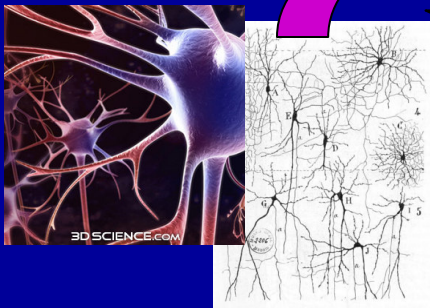


# **Quantitative approaches in behavioral neuroscience**

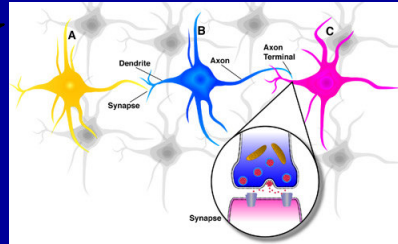
**1st ISBS Summer School  
St. Petersburg, Russia  
May 9th -15th,2008**

# From neurons to complex behaviors

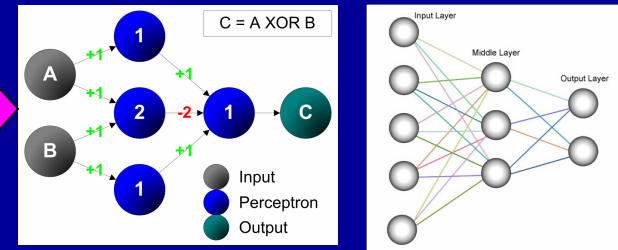
Neurons



Biological neural networks



“Model” neural networks

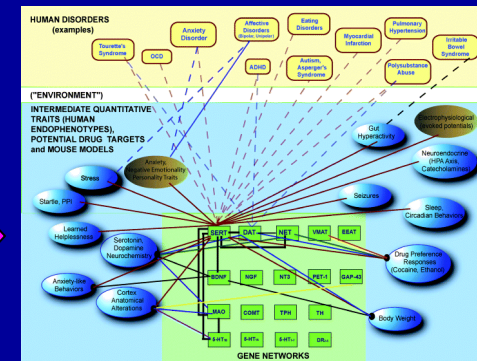


**Key brain processes:**  
Imaging Decision Action



Complex animal behaviors

**Translating animal behavior into complex human phenotypes**

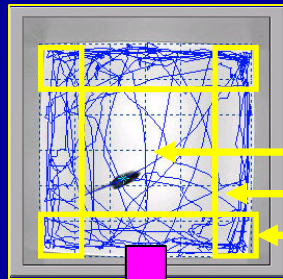
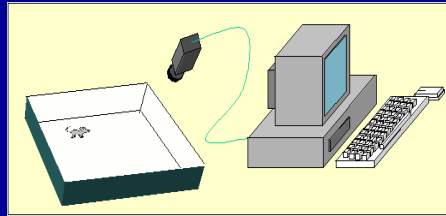


Models of human brain disorders

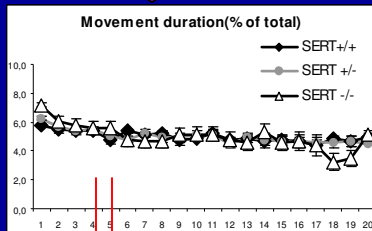
# Quantification of animal behaviors

## I. Analysis of quantity vs. quality/patterning

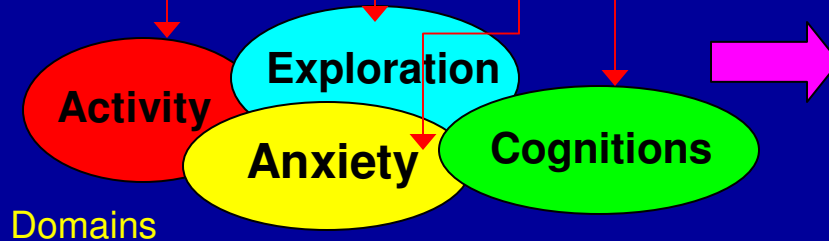
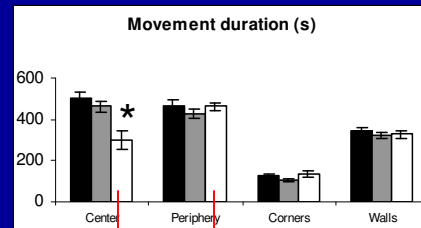
- spatial
- temporal
- spatio-temporal



Center  
Periphery  
Corners



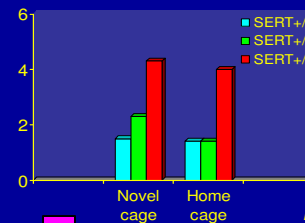
*Kalueff et al., 2007, in press*



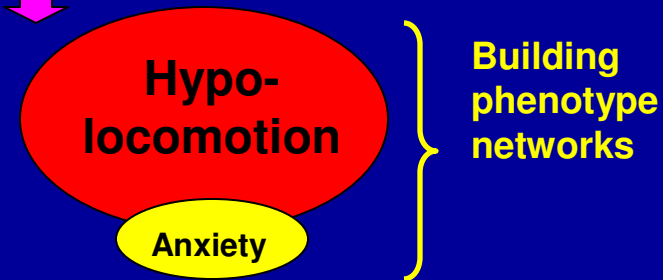
## II. Confronting behavioral domains

**Example:** marble burying test

- Anxiety
- Activity

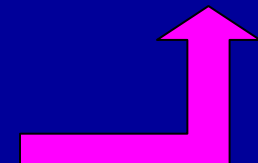


*Kalueff et al., 2006*



**Defining endo-phenotypes:**

- ↓ Locomotion
- ↑ Anxiety or emotionality
- Unaltered spatial memory
- Use of different spatial strategies

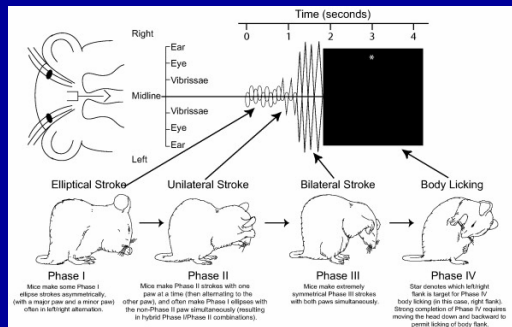
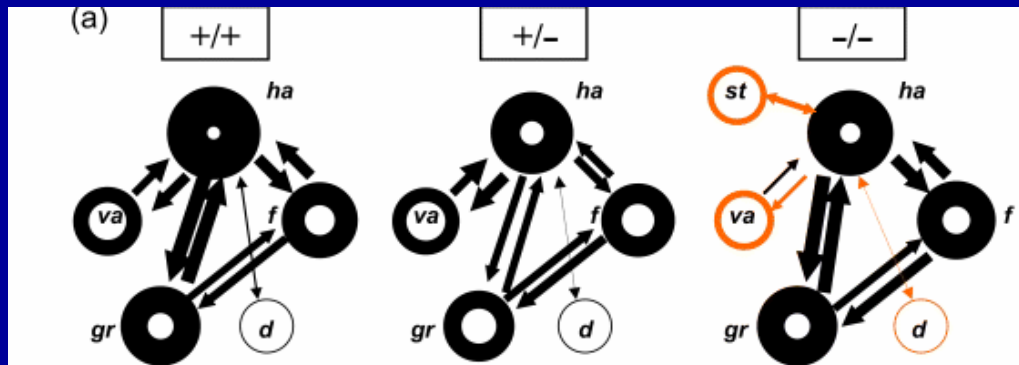
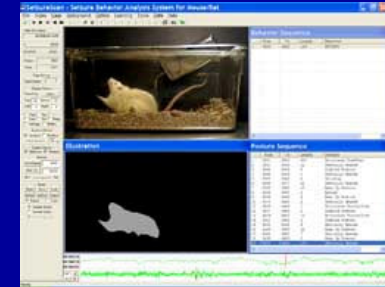




# Other data-mining approaches

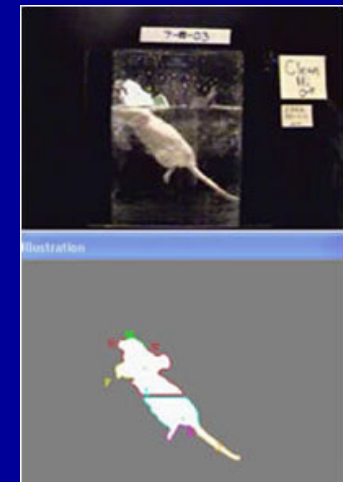
- Correlation analysis
- Principal component analysis
- Analysis of **microbehaviors** →
- Assessment of behavioral **organization** ↓

E.g.: ethograms



Kalueff et al., 2007, *Genes Brain Behav*

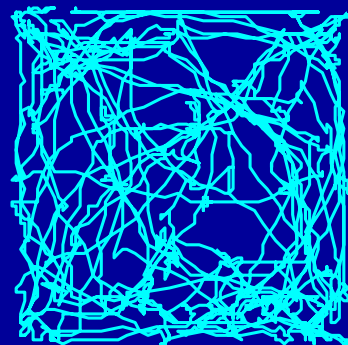
E.g., grooming  
Berridge et al., 2005



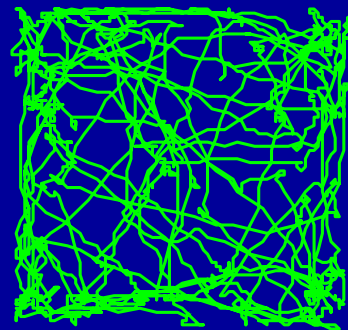
Clever System Inc

Better models  
of behaviors

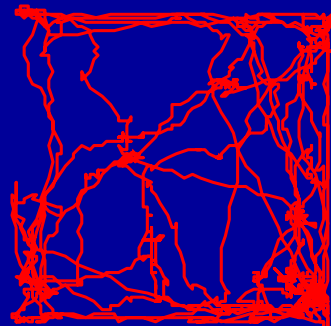
# Towards better models of behaviors



+/+

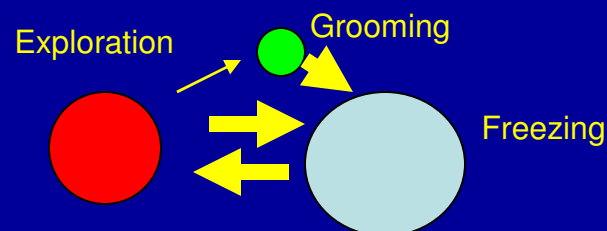


+/-

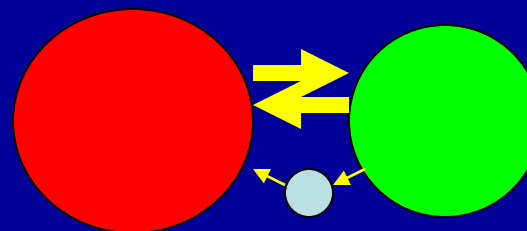


-/-

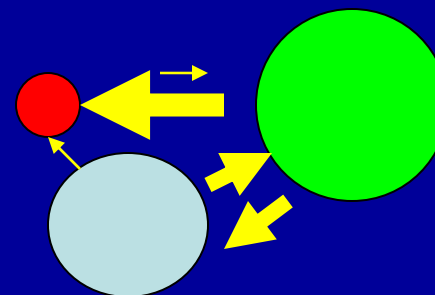
Thigmotaxis:  
High anxiety



High  
anxiety



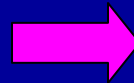
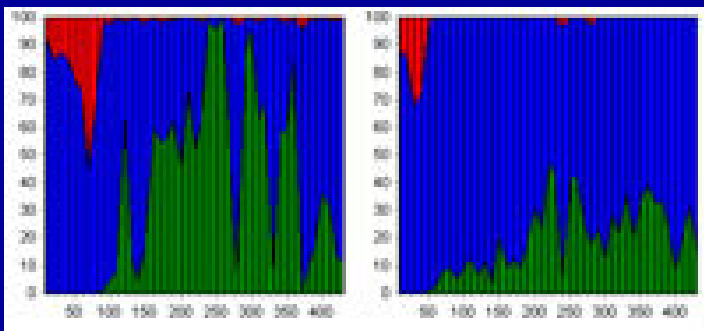
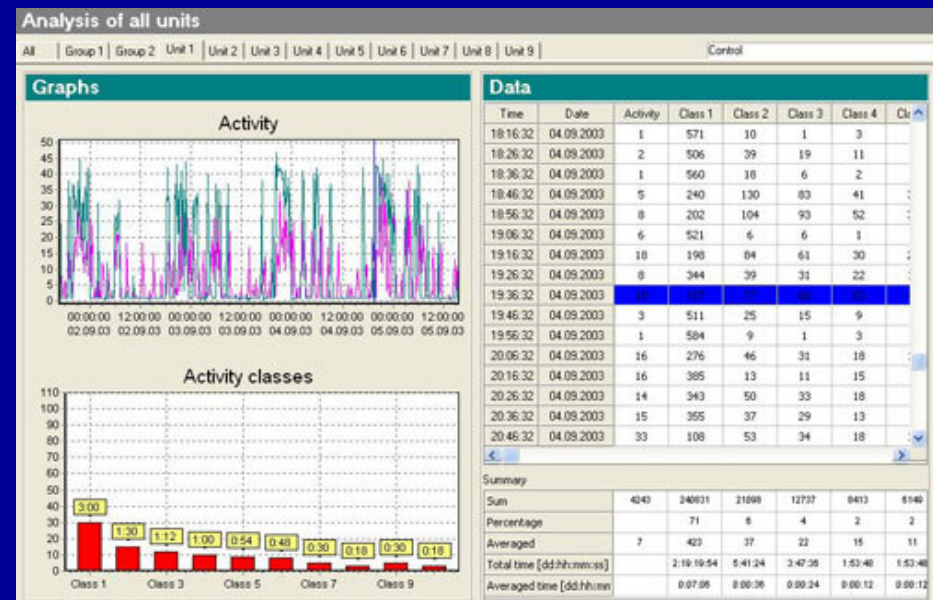
OCD-like  
behavior



Depressive  
phenotype

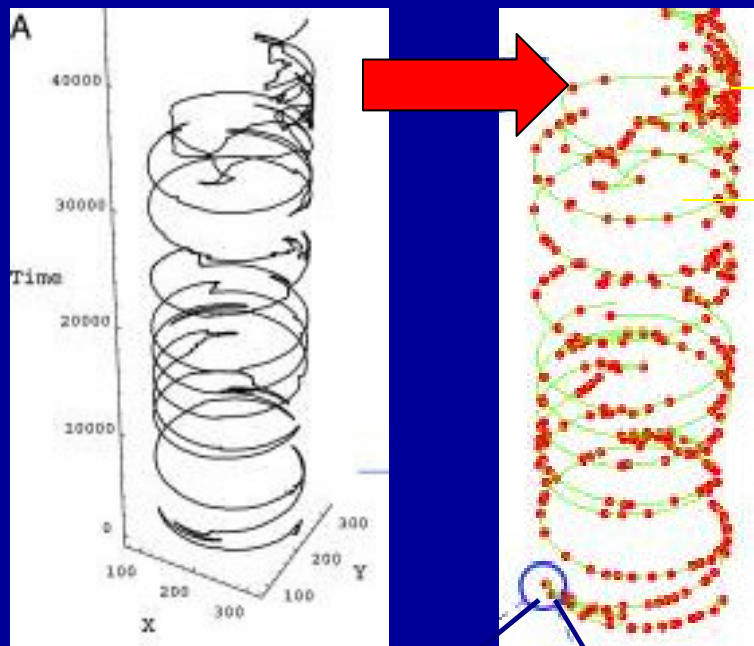
Can be used to create artificial  
models of aberrant behaviors

# Extensive automated phenotyping systems



**Better models  
of behaviors**

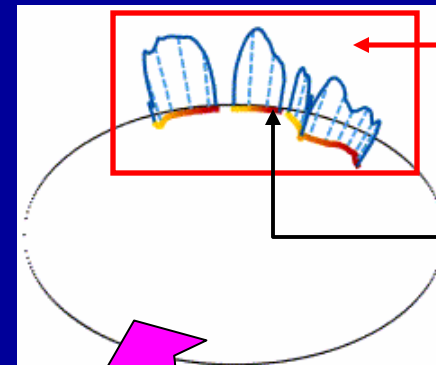
# Extensive automated behavioral analysis



The path in a 3D representation of X, Y, and time

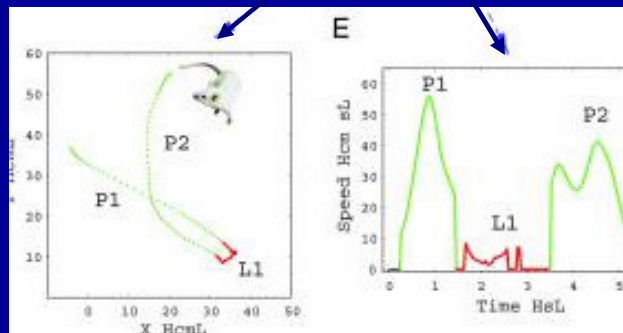
Slow movement episodes  
(e.g., stops)

Progressions (green)



New approach:  
sensitive to stress,  
drugs and genetic  
differences

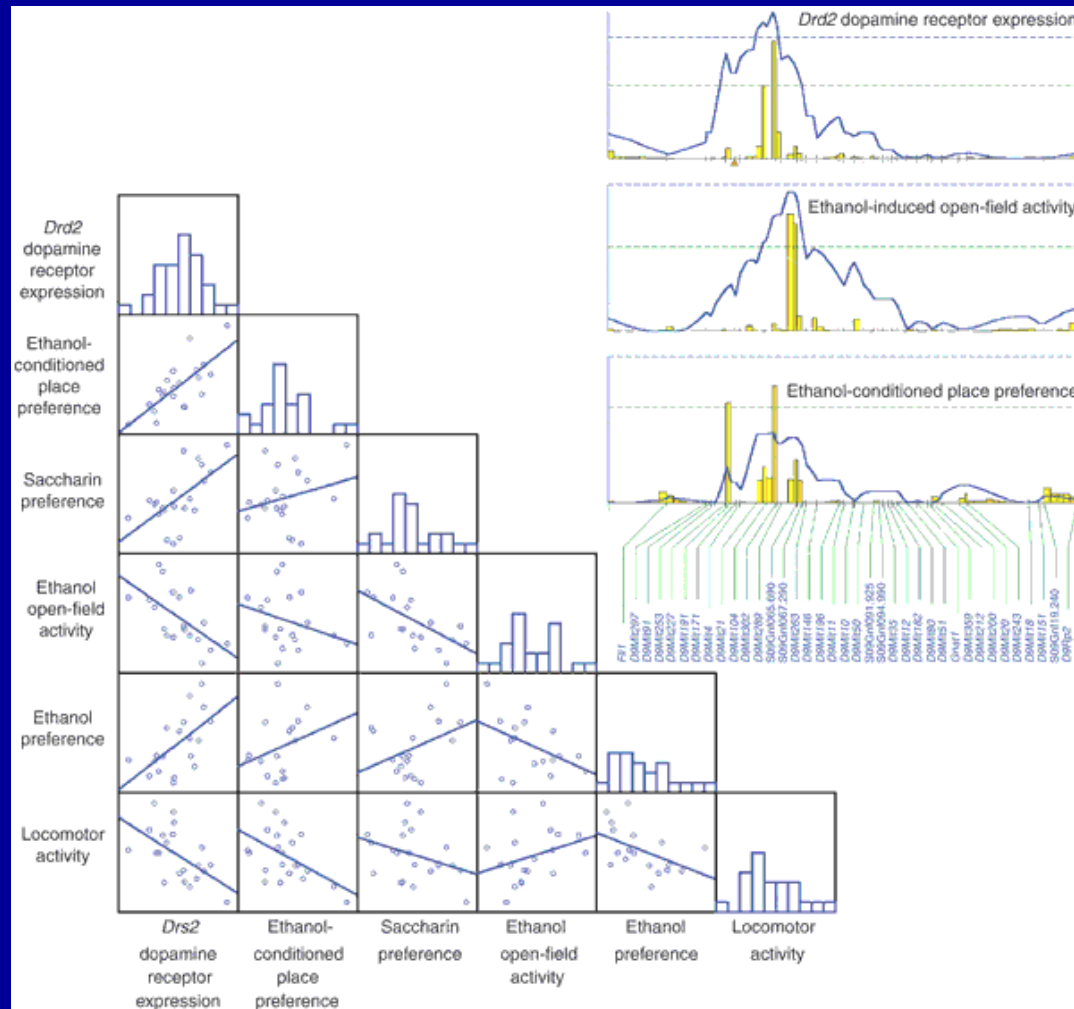
Traditional  
approach



The path plot and speed profile of two progression segments (P1 and P2) are separated by one "stopping" episode

*Kafkafi et al., 2005, PNAS*

# Gene-Behavior correlations

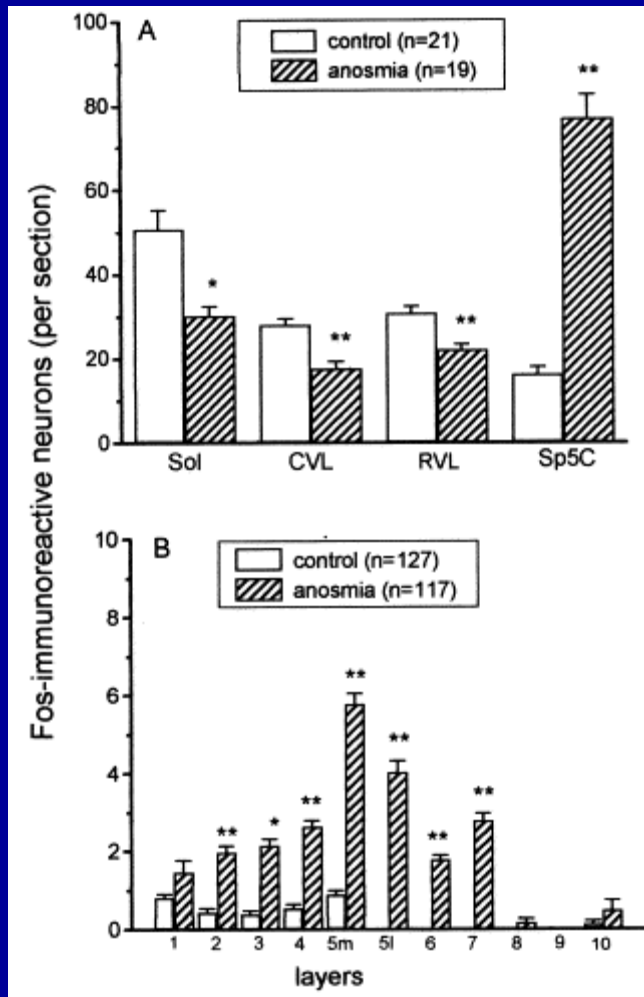


Correlation of *Drd2* expression (MA) with several behavioral phenotypes

*Chesler et al., 2005*



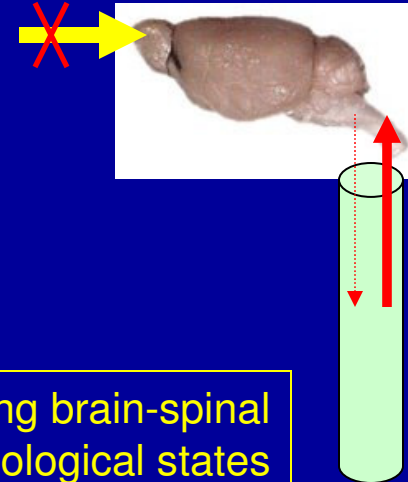
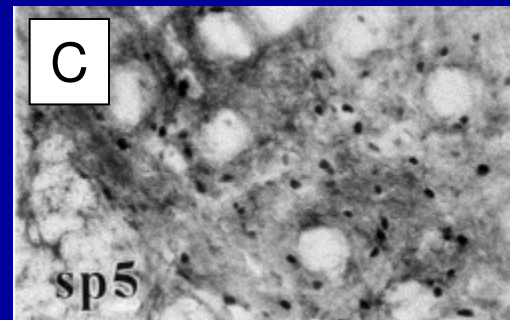
# Functional neurogenomics: c-fos



A: Number of Fos-LI cells in the nucleus of solitary tract (Sol), caudal and rostral parts of ventrolateral medulla (CVL, RVL) and the spinal trigeminal nucleus caudalis (Sp5C) in anosmic vs. control rats

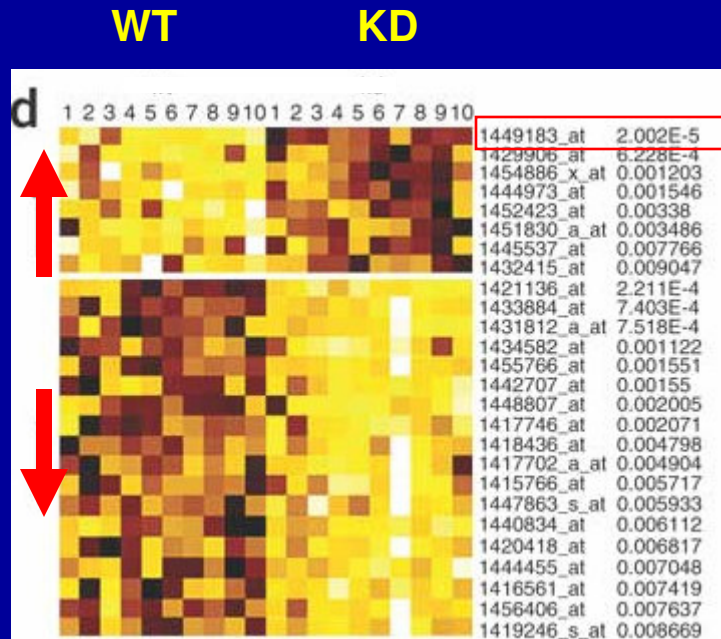
B: Number of Fos-LI neurons in different layers of the lumbar enlargement (L4/L5) in anosmic vs. control rats

C: Intensive Fos-immunoreactivity in the spinal trigeminal nucleus caudalis in anosmic rat



May be relevant to modeling brain-spinal networks at different physiological states

# Functional neurogenomics: MA



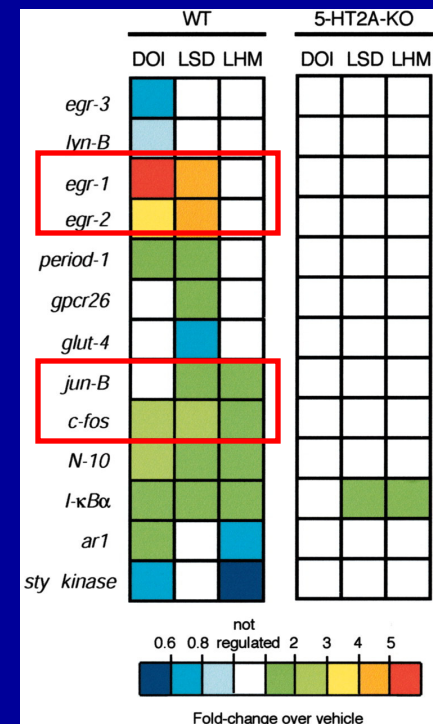
Paterlini et al., 2005, Nat Neurosci

Schizophrenia-related phenotype in *Prodh* knock-down mice associated with up-regulation of catecholamine-O-methyl-transferase (COMP) gene in the cortex

G x G

Drug x G

Early genes

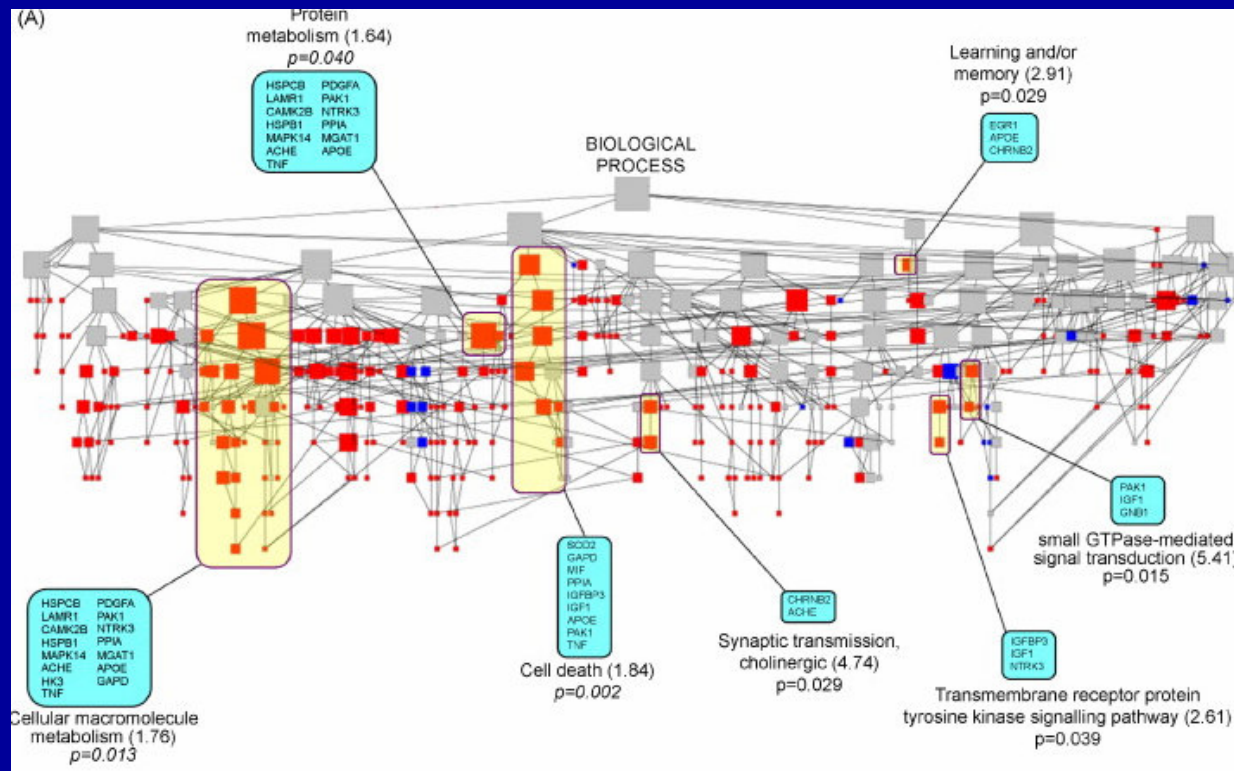


Transcriptome fingerprints induced by 5-HT2AR agonists  
In wild-type (WT) and 5-HT2AR null-mutant (KO) mice

Gonzales-Maesó et al., 2003, J Neurosci

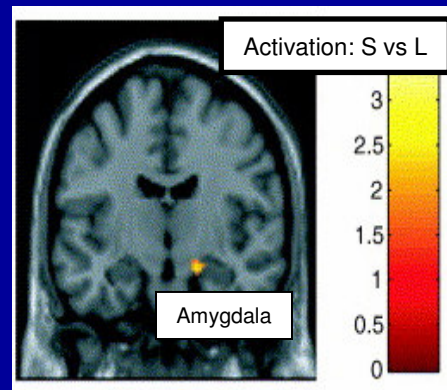
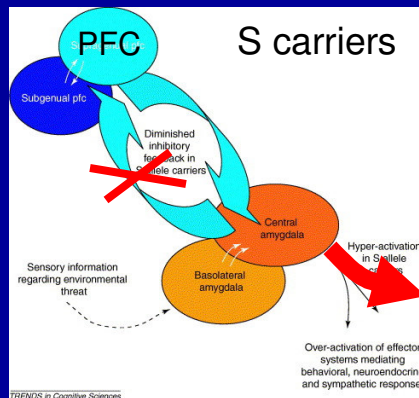
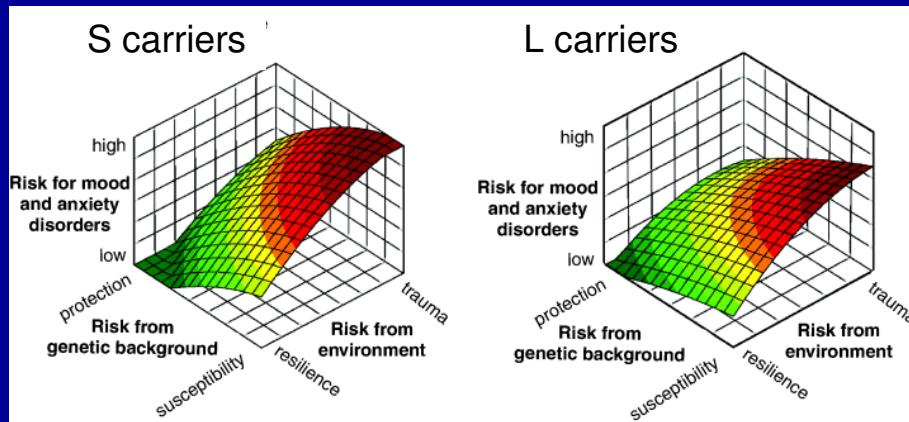
# High-throughput “omics”: functional gene networks

32 genes differentially expressed in mice-winners and losers (GoMiner). GoMiner classified these genes into biologically coherent categories and assessed these categories, generating hypotheses on how these genes may be related



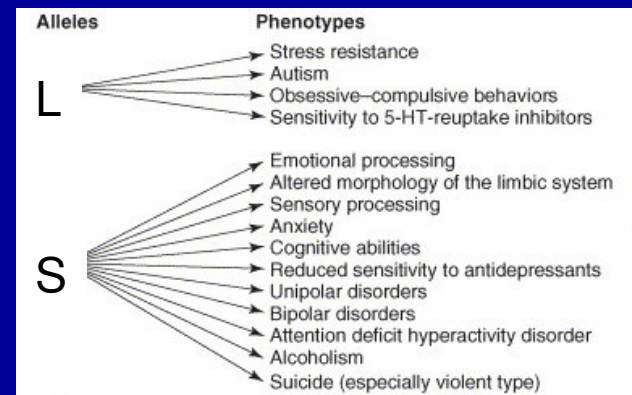
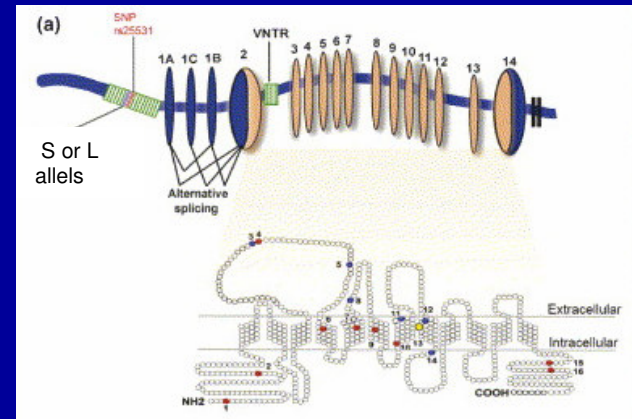
# Modeling genetics of brain disorders

3D model of SERT contribution to individual differences in negative emotionality, mood and anxiety disorders



Holmes and Hariri, 2003, 2005

Human SERT genetic polymorphisms and neuropsychiatric phenotypes

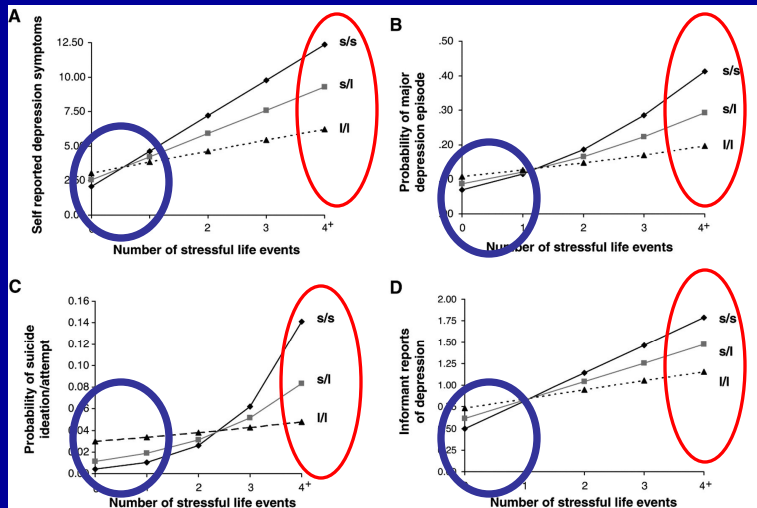


Kalueff et al., 2007



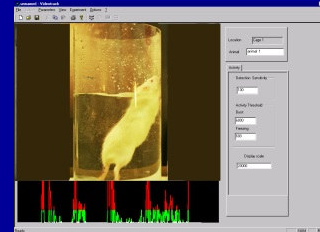
# Modeling complex brain phenotypes: G x E

Gene x environment interactions: SERT gene variants and clinical depression



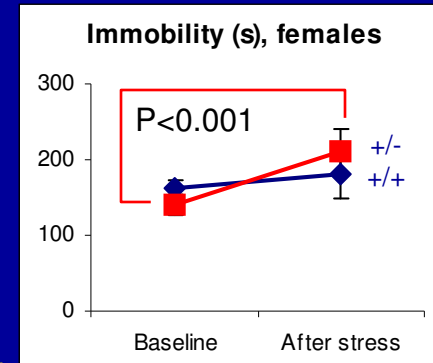
*Caspi et al., 2003, Science*

Replication of Caspi's study in SERT $\pm$  mice using the forced swim test (immobility = despair)

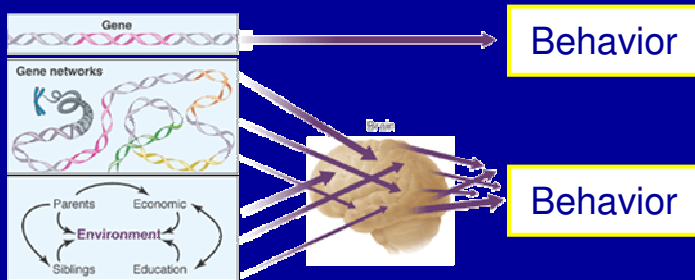


The forced swim test

SERT $+/+$  mice = l/l  
SERT $\pm$  mice = s/s or s/l



*Kalueff et al., unpublished data*



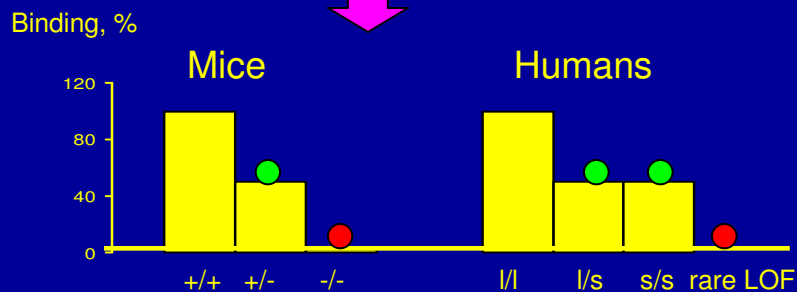
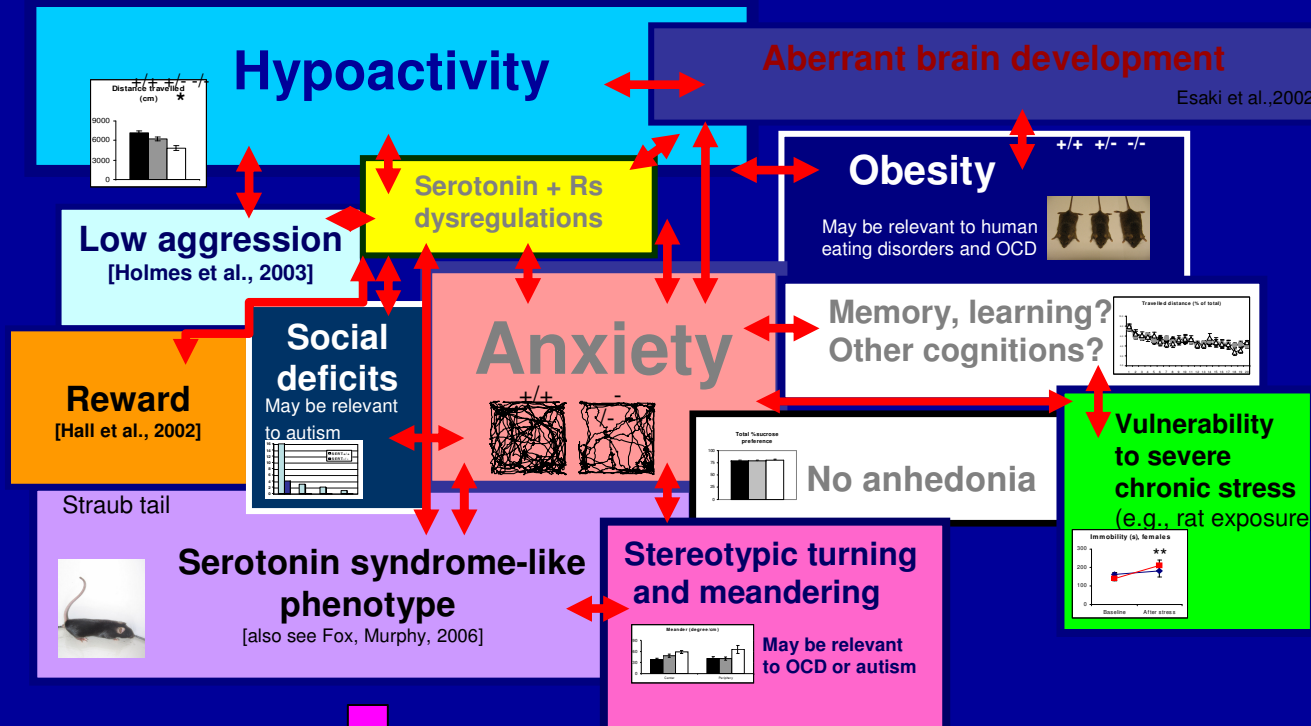
*Hammer D, 2002, Science*

The importance of modeling  
neural x gene x environment  
networks



# Building phenotype networks: SERT-/- mice

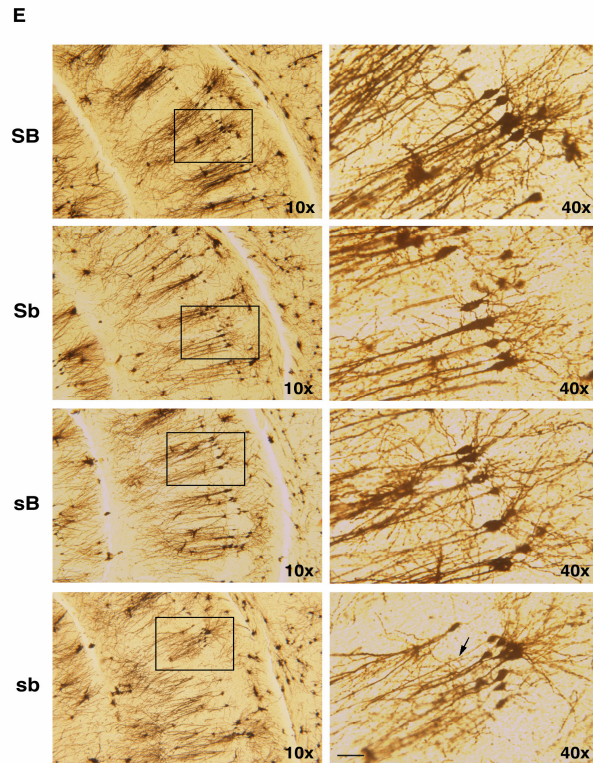
Kalueff et al., CINP, 2007



Translating animal phenotypes into human behavior



# Gene x Gene interactions: gene networks



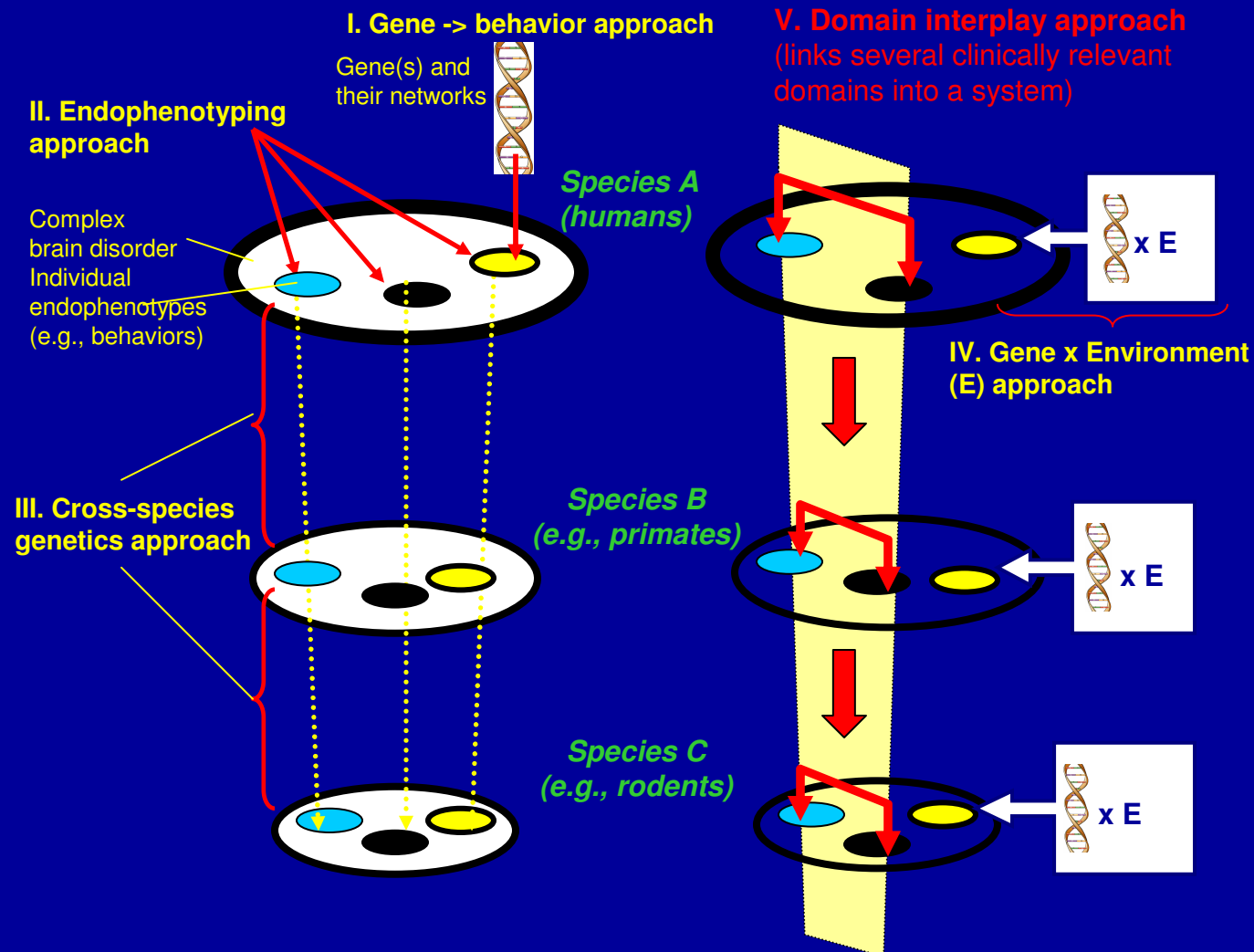
SERT<sup>-/-</sup> x BDNF<sup>+/-</sup> mice

Exaggerated anxiety in SERT<sup>-/-</sup> x BDNF<sup>+/-</sup> mice (Ren-Patterson et al., 2005)

Altered neuronal morphology and neurochemistry in SERT<sup>-/-</sup> x BDNF<sup>+/-</sup> mice (Ren-Patterson et al., 2005)

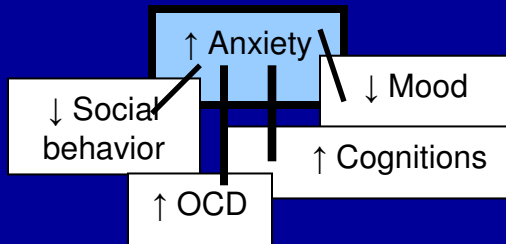
*Ren-Patterson et al., 2005, J Neurosci Res*

# Modeling domain interplay in biopsychiatry

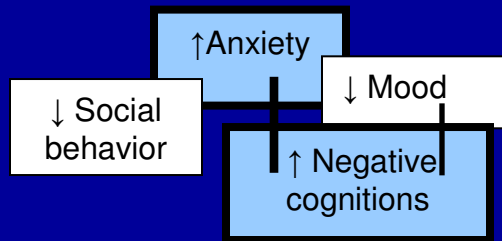


# Domain-oriented modeling of brain disorders

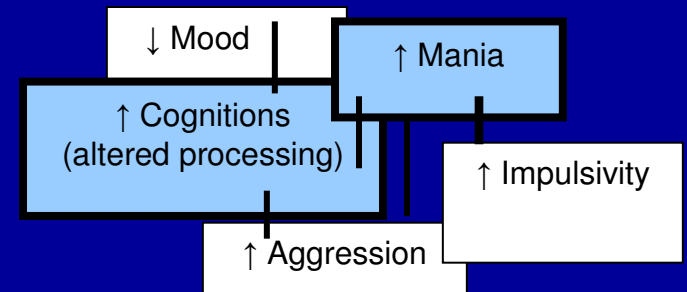
## Generalized anxiety



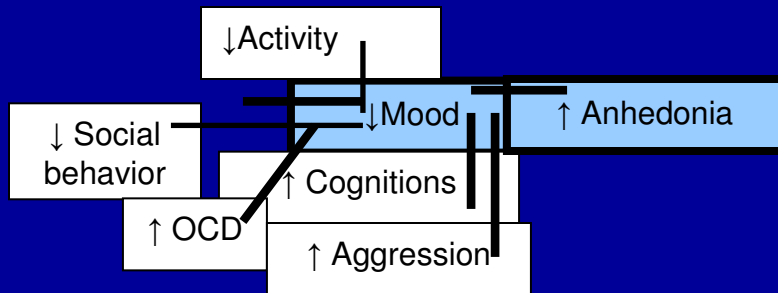
## Post-traumatic stress



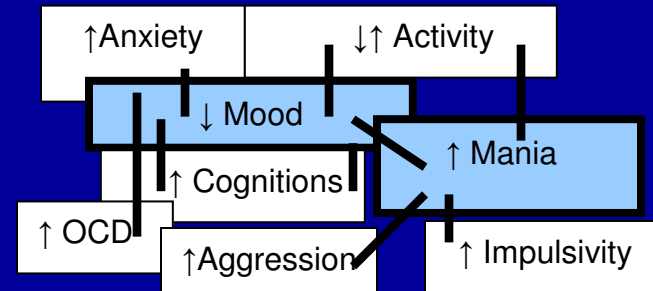
## Schizophrenia



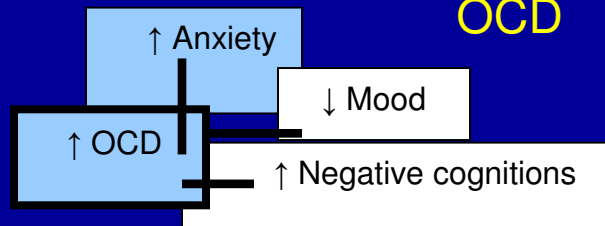
## Unipolar depression



## Bipolar depression

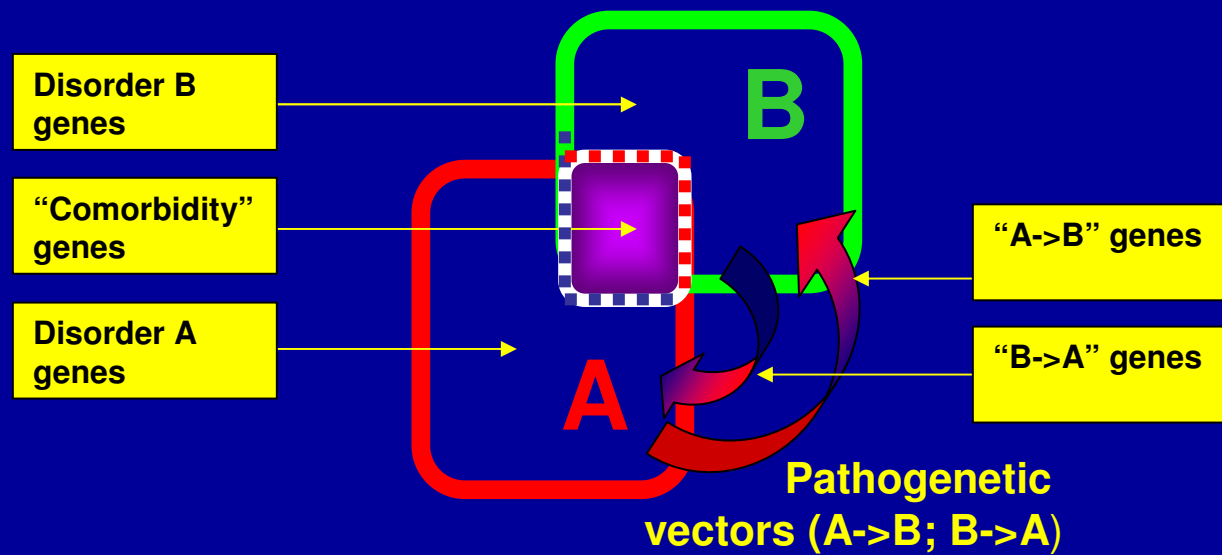


## OCD



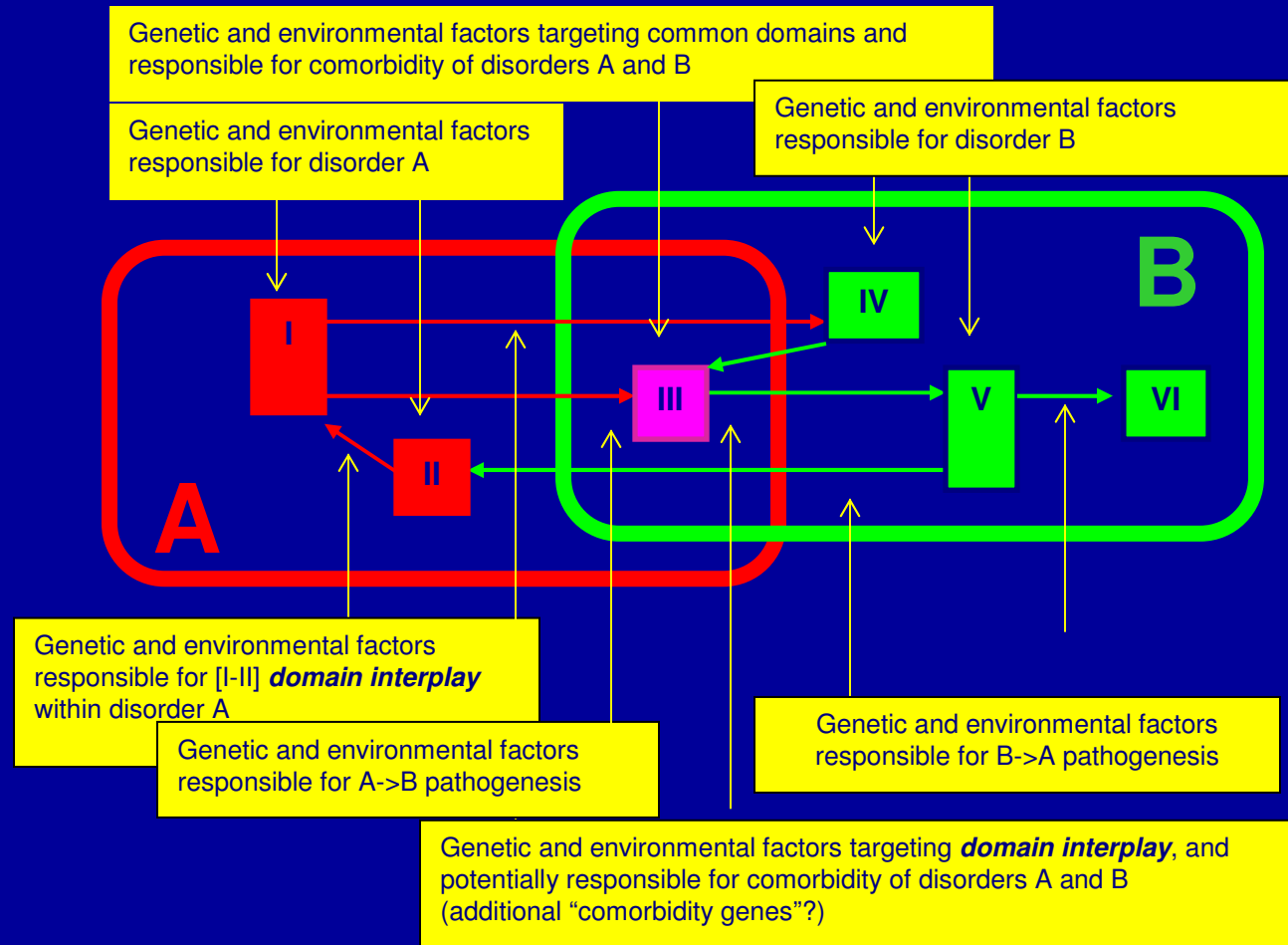
*Kalueff et al., 2007, submitted*

# Domain-oriented modeling of brain disorders

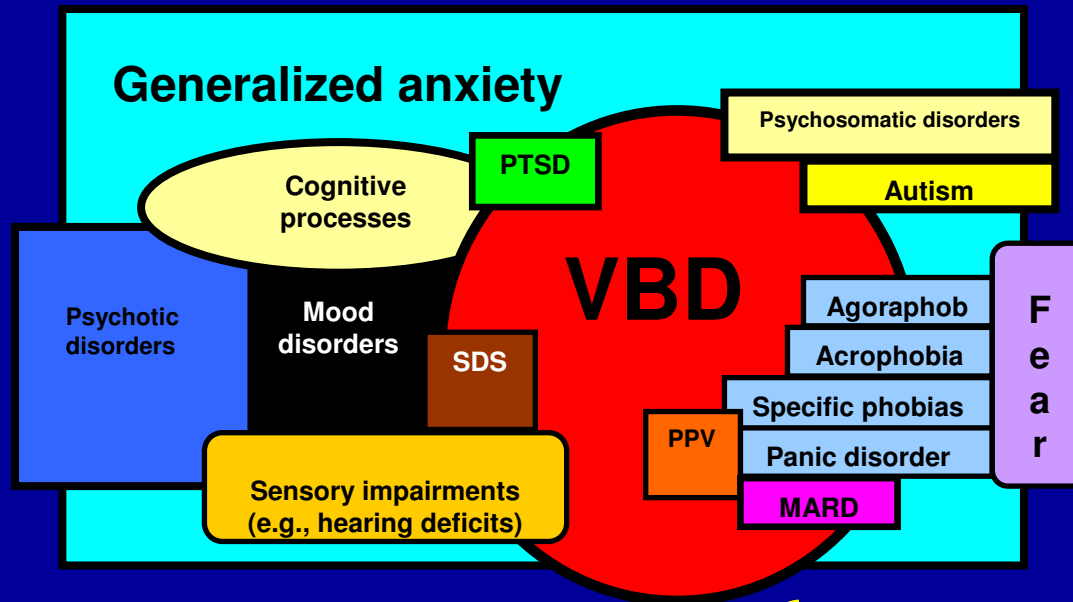




# Domain-oriented modeling of brain disorders



# Domain-oriented modeling of brain disorders

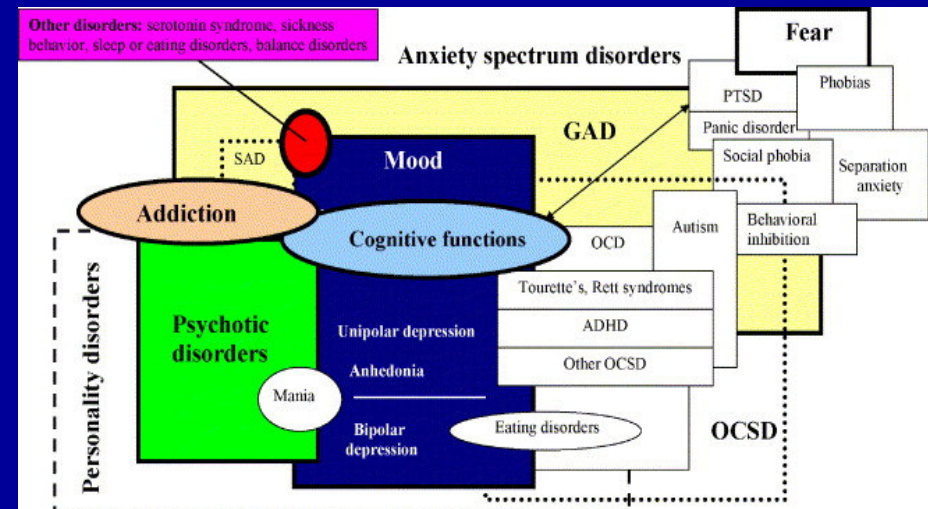


Anxiety, vestibular functions and sensory-motor integration

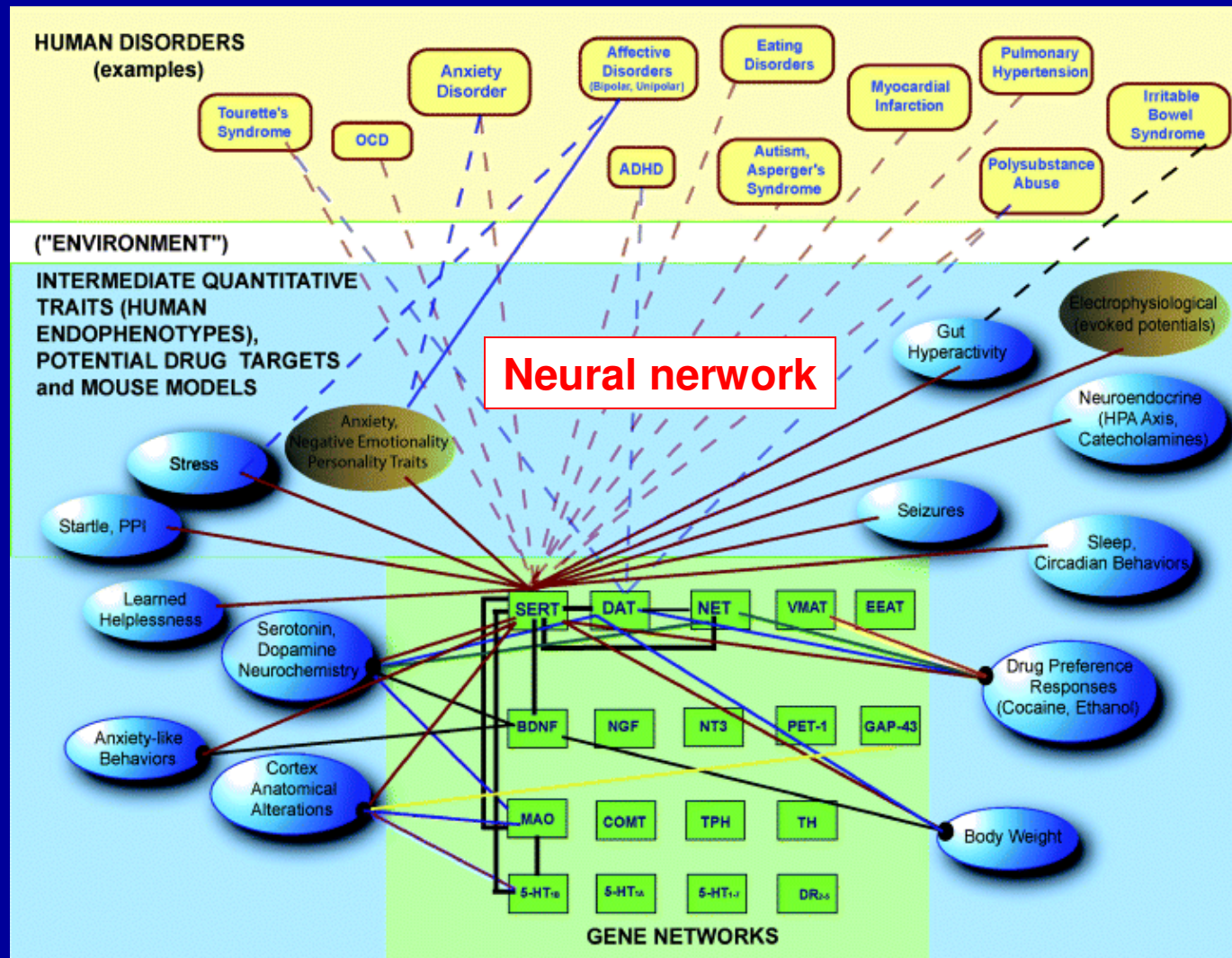
Kalueff et al., 2007, *Behavioral Brain Research*, in press

Continuum nature of neurobehavioral disorders

Kalueff et al., 2007, *Behavioral Brain Research*



# Network-based modeling of brain disorders



## Other interesting topics for QNP

- Molecular modeling of brain receptors
- QTL and behavior
- Information theory: applications to brain mechanisms and behavior

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"...then we add a smidgin of this - that's less than a dollop, but  
more than a pinch..."