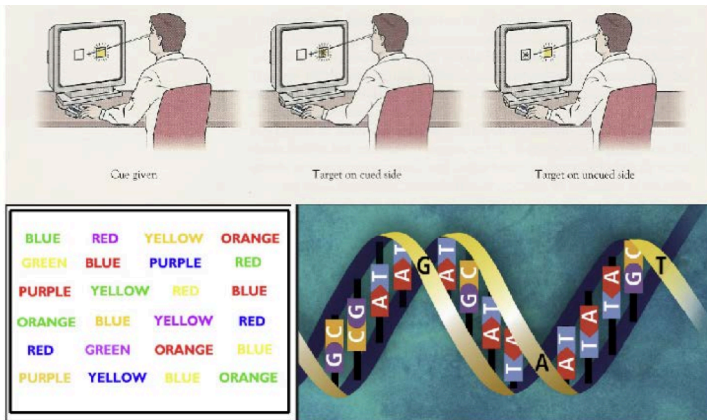


# Visual Computing Forum

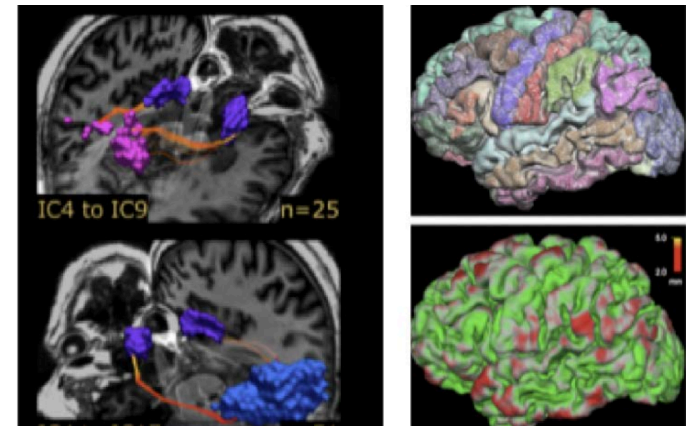


## AGING COGNITION, BRAIN IMAGING AND GENETICS



Astri J. Lundervold

BERGEN, 2013/03/01



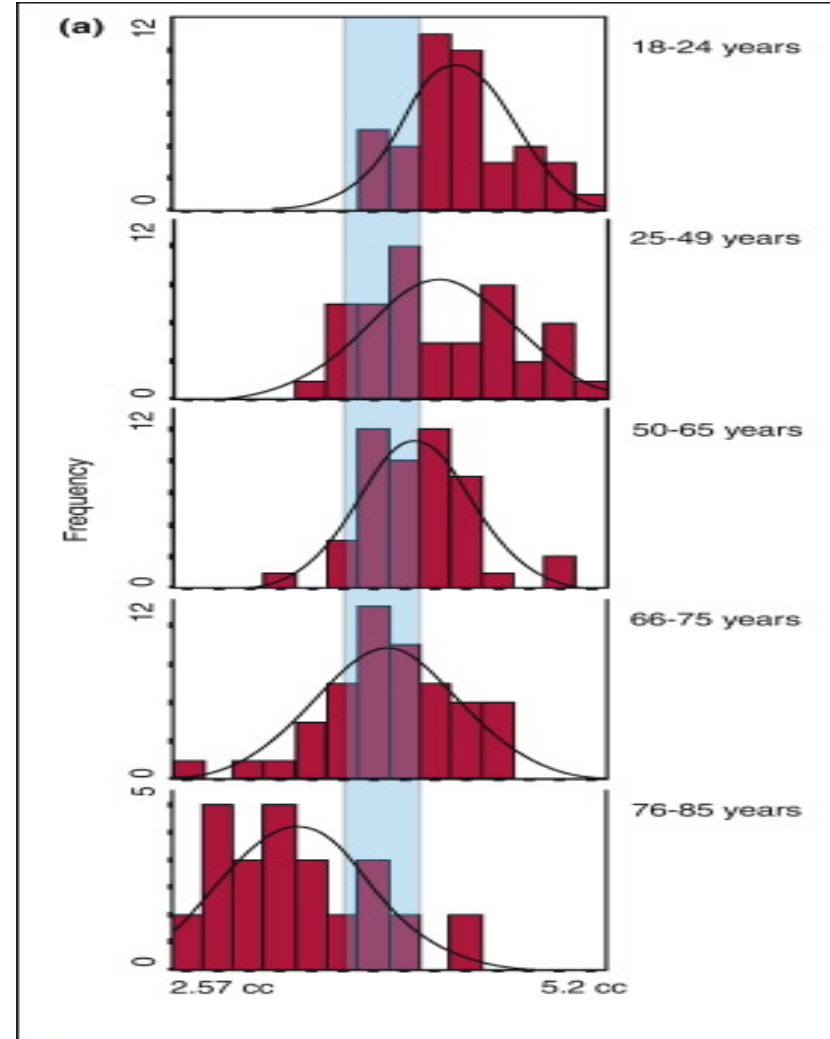


## COGNITIVE AGING

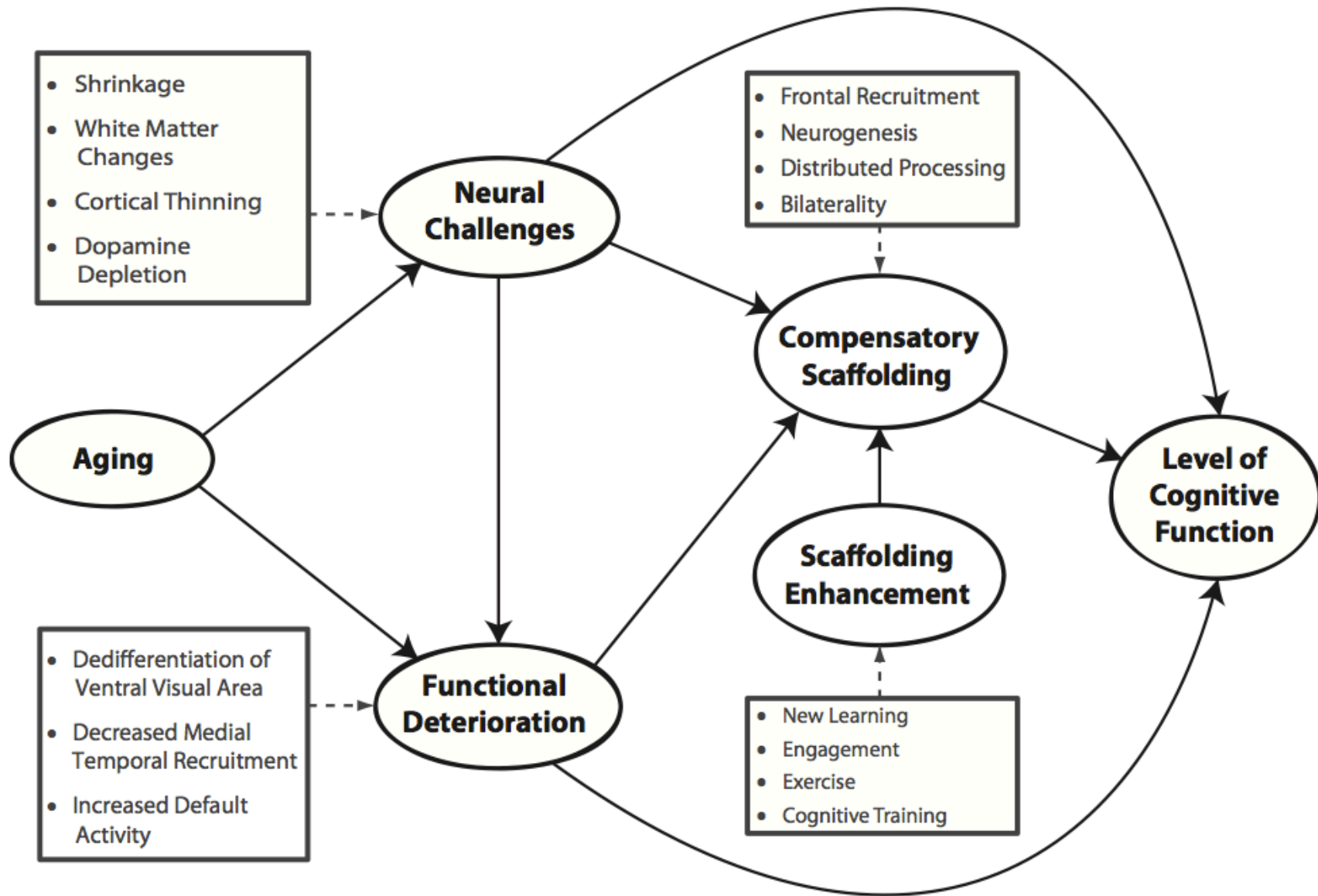


# GENETIC VARIATION & BRAIN MAINTENANCE

Lars Nyberg , Martin Lövdén , Katrine Riklund , Ulman Lindenberger , Lars Bäckman

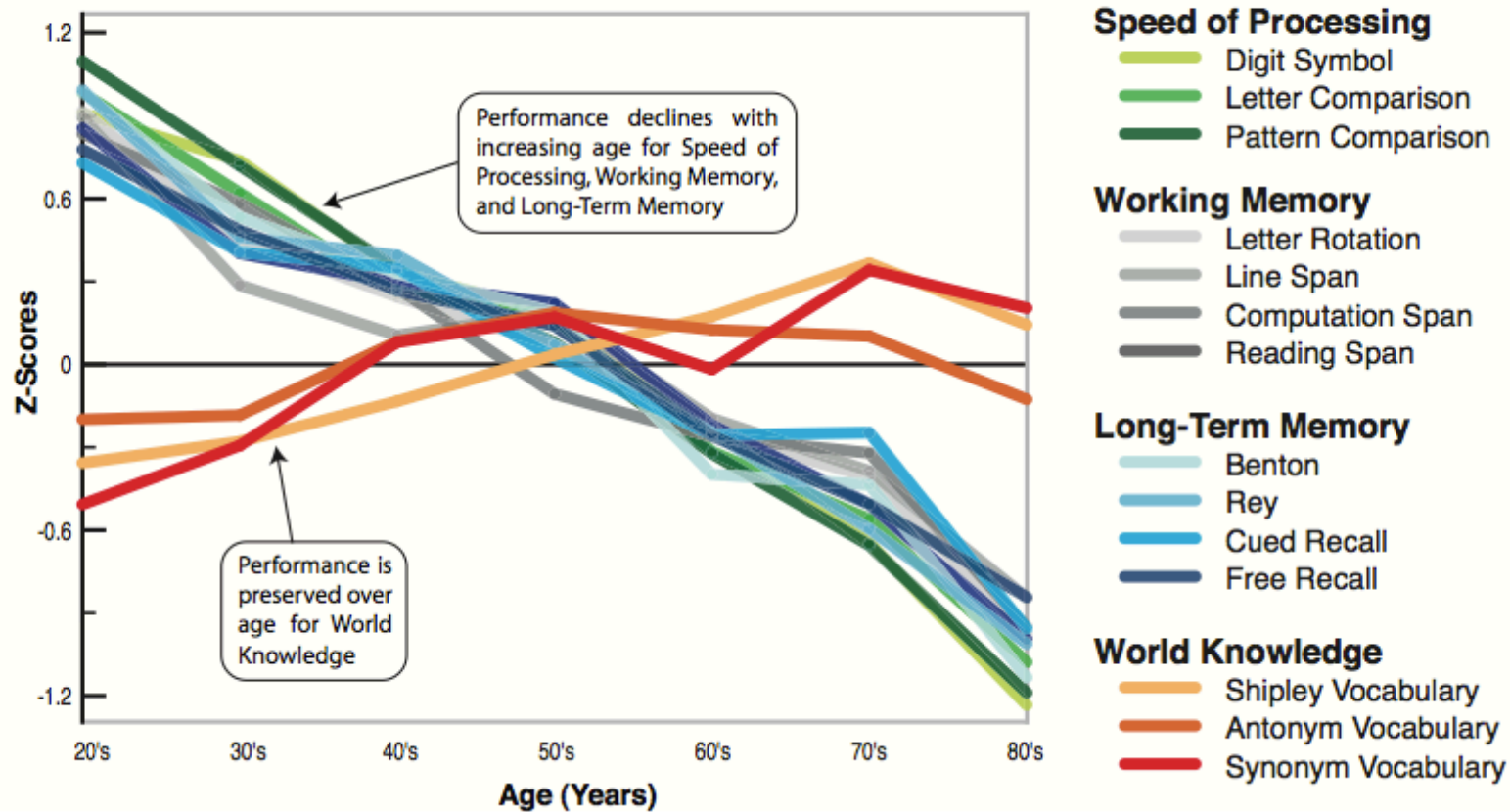


- Sexual reproduction has the potential to produce tremendous genetic variation in offspring.
- This variation is due to independent assortment and crossing-over during meiosis, and random union of gametes during fertilization.



**Figure 4**

A conceptual model of the scaffolding theory of aging and cognition (STAC).



**Figure 1**

Cross-sectional aging data adapted from Park et al. (2002) showing behavioral performance on measures of speed of processing, working memory, long-term memory, and world knowledge. Almost all measures of cognitive function show decline with age, except world knowledge, which may even show some improvement.

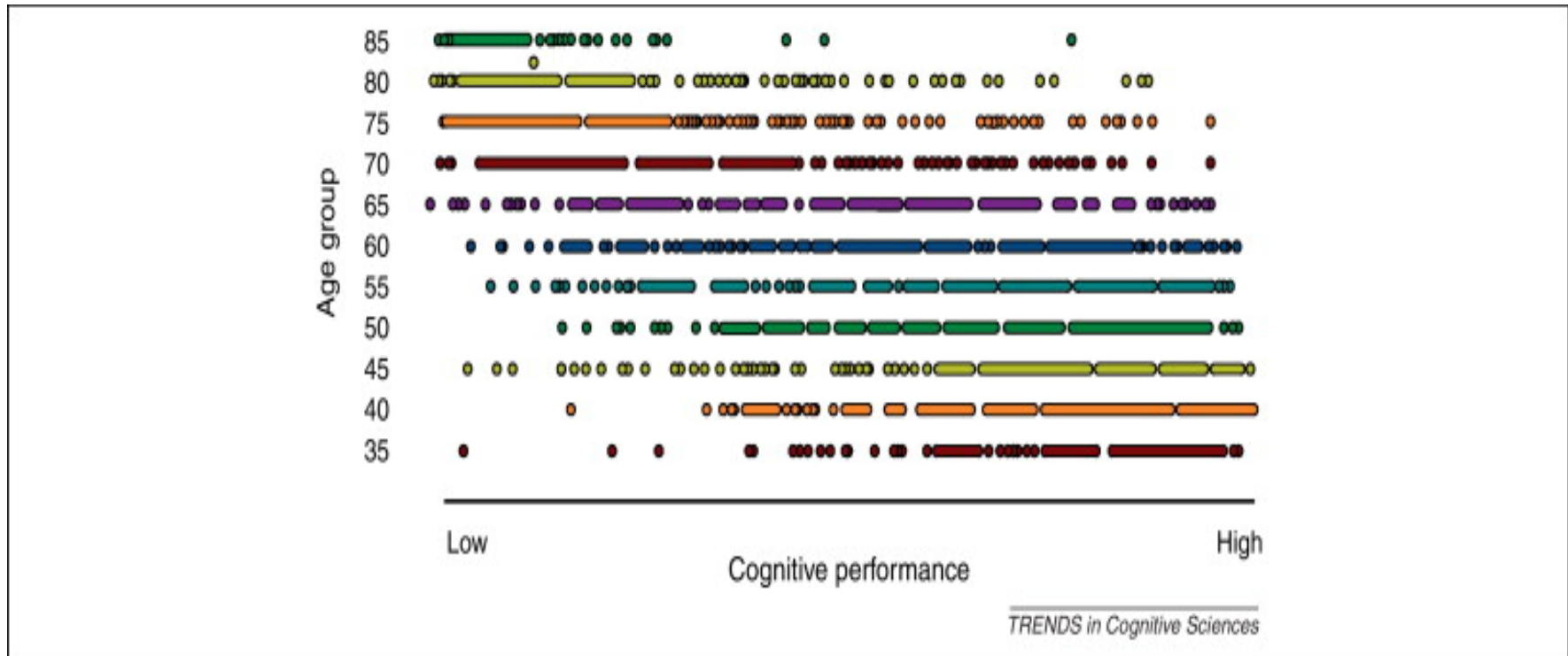


Figure 2 Illustration of variability in memory aging. The graph shows the results of a Q-mode factor analysis that sorted individuals into high versus low cognitive performers (each circle denotes the average score of an individual). Although a n...

Lars Nyberg , Martin Lövdén , Katrine Riklund , Ulman Lindenberger , Lars Bäckman

### Memory aging and brain maintenance

Trends in Cognitive Sciences Volume 16, Issue 5 2012 292 - 305

<http://dx.doi.org/10.1016/j.tics.2012.04.005>

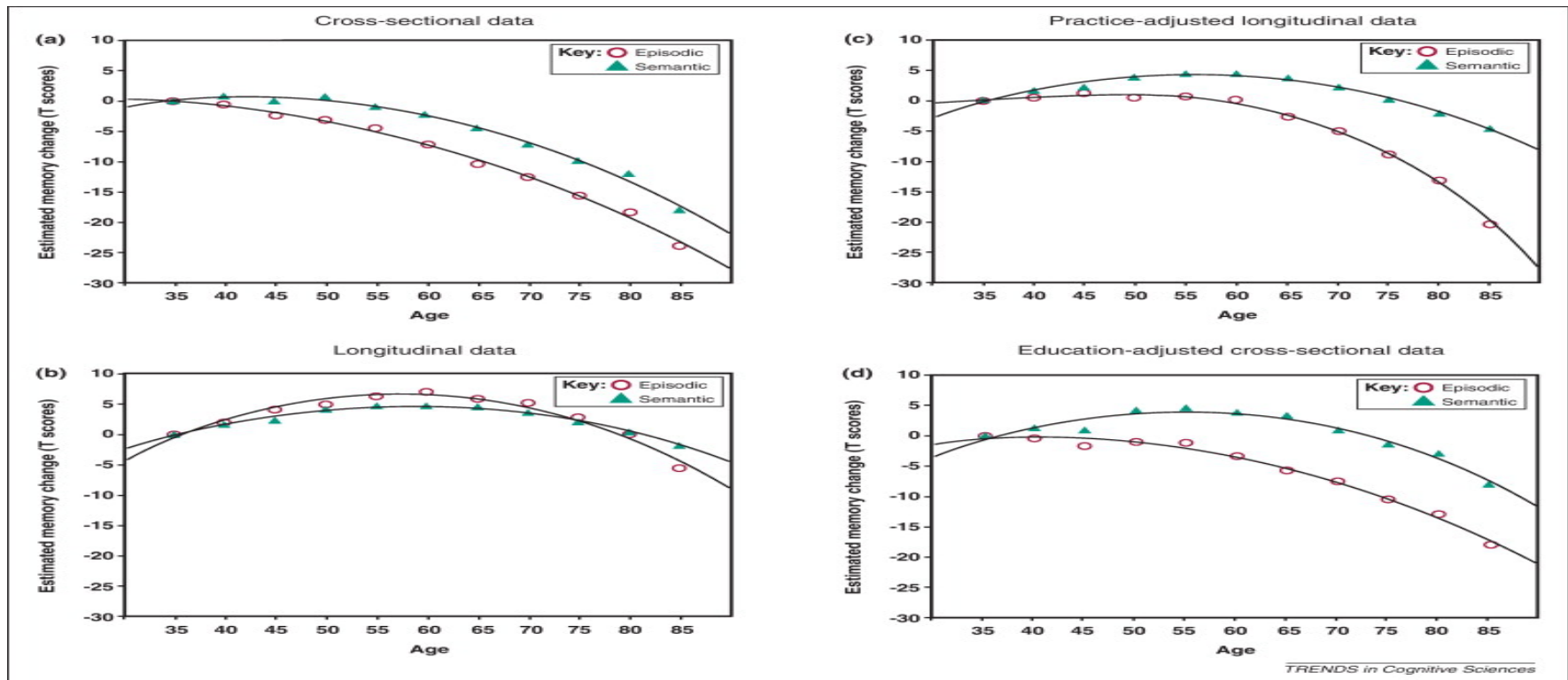


Figure 1 Illustration of assessment of age-related episodic-memory change with cross-sectional and longitudinal data. (a) Cross-sectional data reveal early onset of decline. (b) Longitudinal data indicate a positive gradient.

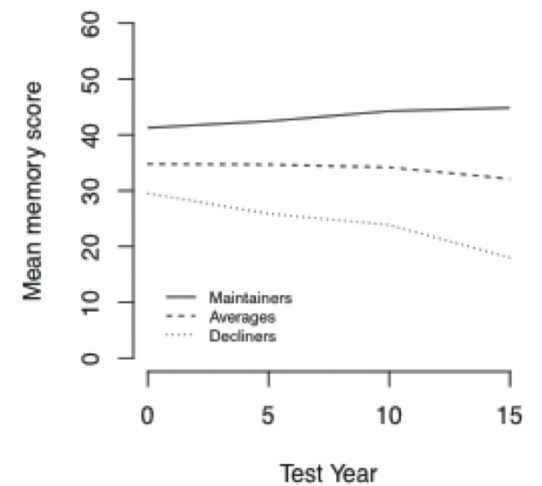
Lars Nyberg, Martin Lövdén, Katrine Riklund, Ulman Lindenberger, Lars Bäckman

### Memory aging and brain maintenance

Trends in Cognitive Sciences Volume 16, Issue 5 2012 292 - 305

<http://dx.doi.org/10.1016/j.tics.2012.04.005>

A



# Aging – cognition, imaging and genetics

OSLO and BERGEN

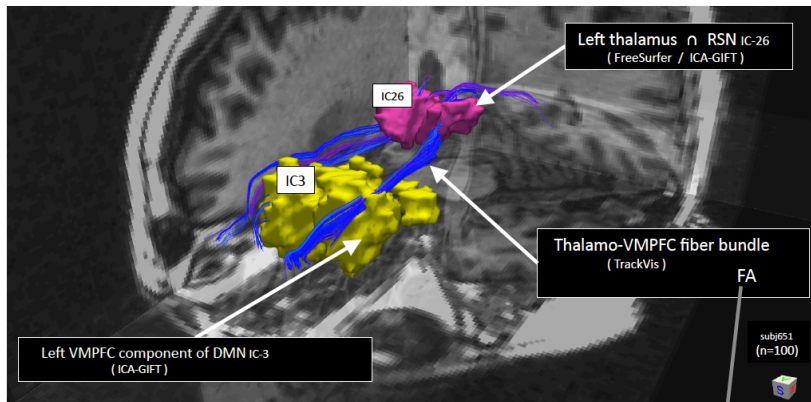
Sensory and motor function  
 Attention/executive function  
 Memory function  
 Language function  
 Visual Cognition  
 Self-reports of cognitive problems;  
 depression and sleep



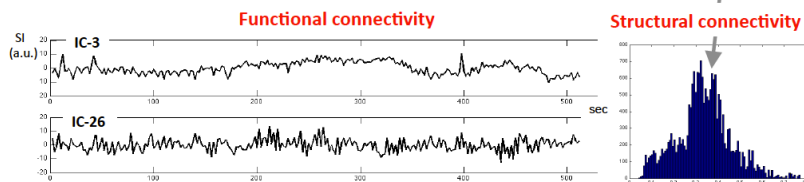
Astri J. Lundervold

Structural and functional connections using series 2, 3, 4 & 5

Genotyping: Stephanie LeHellard, Thomas Espeset et al.



Genome wide scans (using Illumina 610 quad CHIP) for 600k SNPs.  
 Used in international collaborations.

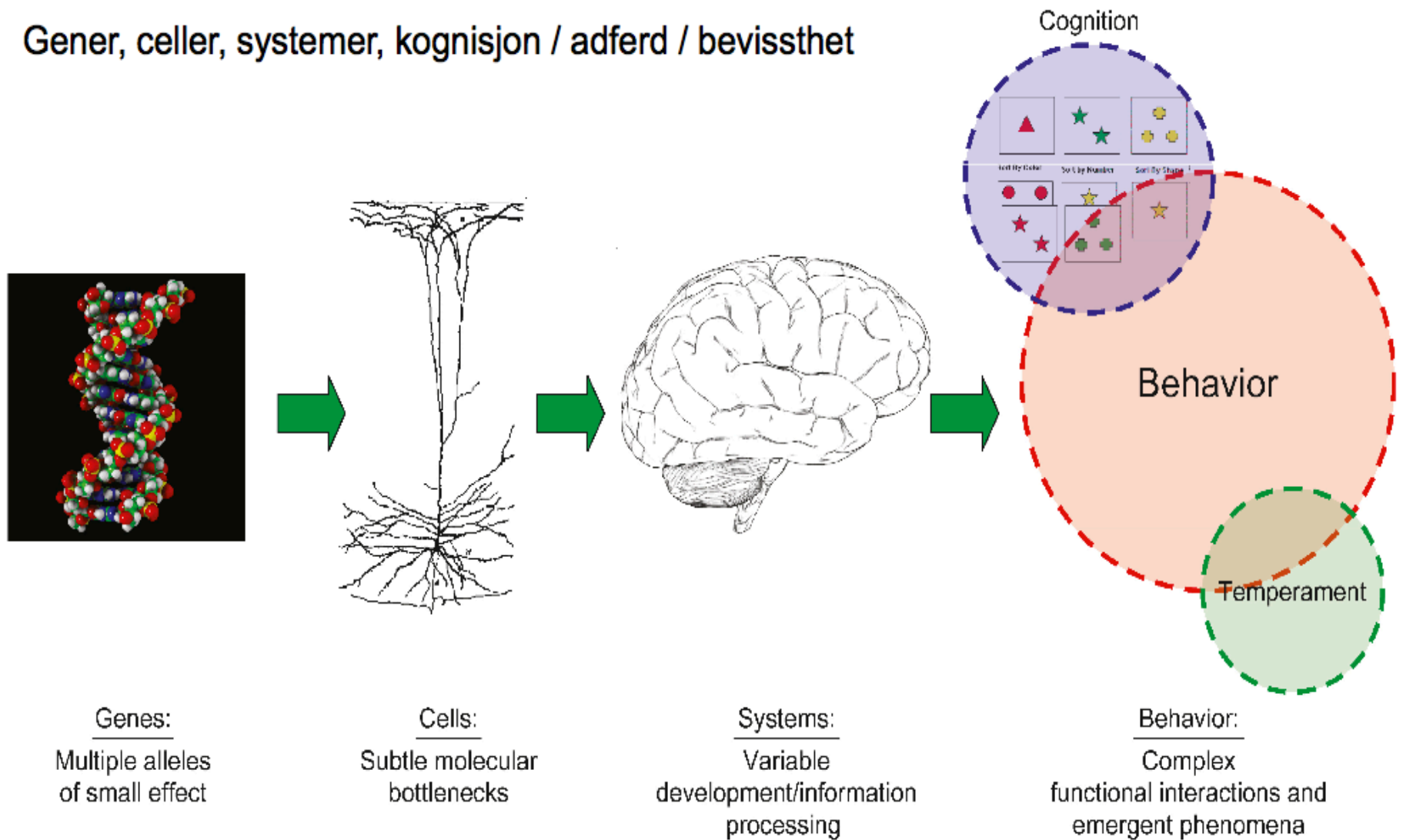


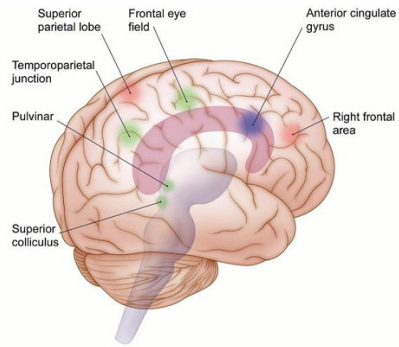


# Participants

- WAVE-1 (2004/2005)
  - Neuropsychological test results n = 165
  - MRI n = 120
  - Blood samples
- WAVE-2 (2008/2009)
  - Neuropsychological test results n = 134
  - MRI n = 118
- WAVE-3 (2011/2012)
  - Neuropsychological test results n n=109
  - MRI n = 94

# Gener, celler, systemer, kognisjon / adferd / bevissthet





# Clinical Neuropsychology

- \* To understand the relation between behavior and the underlying neural systems.
- \* Even simple cognitive tasks are dependent on a neural network involving different brain areas.
- \* Each network represents a specific subfunction

Posner, M. (1988). Structures and function of selective attention. I T. Boll & B.K. Bryant (red)  
Clinical neuropsychology and brain functions. Washington DC, APA, s. 173-202).

# Neuropsychological function

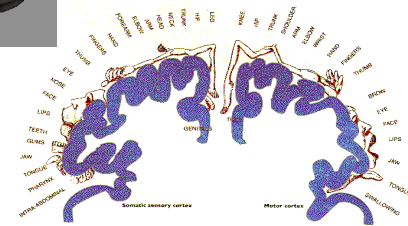
## Sensori-motor function

Perception, tempo, coordination



## Cognitive function

Attention, psychomotor tempo, memory function, language, visual cognition, executive function



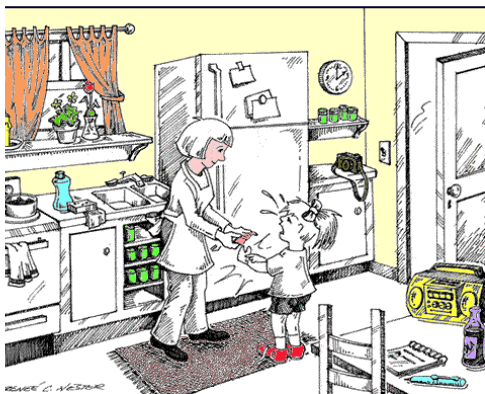
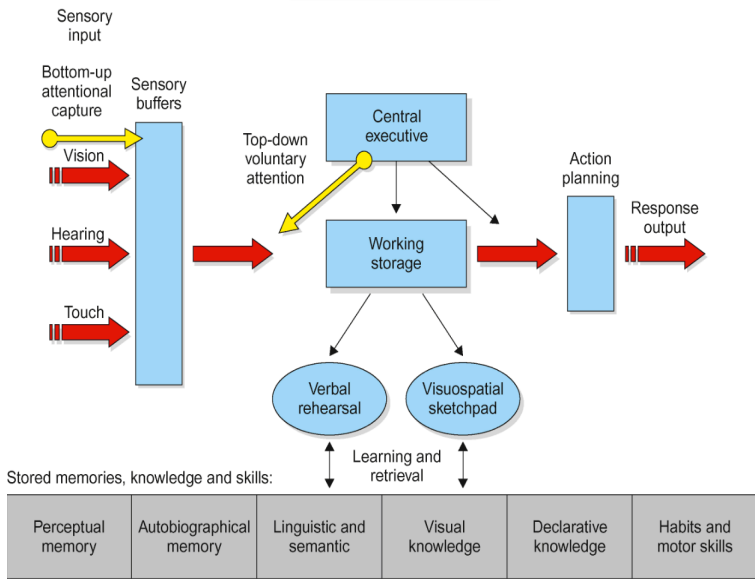
## Emotional function

Behavior, self-perception, regulation, emotions

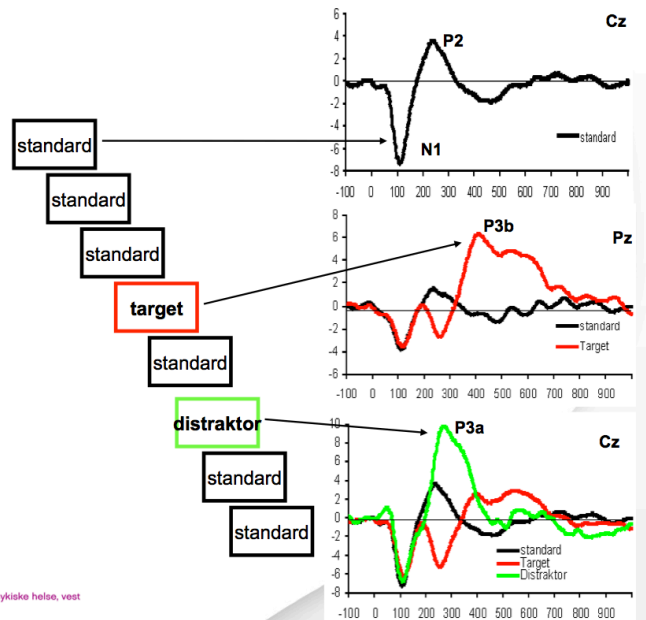
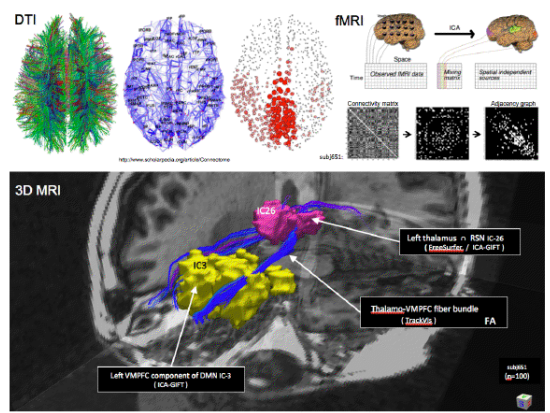
# Clinical Neuropsychology

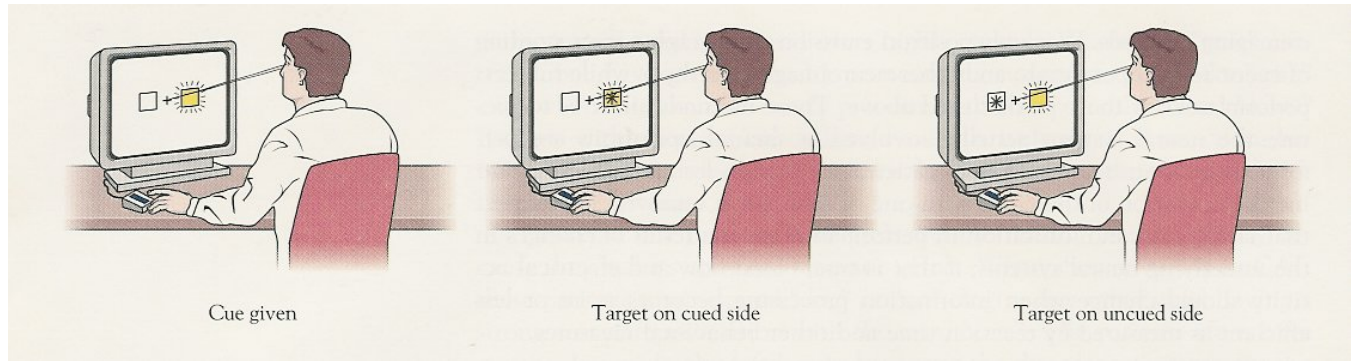
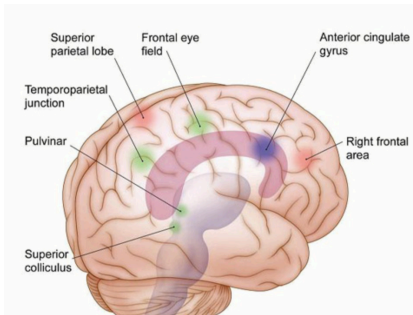
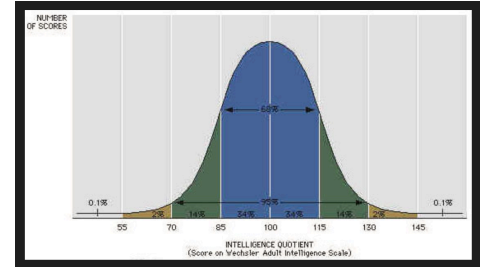
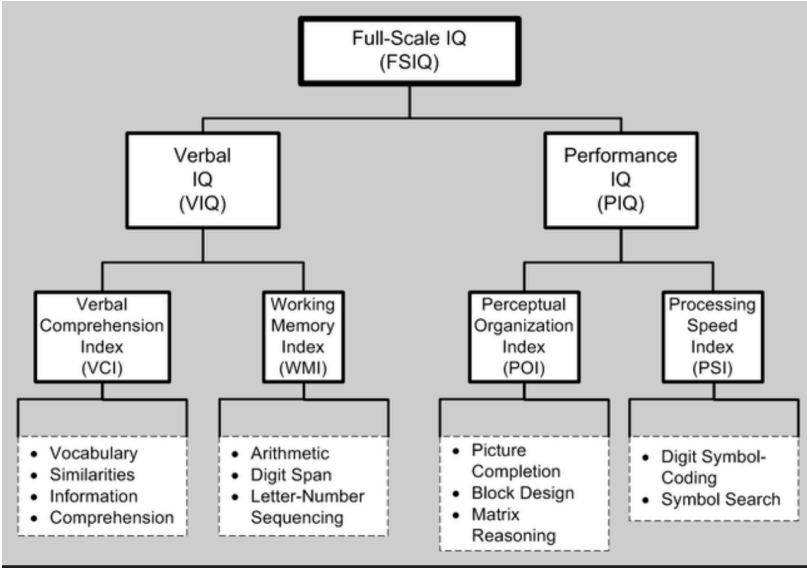
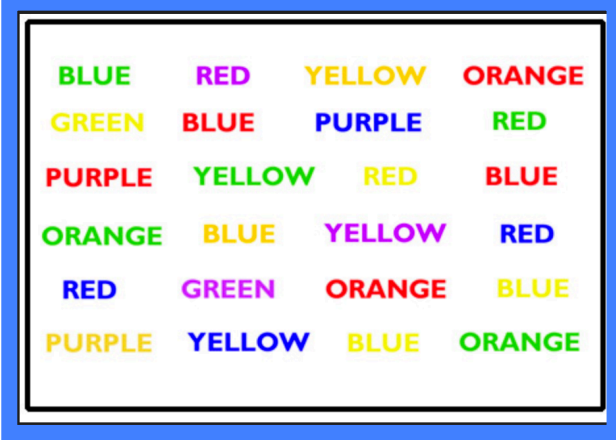
Baars & Gage, 2010

A functional framework



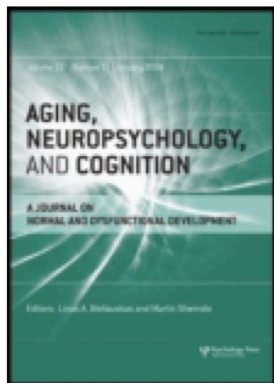
'Graphing' the functional resting state network in subj651







Eike Wehling



## Aging, Neuropsychology, and Cognition

Publication details, including instructions for authors and subscription information:

<http://www.tandfonline.com/loi/nanc20>

### Familiarity, Cued and Free Odor Identification and Their Association with Cognitive Functioning in Middle Aged and Older Adults

Eike Ines Wehling<sup>a</sup>, Steven Nordin<sup>b</sup>, Thomas Espeseth<sup>c</sup>, Ivar Reinvang<sup>c</sup> & Astri J. Lundervold<sup>a</sup>



## Neurobiology of Aging

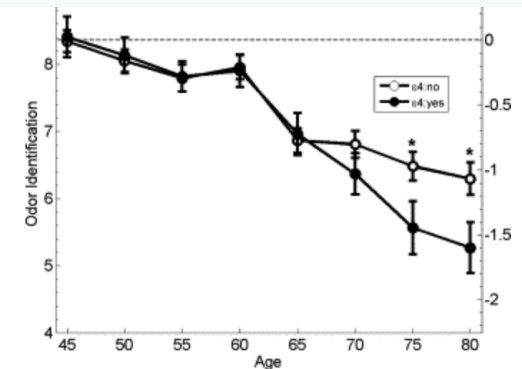
Volume 31, Issue 4, April 2010, Pages 567–577



## Full Text (HTML)

### Unawareness of Olfactory Dysfunction and its Association with Cognitive Functioning in Middle Aged and Old Adults

*Arch Clin Neuropsychol* (2011) 26(3): 260-269 first published online April 6, 2011



Odor identification impairment in carriers of ApoE-ε4 is independent of clinical dementia

Jonas K. Olofsson<sup>a, b, c</sup>, Steven Nordin<sup>a, d</sup>, Stefan Wiens<sup>b, c</sup>, Margareta Hedner<sup>b, c</sup>, Lars-Göran Nilsson<sup>b, c</sup>, Maria Larsson<sup>b, c</sup>

# Cognitive tests/questionnaires

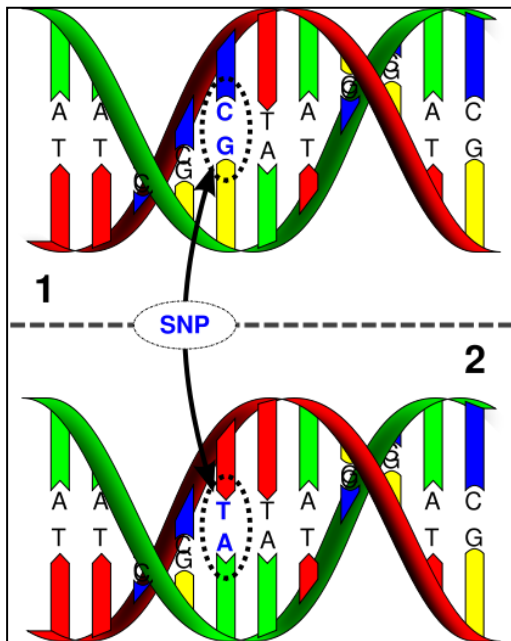
| Test                                     | Wave 1 | Wave 2 | Wave 3 |
|--|--------|--------|--------|
| WASI (2 subtests, IQ est.)               | X      | X      | X      |
| Odour identification (SOIT)              | X      | X      | X      |
| Trail Making Test                        | X      | X      | X      |
| Coding                                   | X      | X      | X      |
| Stroop (D-KEFS)                          | X      | X      | X      |
| FAS (D-KEFS)                             | X      | X      | X      |
| CVLT-II                                  | X      | X      | X      |
| Rey Complex Figure                       |        | X      | X      |
| Letter-number                            |        | X      | X      |
| PASAT                                    | X      | -      | X      |
| CDP and memory (exp.)                    | X      | X      |        |
| Grooved Pegboard                         |        | X      | X      |
| Benton/Dichotic listening                | X      | -      | -      |
| Self-reports (depression, memory, sleep) | X      | X      | X      |





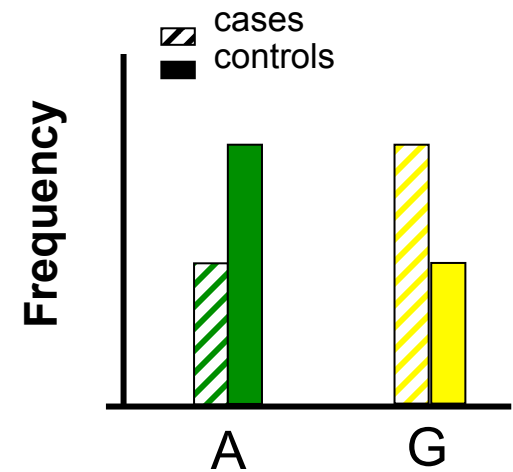
|    | Name            | Type    | Width | Decimals | Label  | Values | Missing | Columns | Align | Measure | Role  |
|----|-----------------|---------|-------|----------|--|--------|---------|---------|-------|---------|-------|
| 1  | id              | Numeric | 4     | 0        | Project ID   | None   | None    | 8       | Right | Scale   | Input |
| 2  | cvlt_tri_1_r    | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial 1 - Number Correct - raw score  | None   | None    | 8       | Right | Scale   | Input |
| 3  | cvlt_tri_1_s    | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial 1 - Number Correct - standard score   | None   | None    | 8       | Right | Scale   | Input |
| 4  | cvlt_tri_2_r    | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial 2 - Number Correct - raw score  | None   | None    | 8       | Right | Scale   | Input |
| 5  | cvlt_tri_2_s    | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial 2 - Number Correct - standard score   | None   | None    | 8       | Right | Scale   | Input |
| 6  | cvlt_tri_3_r    | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial 3 - Number Correct - raw score  | None   | None    | 8       | Right | Scale   | Input |
| 7  | cvlt_tri_3_s    | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial 3 - Number Correct - standard score   | None   | None    | 8       | Right | Scale   | Input |
| 8  | cvlt_tri_4_r    | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial 4 - Number Correct - raw score  | None   | None    | 8       | Right | Scale   | Input |
| 9  | cvlt_tri_4_s    | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial 4 - Number Correct - standard score   | None   | None    | 8       | Right | Scale   | Input |
| 10 | cvlt_tri_5_r    | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial 5 - Number Correct - raw score  | None   | None    | 8       | Right | Scale   | Input |
| 11 | cvlt_tri_5_s    | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial 5 - Number Correct - standard score   | None   | None    | 8       | Right | Scale   | Input |
| 12 | cvlt_tri_tot_r  | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial 1-5 Total - Number Correct - raw score  | None   | None    | 8       | Right | Scale   | Input |
| 13 | cvlt_tri_tot_t  | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial 1-5 Total - Number Correct - t-score  | None   | None    | 8       | Right | Scale   | Input |
| 14 | cvlt_tri_b_r    | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial B - Number Correct - raw score  | None   | None    | 8       | Right | Scale   | Input |
| 15 | cvlt_tri_b_s    | Numeric | 8     | 2        | CVLT-II - Immediate Recall - Trial B - Number Correct - standard score   | None   | None    | 8       | Right | Scale   | Input |
| 16 | cvlt_sd_fr_r    | Numeric | 8     | 2        | CVLT-II - Delayed Recall - Short Delay Free Recall - Number Correct - raw score  | None   | None    | 8       | Right | Scale   | Input |
| 17 | cvlt_sd_fr_s    | Numeric | 8     | 2        | CVLT-II - Delayed Recall - Short Delay Free Recall - Number Correct - standard score   | None   | None    | 8       | Right | Scale   | Input |
| 18 | cvlt_sd_cr_r    | Numeric | 8     | 2        | CVLT-II - Delayed Recall - Short Delay Cued Recall - Number Correct - raw score  | None   | None    | 8       | Right | Scale   | Input |
| 19 | cvlt_sd_cr_s    | Numeric | 8     | 2        | CVLT-II - Delayed Recall - Short Delay Cued Recall - Number Correct - standard score   | None   | None    | 8       | Right | Scale   | Input |
| 20 | cvlt_ld_fr_r    | Numeric | 8     | 2        | CVLT-II - Delayed Recall - Long Delay Free Recall - Number Correct - raw score   | None   | None    | 8       | Right | Scale   | Input |
| 21 | cvlt_ld_fr_s    | Numeric | 8     | 2        | CVLT-II - Delayed Recall - Long Delay Free Recall - Number Correct - standard score  | None   | None    | 8       | Right | Scale   | Input |
| 22 | cvlt_ld_cr_r    | Numeric | 8     | 2        | CVLT-II - Delayed Recall - Long Delay Cued Recall - Number Correct - raw score   | None   | None    | 8       | Right | Scale   | Input |
| 23 | cvlt_ld_cr_s    | Numeric | 8     | 2        | CVLT-II - Delayed Recall - Long Delay Cued Recall - Number Correct - standard score  | None   | None    | 8       | Right | Scale   | Input |
| 24 | cvlt_sem_r      | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - Semantic Clustering - raw score   | None   | None    | 8       | Right | Scale   | Input |
| 25 | cvlt_sem_s      | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - Semantic Clustering - scaled score  | None   | None    | 8       | Right | Scale   | Input |
| 26 | cvlt_ser_r      | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - Serial Clustering Bidirectional- raw score                                    | None   | None    | 8       | Right | Scale   | Input |
| 27 | cvlt_ser_s      | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - Serial Clustering Bidirectional- scaled score                                 | None   | None    | 8       | Right | Scale   | Input |
| 28 | cvlt_sub_r      | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - Subjective Clustering Bidirectional- raw score                                | None   | None    | 8       | Right | Scale   | Input |
| 29 | cvlt_sub_s      | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - Subjective Clustering Bidirectional- scaled score                             | None   | None    | 8       | Right | Scale   | Input |
| 30 | cvlt_prim_r     | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - % Recall from Primacy - raw score   | None   | None    | 8       | Right | Scale   | Input |
| 31 | cvlt_prim_s     | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - % Recall from Primacy - scaled score  | None   | None    | 8       | Right | Scale   | Input |
| 32 | cvlt_mid_r      | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - % Recall from Middle - raw score  | None   | None    | 8       | Right | Scale   | Input |
| 33 | cvlt_mid_s      | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - % Recall from Middle - scaled score   | None   | None    | 8       | Right | Scale   | Input |
| 34 | cvlt_recen_r    | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - % Recall from Recency - raw score   | None   | None    | 8       | Right | Scale   | Input |
| 35 | cvlt_recen_s    | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - % Recall from Recency - scaled score  | None   | None    | 8       | Right | Scale   | Input |
| 36 | cvlt_slope_r    | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - Total Learning Slope Trials 1-5 - raw score                                   | None   | None    | 8       | Right | Scale   | Input |
| 37 | cvlt_slope_s    | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - Total Learning Slope Trials 1-5 - scaled score                                | None   | None    | 8       | Right | Scale   | Input |
| 38 | cvlt_cons_r     | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - Across-Trial Recall Consistency - raw score                                   | None   | None    | 8       | Right | Scale   | Input |
| 39 | cvlt_cons_s     | Numeric | 8     | 2        | CVLT-II - Learning Characteristics, Trials 1-5 Total - Across-Trial Recall Consistency - scaled score                                | None   | None    | 8       | Right | Scale   | Input |
| 40 | cvlt_interf_... | Numeric | 8     | 2        | CVLT-II - Recall Contrast Measures - Proactive Interference - List B vs. Trial 1 - %   | None   | None    | 8       | Right | Scale   | Input |
| 41 | cvlt_interf_s   | Numeric | 8     | 2        | CVLT-II - Recall Contrast Measures - Proactive Interference - List B vs. Trial 1 - scaled score                                      | None   | None    | 8       | Right | Scale   | Input |
| 42 | cvlt_sd_ret...  | Numeric | 8     | 2        | CVLT-II - Recall Contrast Measures - Short-Delay Retention/Retroactive Interference - Short Delay Free Recall vs. Trial 5 - %        | None   | None    | 8       | Right | Scale   | Input |
| 43 | cvlt_sd_ret_s   | Numeric | 8     | 2        | CVLT-II - Recall Contrast Measures - Short-Delay Retention/Retroactive Interference - Short Delay Free Recall vs. Trial 5 - scale... | None   | None    | 8       | Right | Scale   | Input |
| 44 | cvlt_ld_ret_... | Numeric | 8     | 2        | CVLT-II - Recall Contrast Measures - Long-Delay Retention - Long Delay Free Recall vs. Short Delay Free Recall - %                   | None   | None    | 8       | Right | Scale   | Input |

Tests whether the presence of a specific genetic variant (e.g. SNP allele) is correlated to a particular disease status or trait value.

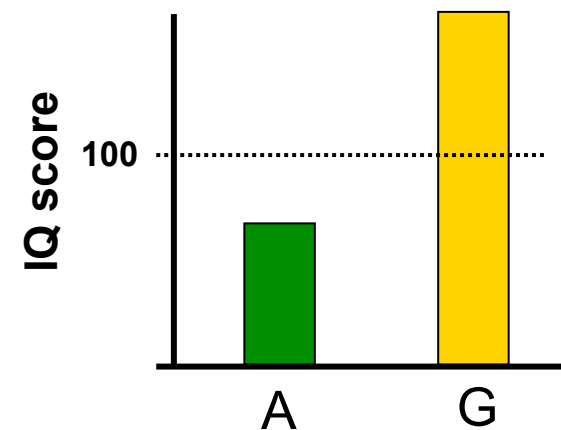


## Association study

### Case-control phenotype



### Quantitative/continuous trait



# Critical advances

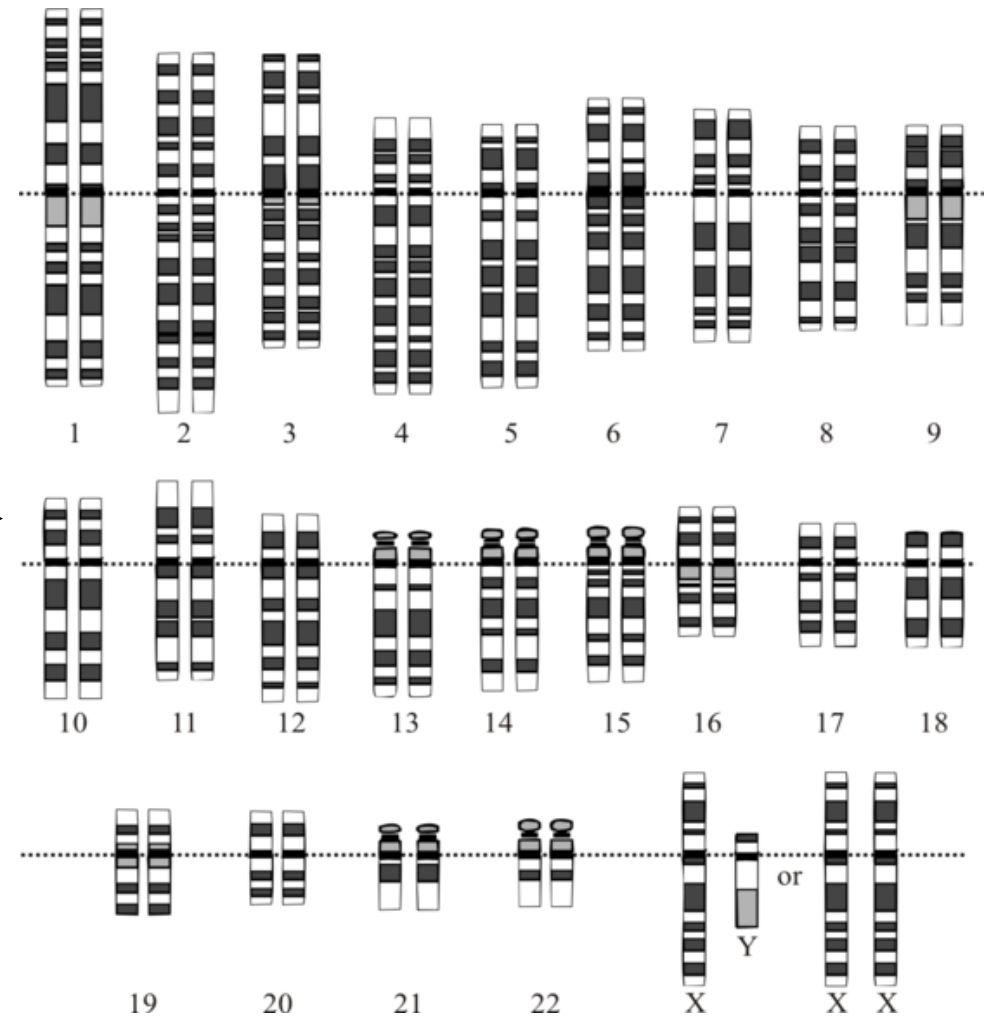
# GWAS: hypothesis-free genomewide approach

Completion of the  
Human Genome Sequence

Mutation screening; SNP  
identification and cataloging

Realization of the  
International HapMap Project

Advances in  
Genotyping technologies

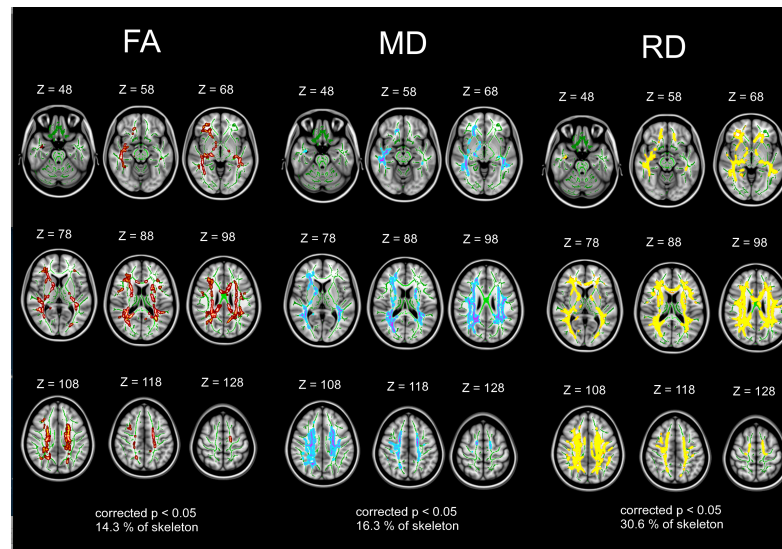
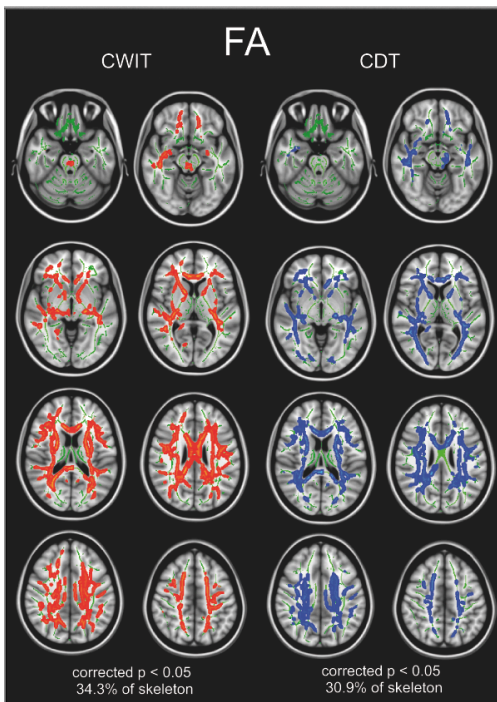


“GWAS is the study of genetic variation across the entire genome that is designed to associate genetic variations (SNPs) with traits or with the presence or absence of disease or condition.”

## General fluid-type intelligence is related to indices of white matter integrity in middle-aged and old adults

### White matter structure of general fluid-type intelligence

Judit Haász\*<sup>1,2,3</sup>, Erling T. Westlye\*<sup>2</sup>, Thomas Espeseth<sup>1,4,5</sup>, Arvid Lundervold<sup>2,6</sup>, Astri J. Lundervold<sup>1,7</sup>



## 2 scores measuring general cognition

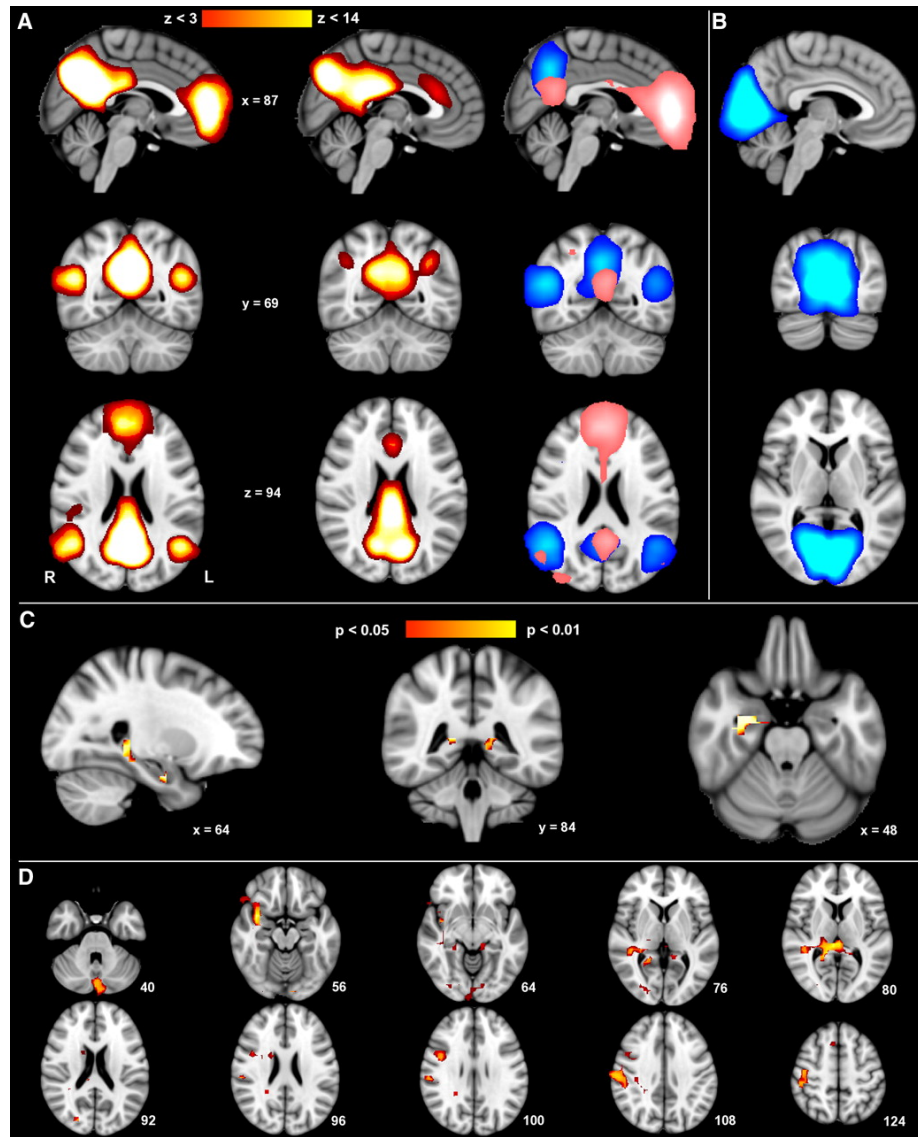
(1) G PCA = G fluid

*“Fluid intelligence or fluid reasoning is the capacity to think logically and solve problems in novel situations, independent of acquired knowledge.”* (Wikipedia)

(2) WASI V = G crystalized

*“Crystallized intelligence is the ability to use skills, knowledge, and experience. It should not be equated with memory or knowledge, but it does rely on accessing information from long-term memory.”* (Wikipedia)

A, In red-yellow to the left is the DMN comprising three components from the gICA.



Westlye E T et al. J. Neurosci. 2011;31:7775-7783

Neurobiology of Disease

**Increased Hippocampal Default Mode Synchronization during Rest in Middle-Aged and Elderly APOE ε4 Carriers: Relationships with Memory Performance**

Erling T. Westlye<sup>1</sup>, Arvid Lundervold<sup>1,2</sup>, Helge Rootwelt<sup>3</sup>, Astri J. Lundervold<sup>4,5</sup>, and Lars T. Westlye<sup>6</sup>



NeuroImage

Volume 63, Issue 1, 15 October 2012, Pages 507–516



**Episodic memory of APOE ε4 carriers is correlated with fractional anisotropy, but not cortical thickness, in the medial temporal lobe** ☆

Erling Tjelta Westlye<sup>a</sup>, Erlend Hodneland<sup>a, b</sup>, Judit Haász<sup>a</sup>, Thomas Espeseth<sup>c, d, e</sup>, Arvid Lundervold<sup>a, f</sup>, Astri J. Lundervold<sup>d, g</sup>

**Age-related disconnection of resting state networks in individuals at genetic risk for Alzheimer's disease**

Erling T. Westlye<sup>1</sup> Erik A. Hanson<sup>2</sup> Astri J. Lundervold<sup>3,4</sup> Arvid Lundervold<sup>1,5</sup>

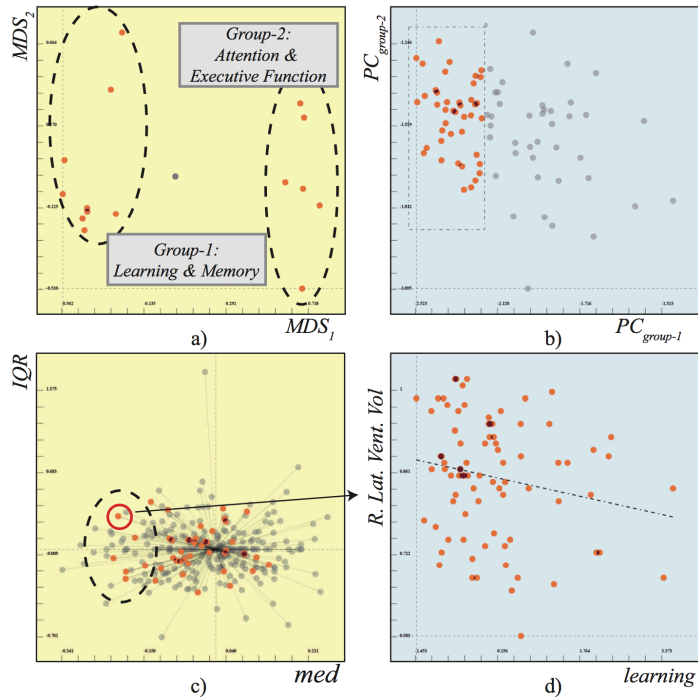
**A LOT OF DATA**

# Hypothesis Generation through Interactive Visual Analysis of Heterogeneous Medical Data

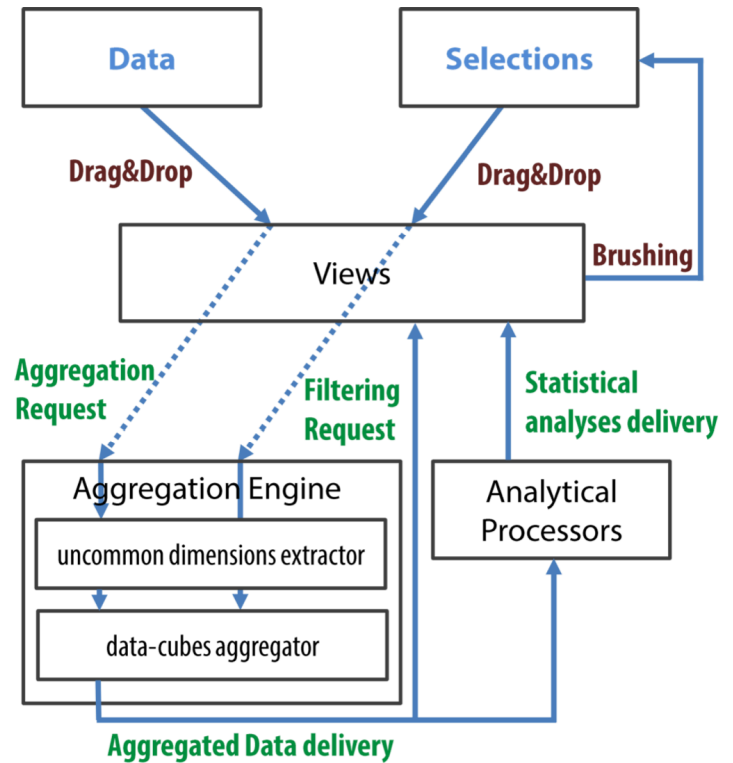
Cagatay Turkey<sup>1</sup>, Arvid Lundervold<sup>2</sup> Astri Johansen Lundervold<sup>3</sup>,  
and Helwig Hauser<sup>1</sup>

## Interactive Visual Analysis of Heterogeneous Cohort Study Data

Paolo Angelelli, Steffen Oeltze, Judit Haász, Cagatay Turkey, Erlend Hodneland,  
Arvid Lundervold, Astri J. Lundervold, Bernhard Preim and Helwig Hauser



**Fig. 2.** a) MDS is applied on the *test score* dimensions, where related dimensions are placed closer. Two groups for the test scores show up in the results. b) Each group is represented through an application of PCA and first components for each of the groups are the axes for the scatterplot. A group of participants, who are better in learning and attentive functions is selected c) Some brain regions are smaller for this subgroup, i.e., have smaller *median* value. d) When one of these dimensions is observed closely, we saw that there is really a negative correlation with one of the test scores from the first group (*learning*).



**Fig. 2.** Simplified illustration of the proposed model. User interactions are colored in red, automatic transparent operations are green, information sources are blue, and in black the components necessary to implement the model.