

Is learning in a conditioning procedure with valent targets unconscious?

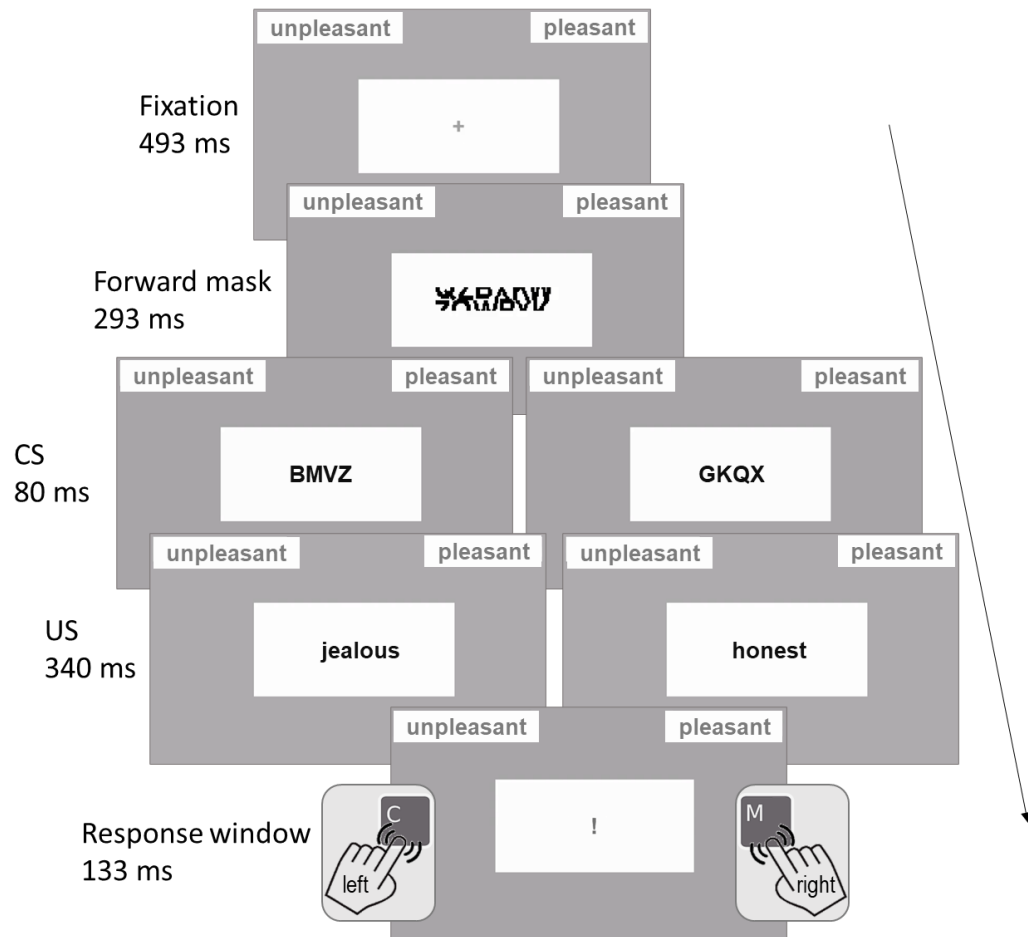
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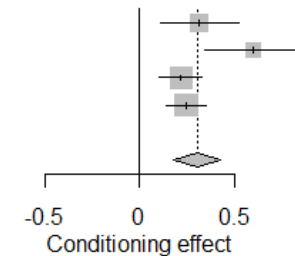
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Learning phase and conditioning test



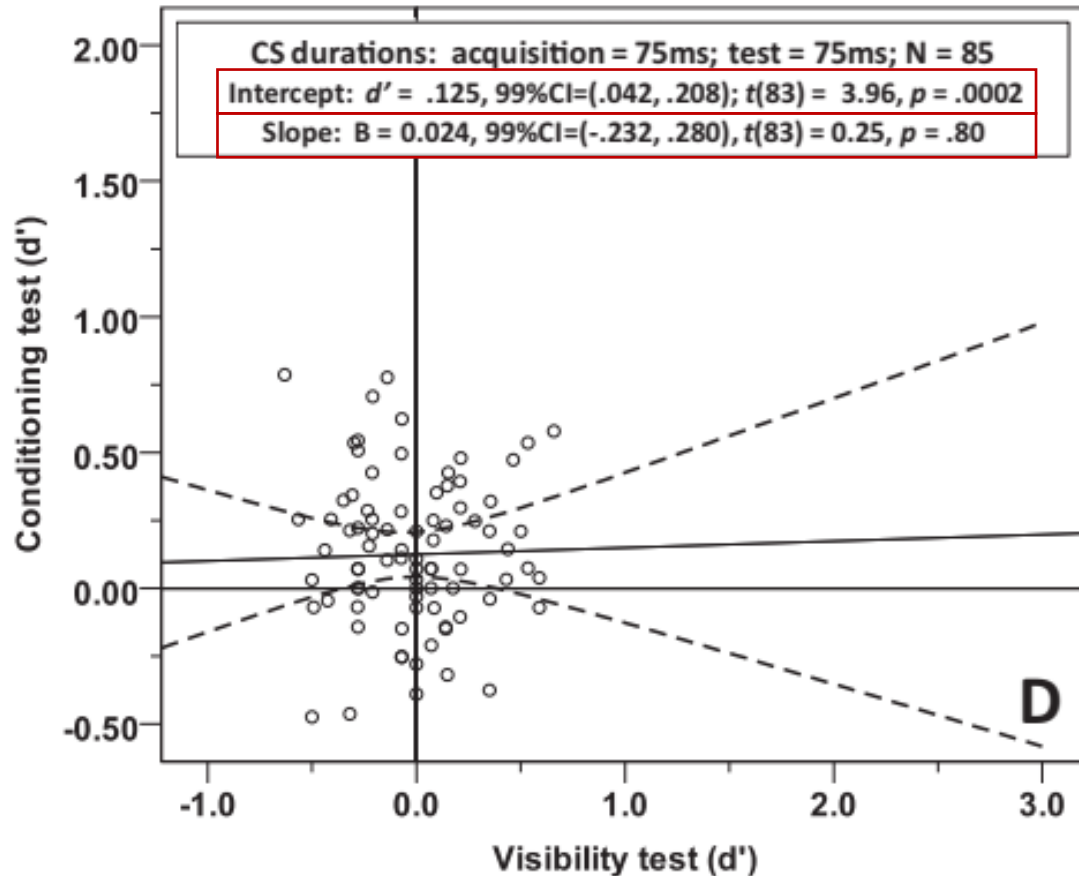
- Replication of Greenwald & De Houwer (2017)
- Learning phase:
 - Task: pleasant / unpleasant target? (2AFC)
 - Response window → fast responding
 - 100 % contingency between CS and US
- Conditioning test:
 - Same task
 - 50 % contingency
 - Better performance for congruent than for incongruent trials

Study	Cohen's d	95% CI
Exp.2, Masked, 70 ms	0.31	[0.11; 0.52]
Exp.2, Masked, 80 ms	0.59	[0.34; 0.85]
Exp.3, Masked, 80 ms	0.22	[0.10; 0.33]
Exp.4, Masked, 80 ms	0.24	[0.14; 0.35]
Random effects model	0.30	[0.18; 0.42]
Heterogeneity: $I^2 = 61\%$, $\tau^2 = 0.0089$, $p = 0.05$		



Unconscious learning?

Data by Greenwald and De Houwer (2017)



- Visibility test:
 - Same sequence of stimuli as in the conditioning test
 - Task: Which CS was shown? (2AFC)
 - Regressing the conditioning effect on visibility:
 - Zero slope: “conditioning independent of the visibility of the CS”
 - Positive intercept: “conditioning in the absence of visibility of the CS”
- Double evidence for unconscious learning

Zero slope: Conditioning independent of the visibility of the CS?



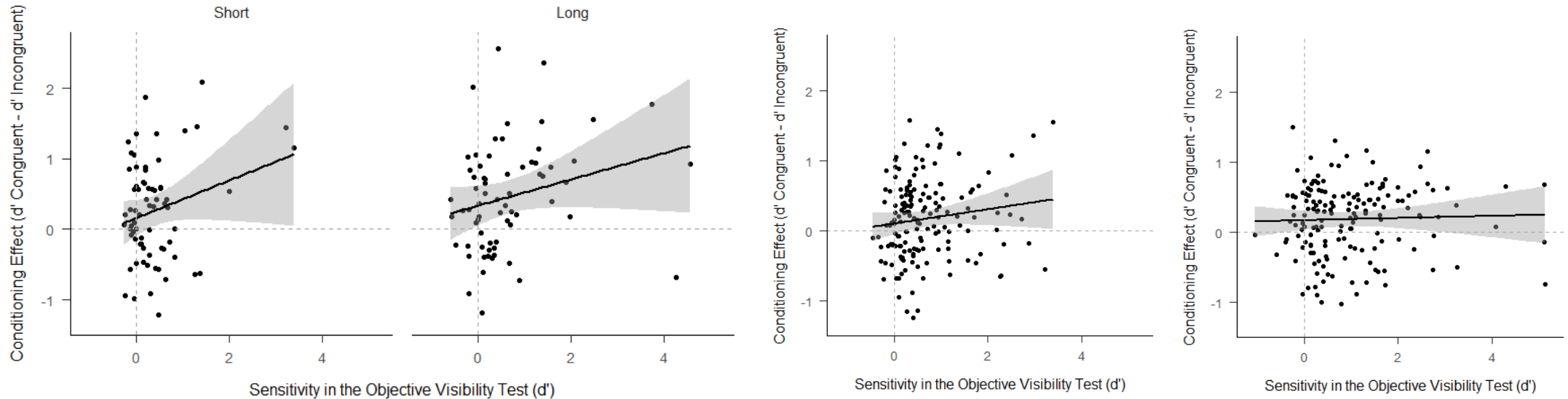
- G&DH: Only error variance in the predictor → under-estimation of the slope
 - Our study: Higher mean visibility → more systematic variance → unbiased estimation of the slope
- G&DH: Application of regression analysis despite measurement error in the predictor → under-estimation of the slope
 - Our study: Application of the Errors-in-variables correction (Klauer, Draine, & Greenwald, 1998) → unbiased estimation of the slope
- G&DH: Significantly positive slope in 1/9 studies ($\alpha=5\%$, one-sided), Meta-analysis with $r = .10$, 95% CI [0.04, ∞], $z = 2.70$, $p = .004$, $I^2=0.0\%$, $\tau_{S_j}^2=0.003$
 - Our study: Significantly positive slope in 3/4 studies ($\alpha=5\%$, one-sided), Meta-analysis with $r = .15$, 95% CI [0.05, ∞], $z = 2.40$, $p = .008$, $I^2=18.5\%$, $\tau_{S_j}^2=0.006$

$r = .25$, $b = 0.28$, 95% CI [0.07, ∞],
 $t(68) = 2.16$, $p = .017$

$r = .25$, $b = 0.20$, 95% CI [0.04, ∞],
 $t(66) = 2.12$, $p = .019$

$r = .14$, $b = 0.10$, 95% CI [-0.004, ∞],
 $t(161) = 1.72$, $p = .044$

$r = .03$, $b = 0.02$, 95% CI [-0.05, ∞],
 $t(161) = 0.48$, $p = .317$



Positive intercept: Conditioning in the absence of visibility of the CS?

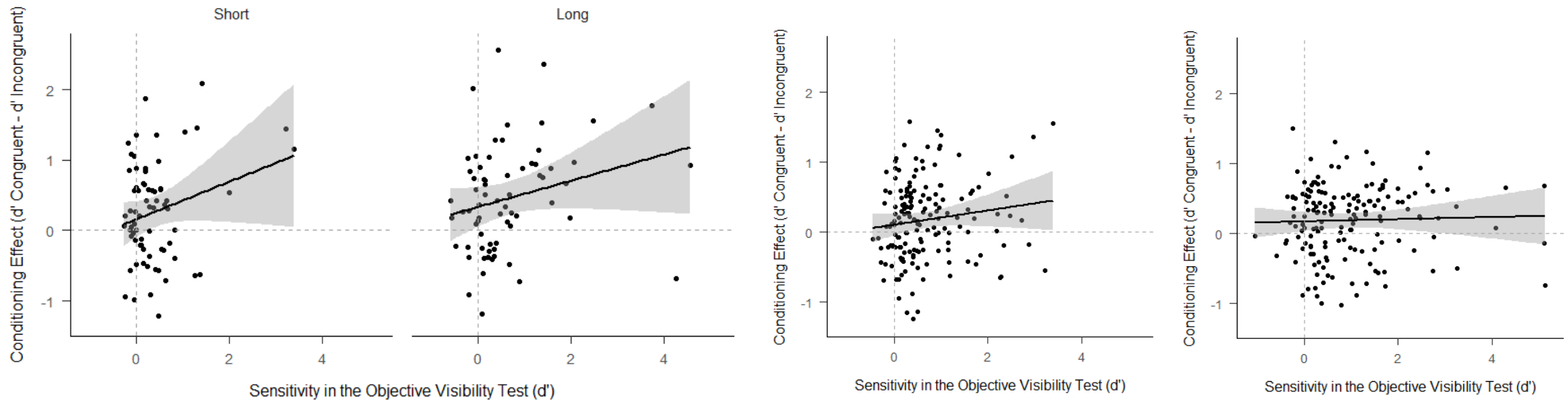
- G&DH: The objective visibility might be under-estimated due to a task-difficulty artifact (Pratte & Rouder, 2009) → over-estimation of the intercept
 - Our study: Insertion of easier trials between the difficult objective visibility trials → unbiased estimation of the intercept
- G&DH: Application of regression analysis despite measurement error in the predictor → over-estimation of the intercept
 - Our study: Application of the Errors-in-variables correction → unbiased estimation of the intercept
- G&DH: Significantly positive intercept in 8/9 studies ($\alpha=1\%$, two-sided)
 - Our study: Significantly positive intercept in 2/4 studies ($\alpha=1\%$, two-sided)

$b = 0.16$, 95% CI [-0.09, 0.41],
 $t(68) = 1.71$, $p = .093$

$b = 0.33$, 95% CI [0.06, 0.60],
 $t(66) = 3.13$, $p = .003$

$b = 0.11$, 95% CI [-0.05, 0.26],
 $t(161) = 1.81$, $p = .072$

$b = 0.17$, 95% CI [0.03, 0.31],
 $t(161) = 3.15$, $p = .002$



Positive intercept: Conditioning in the absence of visibility of the CS?

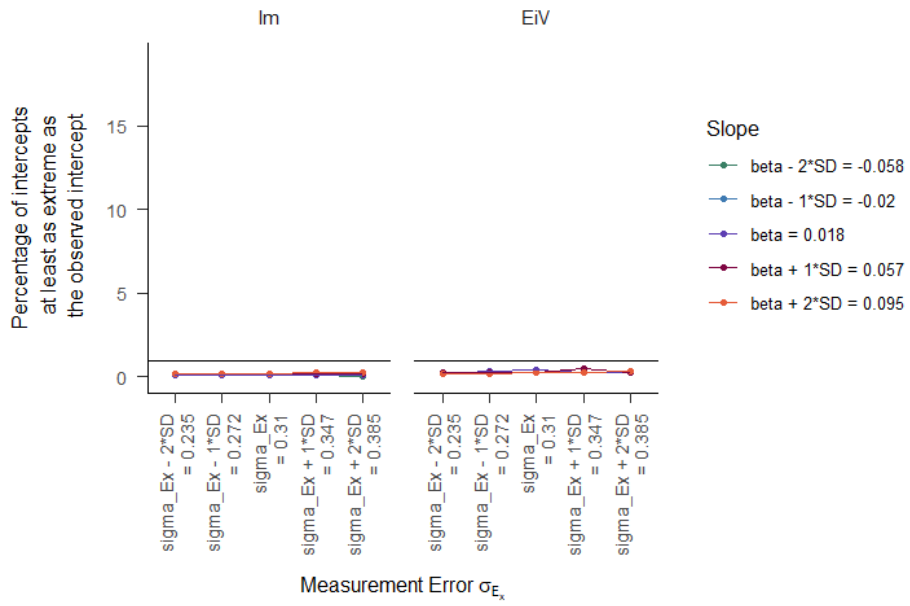
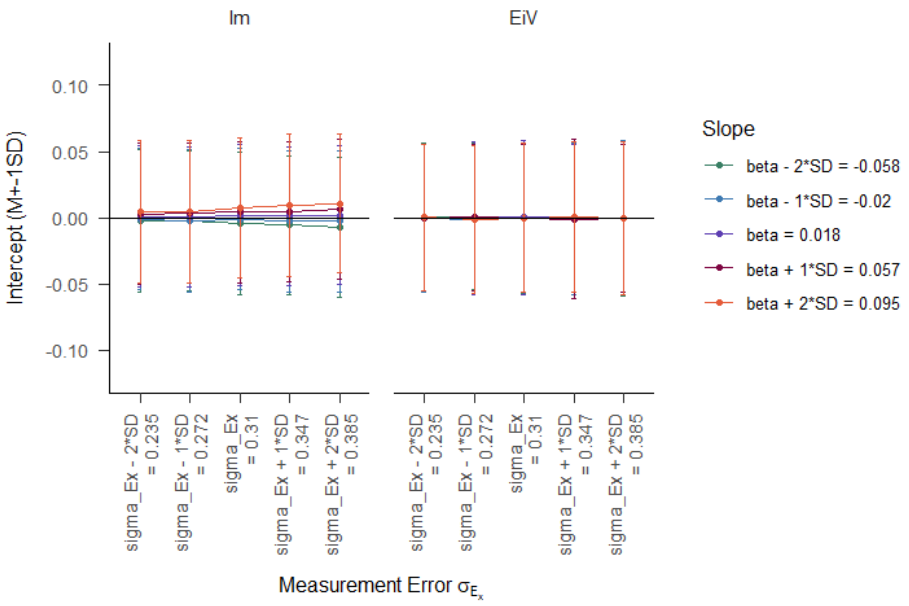
Is the Errors-in-variables correction a valid method to test unconscious learning?

- The intercept is over-estimated by the Errors-in-variables correction...
 - For various distributions of the predictor (Miller, 2000)
 - Even for truncated normal distributed data (Malejka)
 - The over-estimation might be less severe in our study
 - Simulation of huge samples by Miller (Klauer & Greenwald, 2000)
 - Simulation of steep slopes by Miller (Klauer & Greenwald, 2000)
 - Simulation of too few true zero predictor values by Miller (Klauer & Greenwald, 2000)
- Simulations of realistic data that parallels our experimental data



Positive intercept: Conditioning in the absence of visibility of the CS?

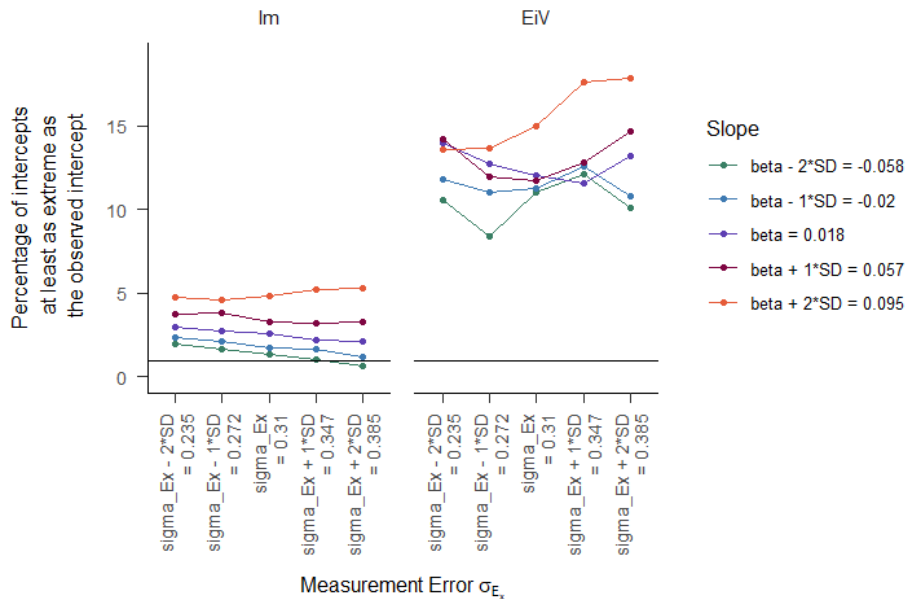
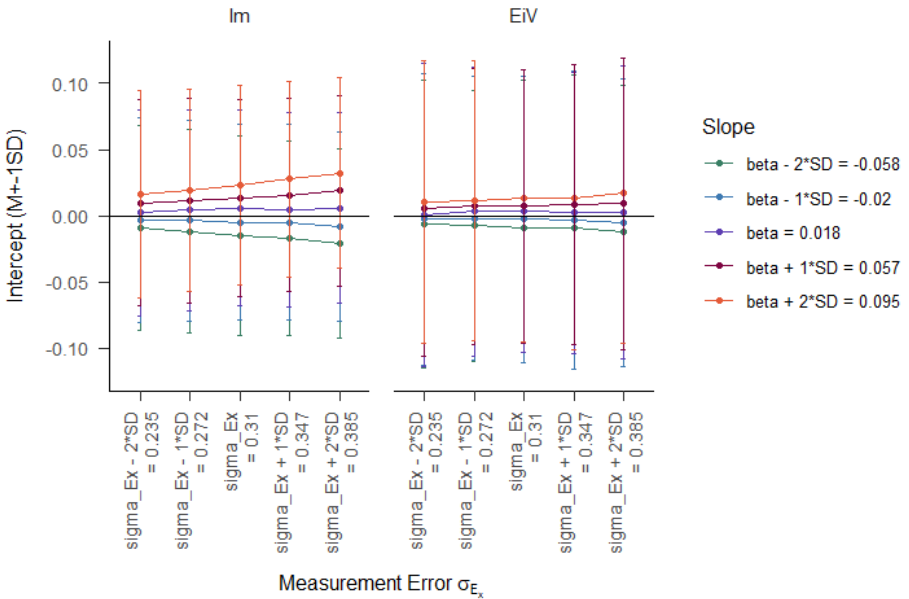
- Simulations with truncated normal distributed data:
 - Unbiased estimation of the intercept with the Errors-in-variables correction
 - The observed intercept is very unlikely compared to the distribution of simulated intercepts ($\alpha=1\%$)





Positive intercept: Conditioning in the absence of visibility of the CS?

- What if the data is not truncated normal distributed?
- Simulations with bootstrapping from our experimental data:
 - (Slightly) biased estimation of the intercept even with the Errors-in-variables correction
 - The observed intercept is likely, compared to the distribution of simulated intercepts ($\alpha=1\%$)



Summary and Conclusion

- We replicated a conditioning effect in a speeded classification task with masked CSs and regressed the effect on the objective visibility of the CSs.
- G&DH: Zero slope → “Conditioning independent of the visibility of the CS”
 - Our study: Methodological and statistical improvements (more systematic variance, motivation trials, Errors-in-variables correction) revealed that the **conditioning effect is moderated by objective visibility**.
- G&DH: Positive intercept → “Conditioning in the absence of visibility of the CS”
 - Our study: Depending on the distribution **the intercept might be over-estimated**.
 - However, in some of G&DH’s experiments objective visibility seems to be absent in the whole sample and still they observed a conditioning effect.
 - To interpret their data as conditioning in the absence of objective visibility, it needs to be ruled out that the objective visibility was under-estimated due to a task-difficulty artifact (Pratte & Rouder, 2009).

Is learning in a conditioning procedure with valent targets unconscious?

- Get the slides:
 - <http://methexp.uni-koeln.de/de/members/philine-thomasius/>
- Contact:
 - Philine Thomasius, University of Cologne, philine.thomasius@uni-koeln.de
- References
 - Klauer, K. C., Draine, S. C., & Greenwald, A. G. (1998). An unbiased errors-in-variables approach to detecting unconscious cognition. *British Journal of Mathematical and Statistical Psychology*, *51* (2), 253–267.
 - Greenwald, A. G., & De Houwer, J. (2017). Unconscious conditioning: Demonstration of existence and difference from conscious conditioning. *Journal of Experimental Psychology: General*, *146*(12), 1705–1721.
 - Pratte, M. S., & Rouder, J. N. (2009). A task-difficulty artifact in subliminal priming. *Attention, Perception, & Psychophysics*, *71*(6), 1276–1283.
 - Miller, J. (2000). Measurement error in subliminal perception experiments: Simulation analyses of two regression methods. *Journal of Experimental Psychology: Human Perception and Performance*, *26* (4), 1461–1477.
 - Klauer, K. C., & Greenwald, A. G. (2000). Measurement error in subliminal perception experiments: Simulation analyses of two regression methods—comment on Miller (2000). *Journal of Experimental Psychology*. *26* (4), 1506–1508.