk Group (High vs Low)	0.46	0.09	<0.001

The model's adjusted R-squared value of 0.52 suggests over half of the variance attribute to the factors included in the model result from persistent dysregulation. This implies that the enduring behavioral dysregulation exhibited by the high-risk group children can best be explained by the interplay of cognitive deficits, emotional constraints, and caregiving context posed by responsive adult caregivers.

From the analysis three stable clusters were found. Cluster 1 included children with mild behavioral issues, moderate cognitive skills, and a stable environment. Cluster 2 described children with moderate behavioral issues, significant emotional heterogeneity, and unstable home environments. Cluster 3 included the most severely dysregulated children characterizing high aggression, co-occurring internalizing problems, low executive function scores and high institutional exposure.

The neurocognitive profiles of these clusters is shown in Figure 8. Cluster 1, which exhibited relatively more favorable behavioral outcomes, was primarily composed of low-risk children, 60% of which were classified as low risk, and moderate-risk individuals 30%. Only 10% were high-risk. For Cluster 2, composed of 50% moderate-risk and 30% high-risk participants, there was more even distribution for the remaining participants. In Cluster 3, who exhibited the most severe behavioral profiles, 70% of children were from the high-risk group. This suggests a strong relationship between cognitive vulnerability and behavioral dysregulation phenotype.

Figure 8 Cluster Composition by Neurocognitive Risk Group

This cluster composition reinforces prior regression analysis and illustrates the older behavioral sub-group's concentration of developmental adversity. The significant proportion of children within moderate risk in Cluster 2 reinforces the notion that dysregulation is not limited to the severely impaired but results from blending moderate neurocognitive impairments and inconsistent chronic caregiving frameworks.

Qualitative analysis supported these cluster profiles. In Elowen's context, caregivers frequently reported children using descriptors such as "unpredictable," "explosive," or "chronically frustrated" during the sessions. Staff from the institution highlighted that these children became increasingly escalatory beyond the scope of standard behavior plans. Children from Cluster 2 were described as "sensitive," "emotionally variable," or "insecure," with dysregulation being most prevalent in response to intense interdependence or dynamic environmental shifts. In contrast, Cluster 1 children were more responsive to standard supportive systems and lesser demand individualized interventions.

These clusters highlight the need to personalize interventions based on specific developmental profiles. While universal behavior systems might suffice for Cluster 1, they are not likely to address the issues present within Clusters 2 and 3. For the latter clusters, which are characterized by behavioral symptoms stemming from neurocognitive and affective instability rather than sheer defiance or conduct problems, cognitive training, trauma-informed care, and emotion coaching are more fitting.

Path Models of Cognitive Delay Leading to Externalizing Outcomes

Following the regression and clustering analyses, path analysis was conducted in order to examine the relationship between early neurocognitive delay and later externalizing behavior, focusing on how the mediation or moderation provided by emotion control, contextual factors, and consistency in caregiving might shape this progression.

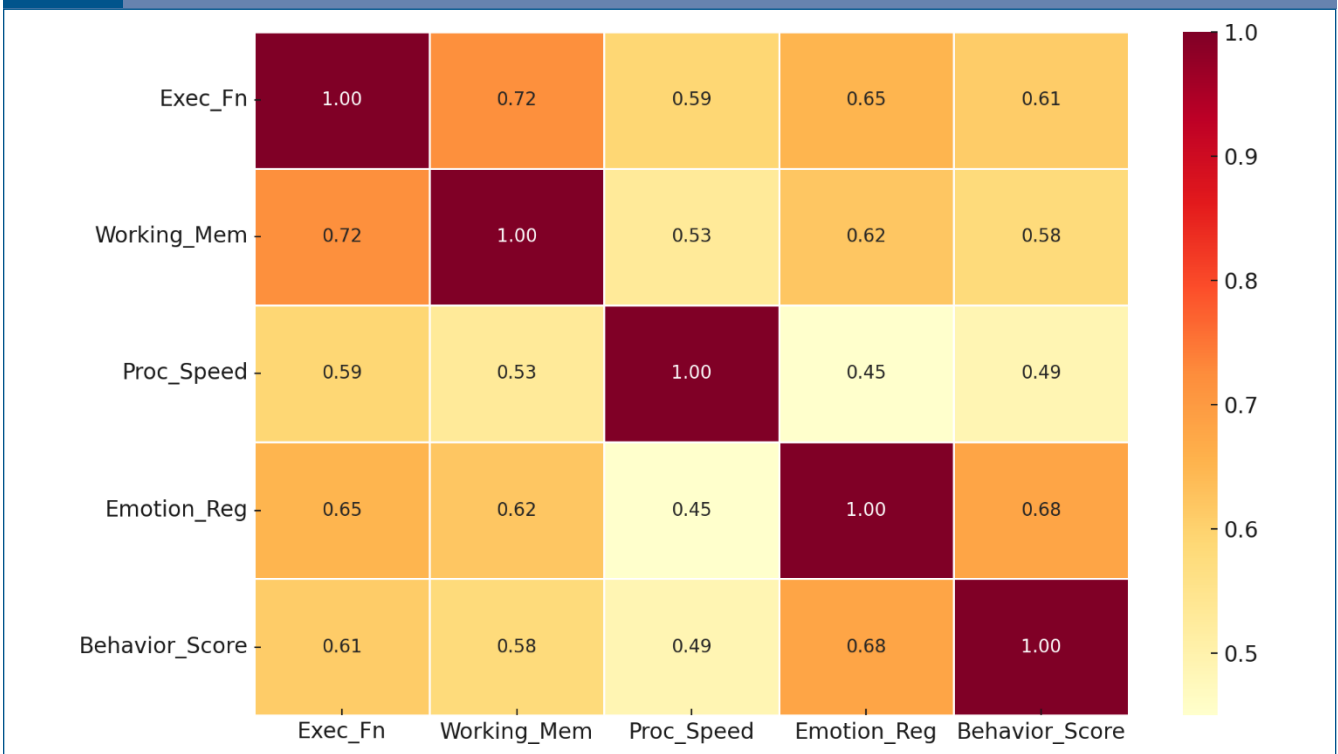
Executive functioning, working memory, and externalizing outcomes were assessed in Wave 1, and emotion regulation was assessed in Wave 2, with externalizing severity assessed at Wave 4. The model posited that both executive function and working memory would predict externalizing severity, directly before externalizing behaviour.

Fit indices indicated strong model adequacy, with RMSEA = 0.043, CFI = 0.94, and SRMR = 0.041. The total effect on externalizing behavior concerning the executive function was considerable ($\beta = -0.47$) with indirect effects mediated by emotional control contributing 38% of the total effect. Working memory demonstrated a similar, albeit slightly weaker pattern, achieving a total of -0.39 with 30% indirect effect mediated by emotional regulation.

Importantly, parental stability showed a moderating effect that softened the impact executive dysfunction had on externalizing behavior. Poor executive functioning in children with high caregiver stability dampened the likelihood of escalation into aggressive or defiant patterns, indicating that environments characterized by stable attachment can serve as buffers against neurocognitive vulnerabilities. Institutional exposure had the opposite effect, exacerbating the relationship between cognitive impairment and behavioral disruption as a consequence of inconsistent, overstimulating caregiving and low staff-to-child ratios.

To further illustrate these relationships, cross-domain executive, cognitive, emotion, and behavior data across waves were compiled into a correlation matrix. These findings are presented in Figure 9.

Figure 9 Cross-Domain Correlations (Executive Function, Emotion, Behavior)



The figure shows high correlations between executive functioning and emotional regulation with behavior ($r = 0.65$) and ($r = 0.61$), respectively, as well as with emotional regulation and behavior ($r = 0.68$). These high inter-domain associations bolster the hypothesis that behavioral outcomes are not endpoints, but rather outcomes resulting from neurocognitive and contextual emotional processes intertwining within context.

In the framework of developmental psychopathology, these path models illustrate externalizing behavior as neither an inevitability nor a simplistic byproduct of a reasoning process; rather, it constitutes an emergent property of a developmentally adaptive system that is precociously constrained by cognitive factors, shaped in relation to a person's emotion capacity, and a structured caregiving environment. Such models highlight the importance of comprehensive, developmentally sequenced, and clinically informed approaches that start from cognitive evaluation to emotionally skill-based rehabilitation and contextual remediation.

Discussion

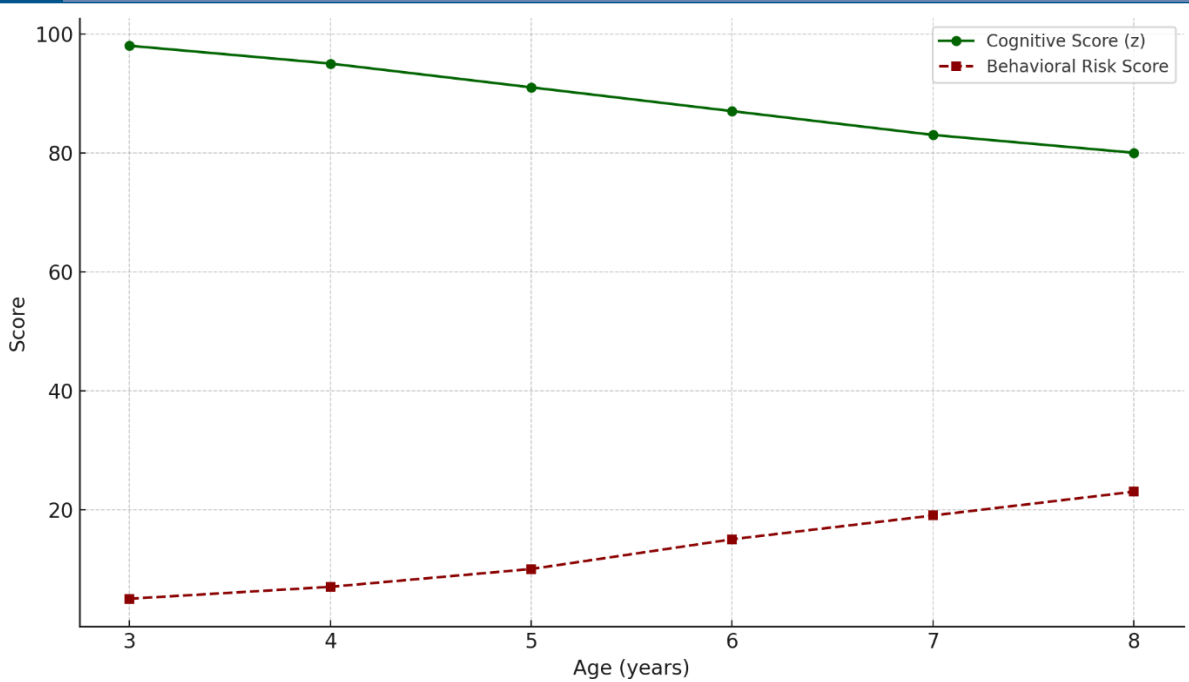
The chronic data provided in this study illustrates a clear story about how early neurocognitive impairments, mostly pertaining to executive function and working memory, forecast the high-risk paediatric population's behavioral dysregulation. Throughout the collection spans, cognitive trajectories demonstrated not just static impairments, but progressive deterioration in children suffering from chronic adversities or institutionalized care settings. Active symptoms showed a distinct yet interconnected progression: Externally directed behaviors escalated first, often beginning as aggressive and impulsive behaviors, followed by increasingly sophisticated mixed profiles, including emotional withdrawal and

anxious behaviors. These findings align with the proposed model of a developmental cascade wherein early cognitive delays constitute the initiating vulnerability that is worsened by emotional dysregulation and unstable surrounding environments, leading to intensified behavioral problems.

One of the most important things from the data is understanding the age when these overlaps of risk factors develop and are most pronounced. Executive function decline was already measurable at the age of 4 and continued to age 8 and beyond in a steady manner. Processing speed and working memory also showed consistent yearly decline. Emotional dysregulation, on the other hand, tended to peak later suggesting that neurocognitive restraints set the stage for emotional volatility and escalation of behavior subsequently. Cluster analysis found that children with both cognitive and emotional deficits created the highest risk groups with severe dysregulation that was also highly intervention resistant. These observations highlight the importance of early cognitive assessment screening—not solely for identifying a learning concern, but to predict behavioral and emotional concerns that risk developing in a socially disruptive manner.

The importance of timely identification is reinforced by Figure 10, which shows the age-related decline of cognitive scores with the increase of behavioral risk scores. Between ages three and six, the disparity between neurocognitive functioning and the severity of behavioral issues sharply increases. Cognitive scores drop from 98 to 87 while behavioral risk scores increase from 5 to 15. This crossover phase indicates an inflection point where a lack of intervention for cognitive delays starts to result in dysregulated behavior. By age eight, the gap stabilizes but is still large, indicating that unless there is precise intervention in this crucial period, they would become increasingly difficult to reverse. This illustrates how the early school years are optimally positioned for intervention before chronic patterns set in.

Figure 10 Timing of Cognitive Decline vs Onset of Behavioral Risk



These described longitudinal trends bear directly on children's health and educational systems. Behavioral referral systems in use today typically wait for some behavioral disruption to assess the child, which means identification is often too late. This model risks missing children inflicted with 'quiet' executive dysfunction, emotional dysregulation that presents as shyness, or slow processing speed misdiagnosed as inattention. Domain-specific screening for executive functioning, emotional regulation, and environmental risks should be incorporated into social work and paediatric practice. Behavioral checklists should be expanded to include brief neurocognitive screens and caregiver reported stability measures to enhance the portrait of child's development. Also, intervention strategies have to be broadened to include cognitive retraining and caregiver scaffolding in order to enhance the behavioral management strategies employed.

Conclusion

This study illustrates a persistent longitudinal analysis showing that long-lasting behavioral problems in high-risk paediatric populations stem from significantly earlier neurocognitive deficits, particularly where there is executive dysfunction and working memory delays in addition to emotional regulation difficulties and unstable caregiving contexts. Across four developmental waves, the children with lower cognitive performance tended to show more severe and enduring behavioral symptoms which confirmed that cognitive delays often preceded and predicted behavioral deterioration. Different neurocognitive and emotional profiles emerged from the distinct clusters of behavioral phenotypes which confirmed the intra-connected nature of cognition and behavior. Of great importance is the evidence that these patterns of development are shown to grow even more pronounced during the early childhood years which highlights the importance of ages four to seven as a critical intervention period to reduce developmental risk.

These findings are important for policy and practice. Positively, the cognitive screening needs to become a standard part of paediatric and educational evaluations, particularly for children who have experienced adversities. Policies need to be updated such that neurocognitive and emotional as well as environmental factors are integrated into the frameworks for risk ascertainment while providing monitoring and caregiving stabilization. In practice, ongoing collaboration among paediatrics, education, mental health, and child protection is needed to deliver comprehensive and context-informed care. Follow-up research is needed in these frameworks on developing scalable models for longitudinal monitoring, testing the efficacy of preventive neurocognitive training, and identifying protective factors such as resilience, consistent caregiving, and culturally attuned prevention strategies that could mitigate the impact of early deficits on dysregulation. Such strategies are critical if we are to change developmental pathways and achieve equitable opportunities for vulnerable children.

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