

# Exploring complex cognitive functions and brain networks using eye-tracking

Introduction to cognitive science

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2015/16

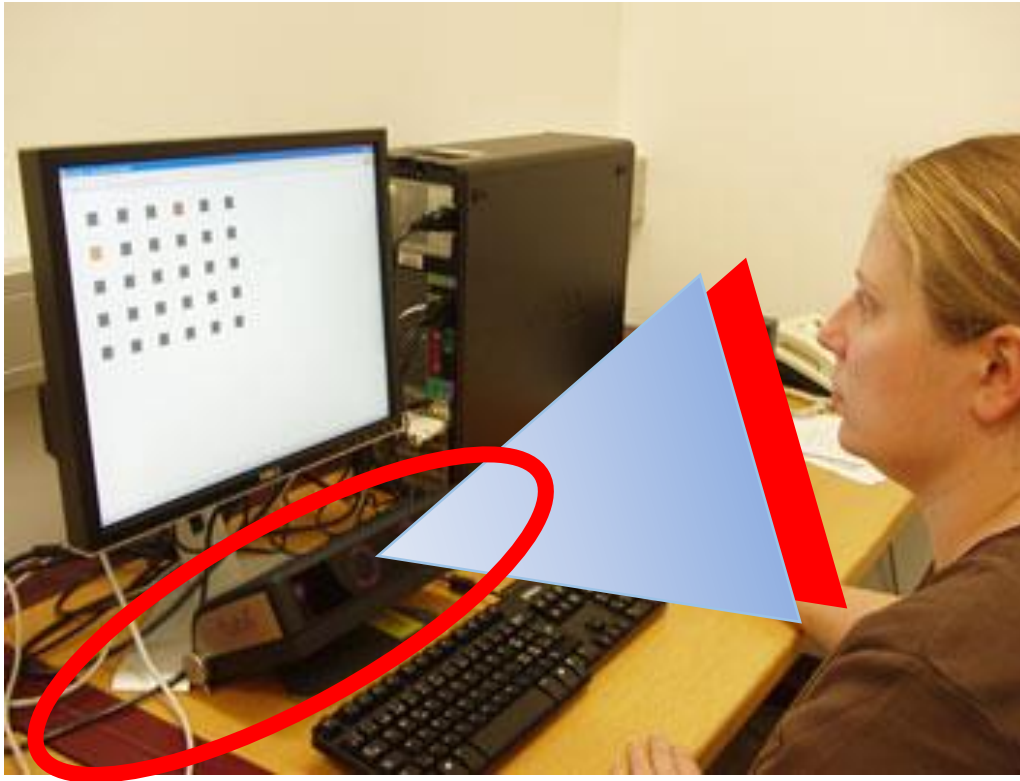
# Outline

- Eye-tracking: how does it work?
- How to use eye-tracking when investigating complex cognitive functions: example of attentional set shifting
- Exploring basic brain networks using eye-tracking

Eye-tracking: how does it work?

# Video-based eye-tracking

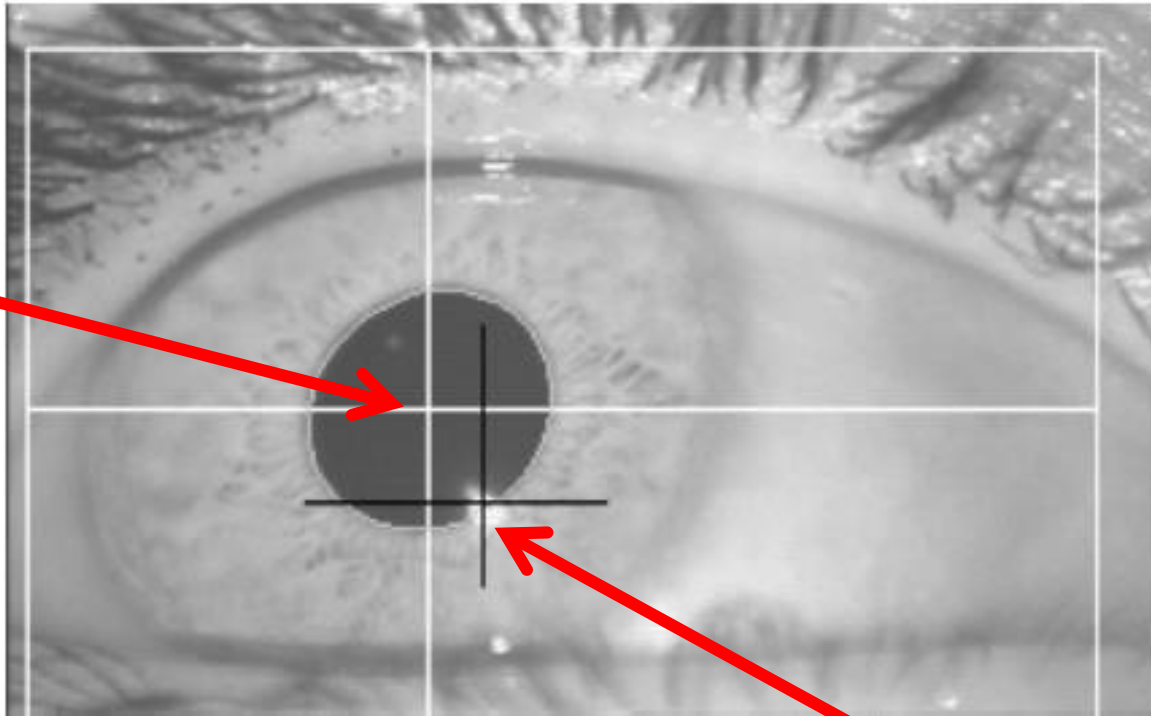
**Infrared light source**



**Video-camera**

# Video-based eye-tracking

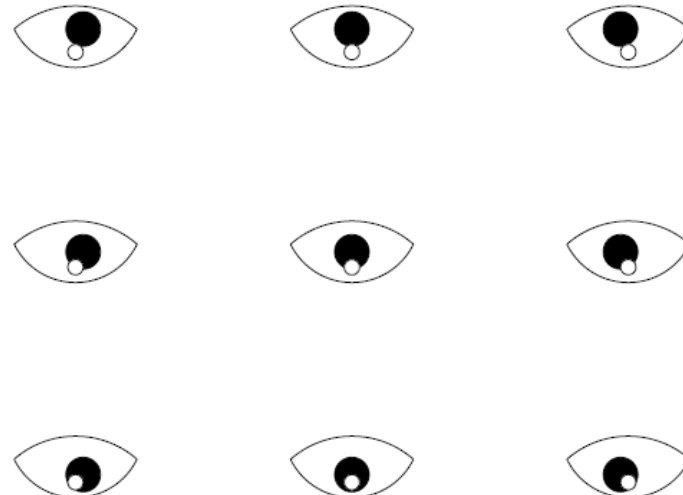
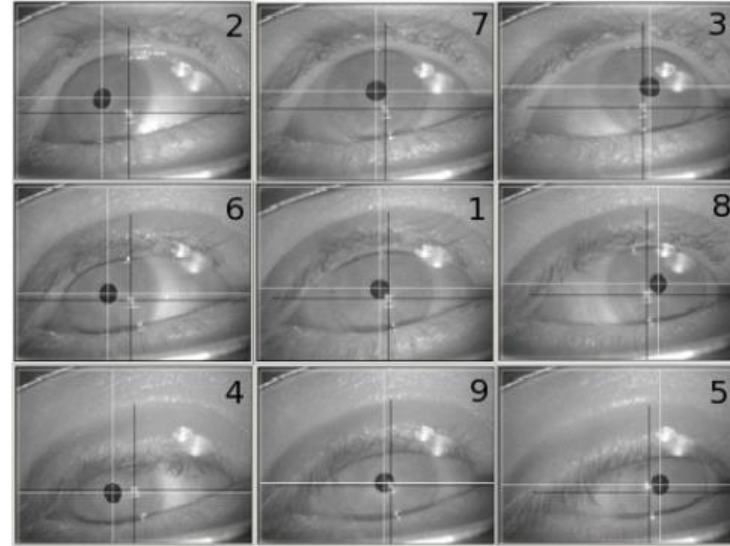
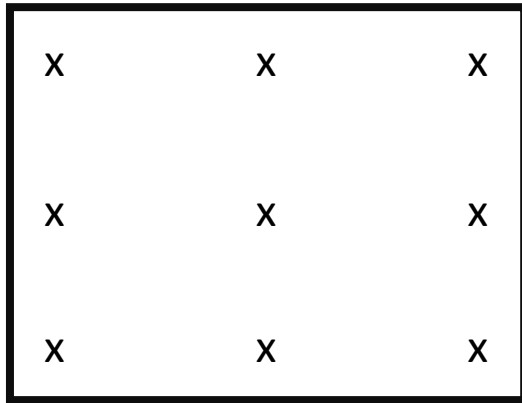
The centre of the pupil



Reflecion of infrared light from the cornea (corneal reflection)

# Video-based eye-tracking

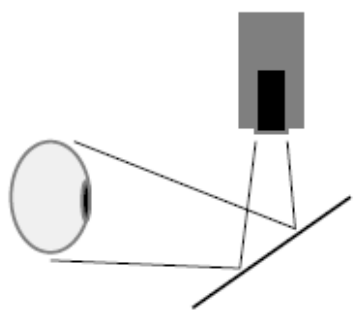
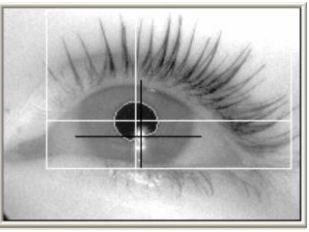
## Calibration



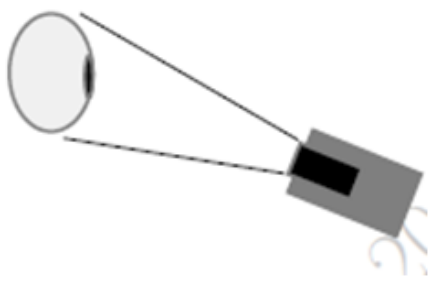
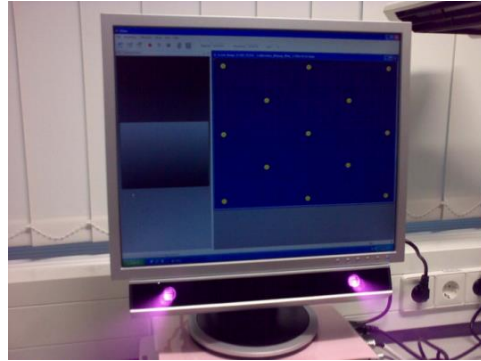
After successful calibration the gaze direction can be computed from the relative position of the two points (pupil and CR)

# Different video-based eye-trackers

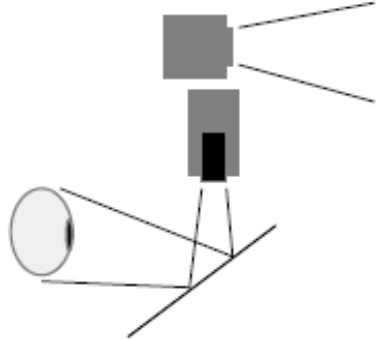
Tower-mounted



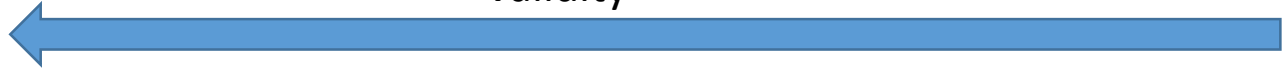
Remote



Head-mounted



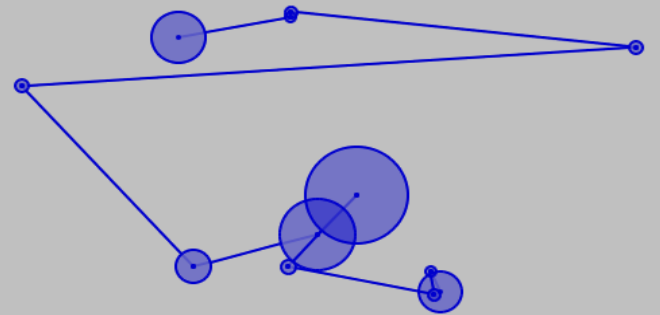
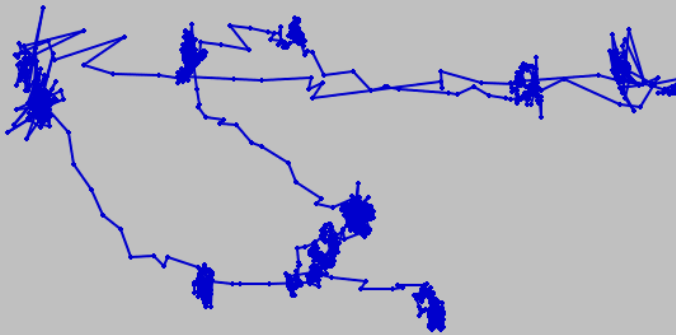
Validity



Data quality

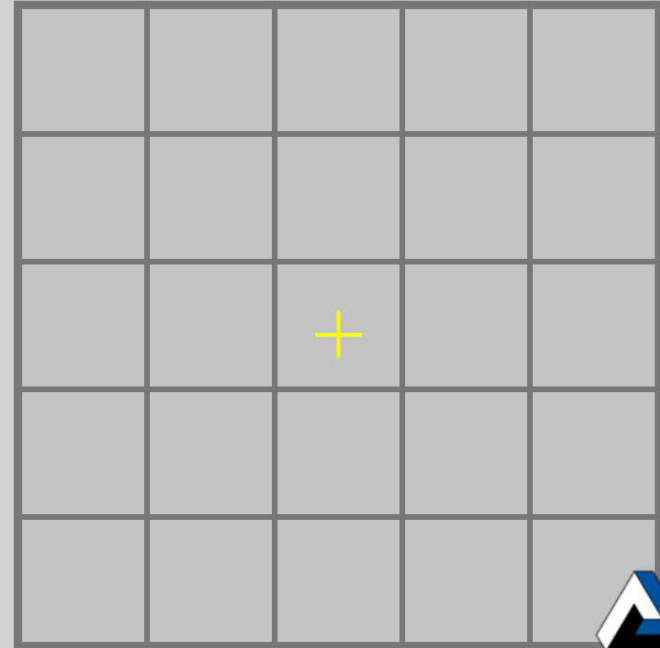
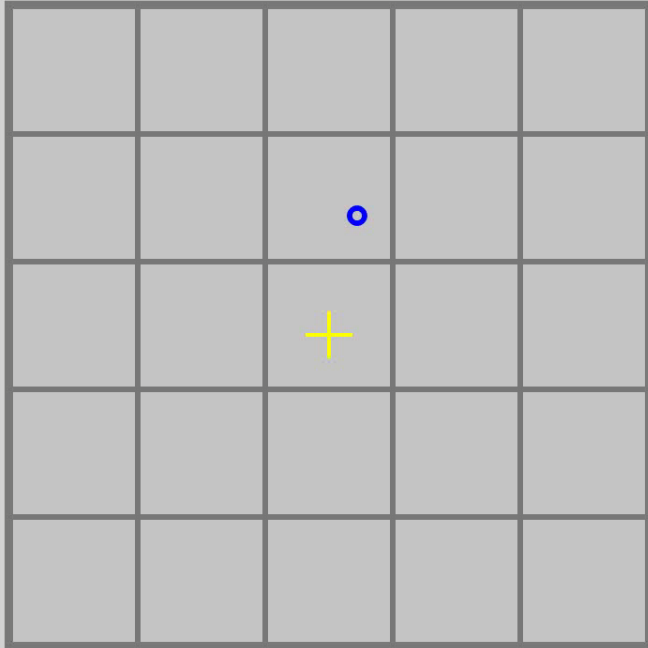


# Data processing





# Data processing



Encoding



Delay



Retrieval

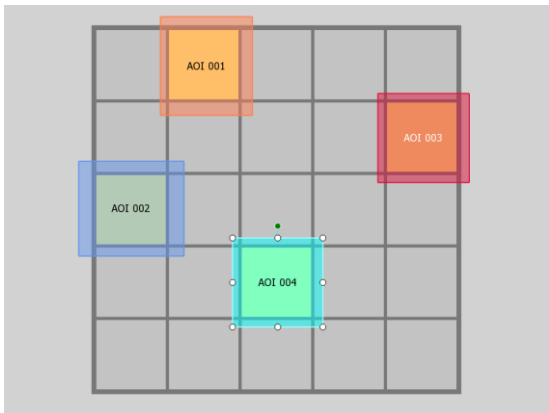
# Data analysis

## 1., Attributes for different eye-movements

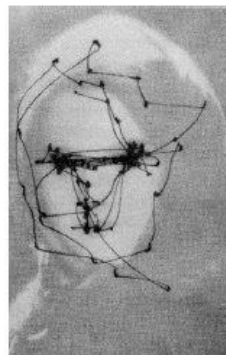
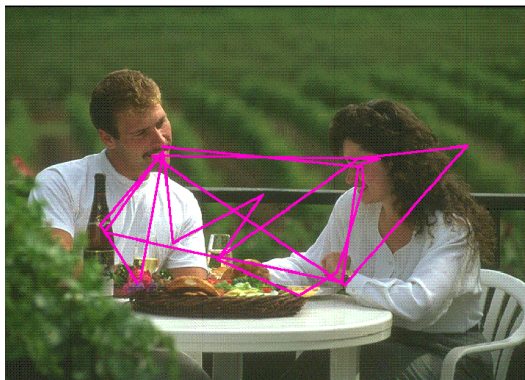
fixation duration, number of fixations, first fixation duration  
saccade duration, saccade velocity, saccade latency, pupil dilation

## 2., Area of Interest analysis (AOI)

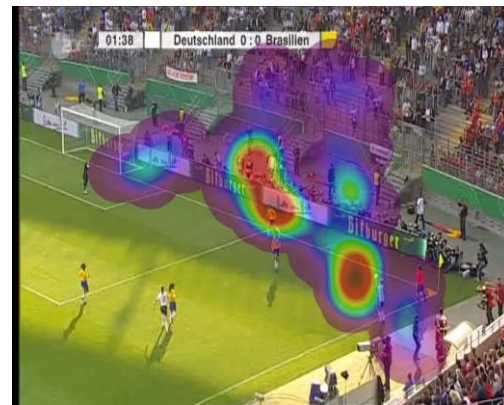
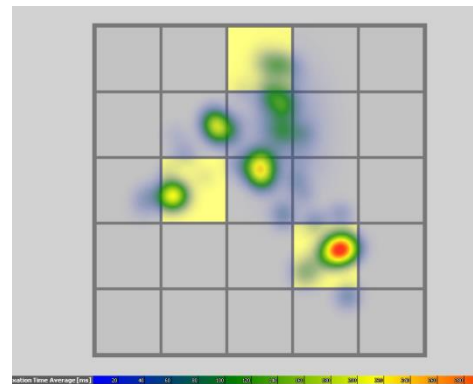
Number of fixations, dwell time, first pass time



## 3., Scanpath



## 4., Heat map



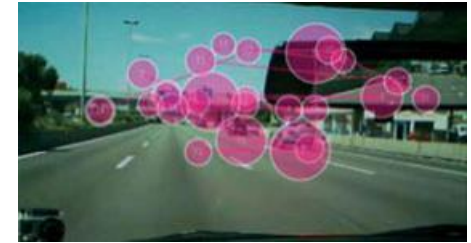
How to use eye-tracking when  
investigating complex cognitive  
functions

Example from our lab: attentional  
flexibility

# Different applied/academic fields where eye-tracking is used

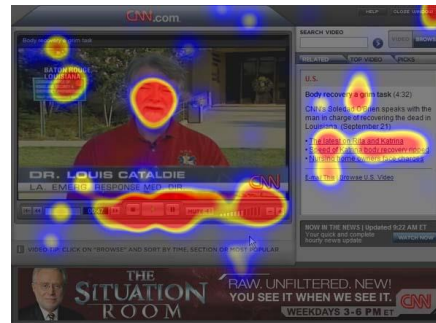
## 1. Human Factors

- Human Computer Interactions (e.g. gaze contingent display)
- Driving studies
- Visual Inspection



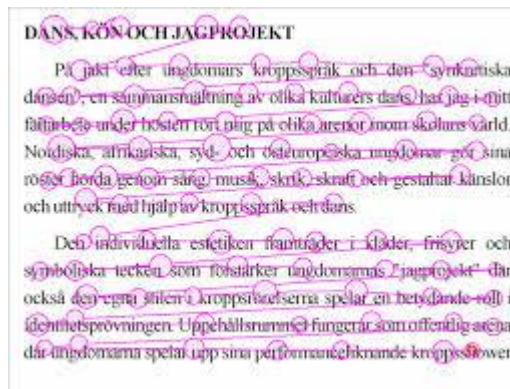
## 2. Marketing

- Effectiveness of ads
- Structure of web pages



## 3. Psychology and neuroscience

- Reading studies
- Visual perception
- Complex cognitive functions
- Neuroscience



# Attentional set shifting

**Attentional set:** Attended stimulus dimension in a complex situation, which directs our behaviour.

**Attentional set shifting:** If our goals change, new stimulus-dimensions (attentional sets) might become relevant.

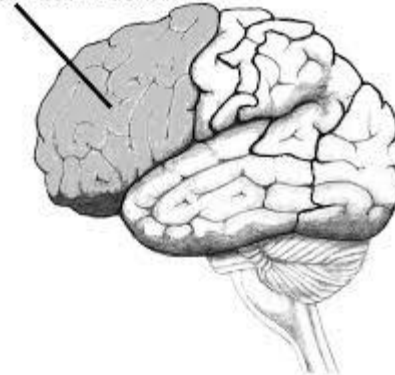
Example: Buying a new refrigerator – what is important?

→ Energy consumption

→ Price

→ Size

Frontal Lobe



# Measures of attentional set shifting

## 1. Wisconsin Card Sorting Task – a sensible measure of frontal lobe function

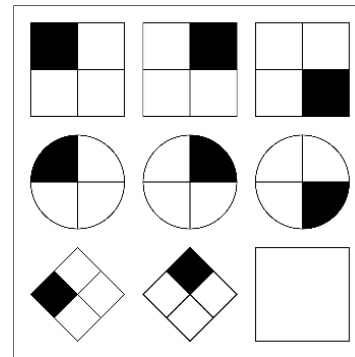
[http://www.psychtoolkit.org/experiment-library/experiment\\_wcst.html](http://www.psychtoolkit.org/experiment-library/experiment_wcst.html)

**Perseveration:** after acquiring one rule, the participant tends to stick with it:

→ Lesion of the frontal cortex

→ Schizophrenia

## 2. Raven – IQ test

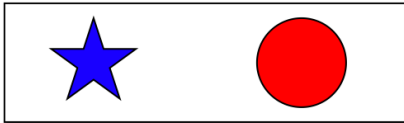


## 3. Intradimensional/Extradimensional Set Shifting Task

An often used variant of this WCST for measuring attentional set shifting:

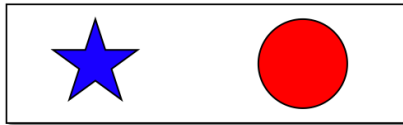
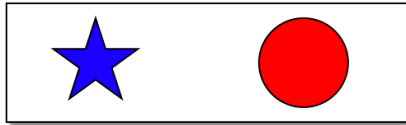
# Intradimensional/Extradimensional Set Shifting Task

**Basic-task:** Which stimulus is rewarded?



# Intradimensional/Extradimensional Set Shifting Task

**Basic-task:** Which stimulus is rewarded?





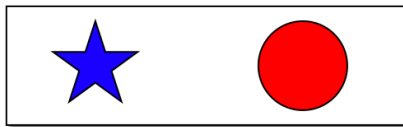
# Intradimensional/Extradimensional Set Shifting Task

**Basic-task:** Which stimulus is rewarded?



Stimulus-feature  
to-be-attended:  
BLUE COLOR

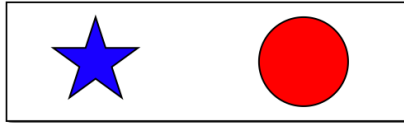
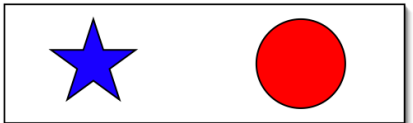
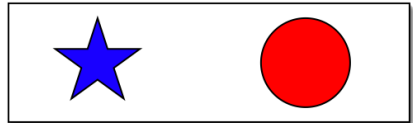
# Intradimensional/Extradimensional Set Shifting Task



Stimulus-feature  
to-be-attended:  
BLUE COLOR

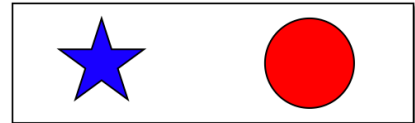
**Shift:** After subjects figured out the rule (i.e. their choices are always correct) → new rule is introduced

# Intradimensional/Extradimensional Set Shifting Task

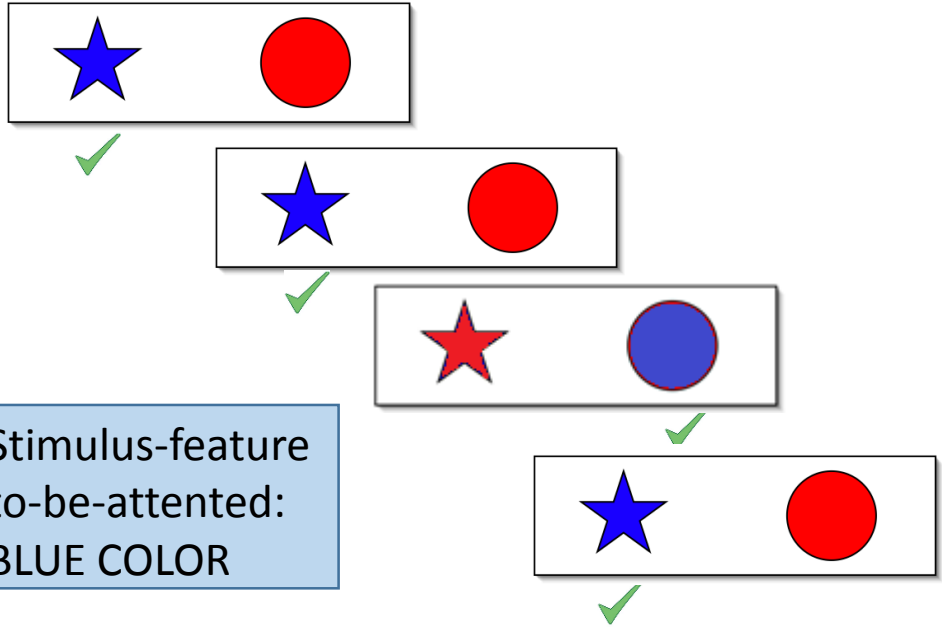


Stimulus-feature  
to-be-attended:  
BLUE COLOR

**Shift:** After subjects figured out the rule (i.e. their choices are always correct) → new rule is introduced



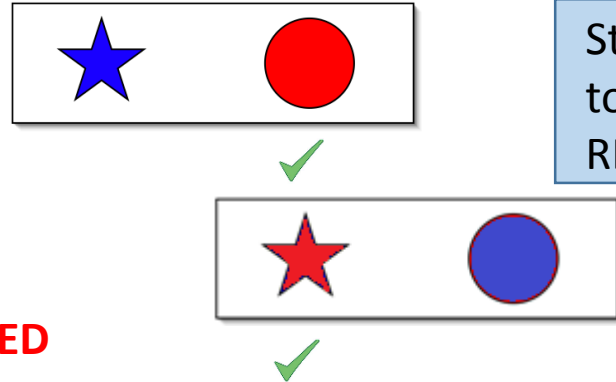
# Intradimensional/Extradimensional Set Shifting Task



Stimulus-feature to-be-attended: BLUE COLOR

**Shift:** After subjects figured out the rule (i.e. their choices are always correct) → new rule is introduced

## Reversal learning

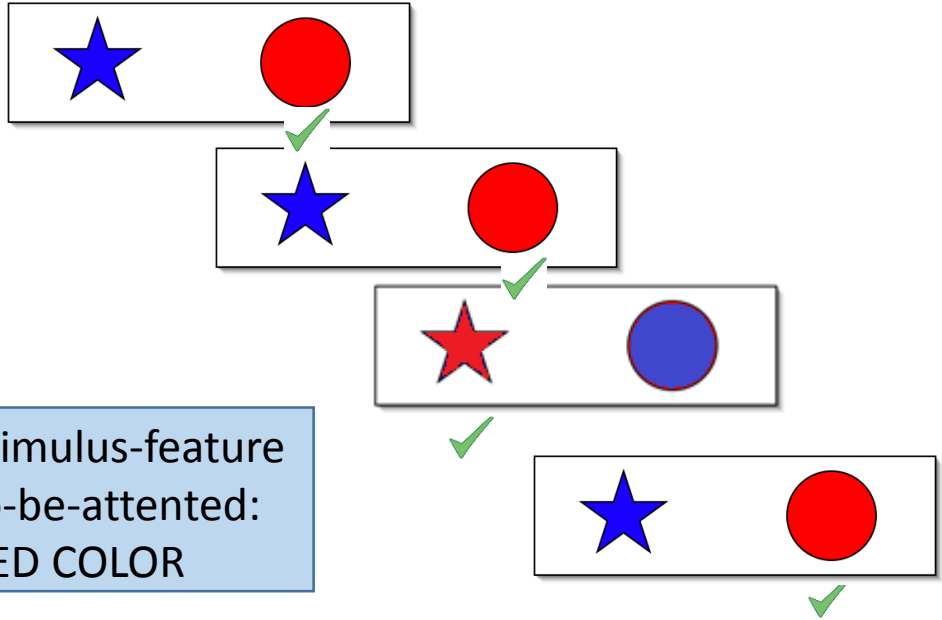


Stimulus-feature to-be-attended: RED COLOR

Rewarded stimulus dimension:  
Displayed stimuli:  
Rewarded stimulus feature:

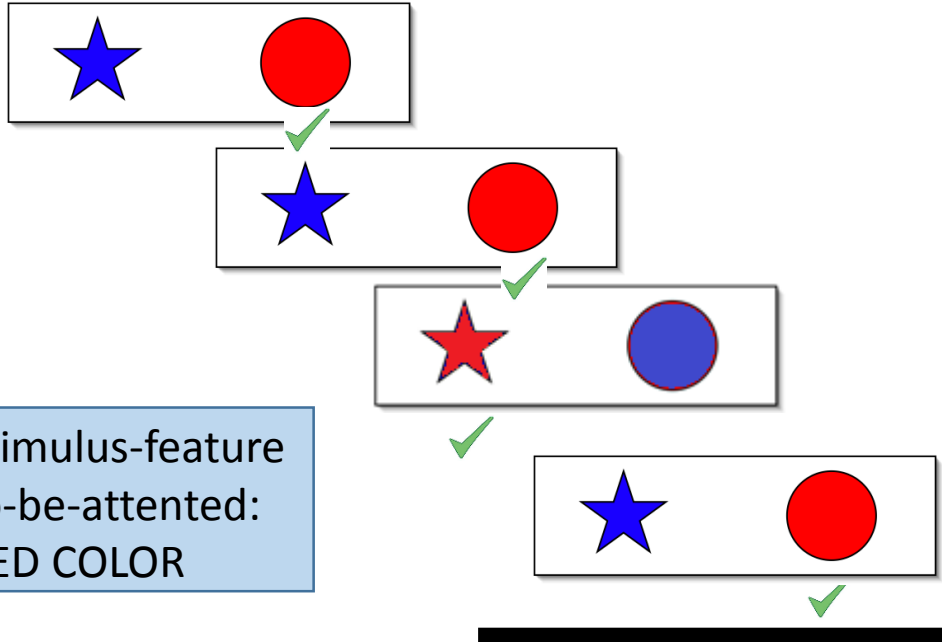
SAME  
SAME  
**CHANGED**

# Intradimensional/Extradimensional Set Shifting Task



Stimulus-feature  
to-be-attended:  
RED COLOR

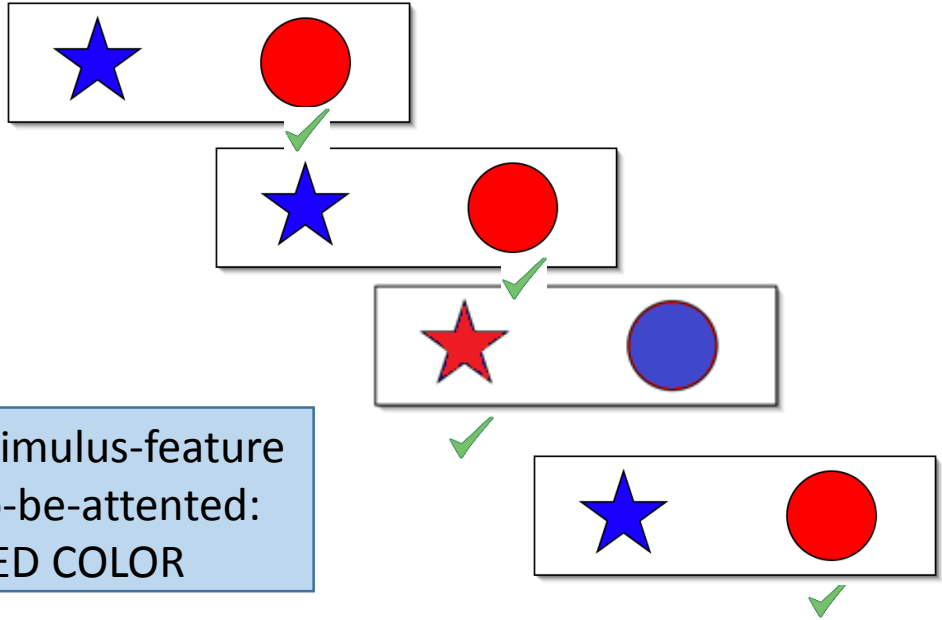
# Intradimensional/Extradimensional Set Shifting Task



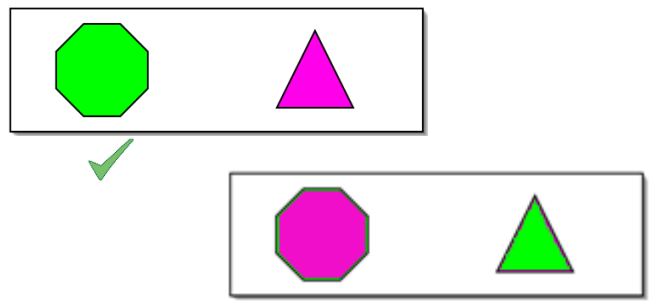
Stimulus-feature  
to-be-attended:  
RED COLOR

**Shift:** After subjects figured out the rule (i.e. their choices are always correct) → new rule is introduced

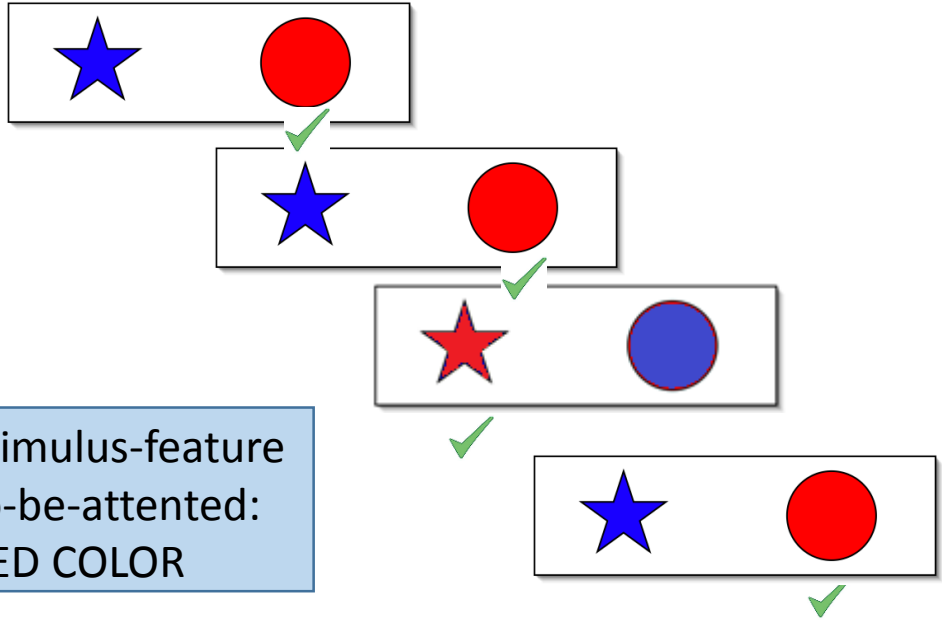
# Intradimensional/Extradimensional Set Shifting Task



**Shift:** After subjects figured out the rule (i.e. their choices are always correct) → new rule is introduced



# Intradimensional/Extradimensional Set Shifting Task

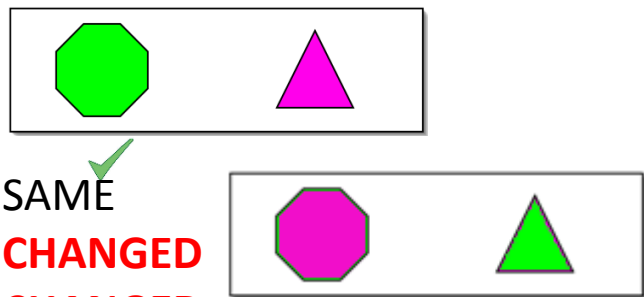


Stimulus-feature to-be-attended: RED COLOR

**Shift:** After subjects figured out the rule (i.e. their choices are always correct) → new rule is introduced

## Intradimensional shift (IDS)

Rewarded stimulus dimension:  
Displayed stimuli:  
Rewarded stimulus feature:

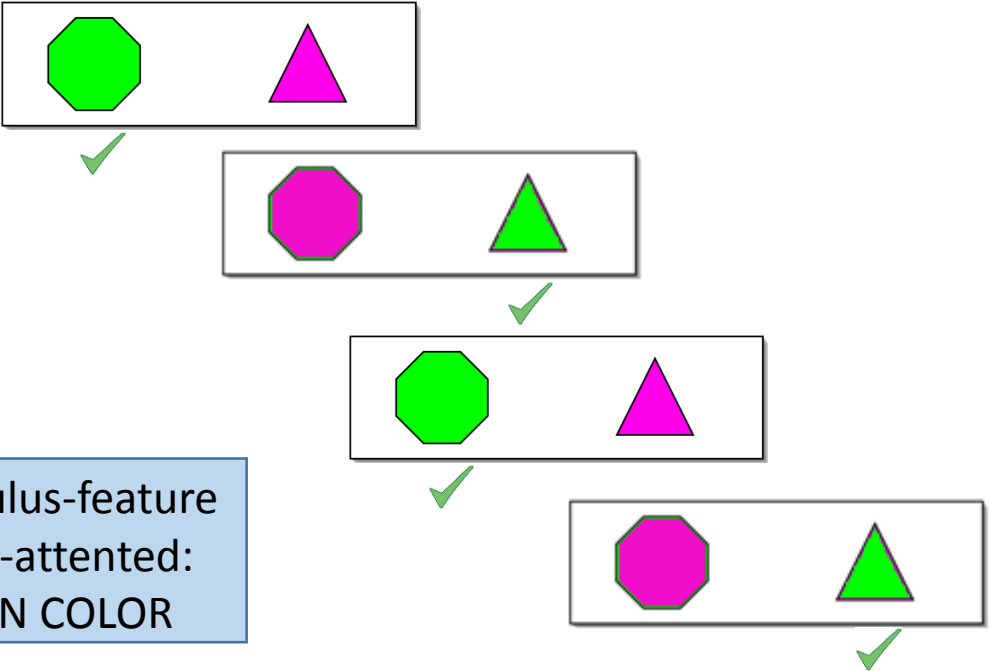


SAME  
**CHANGED**  
**CHANGED**

Stimulus-feature to-be-attended: GREEN COLOR

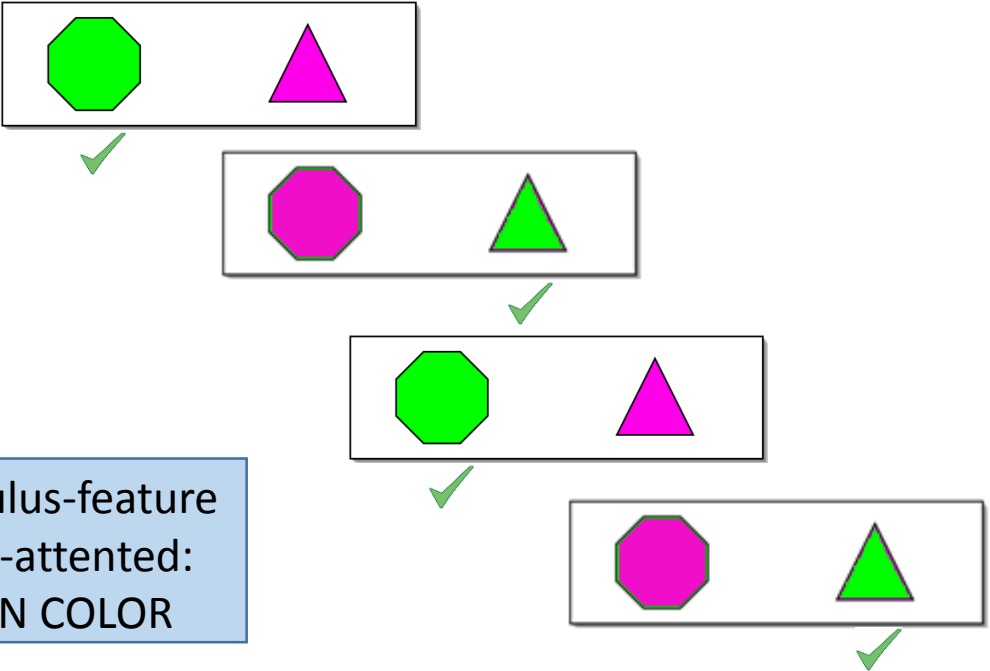


# Intradimensional/Extradimensional Set Shifting Task



Stimulus-feature  
to-be-attended:  
GREEN COLOR

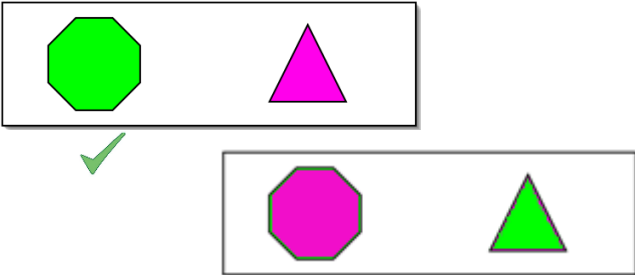
# Intradimensional/Extradimensional Set Shifting Task



Stimulus-feature  
to-be-attended:  
GREEN COLOR

**Shift:** After subjects figured out the rule (i.e. their choices are always correct) → new rule is introduced

# Intradimensional/Extradimensional Set Shifting Task



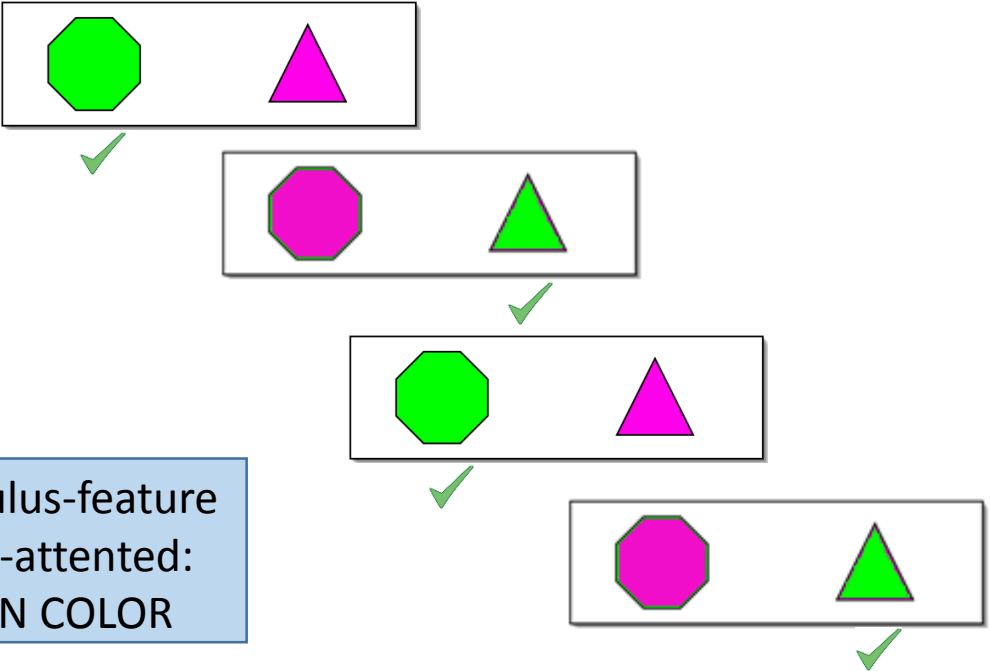
Stimulus-feature to-be-attended: GREEN COLOR

**Shift:** After subjects figured out the rule (i.e. their choices are always correct) → new rule is introduced



Stimulus-feature to-be-attended: SQUARE FORM

# Intradimensional/Extradimensional Set Shifting Task



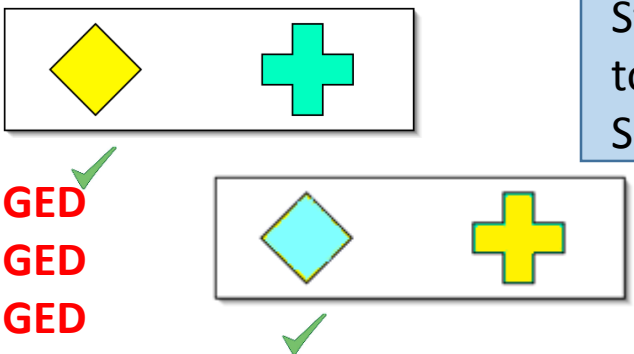
Stimulus-feature to-be-attended: GREEN COLOR

**Shift:** After subjects figured out the rule (i.e. their choices are always correct) → new rule is introduced

## Extradimensional shift (EDS)

Rewarded stimulus dimension:  
Displayed stimuli:  
Rewarded stimulus feature:

**CHANGED**  
**CHANGED**  
**CHANGED**



Stimulus-feature to-be-attended: SQUARE FORM

# Intradimensional/Extradimensional Set Shifting Task

## Reversal learning

Rewarded stimulus dimension:	SAME
Displayed stimuli:	SAME
Rewarded stimulus feature:	<b>CHANGED</b>

## Intradimensional shift (IDS)

Rewarded stimulus dimension:	SAME
Displayed stimuli:	<b>CHANGED</b>
Rewarded stimulus feature:	<b>CHANGED</b>

## Extradimensional shift (EDS)

Rewarded stimulus dimension:	<b>CHANGED</b>
Displayed stimuli:	<b>CHANGED</b>
Rewarded stimulus feature:	<b>CHANGED</b>

# Intradimensional/Extradimensional Set Shifting Task

## Reversal learning

Rewarded stimulus dimension:	SAME
Displayed stimuli:	SAME
Rewarded stimulus feature:	<b>CHANGED</b>

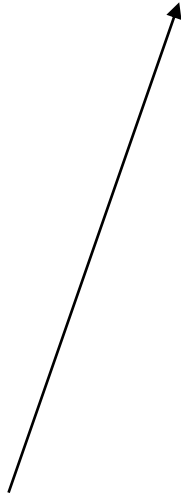
## Intradimensional shift (IDS)

Rewarded stimulus dimension:	SAME
Displayed stimuli:	<b>CHANGED</b>
Rewarded stimulus feature:	<b>CHANGED</b>

## Extradimensional shift (EDS)

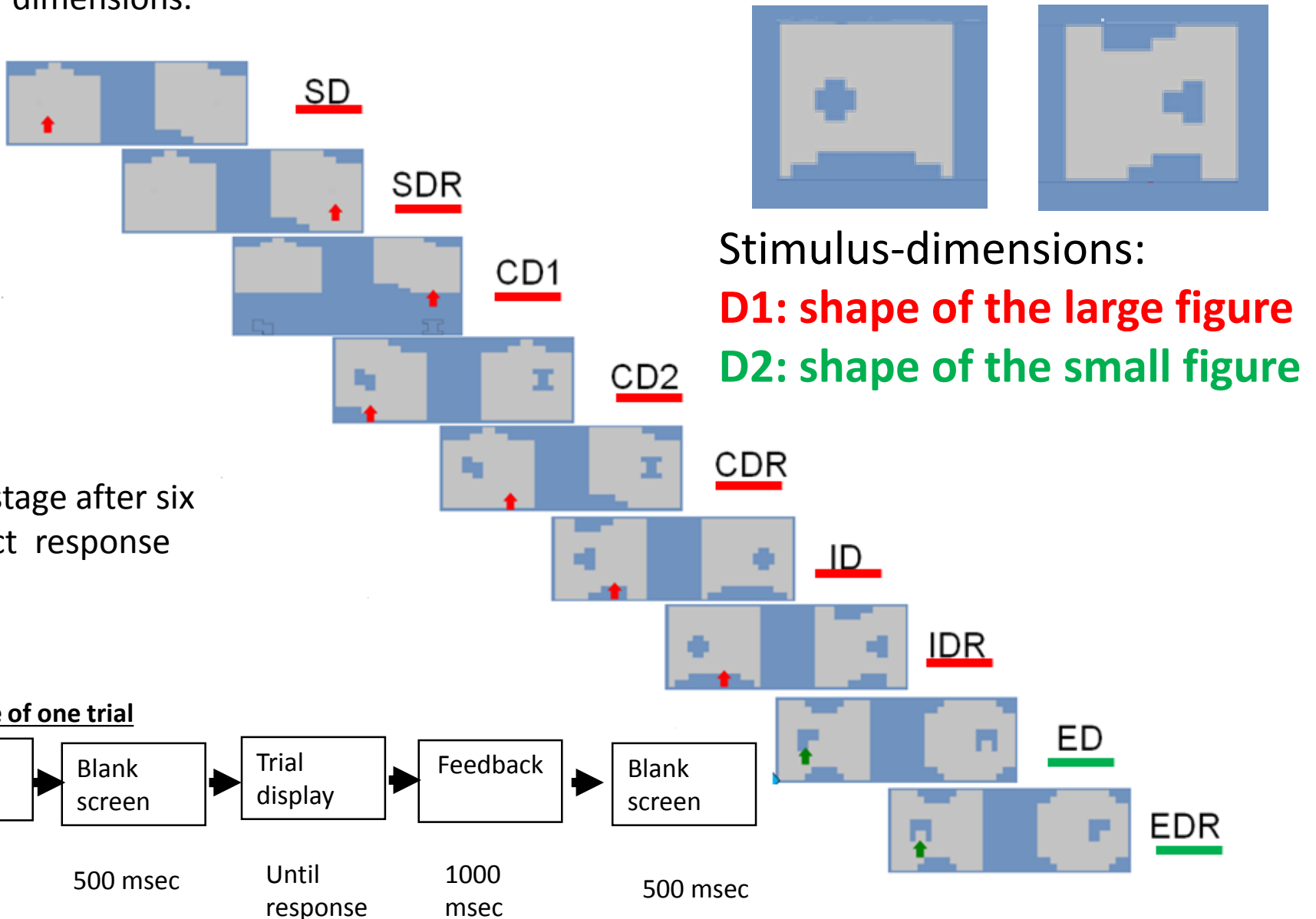
Rewarded stimulus dimension:	<b>CHANGED</b>
Displayed stimuli:	<b>CHANGED</b>
Rewarded stimulus feature:	<b>CHANGED</b>

Most difficult shift:  
Mild to severe deficit in  
several neurological and  
psychiatric population

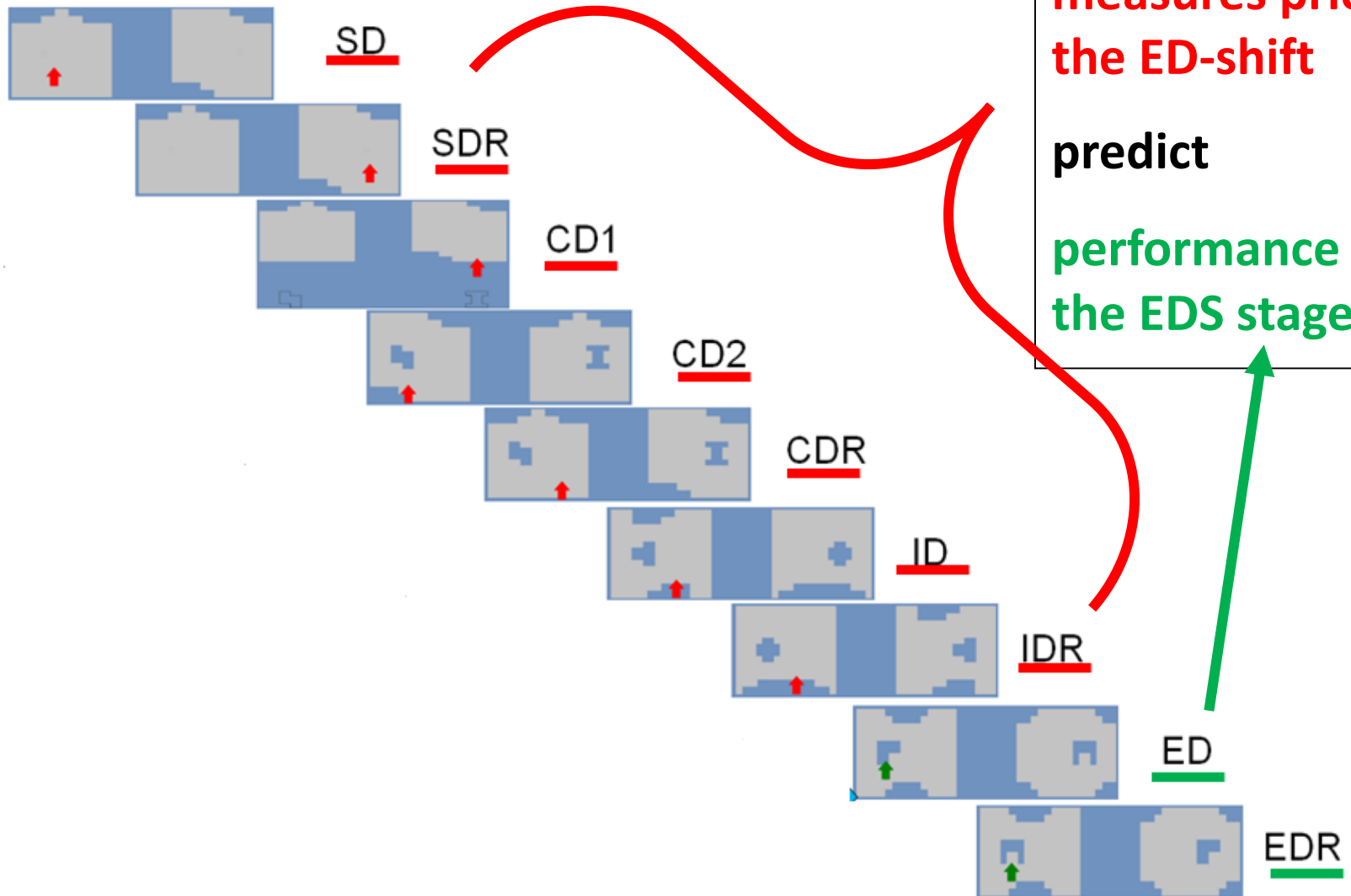


# The eye-IED task

Adaptation to eye-tracking: spatially separating the different stimulus dimensions.



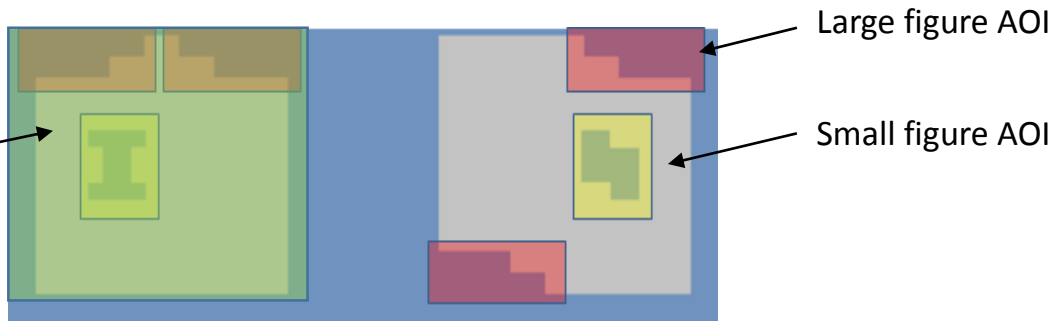
# The eye-IED task





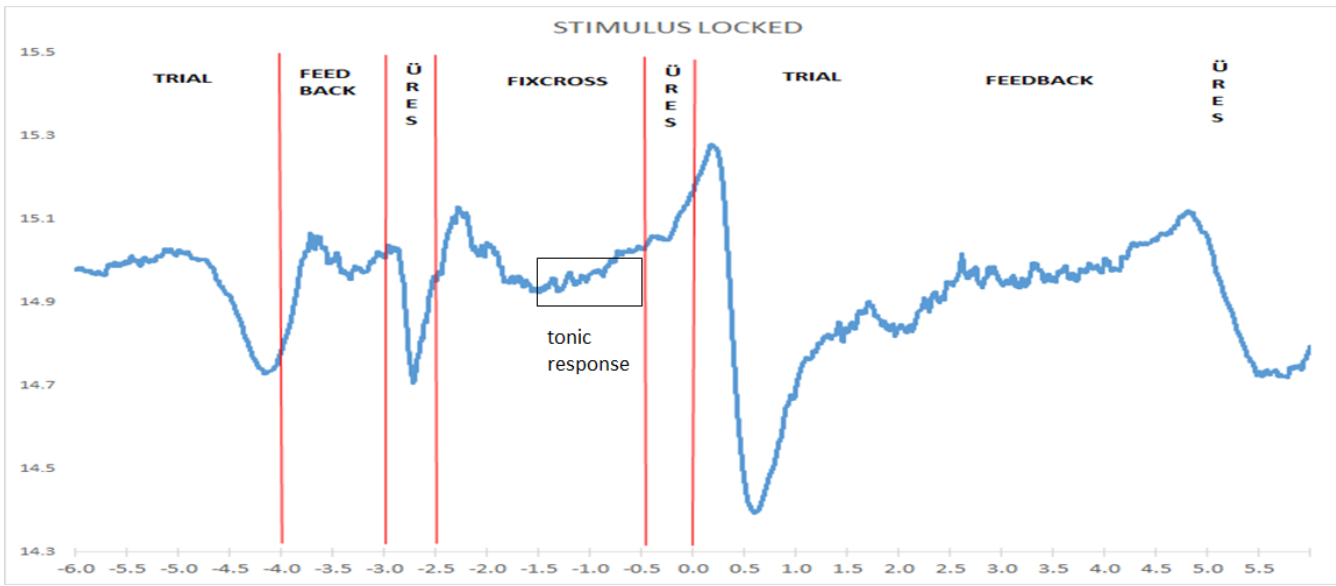
# The eye-IED task - measures

## AOIs



- Dwell times for the small/large AOIs (dotted frame)
- Corrected dwell times for the different AOIs: dwell times for the small/large AOIs, divided by the dwell time for the whole figure

## Pupil dilation



- Baseline pupil dilation indexing tonic activity of the LC/NE system

# Study participants

## Normal population - students

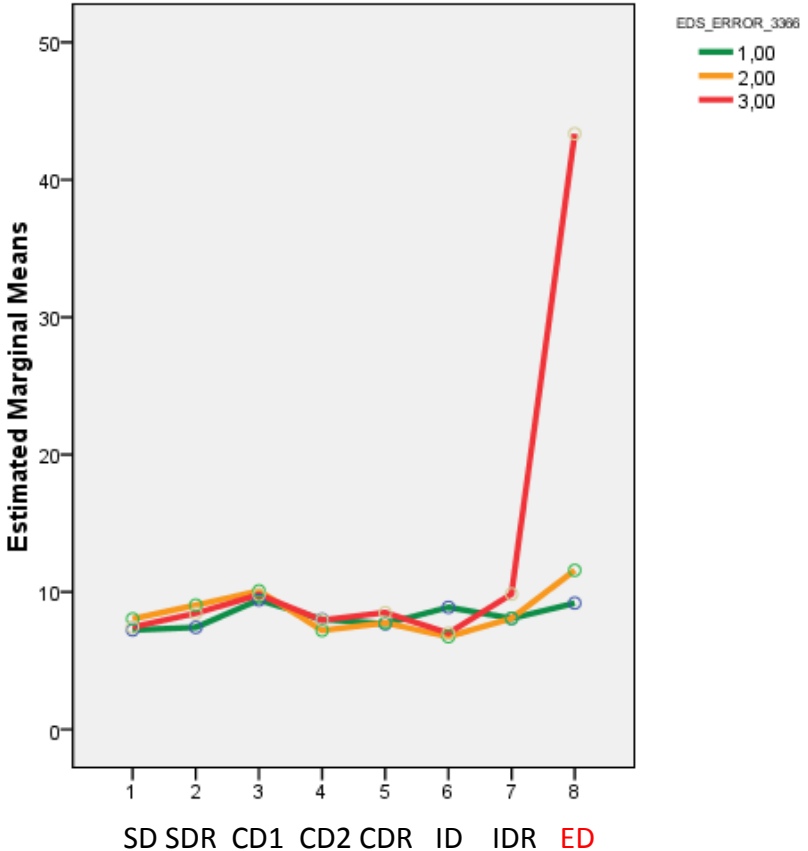
N=70

3 groups:

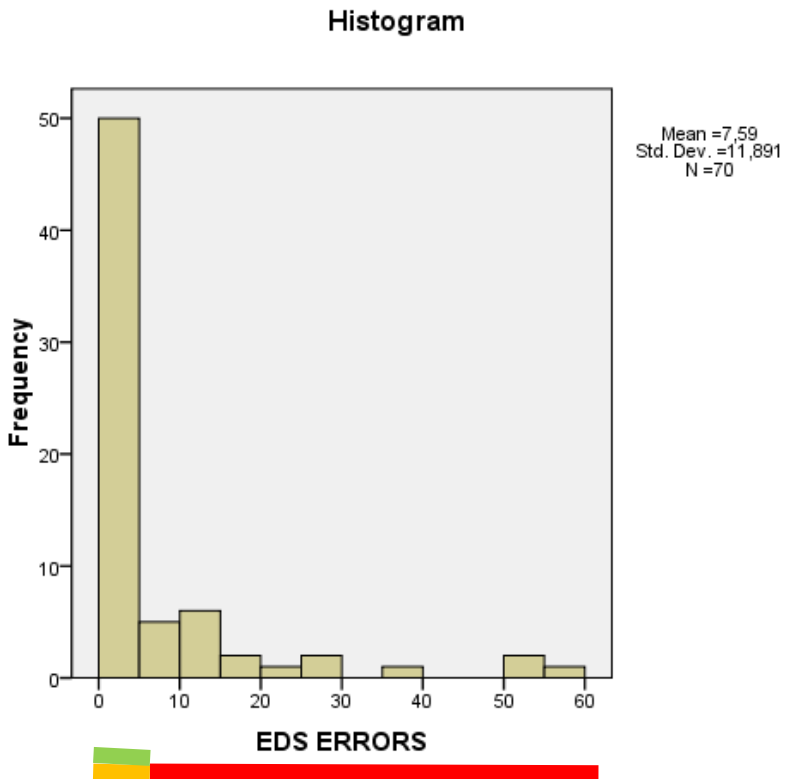
- Good ED performance: Errors in ED stage less than 3 (below the 33th percentile) - N=26
- Medium ED Performance: 3 or 4 errors in ED stage 3 (33th-66th percentile) - N=24
- Bad ED performance: Errors in ED stage more than 9 (above 66th percentile) – N=20

# Behavioral results

## Task performance



## Distribution of ED errors



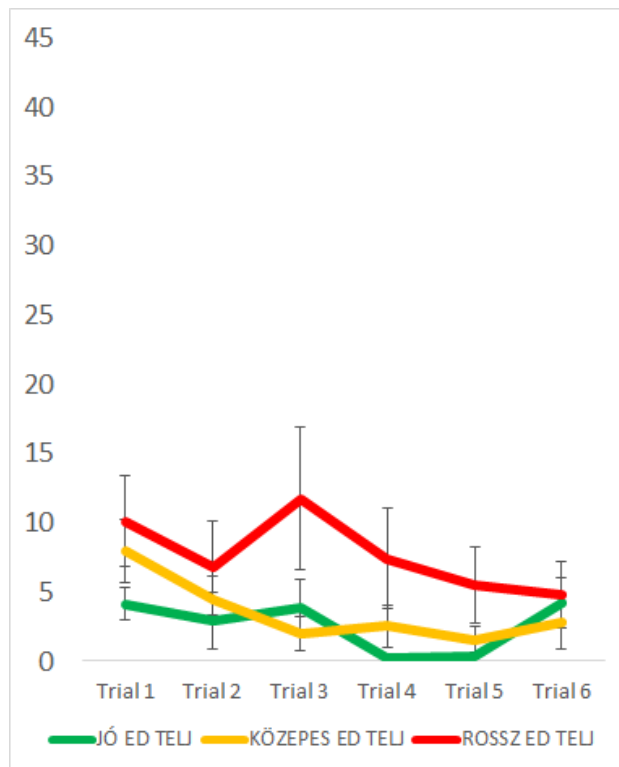
# AOI-analysis I.

## Dwell times for the first six trials of the ED stage

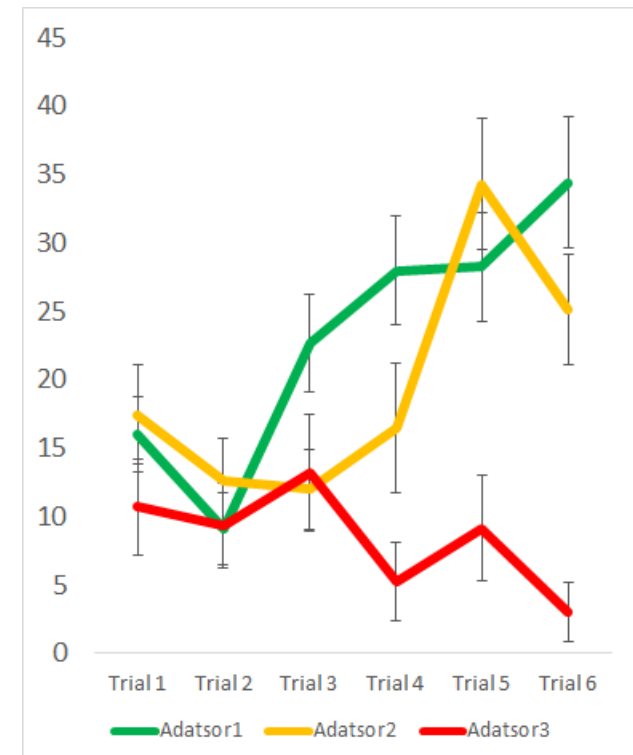
Dwell times –  
Large figure AOI



Dwell times –  
Small figure AOI



AOI main effect:  $F(2,73)=2.5$ ,  $p=.0.08$



AOI main effect:  $F(2,73)=7.8$ ,  $p=.001$

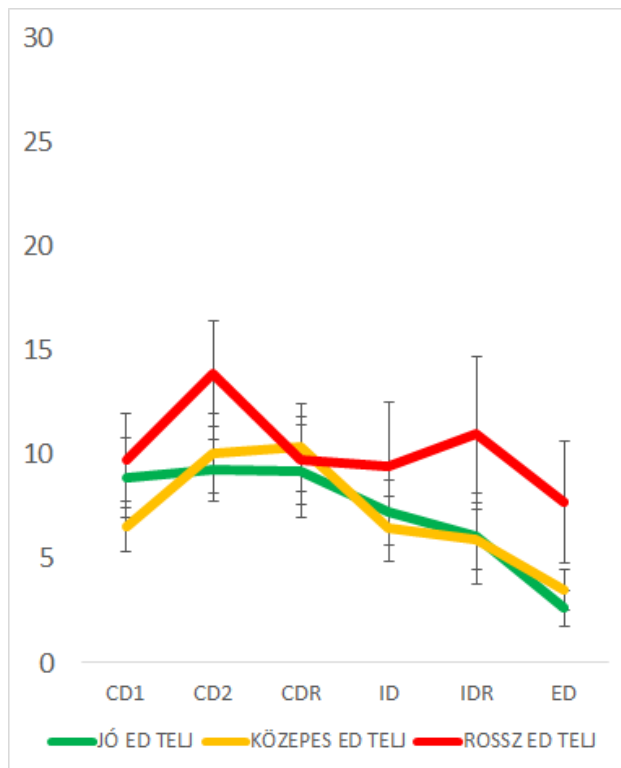
# AOI-analysis II.

## Dwell time average for the stages preceding the ED stage

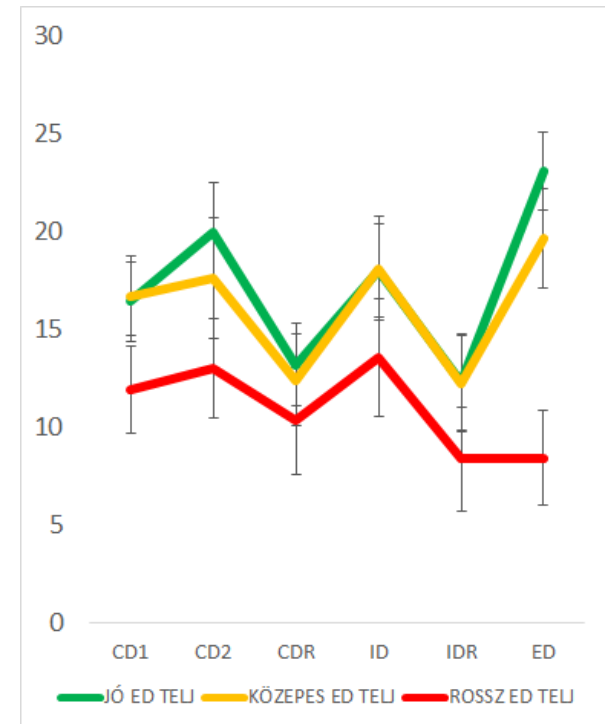
Dwell times –  
Large figure AOI



Dwell times –  
Small figure AOI



AOI main effect:  $F(2,73)=1.3$ ,  $p=.24$



AOI main effect:  $F(2,73)=3.3$ ,  $p=.03$

# Conclusions

Attentional patterns before the extradimensional shift stage predict successful attentional set shifting.

# Exploring basic brain networks using eye-tracking



# Should I stay or should I go? The exploration-exploitation dilemma

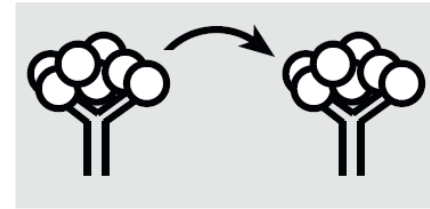
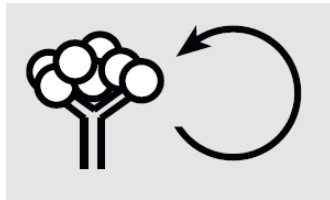
**Exploiting** actions associated with current rewards.



**Exploring** the environment for novel, potentially more rewarding options.

## Dilemma

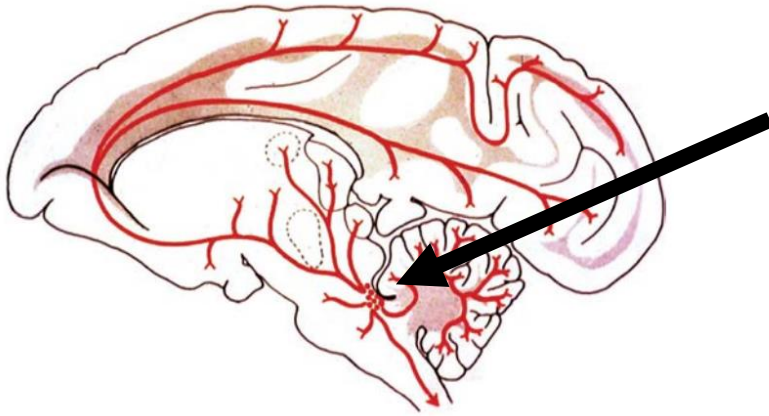
Rewards associated with exploration are uncertain – they can be either larger or smaller than the rewards associated with exploitation.





# Neural systems associated with the exploitation-exploration tradeoff

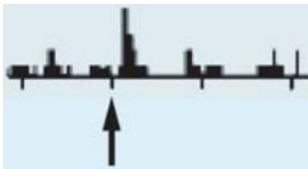
## Noradrenaline – LC-NE system



**Locus coeruleus**

### Exploitation - phasic mode of the LC:

- Low baseline firing with stimulus/response related burst
- Steady-state performance in a known task
- High levels of task performance



### Exploration - tonic mode of the LC:

- High baseline firing with no bursts
- Exploring the environment without clear task goals
- Low level, error prone task performance



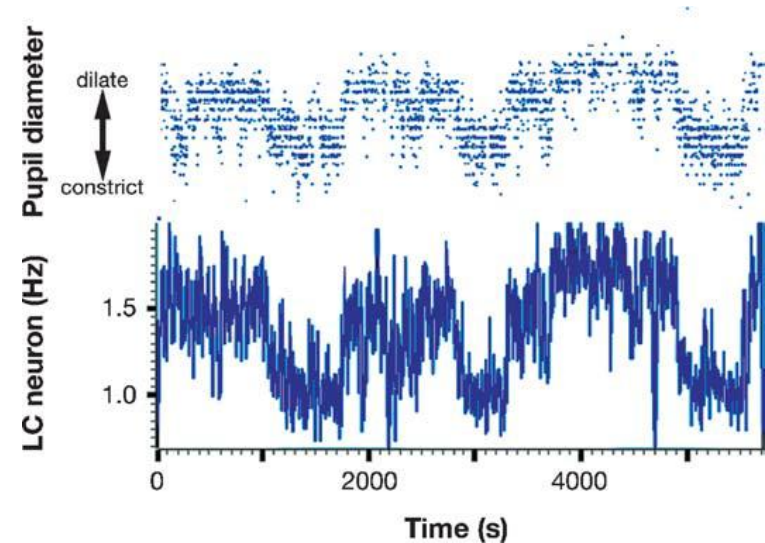
# Neural systems associated with the exploitation-exploration tradeoff

## Noradrenaline – LC-NE system

→ LC activity strongly correlates with pupil diameter

Aston-Jones & Cohen, 2005

Murphy et al., 2014



## Studies with human subjects

High correlation between LC activity and pupil diameter

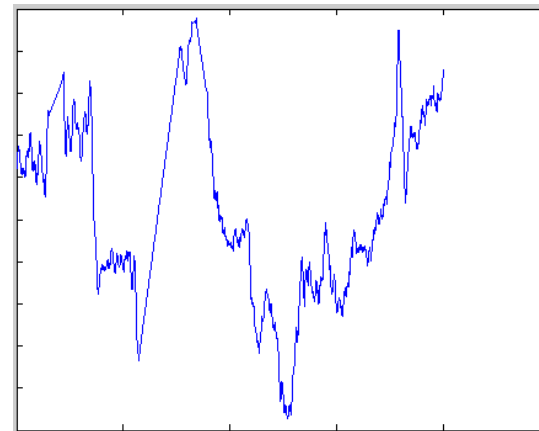
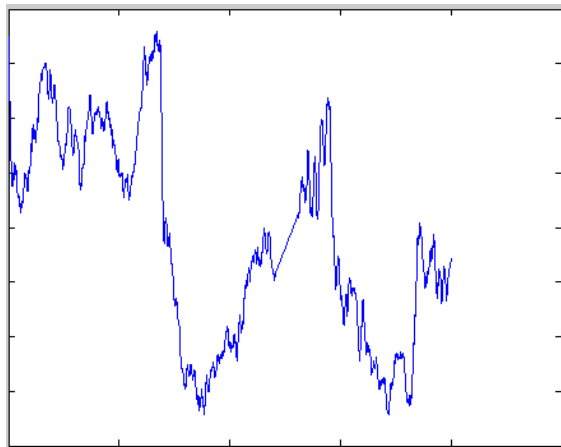
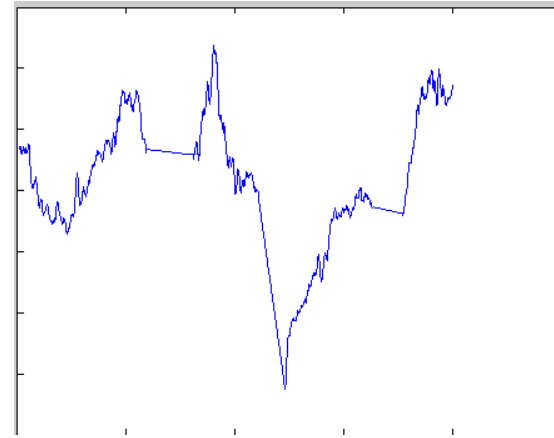
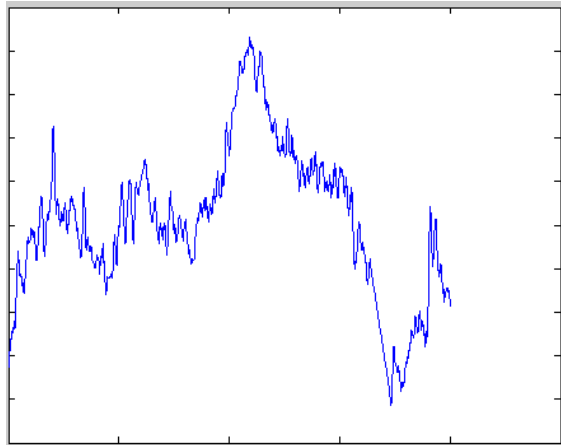
Phasic changes in pupil dilation predict hit rate, steady-state performance, mental effort, WM performance.

Tonic changes in pupil dilation predict erroneous performance

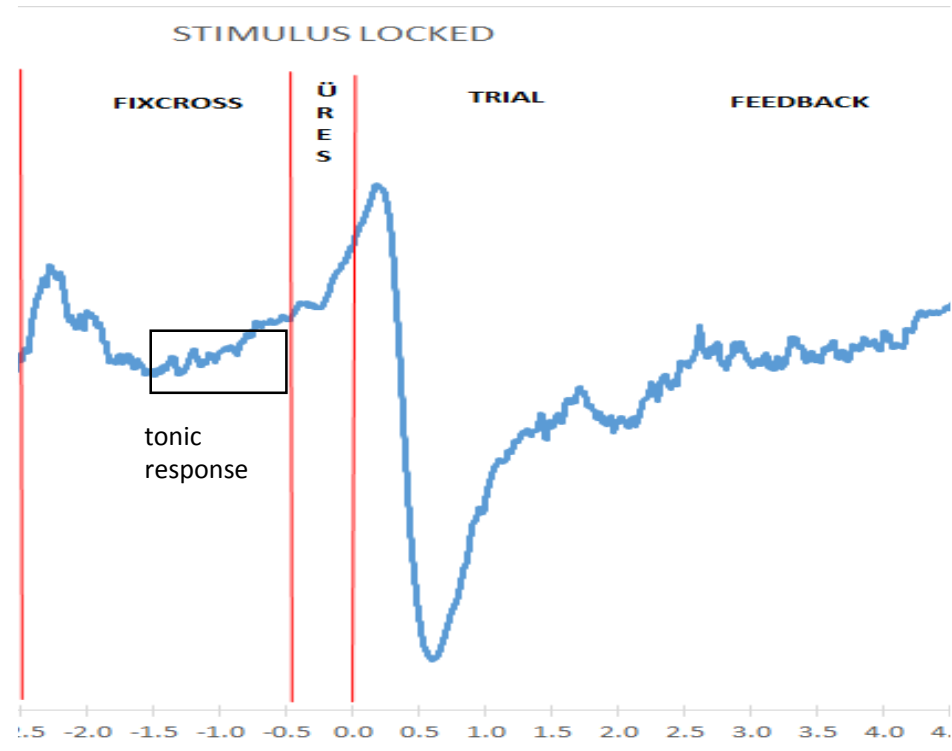
Gilzenrat et al., 2010; Unsworth & Robinson, 2015; Murphy et al, 2011

**HYPOTHESIS: Attentional set shifting → exploration → tonic activation**

# Pupil diameter – individual trials

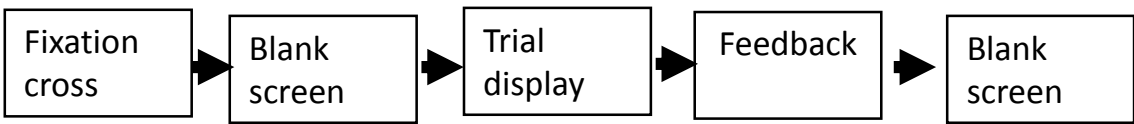


# Stimulus locked averaged pupil diameter



↑  
STIMULUS  
PRESENTED

## Sequence of one trial



2000 msec

500 msec

Until response

1000 msec

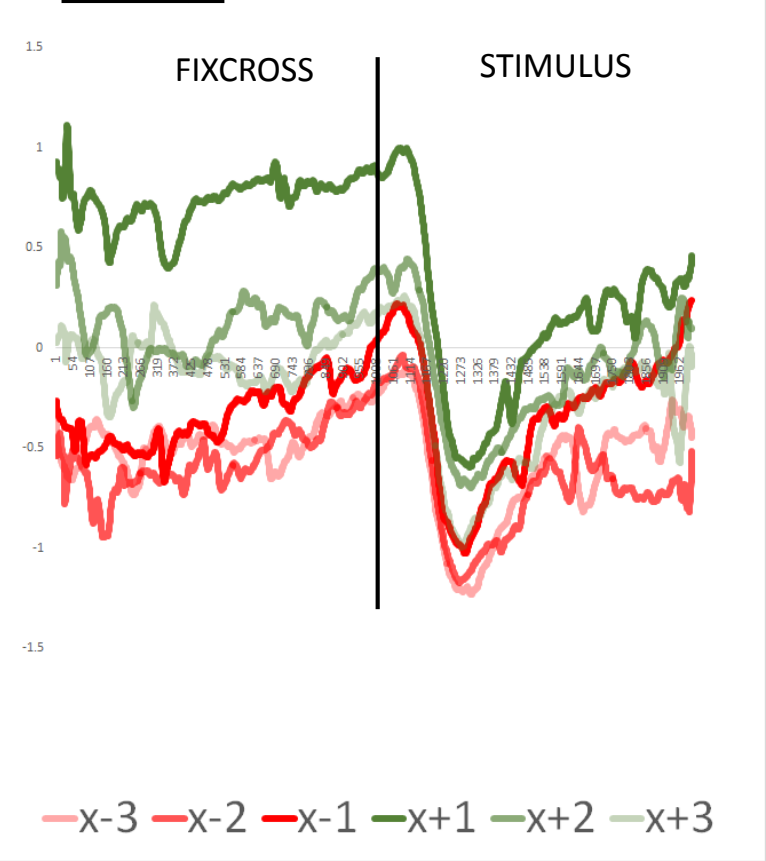
500 msec

„ÜRES’ (hu) = blank

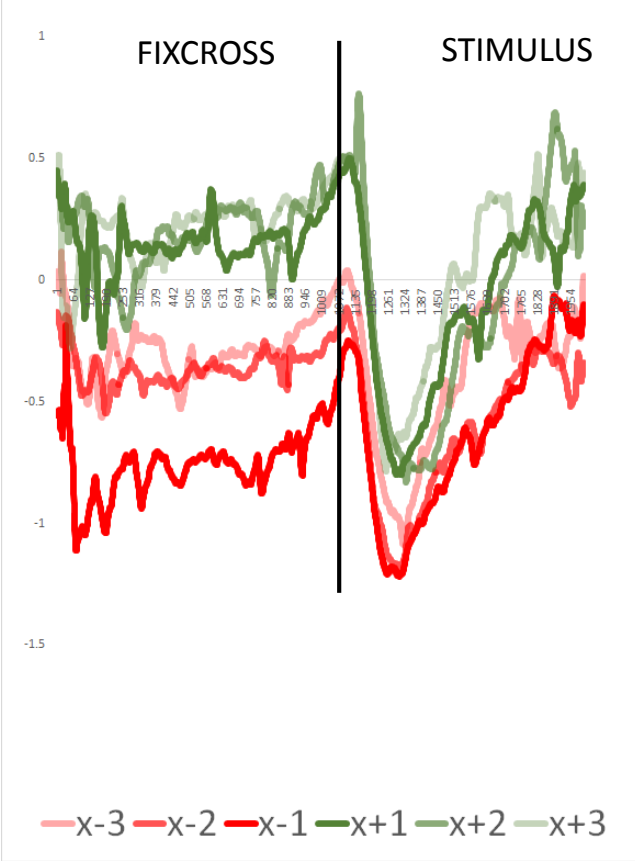
# Pupil diameter before and after a switch

## Pretrial pupil diameter indexing tonic activity of the LC/NE system BEFORE and AFTER switch

### ID-stage



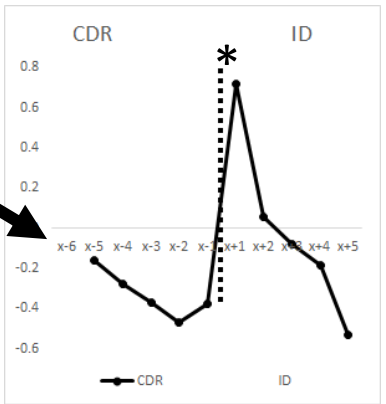
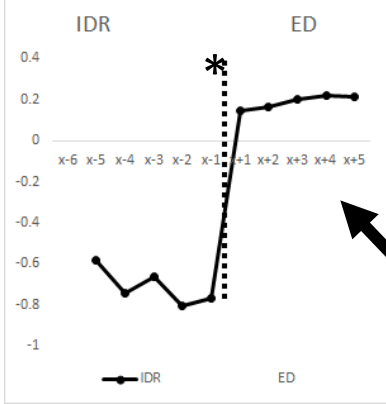
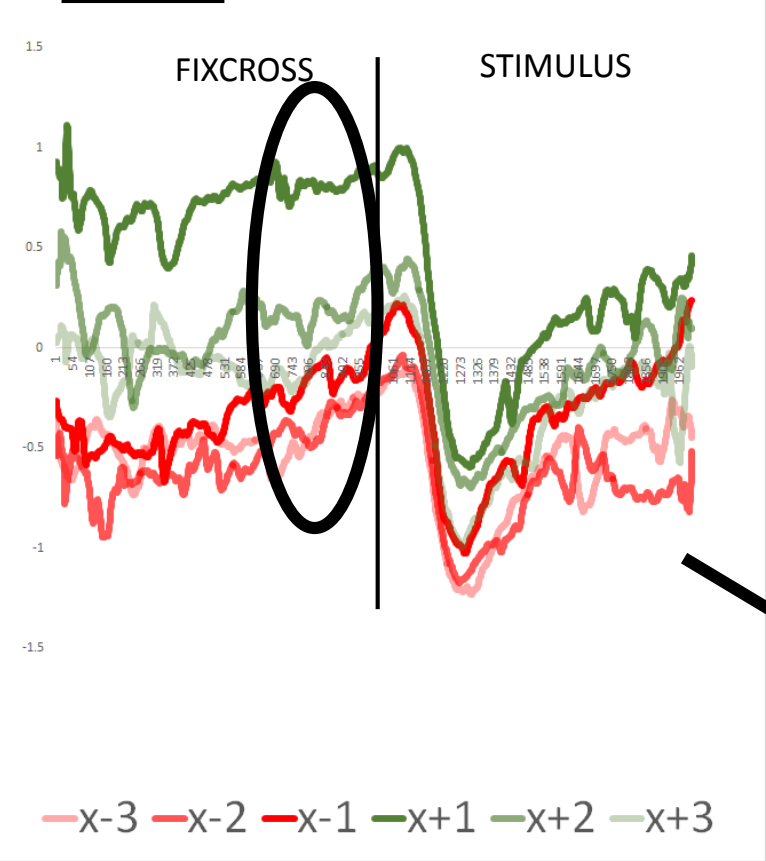
### ED-stage



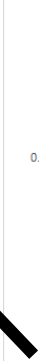
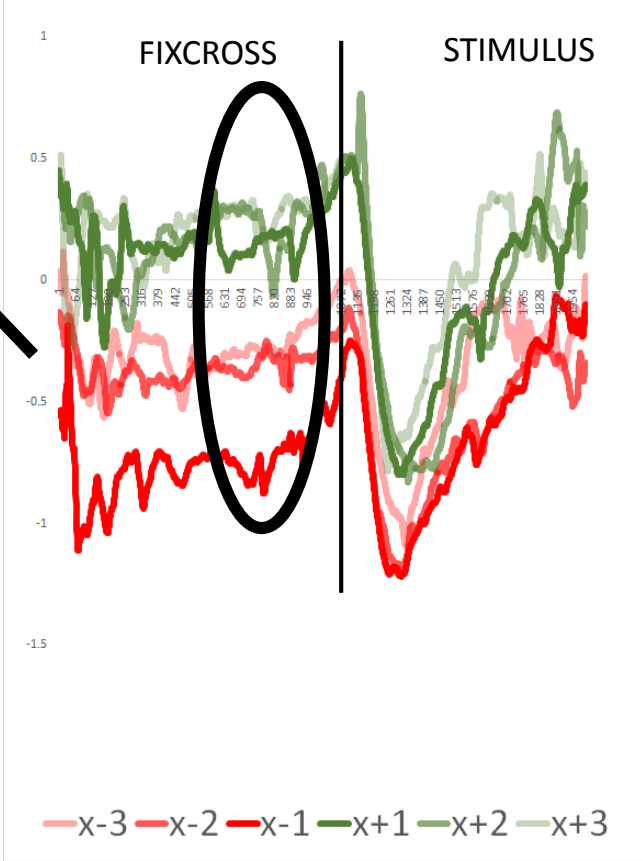
# Pupil diameter before and after a switch

## Pretrial pupil diameter indexing tonic activity of the LC/NE system BEFORE and AFTER switch

### ID-stage

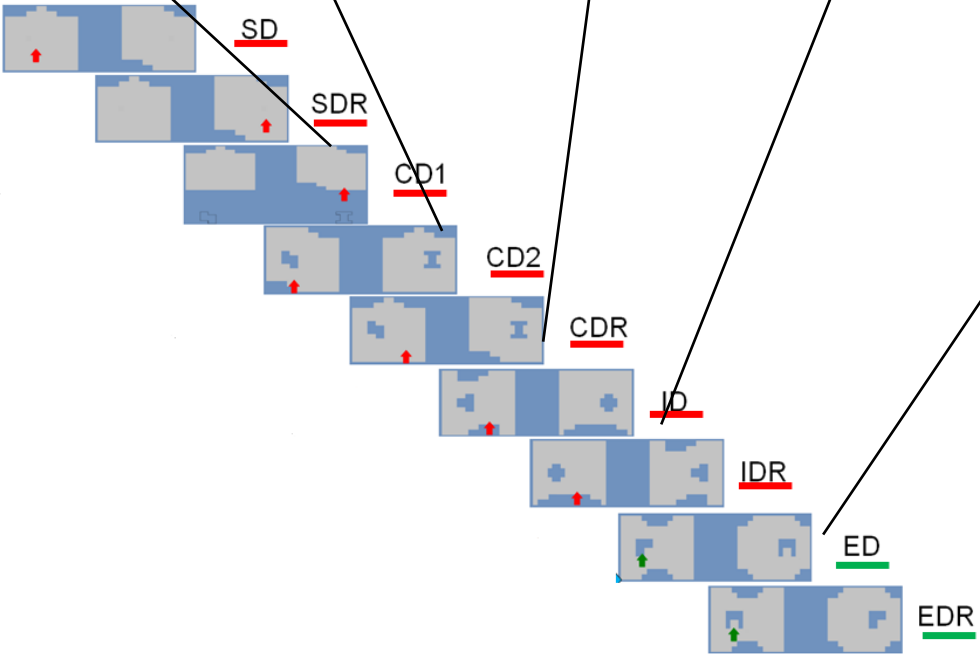
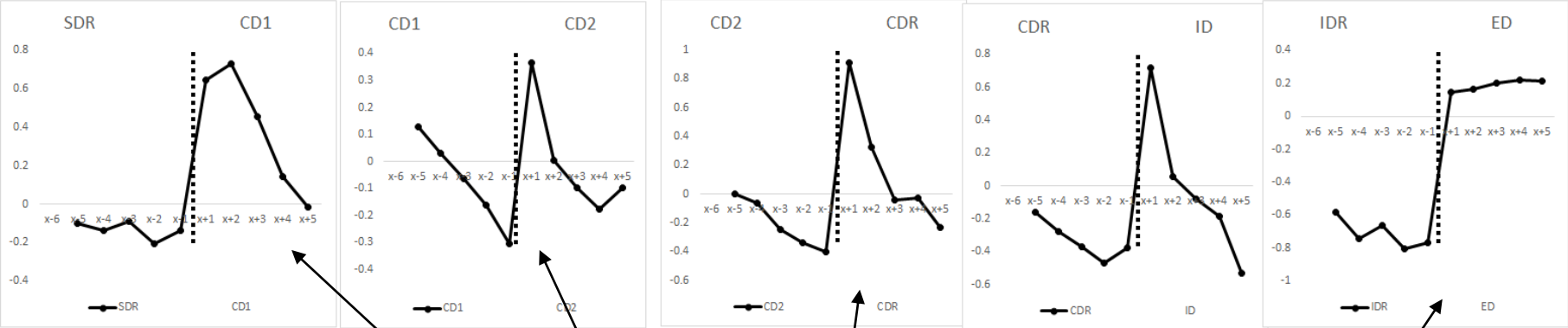


### ED-stage

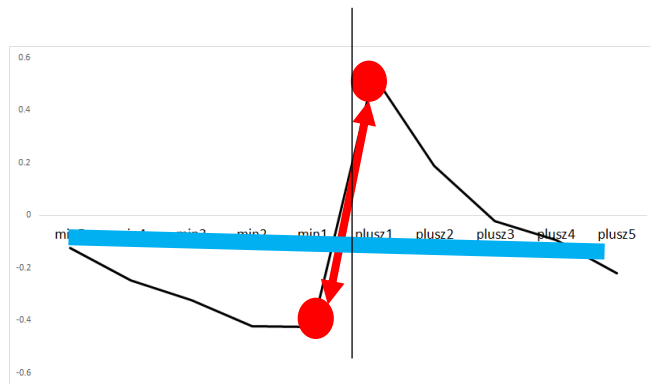


# Pupil diameter before and after a switch

The magnitude of the tonic mode of LC-NE response before and after phase shift



# Tonic LC activity, behavioral performance and attentional patterns

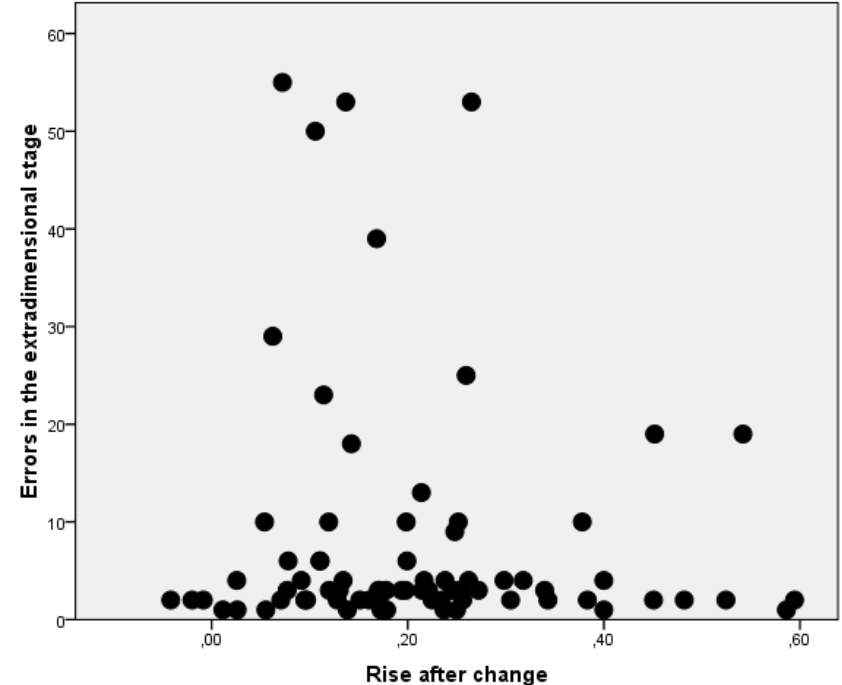
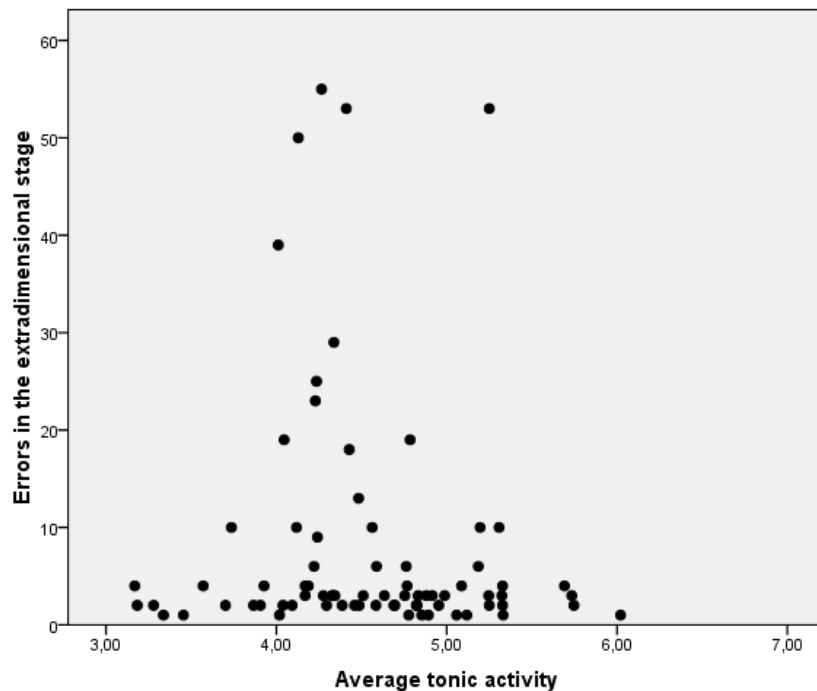


Average pretrial tonic pupil dilation

Increase in tonic activity after changes in reward contingencies

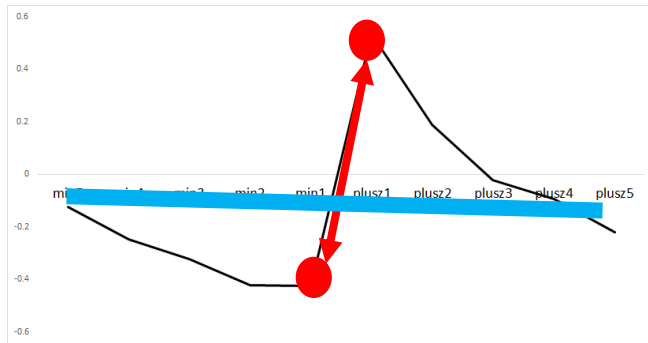
Collapsing data for all stages

## Extradimensional set shifting - performance





# Tonic LC activity, behavioral performance and attentional patterns



Collapsing data for all stages

Average pretrial tonic pupil dilation

**HIGH**

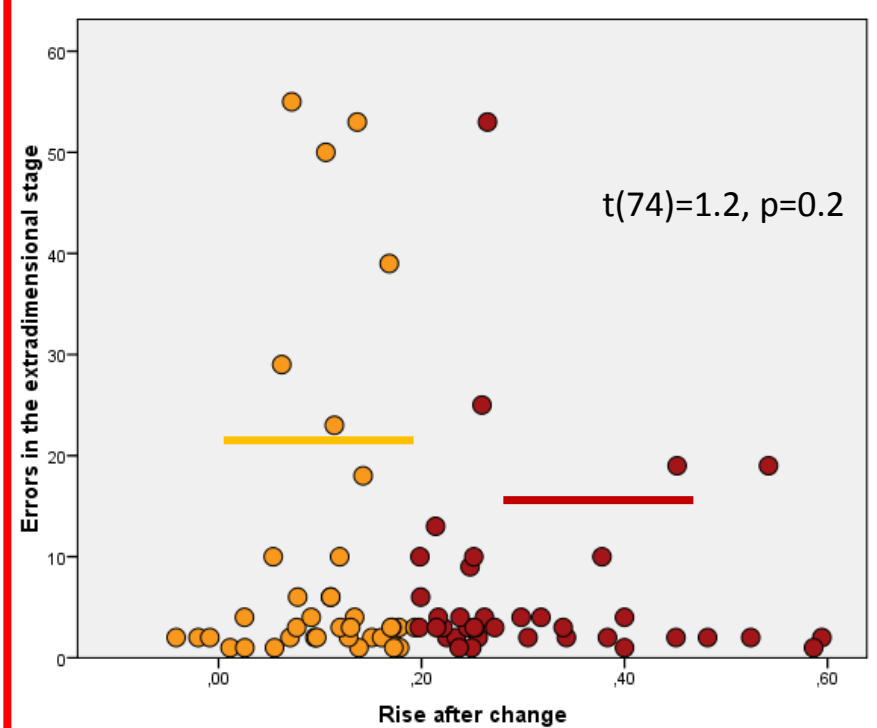
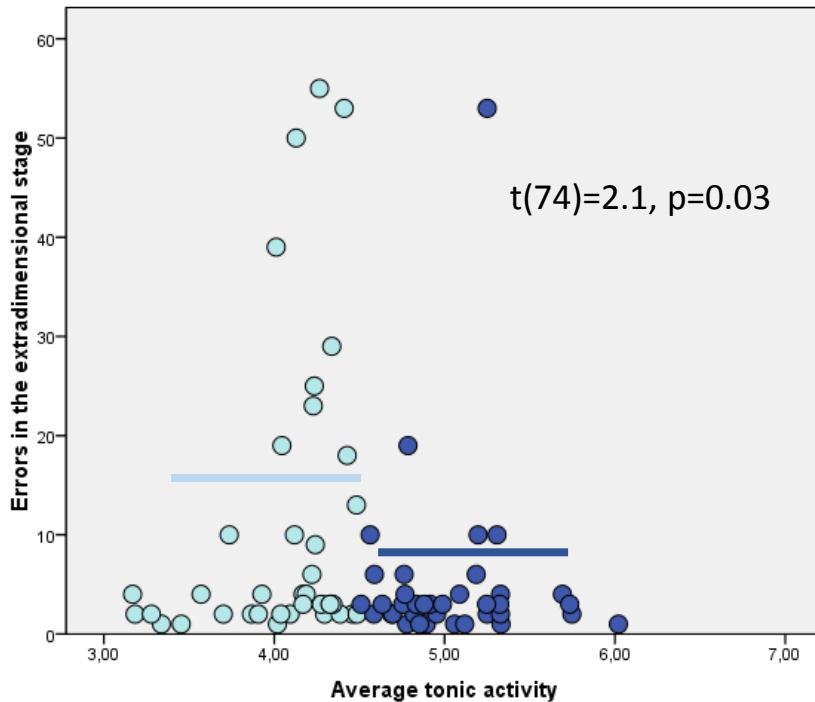
**LOW**

Increase in tonic activity after changes in reward contingencies

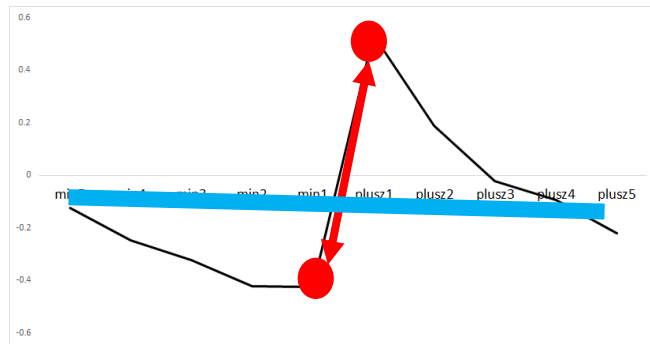
**HIGH**

**LOW**

## Extradimensional set shifting - performance



# Tonic LC activity, behavioral performance and attentional patterns



Collapsing data for all stages

Average pretrial tonic pupil dilation

**HIGH**

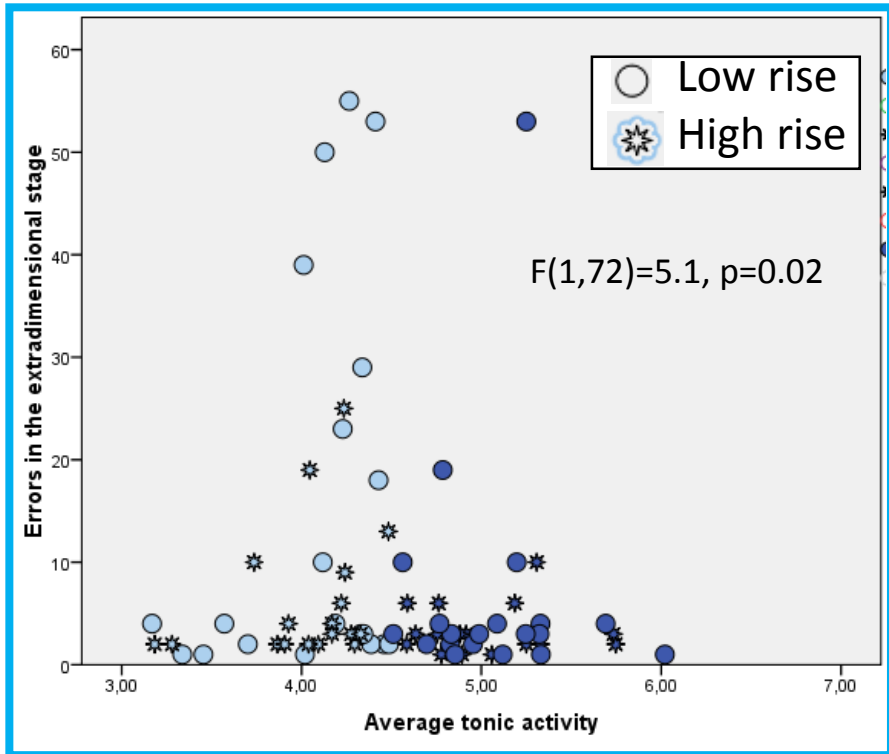
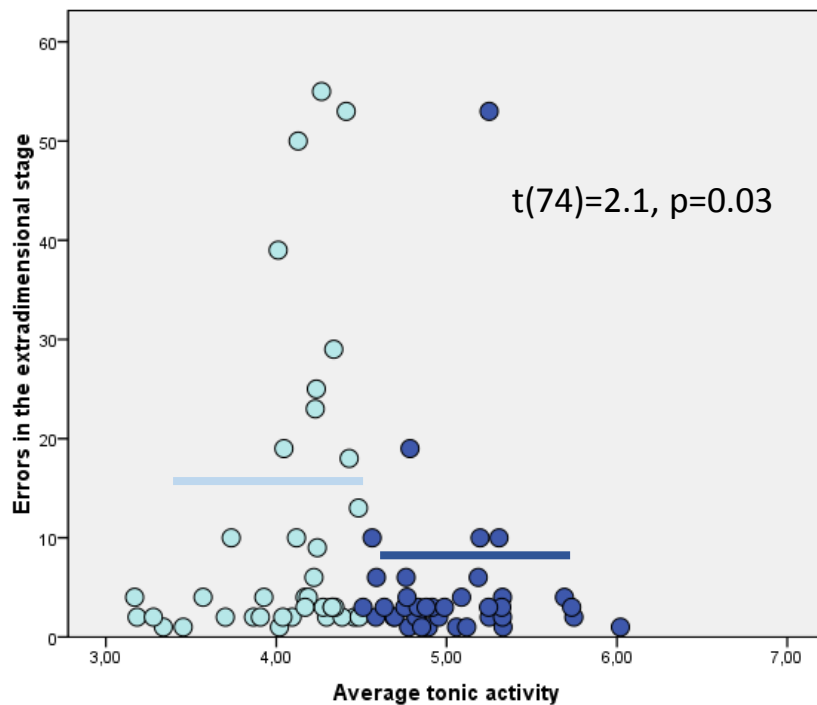
**LOW**

Increase in tonic activity after changes in reward contingencies

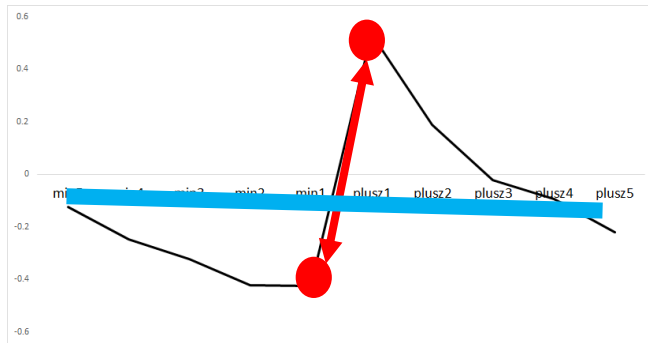
**HIGH**

**LOW**

## Extradimensional set shifting - performance



# Tonic LC activity, behavioral performance and attentional patterns



Collapsing data for all stages

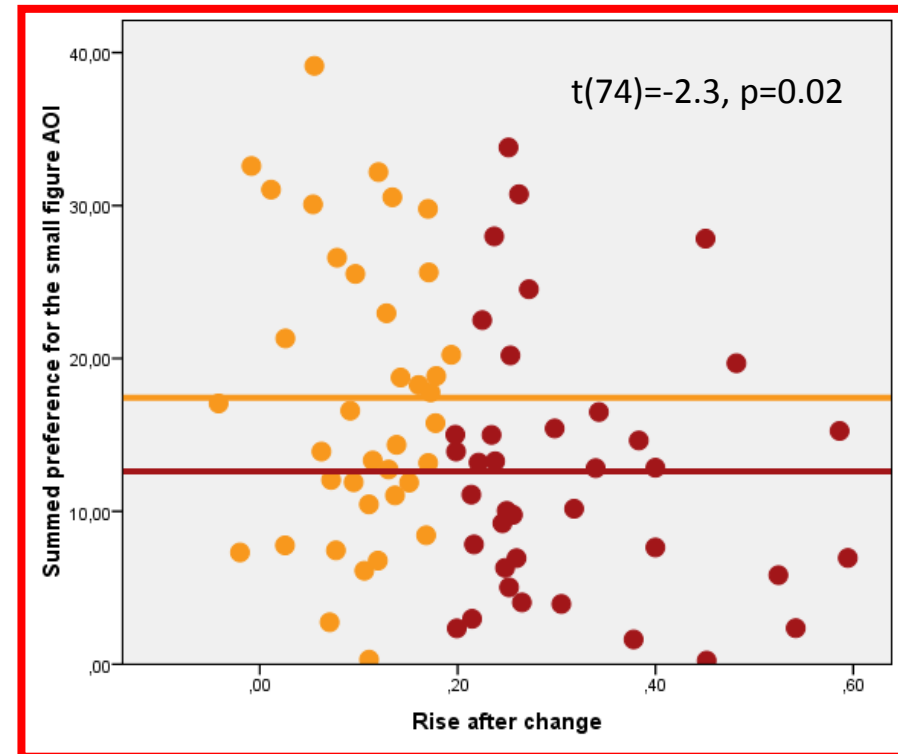
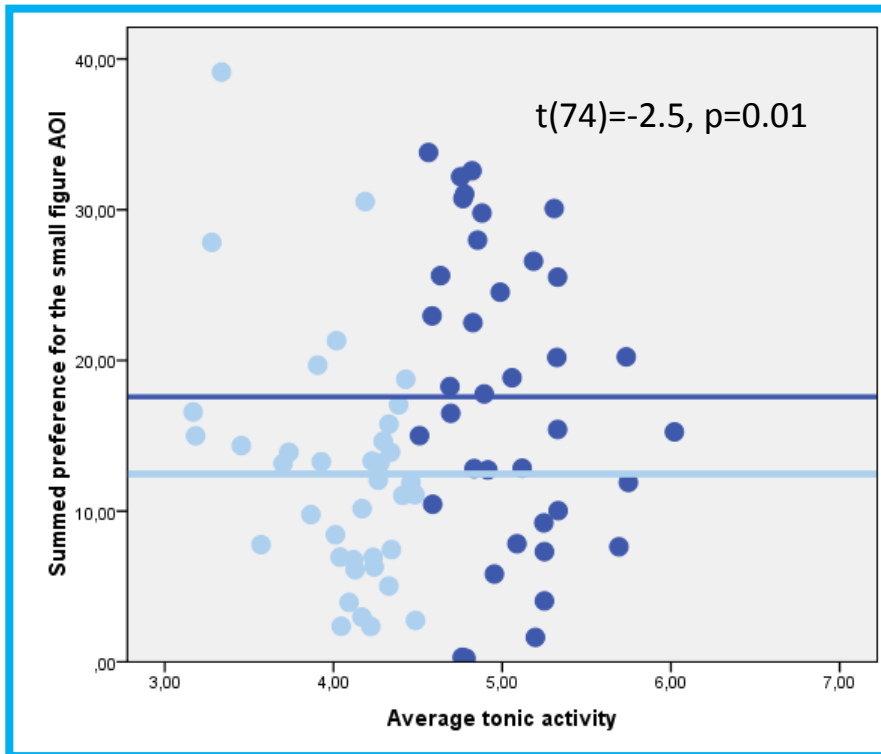
Average pretrial tonic pupil dilation

HIGH  
LOW

Increase in tonic activity after changes in reward contingencies

HIGH  
LOW

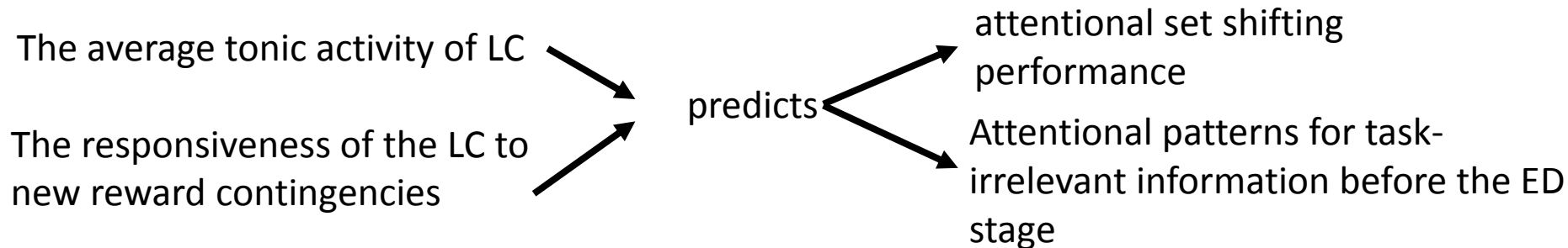
## Dwell time on the irrelevant dimension before ED-stage



# Conclusions

Attentional patterns before the extradimensional shift stage predict successful attentional set shifting.

Changes in reward contingencies are associated with an increase in tonic activity of the LC (as measured by pupil dilation)



## FUTURE STUDIES:

→ exploration/exploitation in different paradigms (e.g. memory retrieval, verbal fluency, economic decision making)

→ The interaction of dopamine and noradrenaline in determining the exploration-exploitation tradeoff

→ Pathological populations (e.g. Parkinson's disease)

→ Personality trait correlates