

## Memory Maintenance and Inhibitory Control Differentiate from Early Childhood to Adolescence

Yee Lee Shing and Ulman Lindenberger

*Max Planck Institute for Human Development, Center for Lifespan Psychology  
Berlin, Germany*

Adele Diamond

*Department of Psychiatry, University of British Columbia, Vancouver, Canada and  
Division of Child & Adolescent Psychiatry, BC Children's Hospital, Vancouver, Canada*

Shu-Chen Li

*Max Planck Institute for Human Development, Center for Lifespan Psychology  
Berlin, Germany*

Matthew C. Davidson

*Department of Psychology, University of Massachusetts, Amherst, Massachusetts*

Existing evidence suggests that the organization of cognitive functions may differentiate during development. We investigated two key components of executive functions, memory maintenance and inhibitory control, by applying latent factor models appropriate for examining developmental differences in functional associations among aspects of cognition. Two-hundred and sixty-three children (aged 4 to 14 years) were administered tasks that required maintaining rules in mind or inhibiting a prepotent tendency to respond on the same side as the stimulus. Memory maintenance and inhibitory control were not separable in children of 4–7 or 7–9.5 years, but were differentiated in an older group (9.5–14.5 years).

Psychometric research generally emphasizes the stability of the structure of cognitive abilities (see Carroll, 1993; Sternberg, 1994, for reviews). In contrast, multivariate research on cognitive development in children and older adults highlights developmental differences in the structure of cognitive abilities and their functional organization (Cattell, 1971; Flavell, 1982; Garrett, 1946; Horn, 1968; Jones & Conrad, 1933). One of the main hypotheses concerning changes in the functional organization of cognitive abilities during child development is the *differentiation hypothesis* (e.g., Garrett, 1946). It postulates that the structure of intelligence develops from a relatively unified, general ability in childhood to more differentiated, specific cognitive abilities by early adulthood. Heinz Werner (1957) generalized the notion of differentiation to the *orthogenetic prin-*

*cipte*, denoting that development proceeds from a state of relative globality to a state of increasing differentiation and hierarchical integration. The notion of developmental changes in specificity and differentiation of cognitive processes was later extended to account for cognitive changes across the lifespan, suggesting that the organization of cognitive processes de-differentiates in old age. Indeed, considerable evidence for such de-differentiation has been found (Baltes, Cornelius, Spiro, Nesselroade, & Willis, 1980; Schaie, 1962; for recent evidence, see de Frias et al., 2007; Li et al., 2004).

Methodologically, developmental differentiation refers to the observation that the degree of correlation across different intellectual abilities, often represented as the prominence of a general factor (*g*) of intellectual functioning, decreases from childhood to adulthood (e.g., Carroll, 1993). This empirical observation is assumed to reflect the decreasing influence of domain-general processing constraints and the increasing importance of specialized mechanisms and knowledge across development (Baltes, Lindenberger, & Staudinger, 2006; Deary et al., 1996; cf. Spearman, 1927).

This study provides evidence for the developmental differentiation of two cognitive functions that depend on the prefrontal cortex (PFC), working memory and inhibitory control, in the course of child development. Both working memory and inhibitory control are key components of executive functions, broadly defined as processes that control (e.g., regulate and coordinate) goal-directed behavior and are often linked to the functioning of the PFC (Diamond, 2006; Miller & Cohen, 2001; Miyake & Shah, 1999; Stuss & Benson, 1986). Working memory has been conceptualized differently by various researchers. Notwithstanding the conceptual differences, a general consensus holds that working memory refers to the ability to briefly hold information in mind (memory maintenance) while also performing mental operations on that information (e.g., Baddeley, 2007; Baddeley & Hitch, 1974; Cowan, 1995; Just & Carpenter, 1992; Petrides, 1994; Shah & Miyake, 1996; Smith & Jonides, 1999). In adults, memory maintenance appears to rely more heavily on ventrolateral (inferior) PFC (except at supra-span levels) and manipulation of its contents appears to rely more on dorsolateral PFC (D'Esposito, Postle, Ballard, Lease, 1999; D'Esposito, Postle, & Rypma, 2000; Rypma, Berger, & D'Esposito, 2002; Rypma & D'Esposito, 1999).

Inhibitory control refers to the ability to suppress inappropriate response or attentional tendencies in order to act appropriately (Carlson, Moses, Hix, 1998; Dempster, 1992; Diamond, 1989, 2006; Moutier, Plagne-Cayeux, Melot, Houdé, 2006; Nigg, 2000). It, too, relies on lateral PFC, albeit usually more posteriorly within lateral PFC (Casey et al., 1997; Durston et al., 2002; Leung & Cai, 2007; Xue, Aron, & Poldrack, 2008). When memory maintenance and inhibition are compared directly within the same study (e.g., Bunge, Ochsner, Desmond, Glover, & Gabrieli, 2001; McNab et al., 2008), both processes recruit several overlapping regions. However, within the circuitry, some regions are more critically involved in the resolution of interferences, whereas others are more involved in the resolution of an increase in maintenance load, supporting the notion that the two processes are distinct but interrelated. In this article, we focus on the information-maintenance aspect of working memory (henceforth termed "memory maintenance") and inhibitory control and investigate whether developmental differentiation occurs between these executive functions.

Empirical studies in the psychometric tradition have often investigated the developmental differentiation hypothesis with measures of intellectual abilities that do not map onto specific cognitive mechanisms such as working memory or inhibitory control. Evidence from this line of re-

search is mixed. In a classical review of about 60 factor analytic studies, Reinert (1970) reported a trend toward increasing differentiation of abilities with age. However, in a more recent review, Carroll (1993) failed to find strong evidence in support of differentiation. Results from a handful of recent cross-sectional studies investigating this topic are consistent with Carroll's finding, as the proportion of variance accounted for by a general factor was found to remain unchanged across age groups (e.g., Bickley, Keith, & Wolfle, 1995; Deary et al., 1996; Juan-Espinosa, Cuevas, Escorial, & Garcia, 2006; Juan-Espinosa, Garcia, Colom, & Abad, 2000; Juan-Espinosa et al., 2002). An exception to this is a study conducted by Tideman and Gustafsson (2004). Employing multiple-group confirmatory factor-analytic techniques, the authors found that latent factors of verbal and non-verbal intelligence were less highly correlated in older age groups (6- to 7-year-olds) than in younger children (3- to 4-year-olds), consistent with the developmental differentiation hypothesis.

To date, there is a small but growing body of research that directly examines the functional organization of basic cognitive mechanisms (as opposed to intelligence constructs) across child development. Gathercole and colleagues (Gathercole, Pickering, Ambridge, Wearing, 2004; Alloway, Gathercole, & Pickering, 2006) examined whether the structure of working memory (according to the Baddeley multi-component model) changes during child development. In general, the authors found that the basic structure of working memory components is largely in place by 4 years of age. However, the domain-specific visuospatial construct and the domain-general processing construct show stronger links in younger children (4–6 years old) compared to older children. In a recent lifespan study, Li et al. (2004) examined correlations among a variety of basic processes (ranging from visual search, response competition, long-term and short-term memory search, and choice reactions) and psychometric intelligence (i.e., fluid and crystallized intelligence) in a lifespan sample covering the ages of 6 to 89 years. It was found that correlations between fluid and crystallized intelligence and the constituent cognitive processes were stronger at either end of the lifespan than in young adulthood. These results support the longstanding theoretical conjecture (Baltes et al., 1980; Schaie, 1962) that intellectual abilities and cognitive processes are more undifferentiated in childhood, gradually become more specialized and reach a more differentiated state in adolescence and adulthood, and then undergo de-differentiation during old age. Given that higher-order intellectual functions are supported by basic cognitive mechanisms, we decided to examine whether increasing differentiation can be observed in the functional organization of two key components of executive functions: memory maintenance and inhibitory control.

Recent progress in understanding the neural bases of cognitive development and the emerging emphasis on cross-level integrations provide increasing opportunities for linking cognitive differentiation to neural changes (Churchland & Sejnowski, 1988; Li & Lindenberger, 1999; Li, Lindenberger, & Sikström, 2001; Lindenberger, Li, & Bäckman, 2006; Munakata, Casey, & Diamond, 2004; Nelson et al., 2002). Specifically, the development of memory maintenance and inhibitory control, the two mechanisms investigated here, appears to be closely linked to the development of PFC. Converging evidence from anatomical, neurochemical, and functional studies suggests that PFC and the functional circuits in which it participates undergo profound changes and reorganization over age well into adolescence and young adulthood (e.g., Bens, 2002; Casey, Galvan, & Hare, 2005; Diamond, 2002; Elbert, Heim, & Rockstroh, 2001; Giedd et al., 1999; Gogtay et al., 2004; Lenroot & Giedd, 2006; Paus, 2005; Sowell, Thompson, Holmes, Bath, et al., 1999; Sowell, Thompson, Holmes, Jernigan, & Toga, 1999).

At the functional level, neuroimaging studies suggest that cognitive development is accompanied by changes in patterns of brain activation, including enhanced activation in critical regions, attenuation in others, as well as shifts in lateralization (e.g., Bunge, Dudukovic, Thomason, Vaidya, & Gabrieli, 2002; de Haan, Pascalis, & Johnson, 2002; Durston et al., 2006; Johnson, 2000, 2001). These effects taken together usually result in more focal and less diffuse brain activation from childhood to adulthood. Also, the activation pattern seen during one type of cognitive task shows less overlap with the pattern of neural activation while performing a different task. Both of these patterns are consistent with a change from less differentiated neural mechanisms to more differentiated function. When differentiation first starts to occur, focal activation is quite intense, but with increasing efficiency the key neural region needs to work less hard. Accumulating evidence suggests that functional circuitry (within-region as well as between regions) and cortical dynamics are constantly undergoing reorganization in adapting to influences such as environmental stimulation, experience, brain development, and deterioration or damage (e.g., Li, 2003; Mueller, Brehmer, von Oertzen, Li, & Lindenberger, 2008; Mueller, Gruber, Klimesch, & Lindenberger, submitted; Theoret et al., 2005).

### AIMS OF THIS STUDY

We postulate that the increasing specialization of PFC neural circuits over time, in conjunction with normative developmental experiences, promotes the differentiation of PFC-dependent cognitive functions. In early childhood, the operation and expression of basic cognitive mechanisms are assumed to depend strongly on system-general constraints. With maturation, these system-general constraints are relaxed through increased specification and specialization of neural circuits, which in turn support greater complexity in cognitive structure and diversity in the operations of cognitive mechanisms.

The analyses reported here are based on data originally reported by Davidson, Amso, Anderson, and Diamond (2006). In contrast to that publication, which, for the most part, examined age differences separately for each of the different tasks, here we use multivariate statistical techniques to examine age differences in the relations among tasks. In the original study, 325 participants (from 4 to 13 years of age and young adults) were tested on a computerized battery of tests designed to independently manipulate (a) the maintenance and manipulation of information held in mind and (b) inhibitory control, to examine the development, interrelations, and possible independence of these two domains of function. Specifically, the battery included tasks designed to vary demands on retaining and processing information that is held in mind and/or inhibiting irrelevant information and/or prepotent responses, in single-task as well as in task-switching contexts (the latter requiring more cognitive flexibility). Although only behavioral data were presented in the Davidson et al. (2006) article, the battery of tasks was designed to be suitable for use in the MR scanner environment and those results have been presented elsewhere (Diamond, O'Craven, & Savoy, 1998).

Differences in the developmental trajectories of information maintenance and inhibitory control aspects of executive functions have been reported (Diamond, 2002; Huizinga, Dolan, & van der Molen, 2006; Luciana, Conklin, Hooper, & Yarger, 2005). In the original article, Davidson et al. (2006) found that 4-year-old children were already able to retain two conditional rules in mind, and that the relative increase in difficulty of holding more rules in mind did not change over age.

Inhibitory control, on the other hand, was especially difficult for younger children as they showed (a) an inhibitory cost completely absent in adults (a cost in both speed and accuracy of exercising inhibition in single-task blocks of incongruent trials versus single-task blocks of congruent trials), (b) that inhibitory cost (the difference in performance on congruent and incongruent blocks) was greater for children of 4–9 years of age than was the differences in performance due to increasing the memory load from two to six items, and (c) the younger the child, the greater the spatial incompatibility effect in variants of the Simon task (reflecting the cost of inhibiting the pull to respond on the same side as the stimulus). The age difference in performance was greatest in the most difficult condition, in which inhibition and memory maintenance were taxed in a task-switching context (Davidson et al., 2006; see Kray, Eber, & Lindenberger, 2004; Kray & Lindenberger, 2000, for parallel findings in aging and across the lifespan). In addition to examining age differences in mean performance level, Davidson et al. examined raw correlations between the memory maintenance and inhibitory control measures. To their surprise, the correlations turned out to be high, despite their hypothesis that the two constructs would be independent.

### ANALYTICAL STRATEGY

By using statistical models separating specific variance from variance common to all indicators of a given construct, this study examines the hypothesis that inhibitory control and the maintenance aspect of working memory develop from a relatively unitary executive function construct at younger ages into distinct mechanisms at older ages. As discussed by Burgess (1997), interpretation of raw correlations among executive function tasks (as was done by Davidson et al., 2006) may be problematic due to issues associated with task impurity, low reliability, and measurement error. A multivariate latent variable approach (i.e., confirmatory factor analysis) that simultaneously accounts for measurement error and extracts common variance among the tasks provides better estimates of interrelations among postulated constructs (Horn & McArdle, 1992; Nesselroade & Thompson, 1995). Thus, the present analysis extends the original work of Davidson et al. (2006) by representing both the mean and covariance structures between memory maintenance and inhibitory control as two aspects of executive functions at the latent (error-free) level separately for three age groups, thereby allowing for a direct test of the developmental differentiation hypothesis.

In an early observation, Nesselroade (1970) postulated that “the universe of behavior is not constant for different age levels and therefore the manifest nature of the factor in behavioral measures will change” (pp. 199–200). According to this notion of differential manifestation, the same ability may manifest itself in different ways as development unfolds (see also, Kagan, 1980). The analytical strategies of structural equation modeling applied in child development and aging research are typically more appropriate for examining individual differences in *amount* (quantity) rather than in *form* (quality) (cf. Nesselroade, Gerstorf, Hardy, & Ram, 2007). In particular, invariant loading patterns across groups (i.e., invariance in form) are seen as prerequisites before factor comparisons across groups can be considered legitimate (see e.g., Meredith, 1993). This view on invariance assumes that the behavioral manifestations of unobserved abilities are necessarily the same across development and there can only be quantitative difference.

Here, we follow a relatively novel strategy for identifying and scaling latent variables that allows for different manifestations of latent factors in different age groups (for a similar application in aging research, see Tucker-Drob & Salthouse, 2008). The basic strategy was introduced by Lit-

tle, Slegers, and Card (2006) and designated as the effects-coding method. The strategy entails constraining the set of indicator intercepts to sum to zero for each construct and the set of loadings for each construct to sum to the number of unique indicators. As a consequence, the estimated latent variances and latent means meaningfully reflect the observed metric of the indicators, optimally weighted by the degree to which each indicator represents the underlying latent construct. Little et al. (2006) noted that this strategy adheres to Nesselroade's (2007) idiographic method. Within the invariant configuration of construct-indicator mappings, differences in the relative pattern of factor loadings across groups capture the idiosyncratic manifestation of a construct while simultaneously yielding latent variable estimates for group comparison. In the context of the current study, decreases over age in the correlation between factors indicate increasing differentiation at the level of process interrelations with age.

## METHODS

We restrict the description of measures and procedures to variables that are of primary relevance to the analysis reported here (for more details of the original study see Davidson et al., 2006).

### Participants

Adults in the original sample were excluded from the present analyses because of the small sample size ( $N = 20$ ), which would have prevented use of confirmatory factor analysis. This left us with 263 participants with complete data, aged 4 to 14 years. For the multiple-group analysis, the sample was equally divided into three age groups: youngest ( $N = 90$ ;  $M_{age} = 5.2$  years; age range = 4.0–6.7 years), middle ( $N = 90$ ;  $M_{age} = 8.05$ ; age range = 6.8–9.45 years), and oldest ( $N = 83$ ;  $M_{age} = 11.14$ ; age range = 9.5–14.6 years). Having three age groups was based on theoretical considerations that it is important to keep the separation between the middle and oldest group as developmental difference in PFC integrity was found between pre-adolescent and adolescence periods (e.g., Giedd et al., 1999).

### Procedures

Participants completed six tasks designed to vary demands on memory load, inhibitory control, or both. All tasks were computer administered, including stimulus presentation and response recording. Participants were instructed to hold a button box with both hands and to respond with their thumbs. For each trial, one stimulus appeared either at the left, right, or middle of the screen. Depending on the conditional rules associated with the stimuli for each task (e.g., if stimulus A, press left; if stimulus B, press right), participants had to decide whether to press the left or right button. To adjust for the robust effect of age differences in processing speed, stimulus presentation time was 2,500 msec for the youngest age group, whereas stimulus presentation time was 750 msec for the middle and oldest age groups. Stimulus durations were established based on pilot testing. Differences in stimulus duration across the groups affected mean performance but not the correlations among tasks within each group and thus should not pose a concern for the present analyses. The current analysis focused on factor structure instead of mean performance, we refer the readers to the original publication (i.e., Davidson et al., 2006) for results of mean performance.

Each task began with instructions followed by a short practice block consisting of four or six trials. Achieving more than 75% correct performance on the practice trials and being able to verbally explain the conditional rules of the task to the experimenter were the criteria for indicating that a participant had obtained a good enough understanding of the task to proceed to testing. Participants were allowed to repeat the practice block if necessary to achieve that criterion. In the following sections, each of the six tasks is described.

## Tasks

**Abstract shapes.** This memory task consisted of two conditions that varied in set size, involving either two or six abstract shapes. At the beginning of each block, participants were taught a rule for each shape (i.e., whether they should press the left or right button when that abstract shape appeared). The stimuli were presented in the center of the screen so there should have been no preferential activation of the right or left hand. The Abstract Shapes task taxed memory maintenance but not inhibition. Participants first completed the two-shape condition, followed by the six-shape condition. There were two blocks of 20 trials for each of these two conditions. For each condition, the dependent measure was the proportion of correct responses over total responses.

**Dots—Incongruent.** Two types of dots (striped or solid) were used as stimuli for this task. In each trial, a stimulus appeared randomly on the left or right side of the screen. For half of the participants a solid dot indicated they should respond on the side opposite to the location of the dot (i.e., spatially incompatible trials). For a striped dot they were to respond on the same side as the dot. For the other half of participants, these instructions were reversed. All participants started with an initial block of 20 compatible trials (i.e., respond on the same side as the dot, called the Dots—Congruent condition). Since this condition placed little demand on either inhibition or working memory, it is not considered here. This condition was followed by a block of 20 incompatible trials (Dots—Incongruent). Participants had to inhibit the prepotent tendency to respond on the same side as the stimulus in order to respond correctly (Lu & Proctor, 1995; Georgopoulos, 1994; Georgopoulos, Lurito, Petrides, Schwartz, & Massey, 1989). The dependent measure was the proportion of correct responses in this block.

**Dots—Mixed.** This condition was presented after the Dots—Congruent and Dots—Incongruent conditions. Here, both types of dots (striped and solid) were used as stimuli. Before the task started, participants were reminded again about the conditional rule associated with each of the two dots. Either a striped or solid dot appeared randomly on the left or right of the computer screen, yielding spatially compatible and incompatible trials. Participants had to hold in mind the two rules, mentally calculate whether same-side or opposite-side meant press left or press right on a given trial, inhibit the irrelevant rule, and (on spatially incompatible trials) inhibit the tendency to press the button on the same side as the stimulus. This task heavily taxed both inhibition and working memory. There were 20 trials. The dependent measure was the proportion of correct responses on spatially-incompatible trials in this block.

**Pictures.** This inhibitory control task was a classic Simon task. A color picture of either a frog or butterfly was presented on the left or right of the computer screen. Participants were instructed to press the left button when they saw a butterfly, and to press the right button when they saw a frog. Stimuli were presented randomly on the left or right of the screen over the block of 20

trials, yielding spatially compatible and incompatible trials. To minimize the demands on memory, small pictures of the stimuli were attached next to the correct buttons on the response box. Thus, the Pictures task is seen as taxing inhibition on spatially incompatible trials, but not taxing memory. The dependent measure was the proportion of correct responses on spatially incompatible trials.

**Arrows.** In this measure of inhibitory control, an arrow (either pointing straight down or toward the opposite side at a 45-degree angle) was presented randomly at the left or right of the computer screen. When an arrow pointing straight down appeared on the screen, participants were to press the button on the same side as the arrow (spatially compatible trials). When an arrow pointing diagonally toward the opposite side appeared, participants were to press the button on the side opposite the arrow (spatially incompatible trials). Twenty trials were administered. The Arrows task is seen as taxing inhibition of the tendency to respond on the same side as the stimulus for trials with a diagonal arrow, but it is not seen as taxing memory because no arbitrary, abstract association needed to be held in mind; all participants had to do was look at the stimulus and it indicated where to respond. The dependent measure was the proportion of correct responses on spatially incompatible trials.

### Overview of Statistical Analyses

Trials in which a response was given in less than 200 msec (anticipatory response) were considered too fast to be meaningful and thus were excluded from the analyses. The mean proportion of such non-valid responses ranged from 10–17% across tasks. Significant age-specific and task-specific effects on anticipatory responses were observed (see Davidson et al., 2006). This was resolved by taking proportional measures of accuracy. We focused on accuracy instead of reaction time because reaction time measures are known to reflect a strong processing speed factor (e.g., Fry & Hale, 1996; Li et al., 2004; Salthouse, 1996). The correlations between reaction time measures are high in all age groups and produce factors that are highly correlated, precluding the possibility of detecting age differences in differentiation, unless a wide lifespan age range is covered (e.g., Li et al., 2004).

For each measure, outliers were identified within each group as having a  $z$ -score of more than 3.29 ( $p < .001$ , two-tailed test). Only .01 percent of the data was considered as outliers (distributed equally across the groups) and extreme scores were replaced with the next most extreme score within the acceptable distribution. Descriptive data for all tasks are listed in Table 1. Most variables showed acceptable distributions in each age group (i.e., no extreme skewness or kurtosis). The reliability of each measure was examined with the Spearman-Brown reliability coefficient estimated from split-half reliabilities between odd- and even-numbered trials of the corresponding task. This procedure yielded satisfactory values for reliability for most tasks: .69 for Arrows, .74 for Dots—Incongruent, .70 for Dots—Mixed, .87 for 2-Abstract-Shape, .75 for 6-Abstract-Shape, and .55 for Pictures.

### Steps of Confirmatory Factor Analysis

Structural equation modeling analyses were implemented in *M-plus* (Muthén & Muthén, 1998–2006). We first attempted to achieve a tenable multiple-group solution (Horn & McArdle, 1992;

TABLE 1  
Means, Standard Deviations, Kurtosis, and Skewness for Each Measure  
Within Each Age Group

	<i>2-Abstract- Shapes</i>	<i>6-Abstract- Shapes</i>	<i>Dots— Incongruent</i>	<i>Arrows</i>	<i>Dots— Mixed</i>	<i>Pictures</i>
<i>Youngest group</i>						
Mean	0.90	0.81	0.89	0.75	0.69	0.88
Standard Deviation	0.10	0.14	0.13	0.26	0.31	0.13
Kurtosis	0.46	-0.90	2.86	0.18	-0.39	0.67
Skewness	-1.16	-0.32	-1.73	-1.05	-0.82	-1.07
<i>Middle group</i>						
Mean	0.87	0.76	0.90	0.68	0.74	0.81
Standard Deviation	0.09	0.12	0.11	0.24	0.20	0.16
Kurtosis	3.94	0.38	0.89	-0.54	0.75	0.51
Skewness	-1.72	-0.70	-1.25	-0.58	-0.93	-0.87
<i>Oldest group</i>						
Mean	0.92	0.81	0.95	0.80	0.84	0.89
Standard Deviation	0.06	0.14	0.06	0.19	0.15	0.11
Kurtosis	1.12	-0.18	0.64	2.48	-0.23	-0.11
Skewness	-1.20	-0.79	-1.24	-1.44	-0.85	-0.83

The youngest age group received a longer presentation time than the other age groups.

Vandenberg & Lance, 2000). A three-group model was fit, with the equality constraints mentioned above imposed. Having established a tenable two-factor model, a sequence of increasingly strict sets of equality constraints was imposed across age groups to examine the extent of measurement and factorial invariance. The latent factors were regressed onto age to control for potential group differences in the contribution of age-induced collinearities to the factor structure.

All structural models were computed using maximum likelihood estimation. Several indices of model fit were considered. Models were considered a good fit with  $\chi^2/df$  of less than 2, comparative fit index of more than .95 (CFI; Bentler, 1990), and a root-mean-square error of approximation of less than .08 including .05 with its 90% confidence interval (RMSEA; Browne & Cudeck, 1992; Steiger, 1990). Nested models were compared by testing the significance of the difference in  $\chi^2$ , with the degrees of freedom being equal to the difference in the number of free parameters between the two models. The threshold for statistical significance was specified at the .05 level.

## RESULTS

Goodness-of-fit test results of the models are presented in Table 2. First, a one-factor model was simultaneously fit to the data of all age groups (Model 1). All tasks loaded on a general factor and parameters including factor loadings, factor variance, factor means, indicator intercepts, and unique variance (residuals) were estimated. As can be seen in Table 2, the fit of Model 1 was not acceptable,  $\chi^2 = 65.03$ ,  $\chi^2/df = 1.55$ , CFI = 0.89, and RMSEA = 0.08 (90% CI = .04 to .12). Thus, within the common metric space of all age groups, a single factor model did not adequately capture the complexity of the data.

TABLE 2  
Summary of Model Fitting Procedure

<i>Competing models</i>	$\chi^2$	<i>df</i>	<i>CFI</i>	<i>RMSEA (90% CI)</i>	<i>Nested comparison</i>	$\Delta \chi^2$	$\Delta df$
1. One factor	65.03	42	.89	.08 (.04–.12)			
2. Two factors, configural invariance	55.84	36	.91	.08 (.03–.12)			
3. Full Metric Invariance (all factor loadings equal across groups)	73.15	44	.86	.09 (.05–.12)	3 vs. 2	17.31*	8
3a. Partial Metric Invariance (Inhibitory Control loadings equal across groups)	71.41	42	.86	.09 (.05–.12)	3a vs. 2	15.57*	6
3b. Partial Metric Invariance (Memory Maintenance loadings equal across groups)	58.31	38	.91	.08 (.03–.12)	3b vs. 2	2.47	2
4a. Correlation of youngest group = 1	58.60	39	.91	.08 (.03–.11)	4a vs. 3b	0.29	1
4b. Correlation of middle group = 1	58.71	39	.91	.08 (.03–.11)	4b vs. 3b	0.34	1
4c. Correlation of oldest group = 1	62.91	39	.89	.08 (.04–.12)	4c vs. 3b	4.61*	1
4d. Correlation of youngest group = Correlation of middle group	58.99	39	.91	.08 (.03–.11)	4d vs. 3b	0.68	1
4e. Correlation of all groups equal	63.61	40	.89	.08 (.04–.12)	4e vs. 4d	4.62*	1

See text for detailed description of the models. *df*: degrees of freedom for  $\chi^2$  test; *CFI*: comparative fit index; *RMSEA*: root mean square error of approximation. \* $p < .05$ .

Second, a model with two correlated factors was fit. We postulated two factors: (a) *memory maintenance* (as measured by 2-Abstract-Shapes and 6-Abstract-Shapes, assuming that the common variance between the two memory tasks reflects the ability to hold rules in mind) and (b) *inhibitory control* (as measured by Dots—Incongruent, Dots—Mixed, Pictures, and Arrows, assuming that the common variance among these four tasks reflects the ability to inhibit stimulus-congruent response tendencies). The loading patterns were fixed to be the same across all groups (configural invariance), while the factor loadings, factor variances, unique variance parameters (i.e., error variances), factor means, and intercepts of indicators were allowed to vary across the three age groups (see Figure 1). Model 2 provided a better fit to the data than Model 1,  $\chi^2 = 55.84$ ,  $\chi^2/df = 1.55$ , *CFI* = .91, and *RMSEA* = .08 (90% *CI* = .03 to .12). The correlation estimated for the youngest group was .98, for the middle-aged group it was 0.81, and it was 0.32 for the oldest group. This model provides initial support to the hypothesis that memory maintenance and inhibitory control differentiate with increasing age.

We next proceeded from configural to metric measurement invariance by imposing equality constraints on the unstandardized factor loadings (Model 3). Model 3 was nested within Model 2, and a direct comparison showed that the assumption of equal factor loadings was not tenable,  $\Delta\chi^2 = 17.31$ ,  $\Delta df = 8$ ,  $p = .03$ . In other words, constraining all factor loadings to be equal across age groups led to a significant decrement in fit. An examination of the factor loading pattern revealed that the inhibitory control factor manifested itself differently across the three age groups (see Figure 2 Panel A), whereas memory maintenance showed relatively similar loading patterns across age (see Figure 2 Panel B). Hence, we examined whether partial metric invariance across the three age groups was tenable (Models 3a and 3b). As expected, holding the factor loadings of the memory maintenance factor equal across groups but allowing factor loadings for inhibitory control to vary freely provided

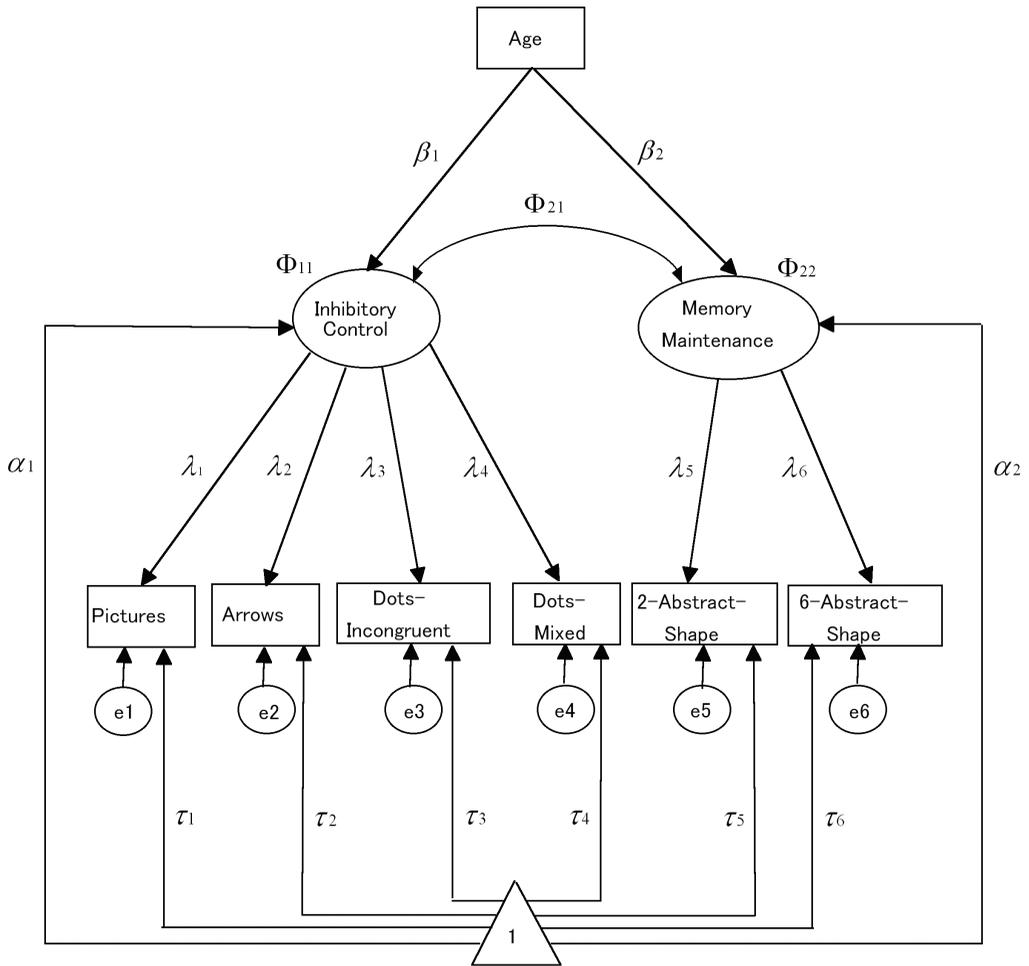


FIGURE 1 Two-factor model estimated for the three age groups. Note that the following constraints were imposed:  $\lambda_1 = 4 - \lambda_2 - \lambda_3 - \lambda_4$ ;  $\lambda_5 = 2 - \lambda_6$ ;  $\tau_1 + \tau_2 + \tau_3 + \tau_4 = 0$ ;  $\tau_5 + \tau_6 = 0$ . The triangle refers to a constant that equals 1 for the estimation of means.

an acceptable representation of the data (but not vice versa). Therefore, the corresponding model (i.e., Model 3b in Table 2) was retained for subsequent analyses. The common variances of the two factors reliably differed from zero in all three age groups (for all six nested comparisons,  $p < .05$ ), which is a precondition for testing hypotheses regarding their intercorrelations.

Finally, we examined group differences in factor interrelations, which are shown in Figure 2, Panel C, to address the main hypothesis of this study. First, we examined separately for each age group whether the correlation between memory maintenance and inhibitory control could be fixed to one (cf. van der Sluis, Dolan, & Stoel, 2005), indicating an undifferentiated general executive functioning factor instead of two distinct memory maintenance and inhibitory control factors. In the resulting models (Model 4a, 4b, 4c), the model fit was significantly worse only when the cor-

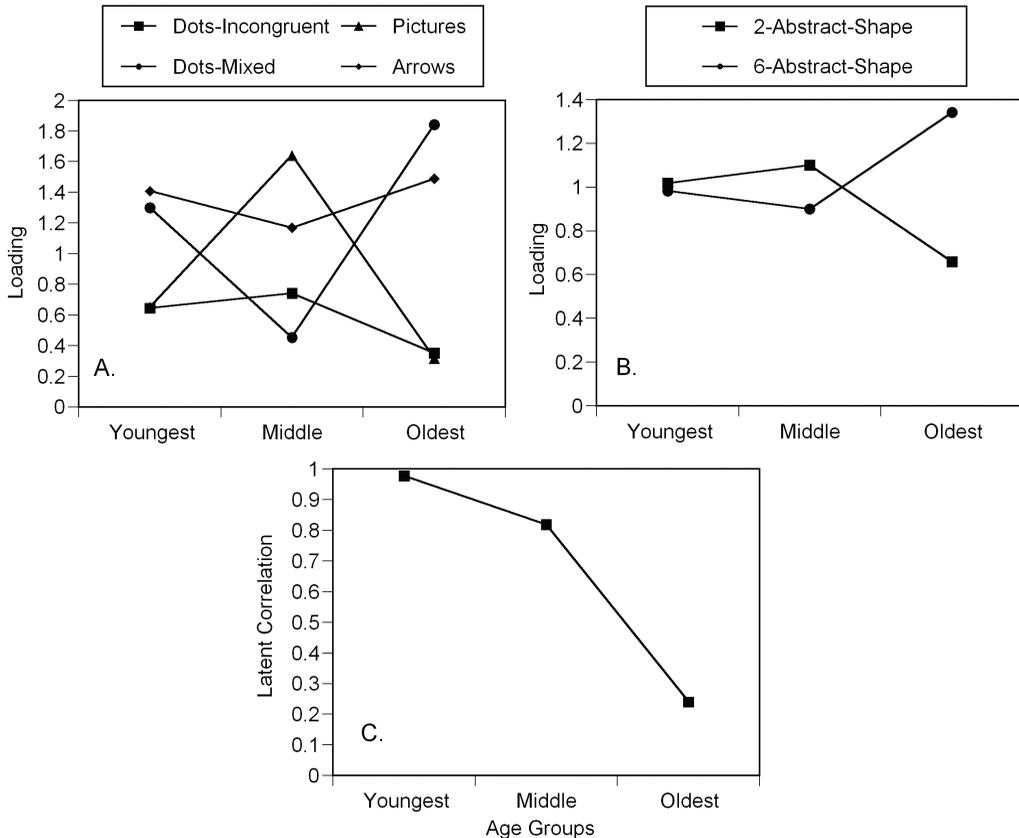


FIGURE 2 Estimates of factor loading and intercorrelations plotted according to age group. Panel A shows age trends in factor loadings for indicators of Inhibitory Control. Panel B shows age trends in factor loadings for indicators of Memory Maintenance. Panel C shows estimates of factor intercorrelations.

relation of the oldest children group was fixed to one  $\Delta\chi^2 = 4.61$ ,  $\Delta df = 1$ ,  $p < .05$ . In the last step of testing, we examined whether the correlations of the three age groups could be constrained to be equal. The resulting model (Model 4d) showed significantly worse fit  $\Delta\chi^2 = 4.62$ ,  $\Delta df = 1$ ,  $p < .05$ , indicating that the correlation between the two factors is significantly different across the age groups.

## DISCUSSION

The goal of this study was to examine whether two components of executive functions, memory maintenance and inhibitory control, differentiate from childhood to early adolescence. Using multiple-group confirmatory factor analysis, we found: (a) that the correlation between memory maintenance and inhibitory control differs reliably from 1.0 in early adolescence, but not in younger children; (b) that the correlation between memory maintenance and inhibitory control is significantly lower in young teenagers than in younger children.

Our findings appear counter to some recent studies that failed to find support for developmental differentiation (e.g., Deary et al., 1996; e.g., Juan-Espinosa et al., 2006). The present study and those studies differ in several important ways, however. First, the main analytical strategies of the previous studies were either to examine the manifest (i.e., raw) correlations, or to compare the amount of variance extracted by the first unrotated factor in a principal component analysis. Neither of those methods separates unique variance from common variance. The confirmatory factor analysis utilized in the current study ensured that the constructs of interest were error-free (see also Alloway et al., 2006; Gathercole et al., 2004; Tideman & Gustafsson, 2004). In particular, the scaling method adapted from Little et al. (2006) is a suitable addition to the multivariate methodological toolbox of developmental psychology, as it allows the relative pattern of factor loadings, and hence the behavioral manifestation of cognitive abilities, to change with age (cf. Kagan, 1980; Nesselroade, 1970; Nesselroade et al., 2007). This nonarbitrary yet flexible scaling method provides valuable indications of the nature of the developmental change process. For example, we observed that the factor-loading pattern of memory maintenance remained relatively similar across the ages investigated, whereas the factor-loading pattern of inhibitory control differed by age. Furthermore, inhibitory control has been shown to be particularly poor in young children and undergo prolonged development across childhood compared to working memory maintenance as defined in this study (e.g., Davidson et al., 2006; Diamond 1995, 2002; but see Huizinga et al., 2006), indicating that age-related differences in covariance pattern of the ability structures occurs concomitantly with age-related changes in the mean pattern (i.e., performance level). Based on these findings, we suggest that the increasing differentiation of executive functions from childhood to early adolescence is driven by the protracted development of inhibitory control.

The second reason that our findings appear counter to other findings is that many previous studies made use of psychometric tests of intellectual abilities (e.g., Wechsler scale or Differential Aptitude Test), and predominantly assessed complex forms of cognition such as language, numerical ability, and reasoning, each of which requires multiple cognitive abilities. In the present study, tasks were designed from a cognitive neuroscience perspective with the explicit goal of assessing basic cognitive functions that are building blocks for more complex forms of cognition. Thus, the abilities measured by the current task battery may have been more sensitive to developmental differentiation than measures conceived within the psychometric research tradition.

Our findings are relevant to the debate over whether working memory and inhibitory control are essentially one function or represent separable cognitive mechanisms. Some researchers view holding information in mind and exercising inhibitory control as closely related but separate processes, both being components of executive function (e.g., Diamond, 2006; Gernsbacher & Faust, 1991; Levy & Anderson, 2002), or as two separate sub-processes of working memory (e.g., Conway & Engle, 1994; Hasher, Stoltzfuz, Zacks, & Rypma, 1991; Kane & Engle, 2002). According to an alternative view, often adopted in neural network modeling, there is no need for a separate inhibitory function beyond working memory (e.g., Cohen, Dunbar, & McClelland, 1990; Kimberg & Farah, 1993; Miller & Cohen, 2001; Munakata, 2001). The increasing differentiation between memory maintenance and inhibitory control observed here suggests the presence of two mechanisms after early childhood and that the specificity of these two mechanisms increases from childhood to adolescence.

The development of working memory and inhibitory control as key components of executive functions has been of great interest to developmental psychology and developmental cognitive neuroscience, as these mechanisms are considered cornerstones of adaptive self-regulation,

higher-order cognition, and goal-directed behavior (Camos, 2008; Dempster, 1992; Harnishfeger & Bjorklund, 1993; Houdé & Tzourio-Mazoyer, 2003; St Clair-Thompson & Gathercole, 2006; Unsworth & Engle, 2007) important for success in school and in life (e.g., Diamond, Barnett, Thomas, Munro, 2007). A child's capacity to retain and work with information held in mind (i.e., working memory) and to suppress inappropriate attention or actions in favor of appropriate ones (i.e., inhibitory control) continues to develop across childhood and adolescence (see Diamond, 2006, for a review). The functioning and development of various aspects of working memory, inhibition, and cognitive flexibility have been shown to depend closely on the structure, neurochemistry, and functional activity of PFC and its networks of functional connections (Arnstein & Robbins, 2002; Bunge & Wright, 2007; Casey et al., 1995; Crone, Donohue, Honomichl, Wendelken, & Bunge, 2006; Miller & Cohen, 2001; Perlstein, Dixit, Noll, & Cohen, 2003).

Based on a dataset with a wide age range spanning early childhood to adolescence, the results from our analysis indicate that the construct of executive functions is not differentiated in children before seven years of age. In parallel, functional changes in the neural basis for cognitive control and executive functioning appear to be characterized by an early lack of differentiation that gives way to increasingly focal activation later in childhood and then decreasingly intense activation of the focal regions during late adolescence as the key regions come to function more efficiently (e.g., Brown et al., 2005; Casey et al., 2005; Durston et al., 2006). Thus, we hypothesize that (a) the undifferentiated memory maintenance and inhibitory control observed in younger children in the present analyses corresponds to highly overlapping patterns of neural activation documented by others for tasks requiring different components or combinations of executive function in young children; (b) the increasing differentiation between memory maintenance and inhibitory control from early childhood to late childhood/early adolescence observed in the present analyses corresponds to increasingly focal and less overlapping neural activation patterns for the cognitive functions with age; and (c) further specialization and partial automatization of these cognitive processes in the course of later development and learning reported by others corresponds to decreasing neural activation of these focal regions and increasing recruitment of other regions of the brain that can subserve task performance more efficiently.

We would like to mention four limitations of the present study that are pertinent for future investigations. First, our analyses were based on age group as a categorical variable. There may be differences within each age group that a finer-scale analysis might reveal and/or any discontinuity between younger and older children might not exactly correspond to our age-group split (based on equal numbers of subjects per group). It would be desirable to examine age differences in latent construct correlations in a more continuous fashion, that is, as a function of years of age (or of other, more proximal indicators of development such as white matter growth). Sample size restrictions did not permit us to examine that here.

Second, the two Abstract-Shape measures of working memory assessed only memory maintenance, not the manipulation of contents held in mind. Future studies should examine the developmental differentiation of memory manipulation, memory maintenance, and inhibitory control (cf. Huizinga et al., 2006). Third, the number of trials for some of the tasks was relatively low (particularly the inhibitory control tasks). We proceeded with the analysis as there was no difference in the number of available trials across age groups, and the analysis method used in this study is suited for dealing with task impurity, low reliability, and measurement error. However, the limitation in number of trials in the tasks needs to be considered, especially for planning of future studies. Finally, our interpretation of results rests on the assumption that inter-individual differences in

cross-sectional data approximate patterns of development at the within-person level. Clearly, however, developmental differentiation is a within-person phenomenon, and is best observed within individuals over time using longitudinal designs (Molenaar, Huizenga, & Nesselroade, 2003). Thus, it remains to be seen whether the present results represent a valid approximation to within-person changes in the organization of memory maintenance and inhibitory control. At this point, using confirmatory factor analysis, we found that the mechanisms of memory maintenance and inhibitory control, as assessed by inter-individual differences within different age groups, reliably become more differentiated from early childhood (beginning at around 5 years) to early adolescence (mean of 11 years). This appears to be driven by changes in inhibitory control with age. Future investigations should assess individual children longitudinally and investigate the neural bases for the cognitive changes investigated here.

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