



THE UNIVERSITY OF  
CHICAGO

Department of Statistics

## STATISTICS COLLOQUIUM

*Joint Seminar with The University of Chicago Booth School of Business*

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### Multiple Hypothesis Testing with a Human In-The-Loop

MONDAY, February 19, 2018, at 4:30 PM

133 Eckhart Hall, 5734 S. University Avenue

*Refreshments before the seminar at 4:00 PM in Jones 111*

### ABSTRACT

We propose a general framework based on *selectively traversed accumulation rules* (STAR) for interactive “human-in-the-loop” multiple testing with generic structural constraints on the rejection set. STAR combines accumulation tests from ordered multiple testing with data-carving ideas from post-selection inference, allowing for highly flexible adaptation to generic structural information. Given independent  $p$ -values for each of  $n$  null hypotheses, STAR defines an iterative protocol for gradually pruning a candidate rejection set, beginning with  $\mathcal{R}_0 = [n]$  and shrinking with each step. At step  $t$ , the analyst estimates the false discovery proportion (FDP) of the current rejection set  $\mathcal{R}_t$ , and halts and rejects every  $H_i$  with  $i \in \mathcal{R}_t$  if  $\widehat{FDP}_t \leq \alpha$ . Otherwise, the analyst may shrink the rejection set to  $\mathcal{R}_{t+1} \subseteq \mathcal{R}_t$  however she wants, provided the choice depends only on partially masked  $p$ -values  $g(p_i)$  for  $i \in \mathcal{R}_t$ , as well as unmasked  $p$ -values  $p_i$  for  $i \notin \mathcal{R}_t$ . Typically, the choice will be based on eliminating the “least promising” hypothesis from  $\mathcal{R}_t$ , after estimating a model from the observable data. By restricting the information available to the analyst, our iterative protocol guarantees exact false discovery rate (FDR) control at level  $\alpha$  in finite samples, for any data-adaptive update rule the analyst may choose. We suggest heuristic update rules for a variety of applications with complex structural constraints, show that STAR performs well for problems ranging from convex region detection and bump-hunting to FDR control on trees and DAGs, and show how to extend STAR to regression problems where knockoff statistics are available in lieu of  $p$ -values.

**Keywords:** interactive multiple testing, data carving, knockoffs, FDR control  
Joint work with Lihua Lei, Will Fithian, and Eugene Katsevich

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