

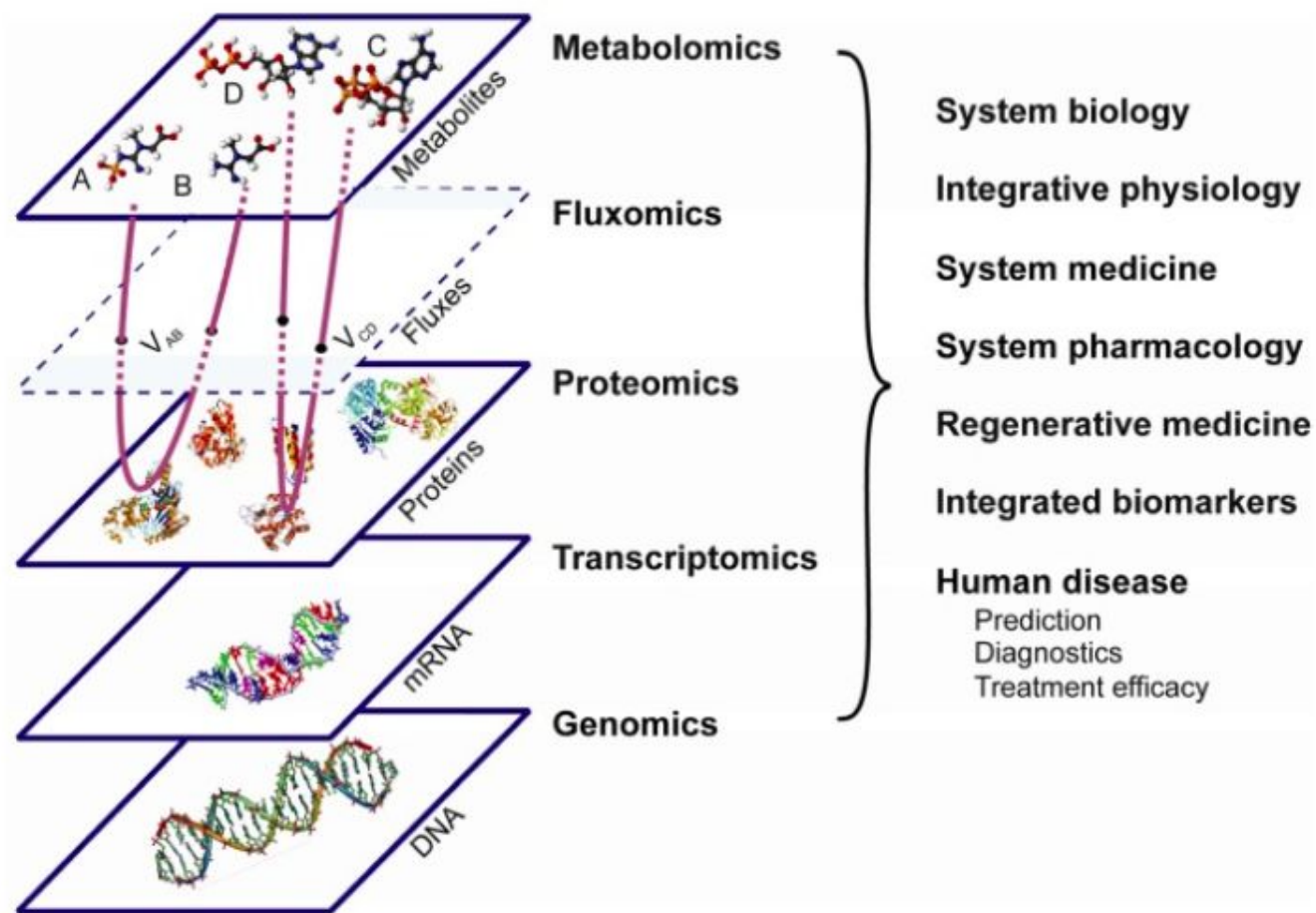
# Modeling Across Levels of Analysis for Precision Neuropsychology

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# Precision Medicine: Spanning Levels of Analysis Down to Basic Biology





Neuroscience

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General Issue

Research Paper

## Phenomics: the systematic study of phenotypes on a genome-wide scale

R.M. Bilder<sup>a, b, e</sup> ✉, F.W. Sabb<sup>a, e</sup>, T.D. Cannon<sup>a, b, e</sup>, E.D. London<sup>a, c, e</sup>, J.D. Jentsch<sup>b, e</sup>, D. Stott Parker<sup>d</sup>, R.A. Poldrack<sup>b, e</sup>, C. Evans<sup>a, e</sup>, N.B. Freimer<sup>a, e</sup>

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<https://doi.org/10.1016/j.neuroscience.2009.01.027>

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- Human Genome Project is now “complete”
- Knowledge is rapidly being accumulated to represent gene expression, proteomics (bottom-up approach), but higher levels are not well represented
- “The main hurdle for biomedical science for the next century is the **Human Phenome Project**<sup>1</sup> – characterizing the manifold human phenotypes from molecule to mind”

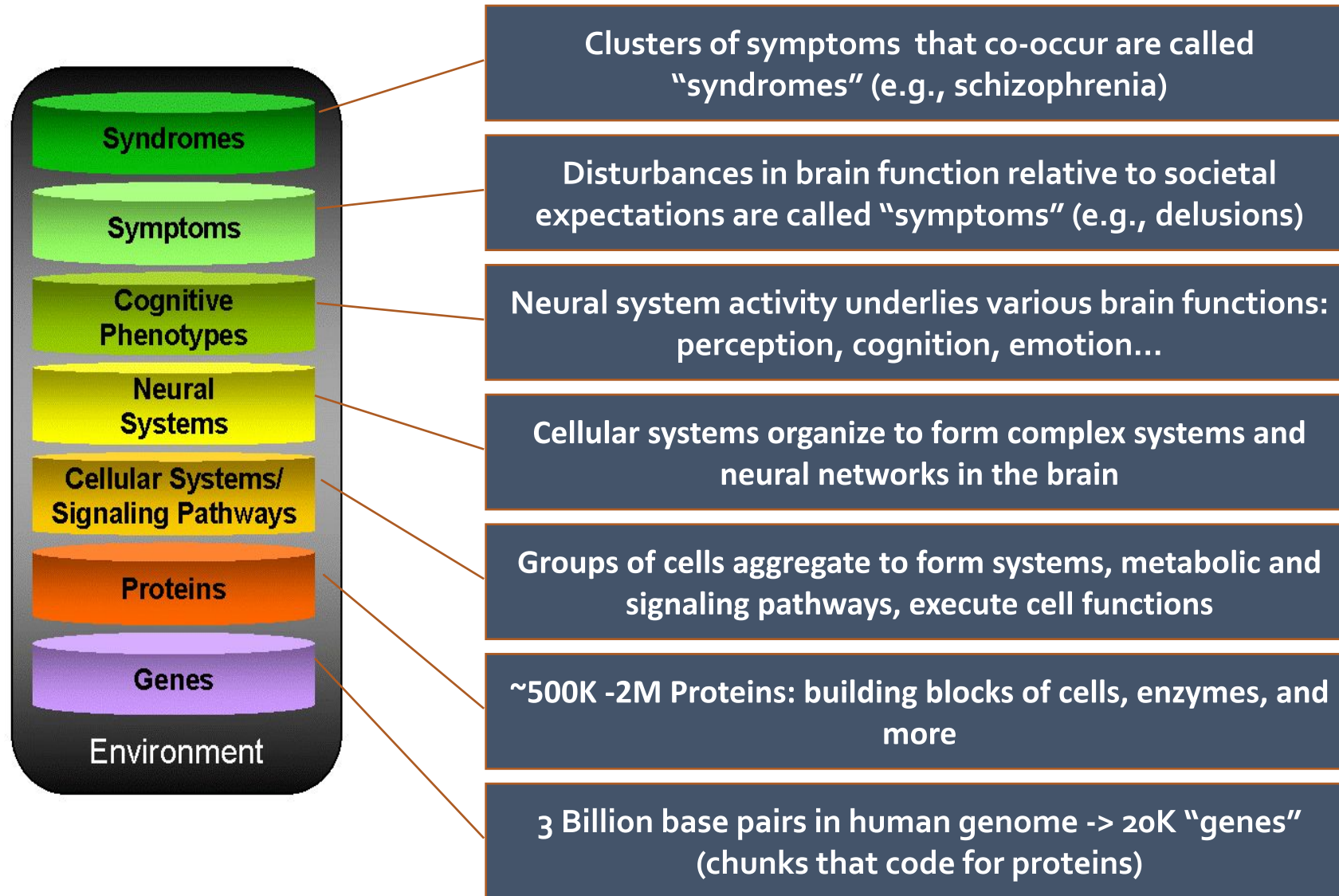
<sup>1</sup>Freimer & Sabatti, *Nat Genet* 2003

# The Human Phenome Project



# From Genome to Syndrome?

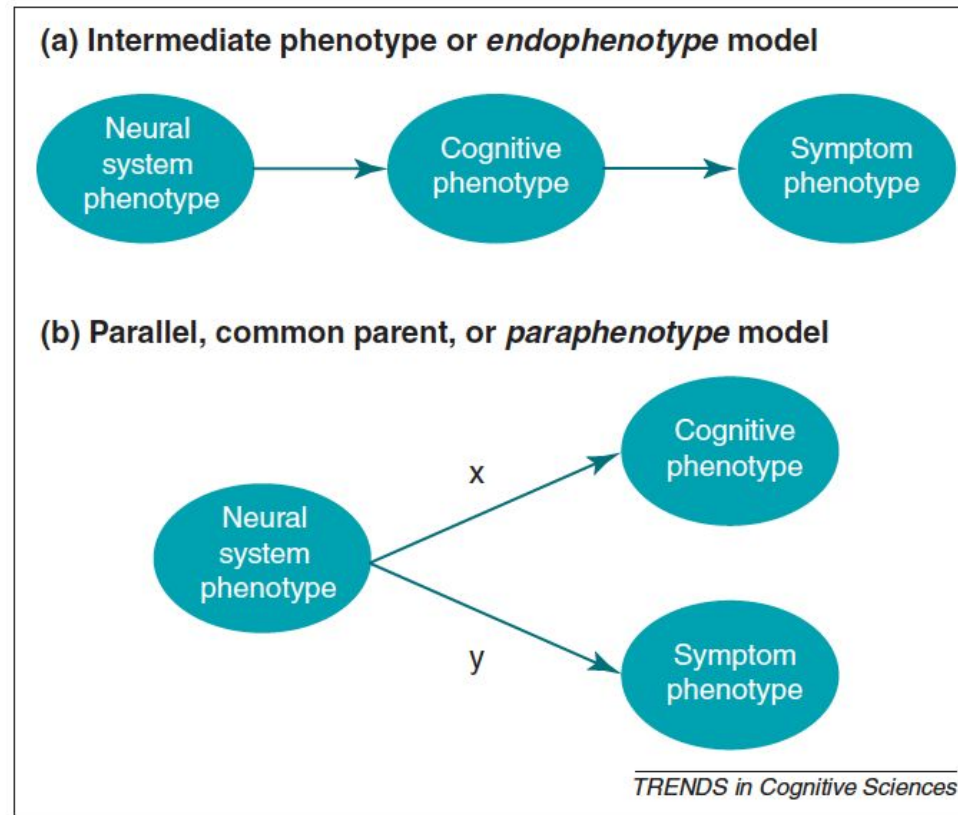
## Example for Neuropsychology

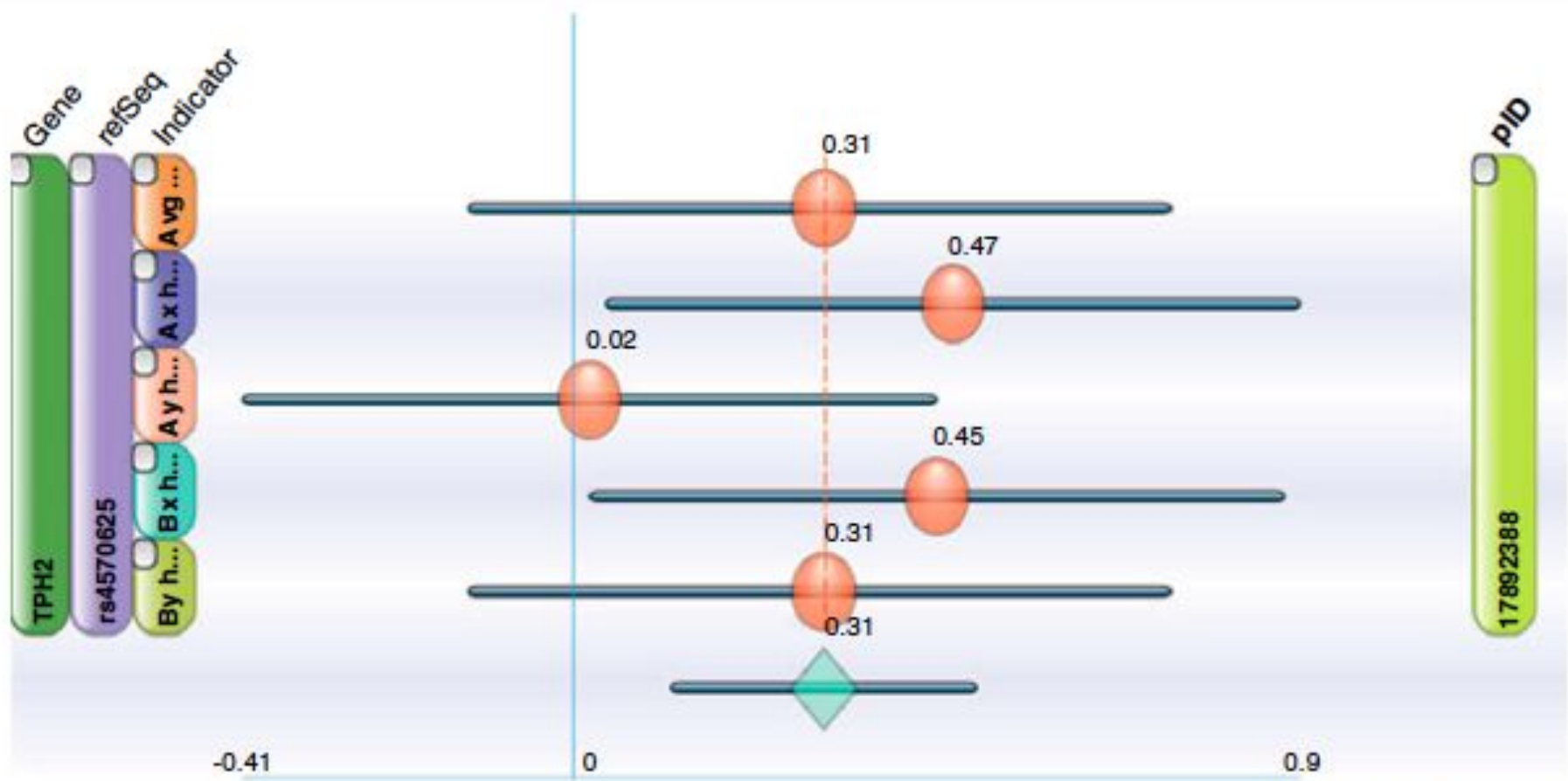


Special Issue: The Genetics of Cognition

# The genetics of cognitive impairment in schizophrenia: a phenomic perspective

Robert M. Bilder<sup>1</sup>, Andrew Howe<sup>2</sup>, Nic Novak<sup>3</sup>, Fred W. Sabb<sup>1</sup> and D. Stott Parker<sup>2</sup>





# Knowledge Base Development for Biomedicine

- Genetics, genomics, and proteomics (Entrez GEO, Gene, Protein, OMIM, SNP, ...)
- Controlled vocabulary resources: UMLS/MeSH, Metathesaurus, Semantic Web, OntoWorld, "Web 2.0"
- "Phenomics" DBs (mostly plants, mouse so far)
- Comparable developments for cognitive neuroscience and neuropsychology?
- If available, would enable connection of NP findings to other sources of biological knowledge (genetic, proteomic, -omic)





# The cognitive atlas: toward a knowledge foundation for cognitive neuroscience

**Russell A. Poldrack<sup>1\*</sup>, Aniket Kittur<sup>2</sup>, Donald Kalar<sup>3</sup>, Eric Miller<sup>4</sup>, Christian Seppa<sup>4</sup>, Yolanda Gil<sup>5</sup>, D. Stott Parker<sup>6</sup>, Fred W. Sabb<sup>7</sup> and Robert M. Bilder<sup>7</sup>**

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<sup>2</sup> *Human-Computer Interaction Institute, Carnegie Mellon University, Pittsburgh, PA, USA*

<sup>3</sup> *National Aeronautics and Space Administration, Ames Research Center, Mountain View, CA, USA*

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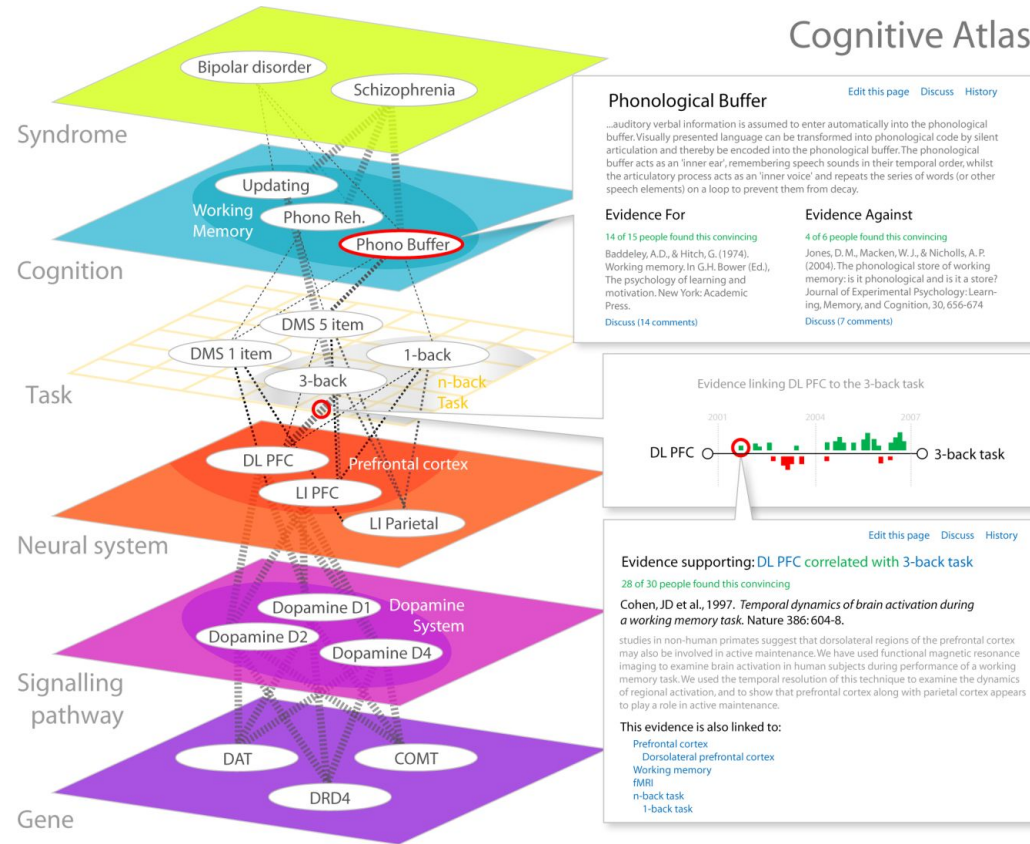
<sup>5</sup> *Information Sciences Institute, University of Southern California, Marina Del Rey, CA, USA*

<sup>6</sup> *Department of Computer Science, University of California Los Angeles, Los Angeles, CA, USA*

<sup>7</sup> *Semel Institute for Neuroscience and Human Behavior, University of California Los Angeles, Los Angeles, CA, USA*



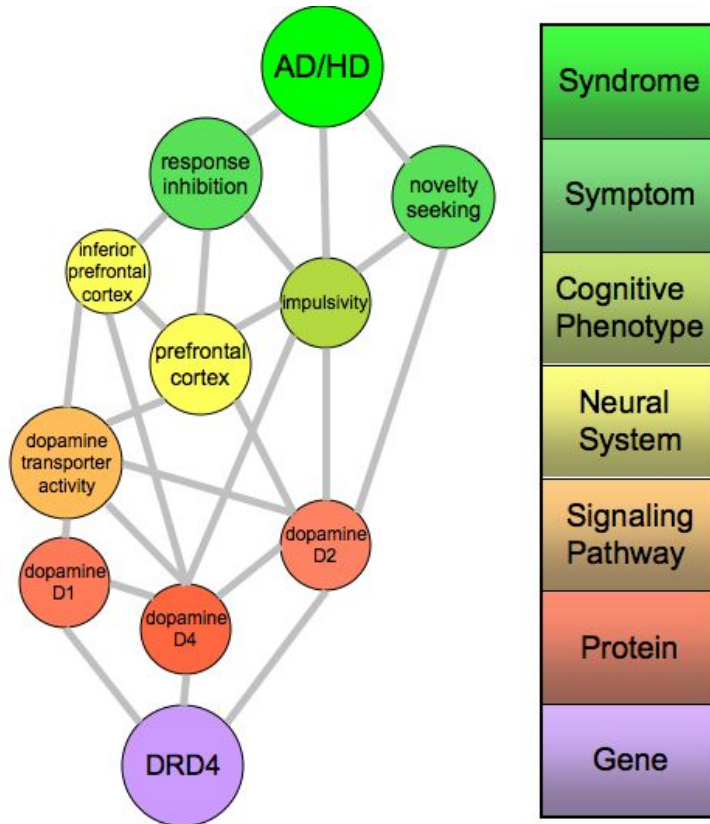
## Cognitive Atlas



- The Cognitive Atlas is conceptualized as a related set of maps. A given map may contain sets of related concepts, quantitative models of literature association, annotated effect size statistics, raw data, summaries of voting, and qualitative free-text inputs.

- For cognitive concepts (e.g., the “phonological buffer”) there are associated cognitive concepts, and a “test” layer comprising objective indicators of the concepts

# Architectures for cognitive ontology development



- Hypotheses for complex neuropsychiatric syndromes demand representation at multiple levels and span multiple biological scales
- Plausible mechanistic hypotheses should have representation at all levels
- Strongest hypotheses are those possessing paths with strongest effects
- Causal models can be constructed, compared (goodness of fit); results can rule out dead ends (pruning) or suggest areas where evidence could yield transformation of current knowledge

Graph representation of multi-level hypotheses for neuropsychiatry research



# Multilevel Models from Biology to Psychology: Mission Impossible?

Bilder RM, Howe AG, Sabb FW

Journal of Abnormal Psychology, 2013 Aug;122(3):917-27.

*It might be argued that the task of the psychologist, the task of understanding behavior and reducing the vagaries of human thought to a mechanical process of cause and effect, is a more difficult one than that of any other scientist.*

(D. O. Hebb, 1949, p. xi)



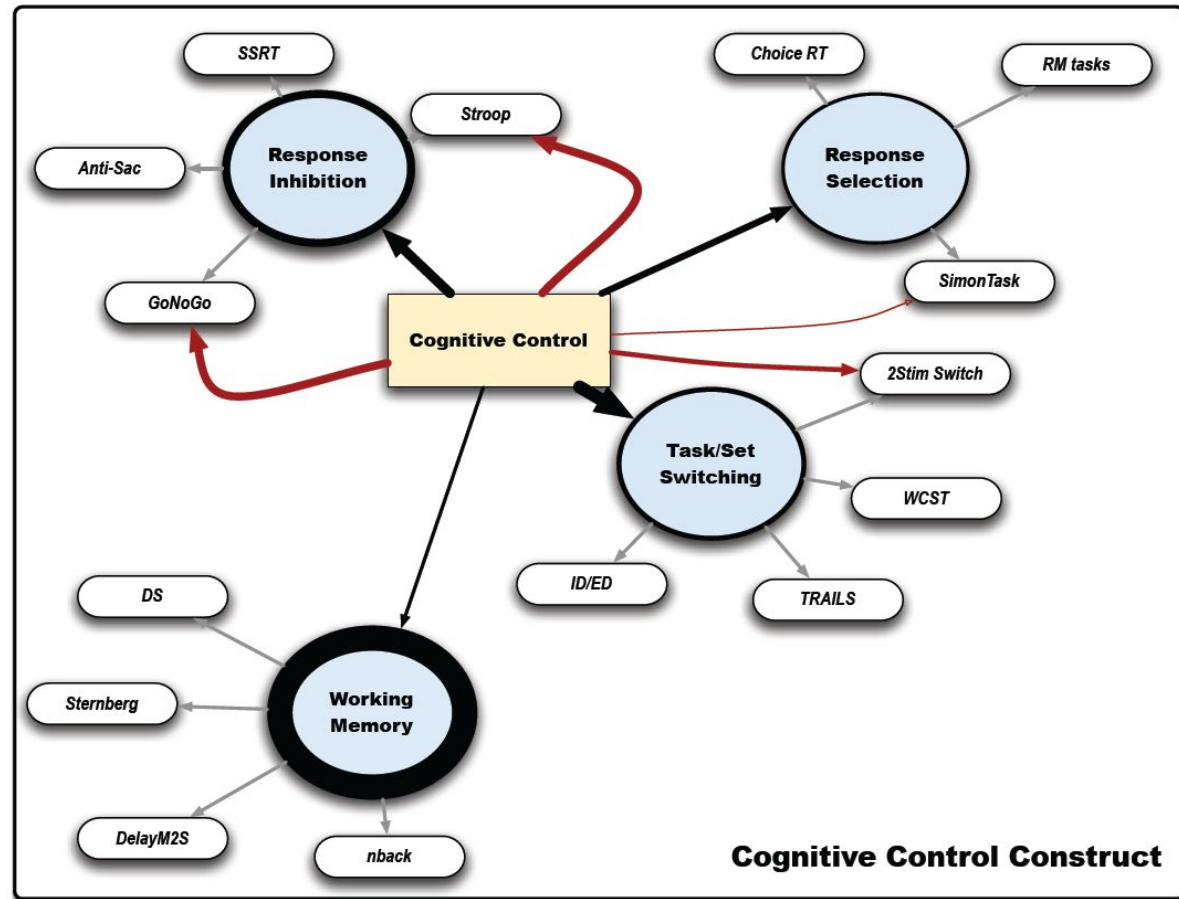
Table 1

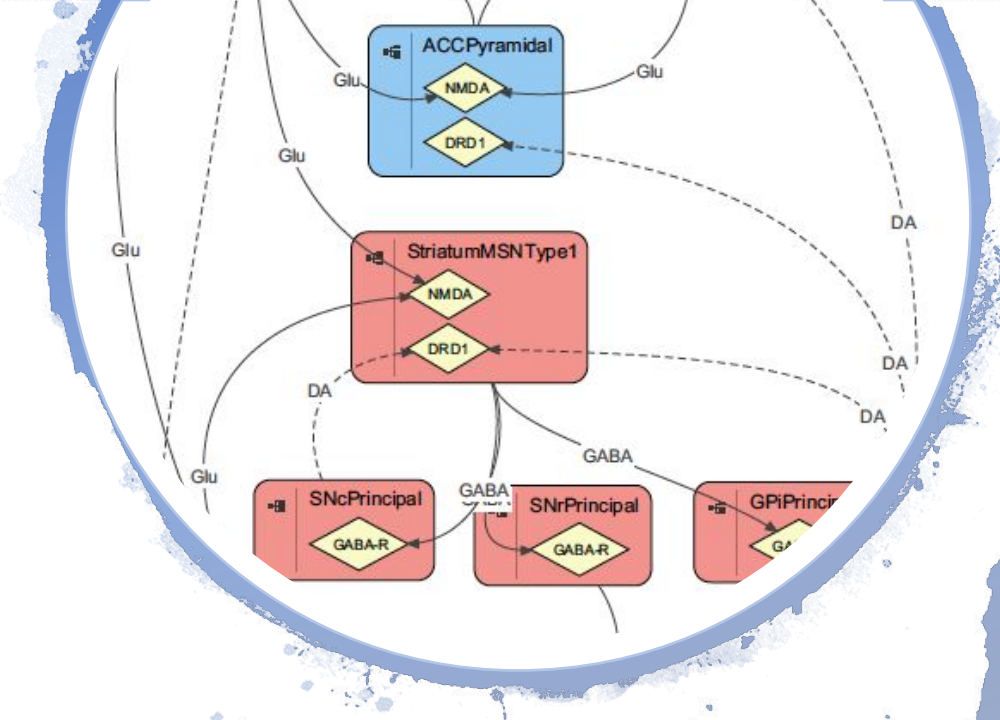
*Examples of Ontologies or Descriptive Systems Used to Represent Concepts and Relations Among Concepts for Levels of Analysis From the Syndrome to the Genome*

Level of analysis	Example ontologies/descriptive systems
Syndrome	Diagnostic and Statistical Manual of Mental Disorders
Symptom	Measurement models with latent symptom constructs based on rating scales, interview schedules
Cognitive	Measurement models with latent cognitive constructs based on psychometric test scores
Neural system/circuit Cellular systems/ signaling pathways	NeuroML; CocoMac; Xanat Ingenuity Pathways Analysis; Gene Ontologies biological processes; KEGG Pathway
Proteins Genes and gene expression	Entrez Protein; UniProt/SwissProt; NextProt Gene Ontologies; Entrez Gene, Gene Expression Omnibus

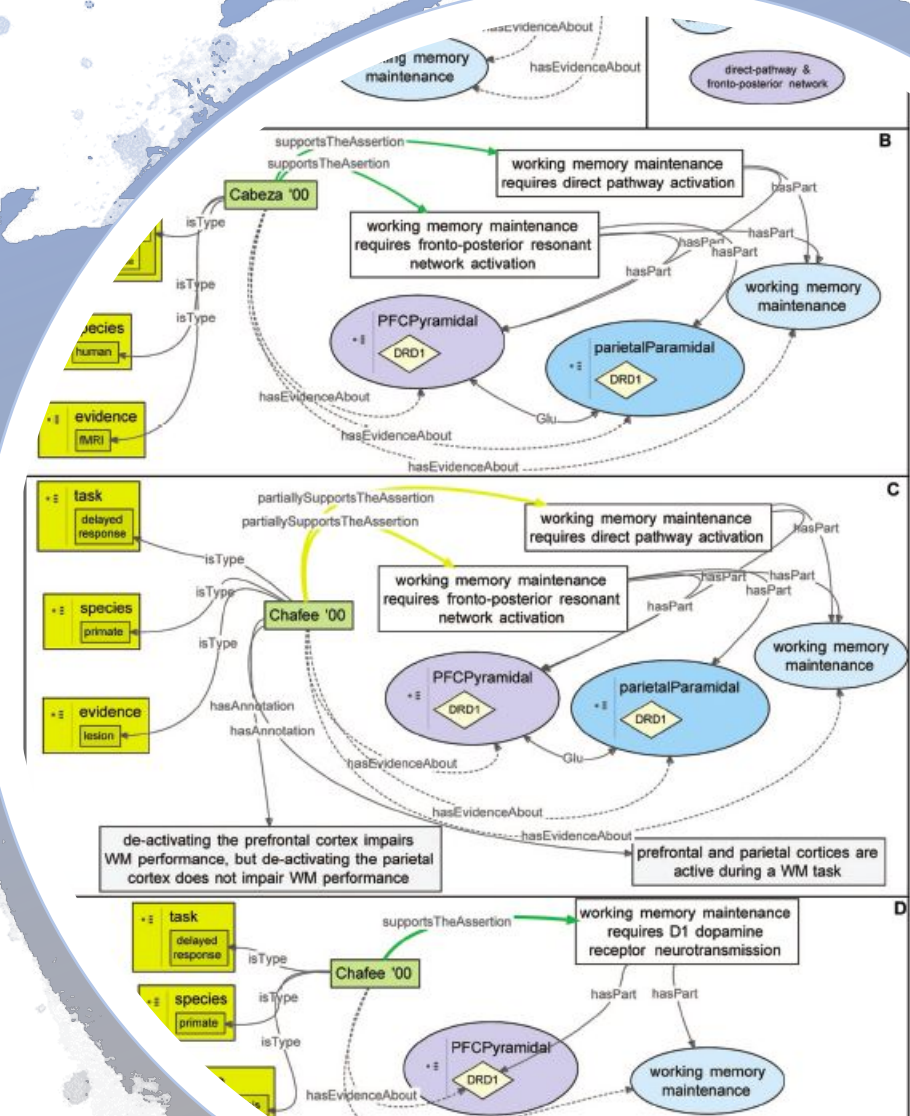
# Concept definition via multiple sub-constructs and test indicators

“Cognitive control” has been associated in PubMed literature with RI, RS, TSS and WM. Sampling all 5 concepts (x30 papers) identified the task indicators used to assess these concepts. CC itself was measured using *only* task indicators already used to define RI, RS and TSS.

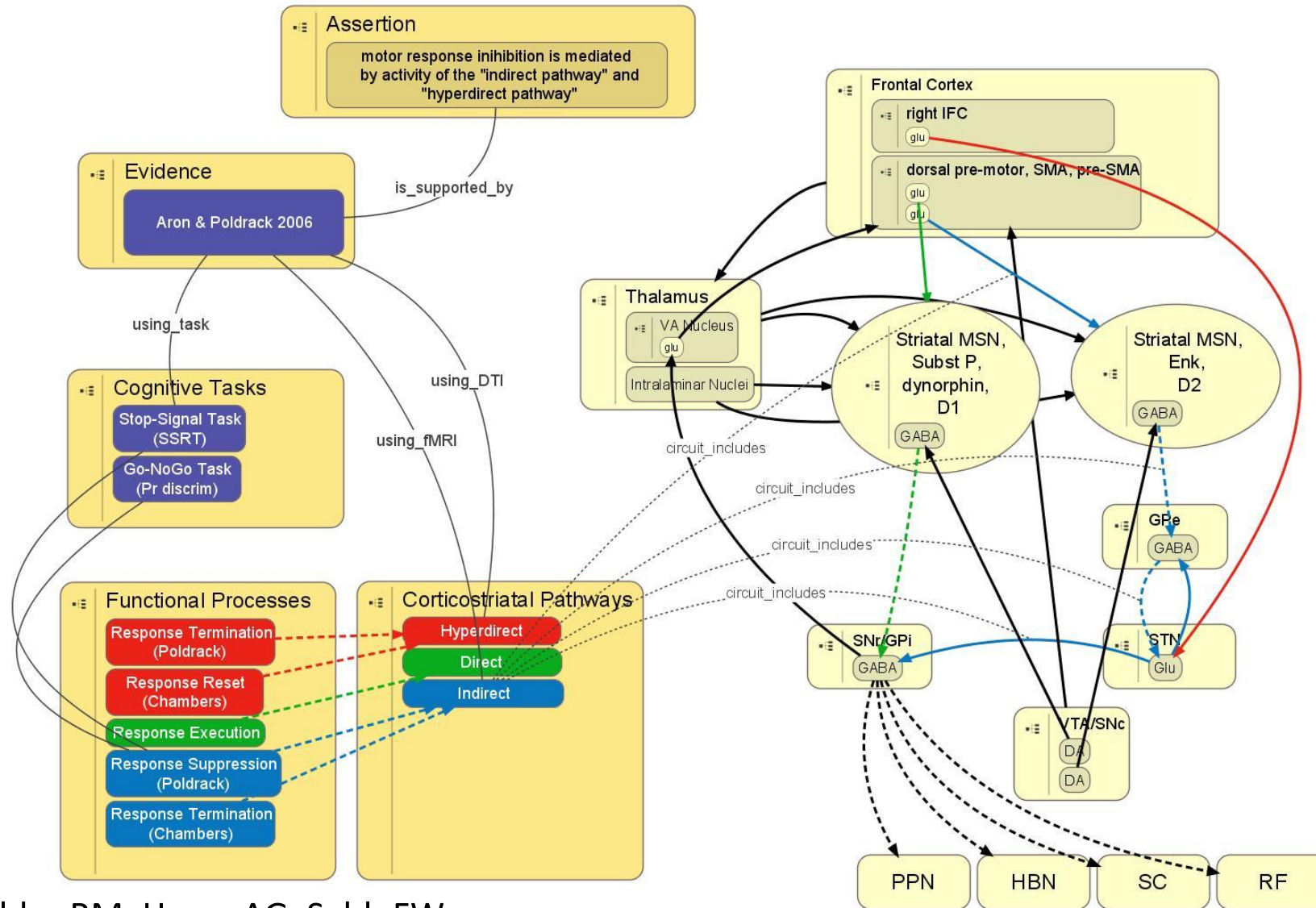




- Managing assertions about brain-behavior relations using a neural circuit description framework
- Enabling machine operations on knowledge elements to test hypotheses and generate new experimental designs



# Schema for Validation of Hypotheses about Neurocognitive Concepts



Bilder RM, Howe AG, Sabb FW  
 Journal of Abnormal Psychology, 2013 Aug;122(3):917-27.



**THE NATIONAL NEUROPSYCHOLOGY NETWORK (NNN) DEVELOPS A FOUR-SITE DEMONSTRATION PROGRAM, THROUGH WHICH CENTERS ACQUIRING CLINICAL NEUROPSYCHOLOGICAL (NP) DATA CAN ACCUMULATE, AND AGGREGATE THE ITEM-LEVEL DATA FROM THE MOST WIDELY USED NP ASSESSMENT INSTRUMENTS INTO THE NIH NATIONAL DATA ARCHIVE (NDA).**

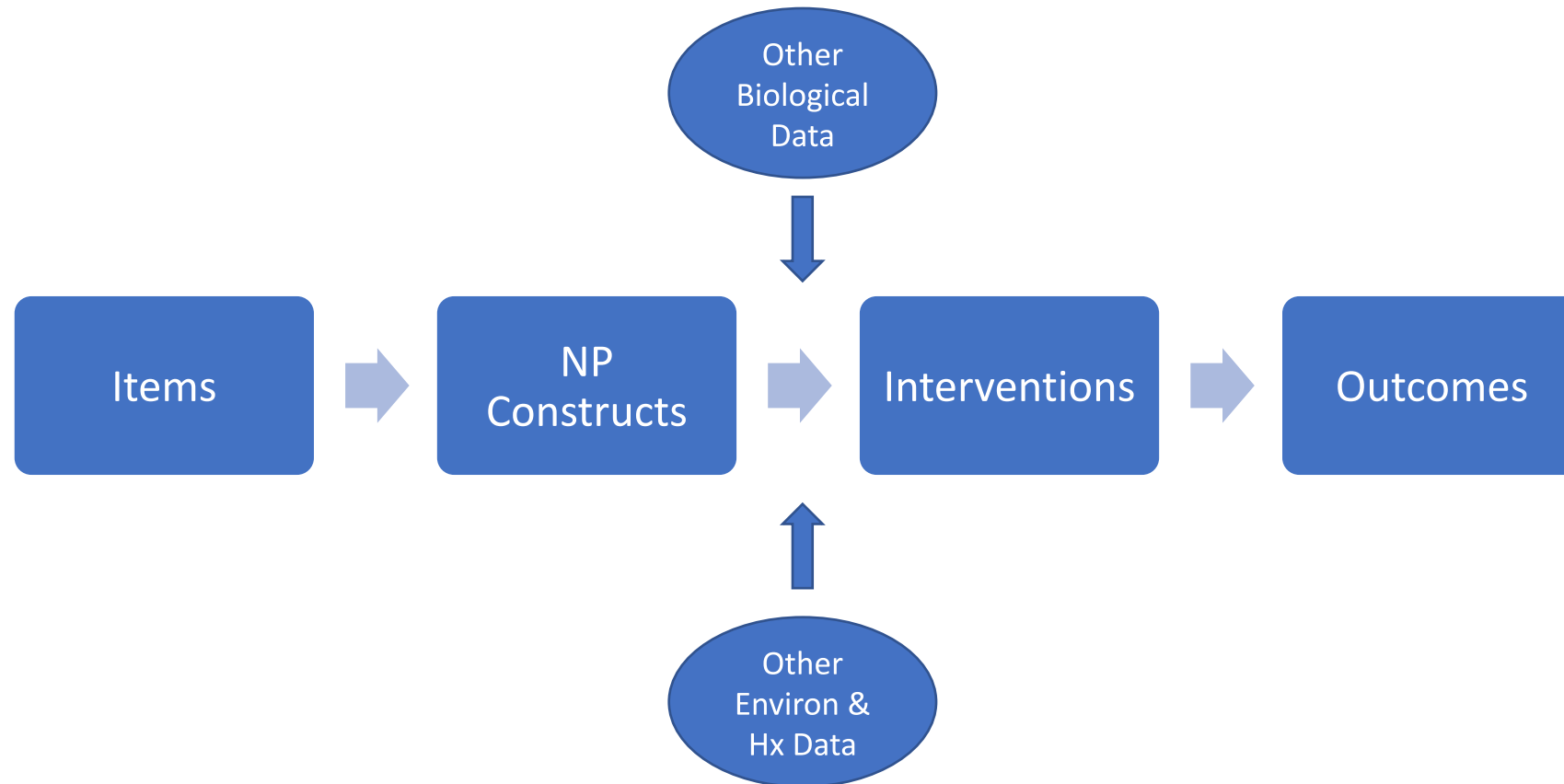
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<https://www.sistat.ucla.edu/NNNWeb/index.html>



# The Path to Precision Neuropsychology



# Many thanks!

**National Neuropsychology Network** (Bauer, Drane, Loring, Umfleet, Cavanagh, Enriquez)

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