# PROVIDENCE: an Efficient and Secure Ballot Polling Risk-Limiting Audit

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### Election security

#### What do we want?

▶ The right winner and strong evidence that they are the right winner

- ► Software independent
  - ► Configuration errors, bugs, hacking

# Election security

#### An approach<sup>1</sup>:





verifiedvoting.org

Compliance audits and tabulation audits

<sup>&</sup>lt;sup>1</sup>Strongly supported by a report of the National Academy of Sciences and the Voluntary Voting Systems Guidelines, the closest we have to standards for election technology.

#### Our Contributions

- ▶ Rigorous tabulation audit (risk-limiting audit) PROVIDENCE, the most efficient and secure of its kind
- Open source implementation, included in Arlo, most popular audit software
- ▶ Pilot use of Providence in the city of Providence, Rhode Island in 2022
- ► Comparison of Providence with other ballot polling RLAs with new workload models

 ${\sf Background}$ 

# Risk-Limiting Audits (RLAs)

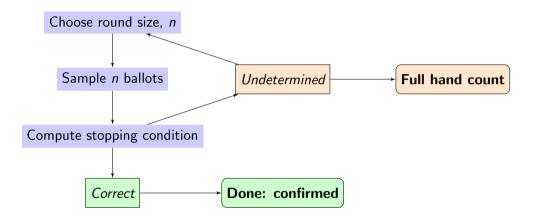
Assumption: successfully completed compliance audits

**Risk-Limiting Audit (RLA) with risk limit**  $\alpha$ : A tabulation audit that, if the reported outcome is wrong, will detect and correct it with probability at least  $1 - \alpha$ .

Small  $\alpha$  is good.

The **stopping probability** for a given sample is the probability that—given the reported outcome is correct—the audit confirms the result. Large stopping probabilities are good.

## Ballot Polling RLAs



# Existing ballot polling RLAs

#### Bravo

- ► Theory: the most efficient RLA (requires the smallest expected number of ballots) when ballots are sampled one at a time (ballot-by-ballot).
- Practice: in real audits, decisions are taken after many ballots are drawn (round-by-round).

#### Minerva

- Recent RLA designed for round-by-round use.
- ▶ In a first round chosen to give a typical 0.90 stopping probability, MINERVA requires
  - ▶ 50-80% as many ballots as BRAVO.
- Proven to be risk-limiting if all round sizes are predetermined, before the audit begins.

#### Problems We Will Address

- 1. Predetermined round sizes give inflexible audits
  - ▶ May be more efficient to choose future round sizes as a function of previous samples
- 2. Existing workload measures don't capture the cost of a round
  - ▶ We are unaware of any RLAs that have ever actually drawn a single ballot at a time

Our work

# The Adversary in an RLA

#### Definition ( $\alpha$ -RLA)

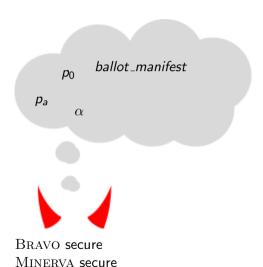
An audit A is an  $\alpha$ -RLA if for samples  $X \in \mathcal{X}$ 

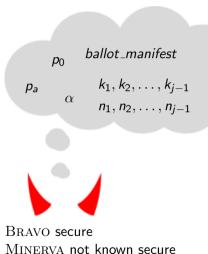
$$\Pr[\mathcal{A}(X) = Correct \mid H_0] \leq \alpha,$$

where  $H_0$  corresponds to the incorrectly reported outcome *closest* to the reported outcome (i.e. a tie)

Adversarial goal: to increase the risk above  $\alpha$ 

$$\Pr[\mathcal{A}(X) = \text{Correct} \mid H_0] > \alpha$$

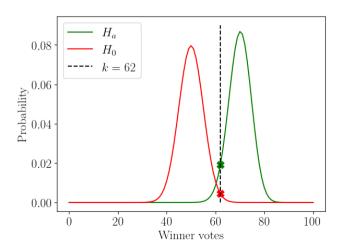




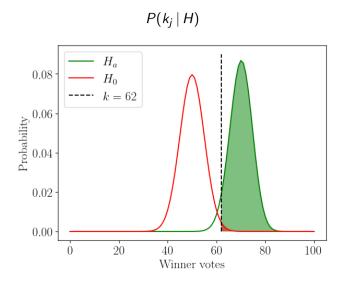
<sup>&</sup>lt;sup>2</sup>Adversary names thanks to our anonymous *USENIX Security* shepherd.

### Bravo



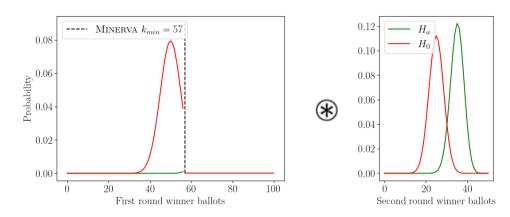


### MINERVA



## How Minerva proceeds

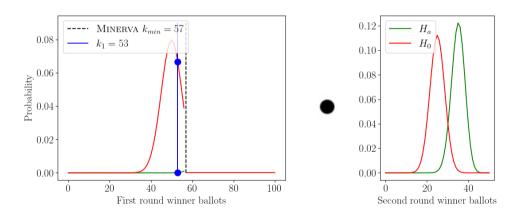
$$P(k_2 \wedge K_1 \leq k_{min,1} | H, n_1) =$$



Implicitly assumes that  $n_2$  is the same for all  $k_1$ 

# How Providence proceeds

$$P(k_2 \wedge k_1|H) =$$



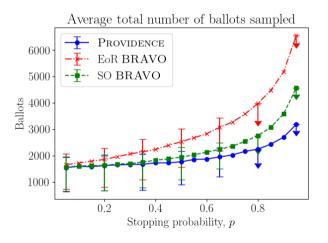
# PROVIDENCE Properties

- ▶ Risk-Limiting in the presence of a strongly-round choosing adversary<sup>3</sup>
- ► Efficiency comparable to MINERVA, shown through simulations

<sup>&</sup>lt;sup>3</sup>Arkady Yerukhimovich points out that random seeds should be freshly generated at the start of each round so that adversaries do not know which ballots will be drawn in a round before they choose the round size.

#### 2016 Presidential contest in VA

 $\mathsf{Margin} \approx 0.053$ 



#### Workload

With a round cost:

$$W(E_b, E_r) = E_b c_b + E_r c_r$$

 $E_b$ : expected number of ballots

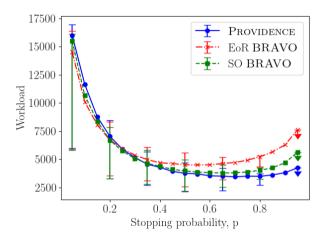
 $E_r$ : expected number of rounds

 $c_b$ : per ballot cost

 $c_r$ : per round cost

#### Workload

$$W(E_b, E_r) = E_b c_b + E_r c_r$$
 with  $c_b = 1$  and  $c_r = 1000$ 



#### Conclusion

- ► PROVIDENCE: efficient and flexible
- Introduction of workload models accounting for the cost of a round
- Other round-size considerations (misleading samples and per-precinct cost)
- Piloted in the city of Providence, Rhode Island
- Implemented in Arlo, most commonly used RLA software

Thank you