#### corre

### correlations with random effects

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this is very surprising, considering how often correlation estimates taking care of random effects would be useful



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- code is available (in part based on existing packages, such as lme4 and lmeresampler), but should be further developed and documented