



# The index of cognitive activity (ICA) – a promising objective measure of Cognitive Load when learning with different visualization formats

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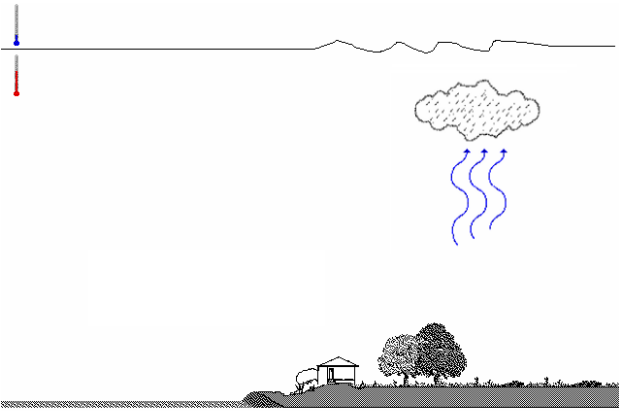
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# Learning with Multimedia (Mayer, 2014)

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## Multimedia Principle:

Text + Visualization



As the air in this updraft cools, water vapor condenses into water droplets and forms a cloud.

>

Text

As the air in this updraft cools, water vapor condenses into water droplets and forms a cloud.

# Learning with Animation vs. Static Picture

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## Research:

- inconsistent (Tversky, Bauer-Morrison, & Bétrancourt, 2002; Höffler & Leutner, 2007)  
→ „What is better?“ → global question is not fruitful
  
- differentiated approach:  
→ for whom, under which conditions and why?
  
- ➔ focus on processing demands of learners when learning with animations or static pictures

# Characteristics of animations

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- possible disadvantages:
  - „Overwhelming“
  - **transience** (e.g., Ayres & Paas, 2007; Castro-Alonso, Ayres, & Paas, 2015)
    - information can be missed
    - learners have to memorize different phases/states

**Interphase**

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  - **visual complexity** (Lowe, 2004)
    - intra-split-attention
    - relevance vs. salience

# Characteristics of animations

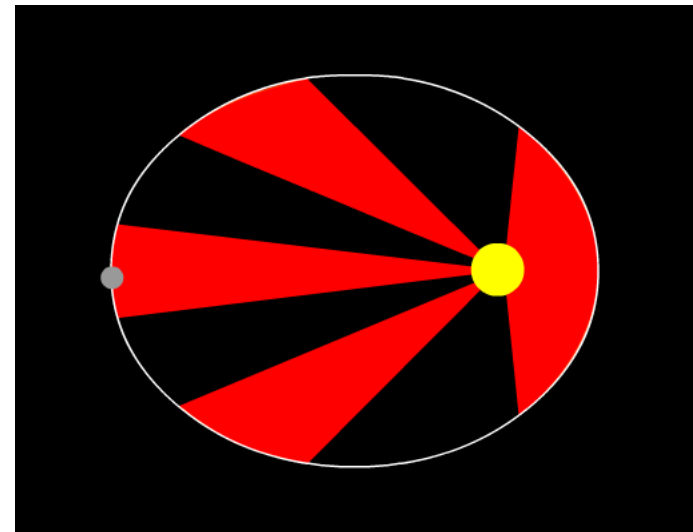
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    - information can be missed
    - learners have to memorize different phases/states
  - **visual complexity** (Lowe, 2004)
    - intra-split-attention
    - relevance vs. salience
- possible advantage:
  - **mental animation of dynamic information** (e.g., Hegarty, 2004; Lowe, 2003)

# Animation vs. Static Picture

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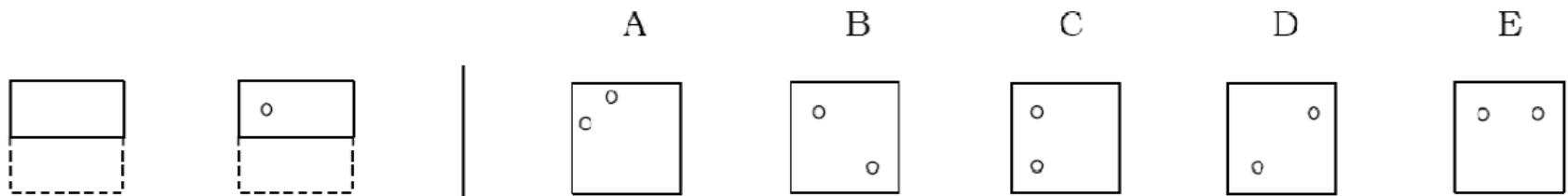
- essential difference: presentation of dynamic information
- learning with static pictures: dynamic information has to be
  - 1.) inferred by the learner
  - 2.) mentioned in an external source (text)



# Animation vs. Static Picture

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- who profits from dynamic information presented in animations?
- learners with problems in mentally animating this dynamic information (=> low spatial abilities?)
- „Ability-as-compensator“- Hypothesis (e.g., Höffler, 2010, Höffler & Leutner, 2011)



(Ekstrom, French, Harman, & Dermen, 1976)



# Measuring Cognitive Load

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- subjective ratings (e.g., Paas, 1992)
- dual task paradigms (e.g., Brünken, Steinbacher, Plass, & Leutner, 2002)
- physiological measurements (e.g., Just et al., 1996)
  - heart rate
  - positron emission tomography (PET)
  - electroencephalography (EEG)
  - electrodermal activity (EDA)
  - pupil dilation measurements
    - task-evoked pupillary responses (TEPRs) (e.g., Van Gerven, Paas, van Merriënboer, & Schmidt, 2004)
    - index of cognitive activity (ICA) (e.g., Marshall, 2002; Bartels & Marshall, 2012)

# Hypotheses / Research Questions

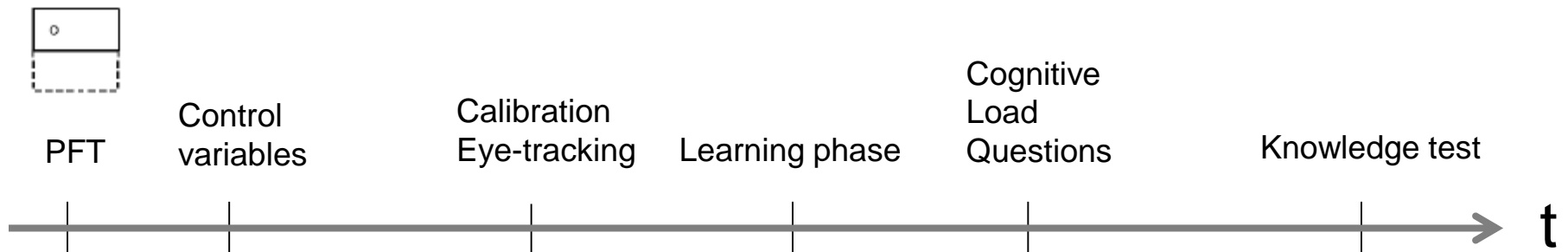
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- Multimedia Principle: Text and visualization should be better suited than text-only (control group)
- Learning with animation vs. static picture:
  - animations should be better suited than static pictures, particularly if the information about the dynamic features is not given in the text
  - ability-as-compensator: learning with animation should be better suited for learners with low spatial abilities (not necessarily for learners with high spatial abilities)
  - explorative: How to best measure Cognitive Load: Is cognitive activity mirrored by pupil changes (ICA)?

# Methods

2x3-Design ( $N = 198$ )

	Animation	Static Picture	Text-only	Total
Text <b>with</b> dynamic information	32	34	32	98
Text <b>without</b> dynamic information	34	32	34	100



Text **with**  
dynamic  
information

Planets are orbiting the sun on an ellipse, not on a circle. At this, the sun is not centered in the middle of the ellipse.

Kepler's second law states that the line joining a planet and the sun sweeps out equal areas during equal intervals of time.

When the distance between sun and planet is getting shorter, a planet has to travel a greater distance so that the line joining a planet and the sun sweeps out equal intervals of time. Therefore, to coincide with Kepler's second law, a planet has to move faster, the shorter ist distance is to the sun, and to move slower, the larger ist distance is to the sun.

Text  
**without**  
dynamic  
information

# Cognitive Load Items

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- 7-point Likert scale
    - 1 (not at all) to 7 (very much)
- 1) How much mental effort did you invest?
  - 2) How difficult was it to learn with the material?
  - 3) How much did you concentrate during learning?
  - 4) How demanding was the task for you?

(Paas, 1992; Cierniak, Scheiter, & Gerjets, 2009)

# Index of cognitive activity (ICA)

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- Marshall, 2002; Bartels & Marshall, 2012
  - based on changes in pupil dilation during learning phase
  - uses signal processing techniques of wavelet analyses
  - is computed for each second of a task
  - values between 0 and 1 values
  - needs to be standardized for each participant
  - was divided in
    - ICA-Visualization (ICA-value for watching the visualization)
    - ICA-Text (ICA-value for reading the text)

# Knowledge test

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- example of verbal factual knowledge
  - *“Please write down everything you can remember from the previous learning phase.”*
- example of transfer knowledge
  - *“Consider, the second law of Kepler would be true: What is the effect on the course on the planet’s speed when the sun is closer to the center (but not in the center)?”*

# Results – Cognitive Load

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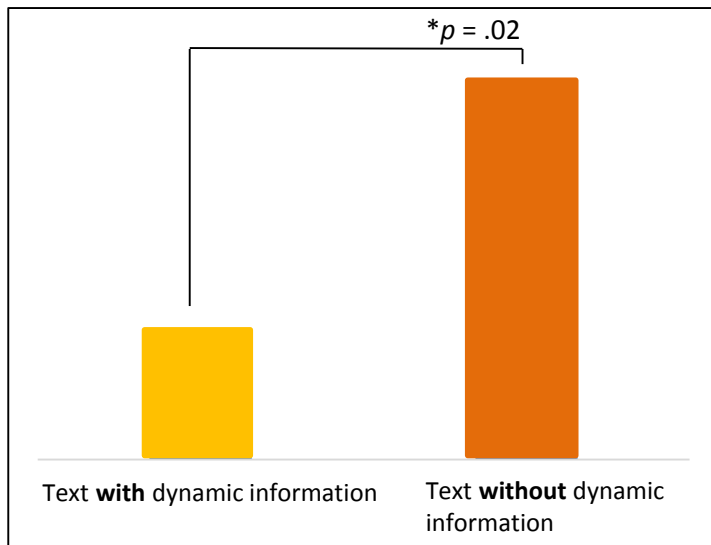
- influence of **text format**
  - difficulty, effort, concentration, demand:  $F_s < 1.48, p_s > .23$
- influence of **visualization format**
  - effort, concentration, demand:  $F_s < 2.18, p_s > .12$
  - difficulty:  $F(1, 185) = 2.76, p = .066, \eta^2_p = .029$ 
    - text only > animation = static picture
- interaction **text information\*visualization format**
  - $F_s < 1.19, p_s > .31$



# Results – ICA for text area

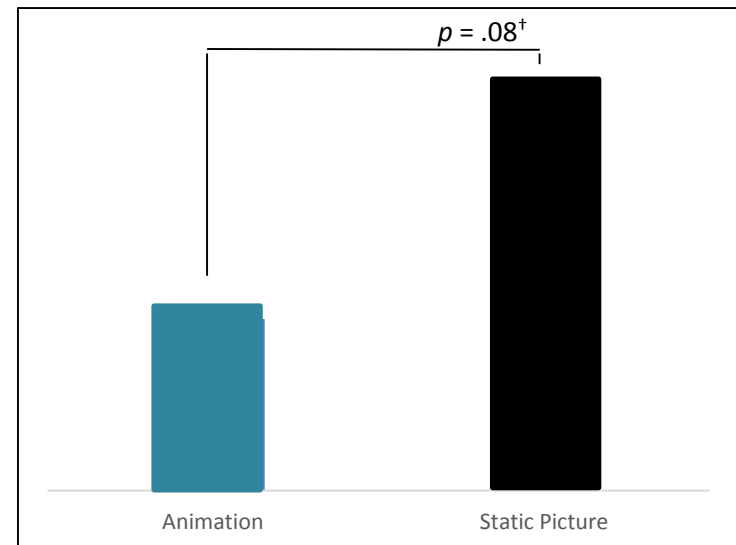
N = 115

## Text format



- main effect (text format): **with < without** dynamic information
  - $F(1, 111) = 5.99, p = .02, \eta^2_p = .05$

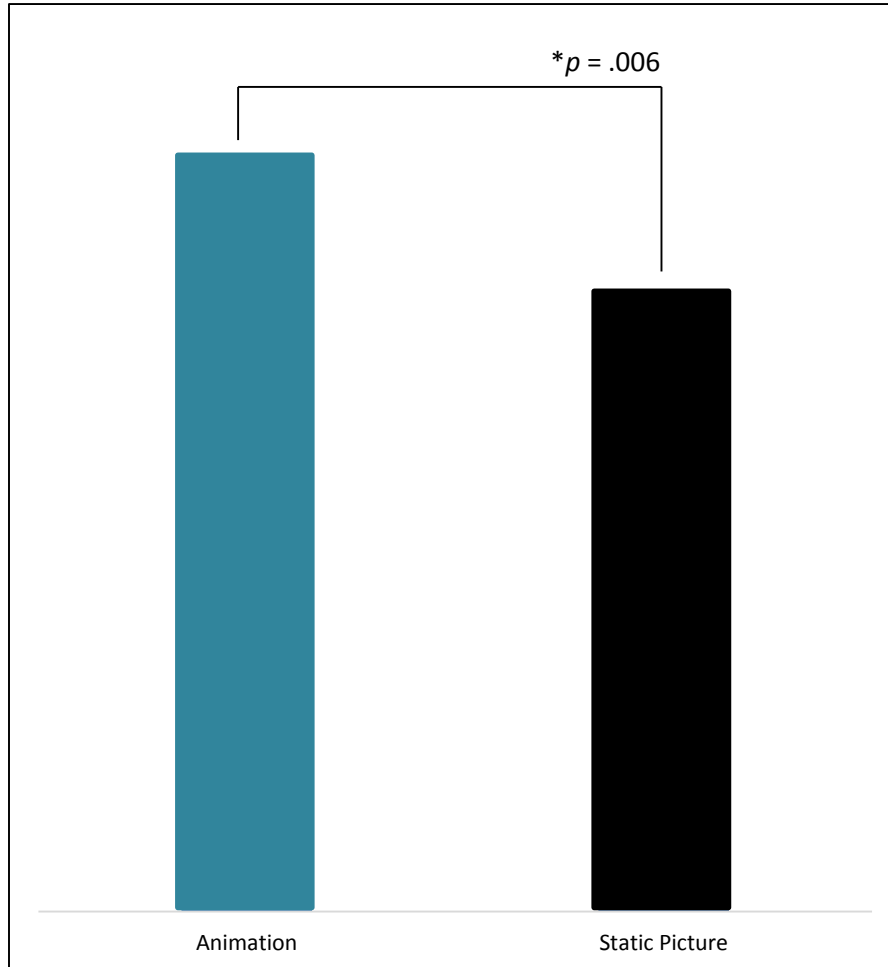
## Visualization format



- main effect (visualization format): **animation < static picture**
  - $(F(1, 111) = 3.17, p = .08^\dagger, \eta^2_p = .03)$
- no interaction:
  - $(F(1, 111) = 1.53, p = .22, \eta^2_p = .01)$

# Results – ICA for visualization area

N = 115

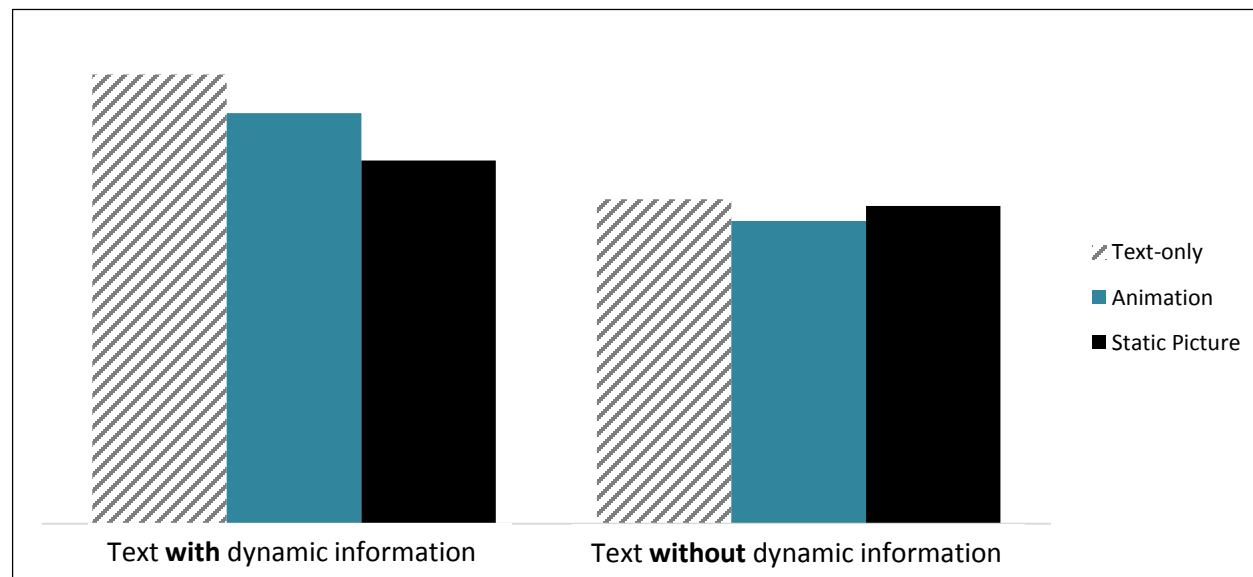


- main effect (visualization format):  
**animation > static picture**
  - $F(1, 111) = 7.89, p = .006, \eta^2_p = .07$
- no main effect (text format):
  - $F(1, 111) = 0.01, p = .92, \eta^2_p = .00$
- no interaction:
  - $F(1, 111) = 1.35, p = .25, \eta^2_p = .01$

# Results – Learning outcome (Retention)

N = 198

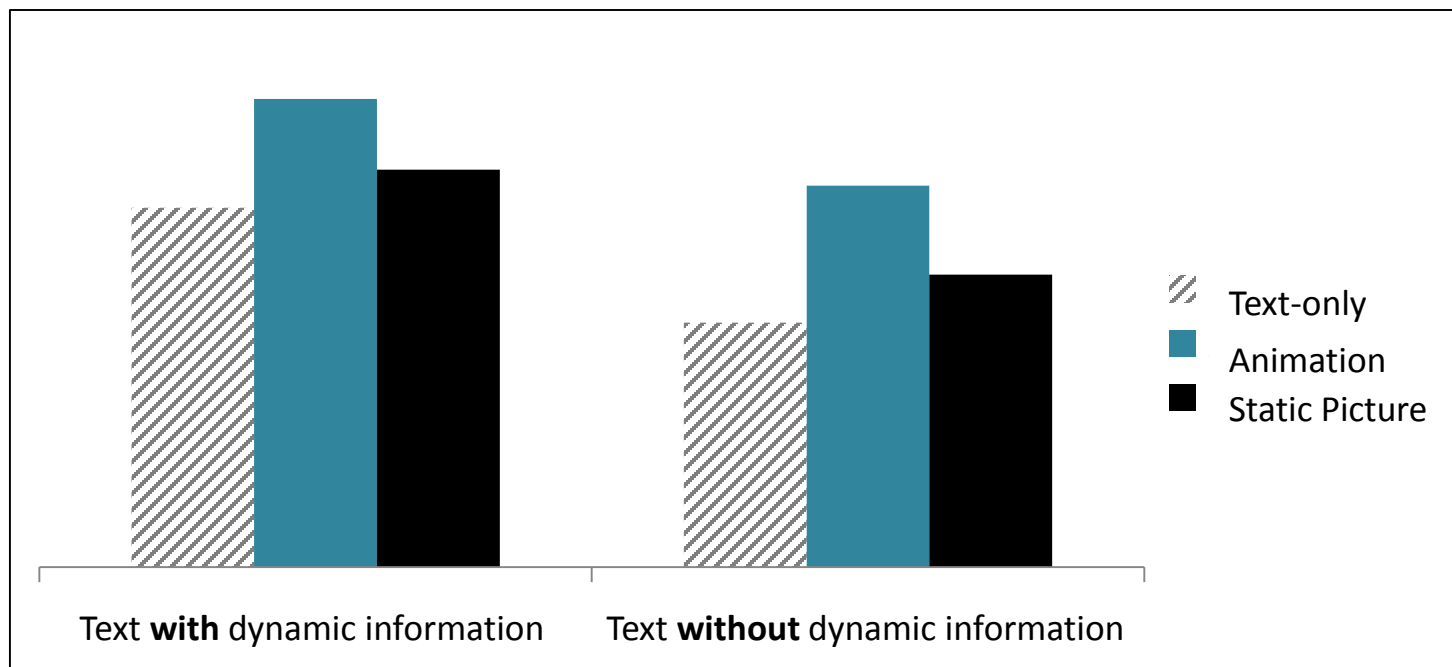
- main effect (text format):  $F(1, 192) = 20.27, p < .001, \eta^2_p = 1.00$ 
  - **with** > **without** dynamic information
- no main effect (visualization format):  $F(1, 192) = 1.77, p = .17, \eta^2_p = .02$
- no interaction: text does not compensate informational disadvantage of static picture;  $F(1, 192) = 1.41, p = .25, \eta^2_p = .01$



# Results – Learning outcome (Transfer)

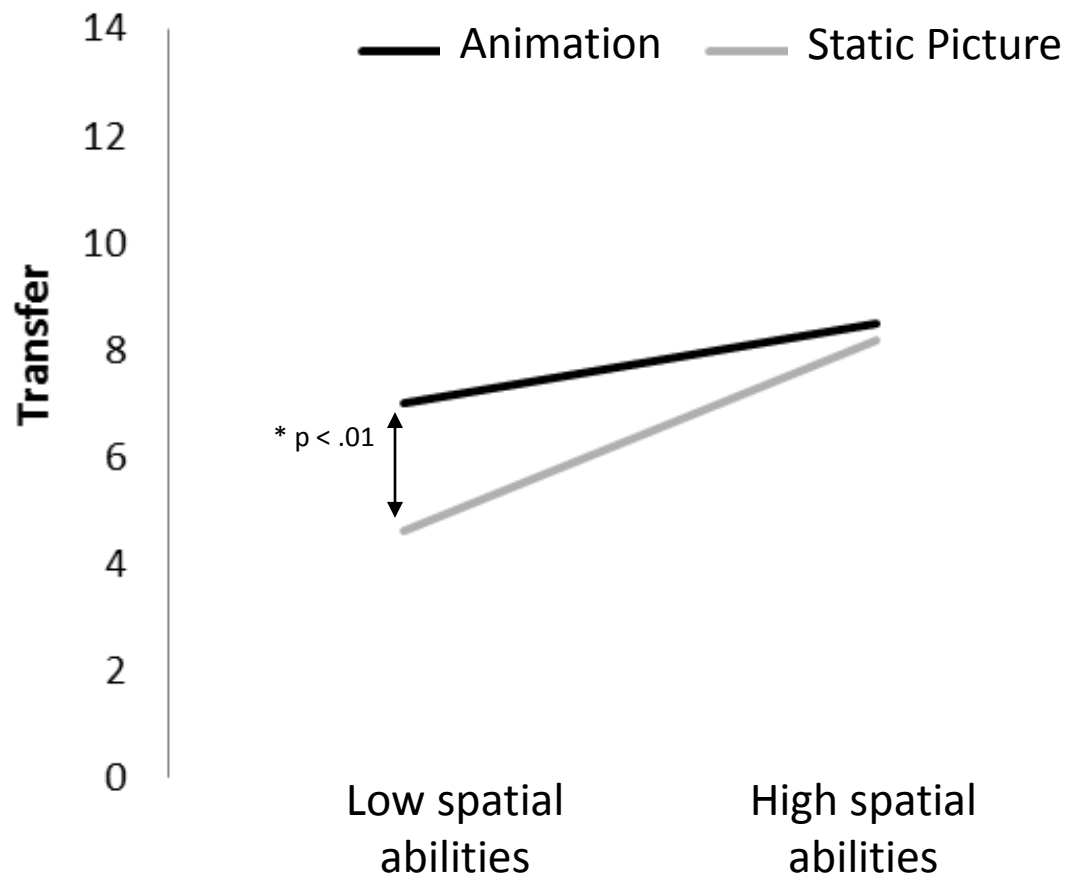
N = 198

- main effect (text format):  $F(1, 192) = 14.71, p < .001, \eta^2_p = .07$ 
  - **with** > **without** dynamic information
- main effect (visualization format):  $F(1, 192) = 6.12, p = .003, \eta^2_p = .06$ 
  - **animation** > **static picture** > **text-only**
- no interaction: text does not compensate informational disadvantage of static picture;  
 $F(1, 192) = 0.51, p = .60, \eta^2_p = .01$



# Results – Learning outcome (Transfer) PFT- Ability as compensator

N = 115

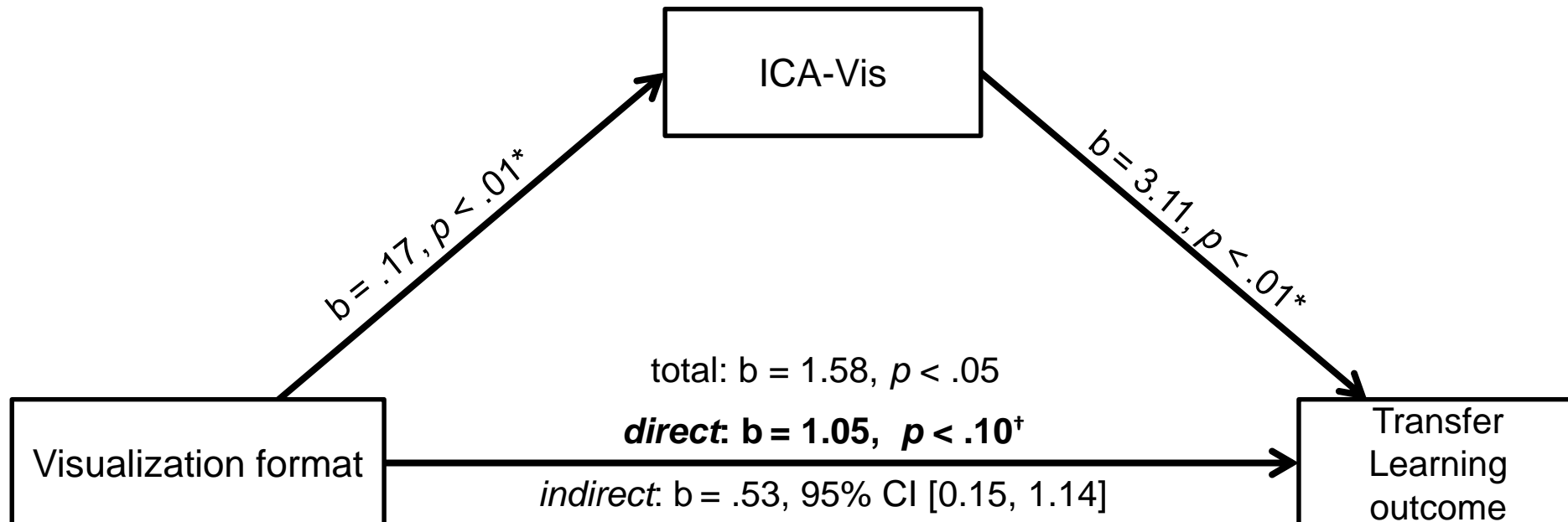


# Results – ICA (Transfer)

N = 115

- ICA regarding visualization: animation > static picture

Mediation analysis:



→ **Mediation: indirect effect for ICA-Vis**

# Summary of Results

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Enhanced learning outcomes when learning with an animation compared to a static picture,

- irrespective of whether dynamic information in the text is given or not
- especially for learners with low spatial abilities (ability-as-compensator)

Enhanced learning outcomes when learning with animations can (partially) be explained by pupil dilations (= ICA)

- ICA = able to detect differences
  - 2 different scores
    - visualization format: **animation** > **static picture**
    - text format: text **without** > text **with** dynamic information

# Discussion

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- Measurement of CL
  - subjective ratings ≠ able to detect differences
    - no differences between visualization and text format
    - splitting between visualization and text format?
  - ICA = more able to detect differences
    - text **without** dynamic information = higher workload; however text **with** dynamic information is more supportive regarding transfer knowledge test → blackbox?!
- Results showed that high “active processing” when learning with visualization is supportive for learning outcome
  - how can we optimize this process?
    - prompting learners to actively engage in learning material (= inferences?)



**Thank you very much for your  
attention and interest!**



For more critical comments, remarks and/or hints:

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