



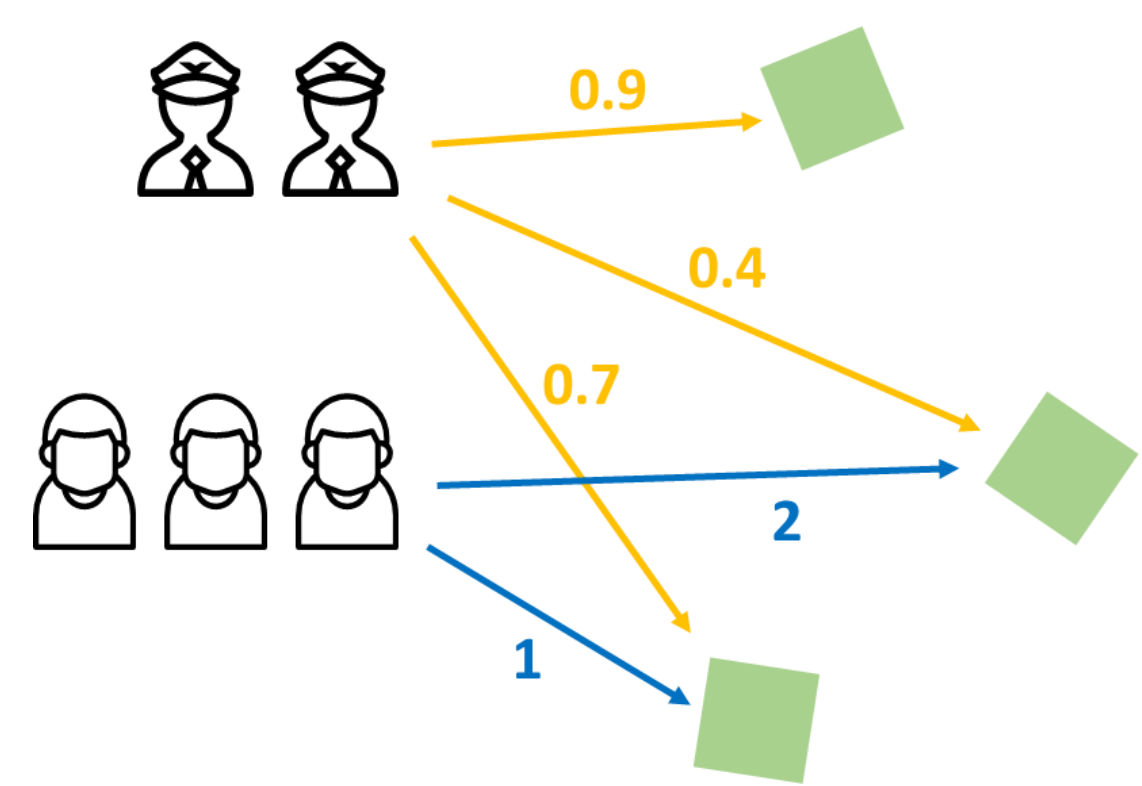
# Improving Community-Participated Patrol for Anti-Poaching



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## Resources Allocation of Community Participated Patrol



**Professional rangers:** distribute efforts among **multiple targets**

**Community members:** patrol **a single target**

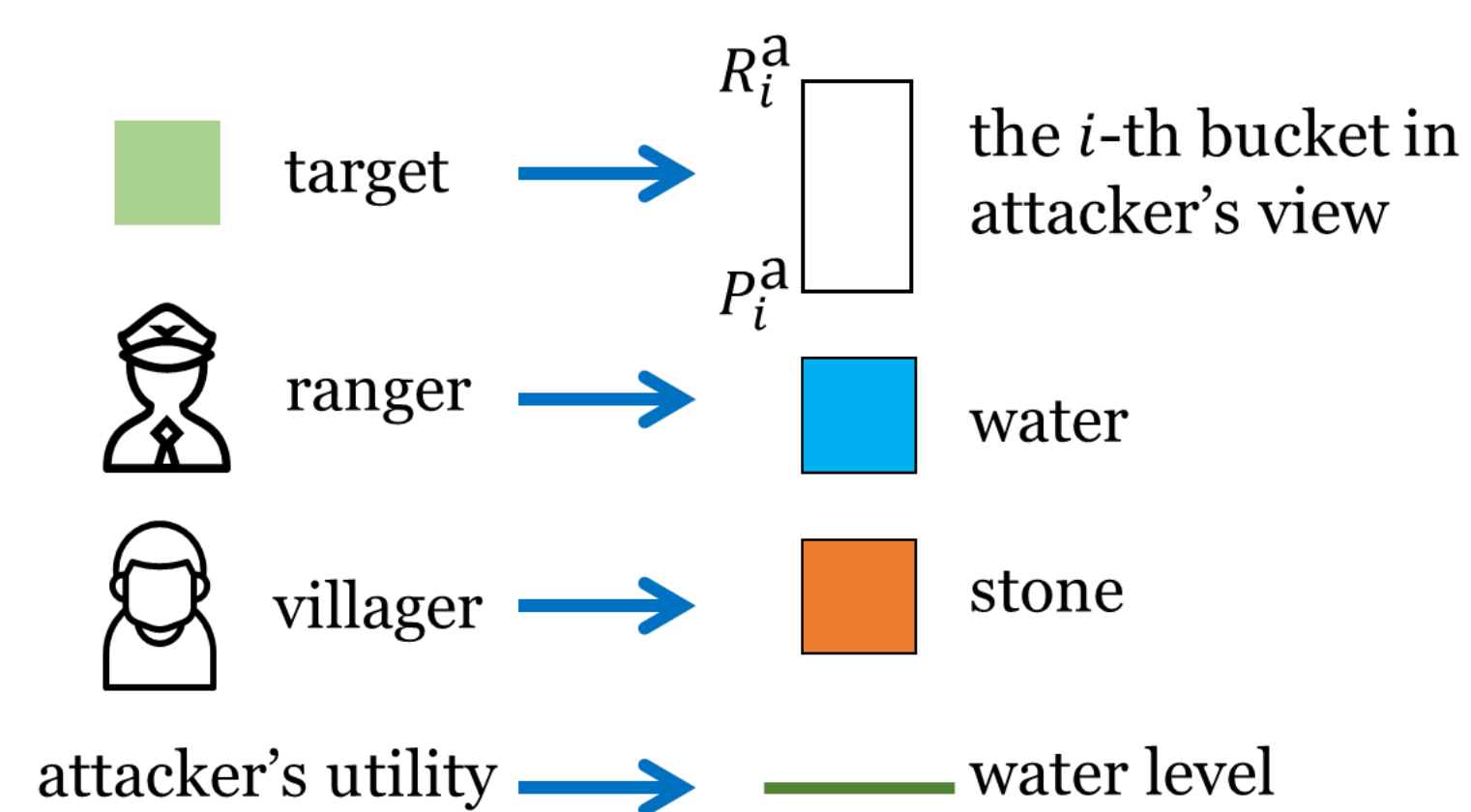
**Goal:** maximize the defenders' expected utility by adjusting defensive strategy

## Mixed-Integer Linear Program Solution

Stackelberg Game:

Integer Constraint → MILP → Exponential Time

## Monotonicity

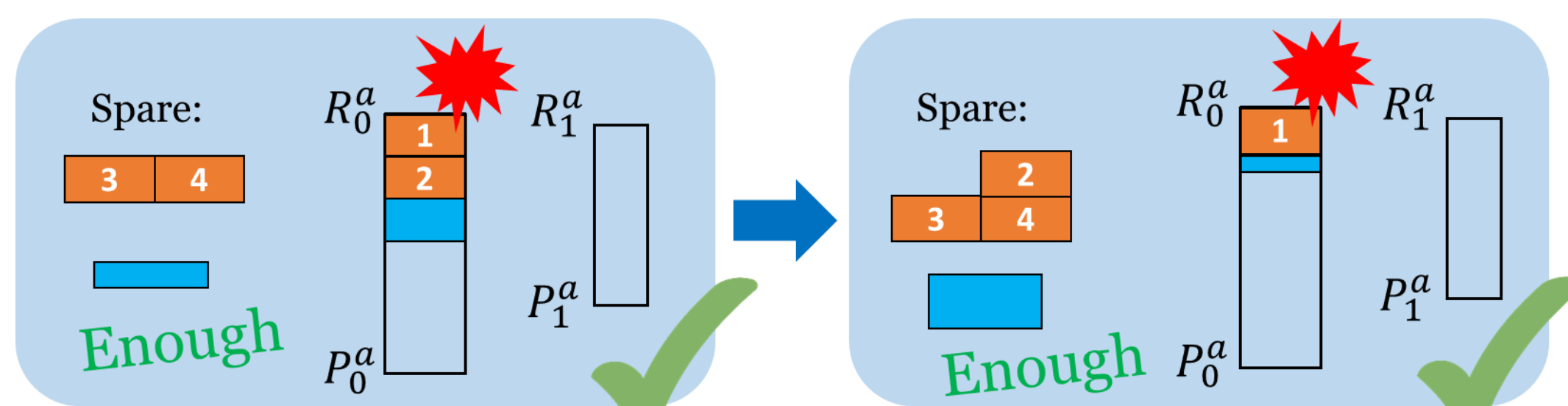


**Stone:** thrown into buckets as a whole

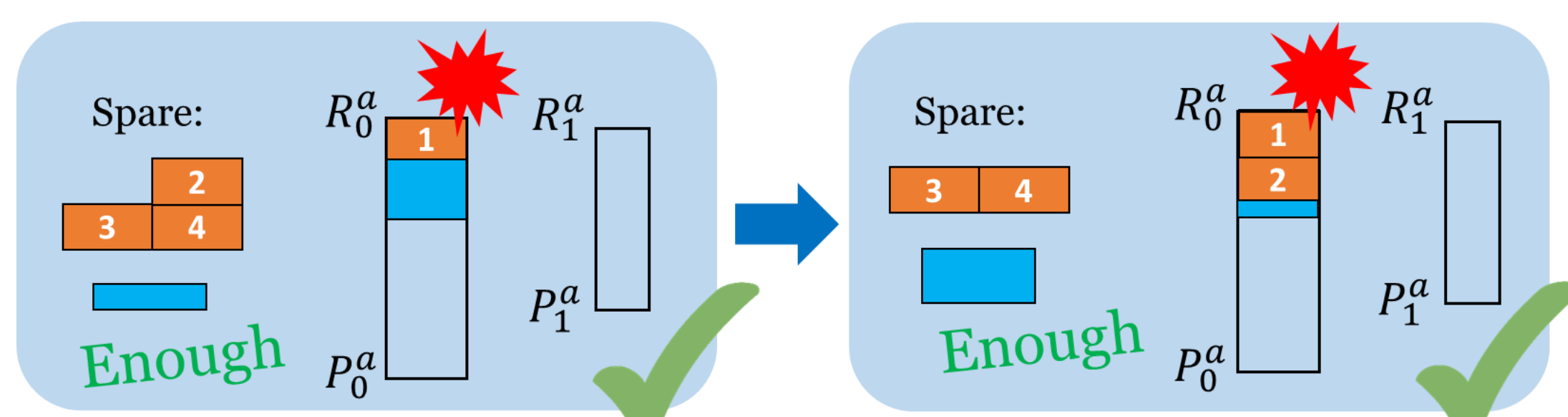
**Water:** poured into buckets at will

**Goal:** Adjust resources to **lower** the water level of bucket  $i^*$  (the one with the **highest** water level)

**Lemma:** When bucket  $i^*$  is chosen to be attacked, **reducing its stones and water** still allows a defensive strategy that makes it be attacked.

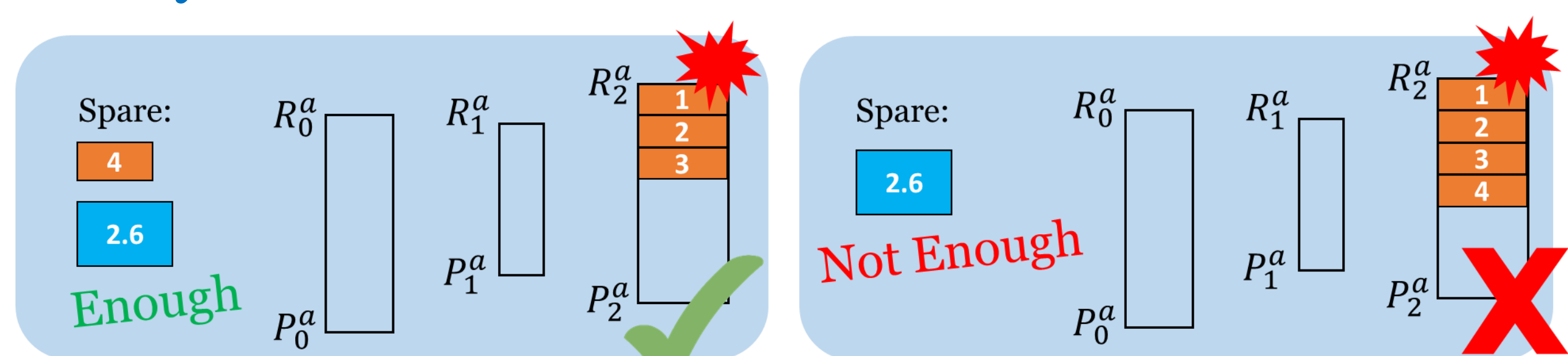


**Lemma:** When bucket  $i^*$  is chosen to be attacked, **replacing its water with stones of equal volume** still allows a defensive strategy that makes it be attacked.

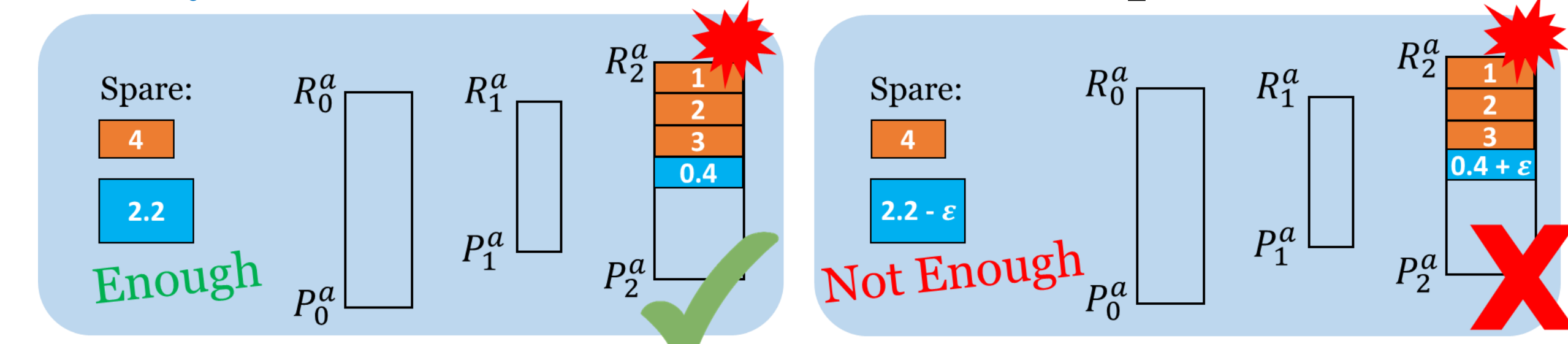


## Two-Dimensional Binary Search

1. Iterate over all buckets as the attacked bucket  $i^*$
2. Binary search on the max number of stones thrown into  $i^*$



3. Binary search on the amount of water poured into  $i^*$



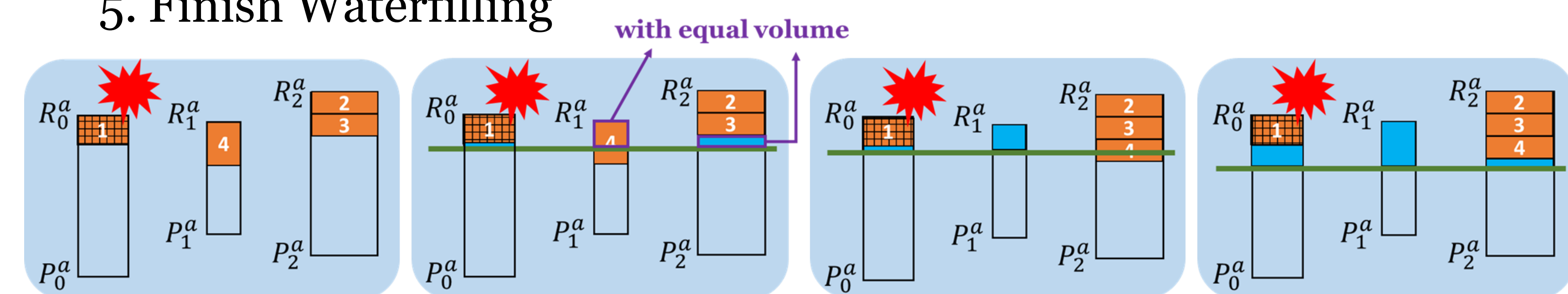
To any desired accuracy

Complexity:  $O(n^2 \log \frac{M}{\epsilon})$

$M$  is the maximum absolute reward or penalty

## Hybrid Waterfilling

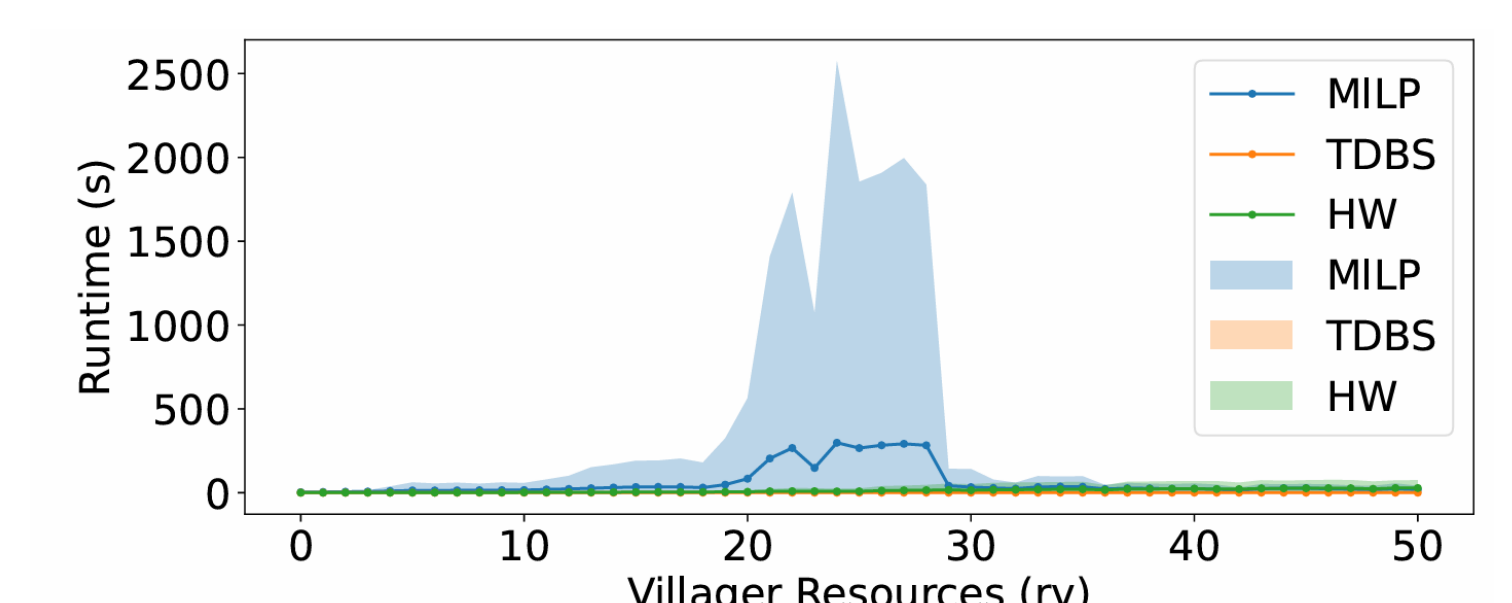
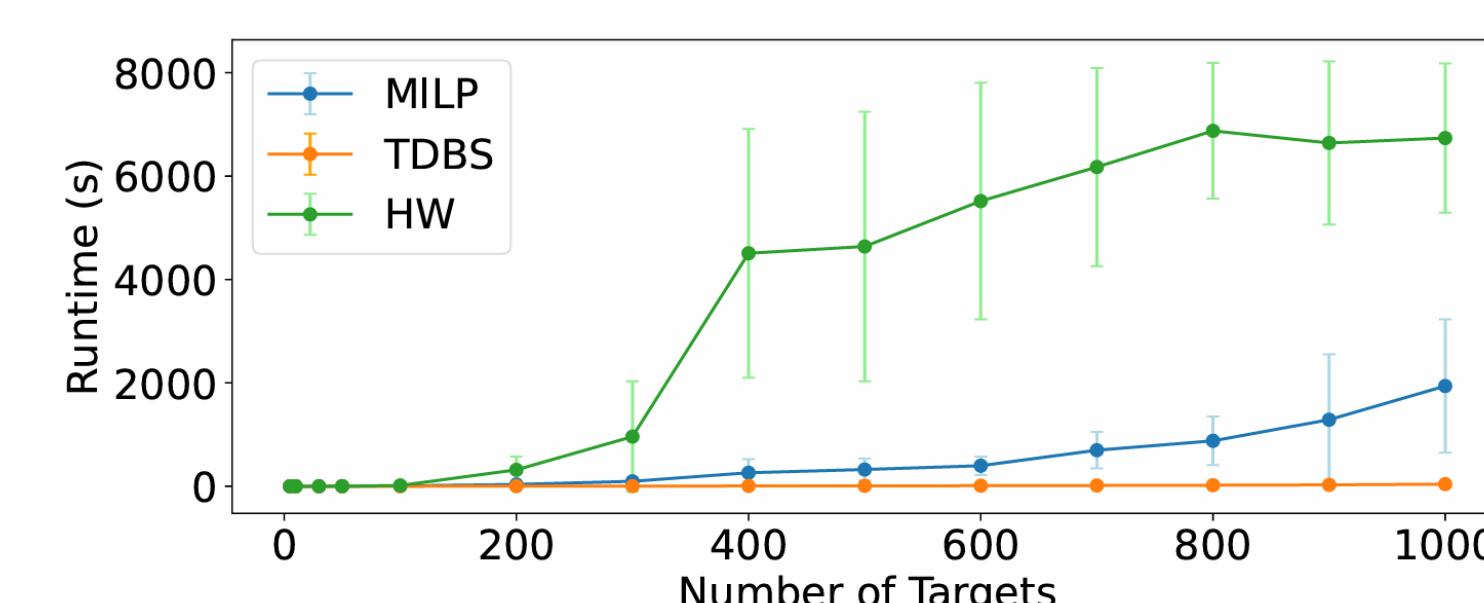
1. Iterate over all buckets as the attacked bucket  $i^*$
2. Binary search on the max number of stones thrown into  $i^*$
3. Greedy for spare stones
4. Waterfilling to a critical point and trigger a swap
5. Finish Waterfilling



Exact

Complexity:  $O(n^4 \log n)$

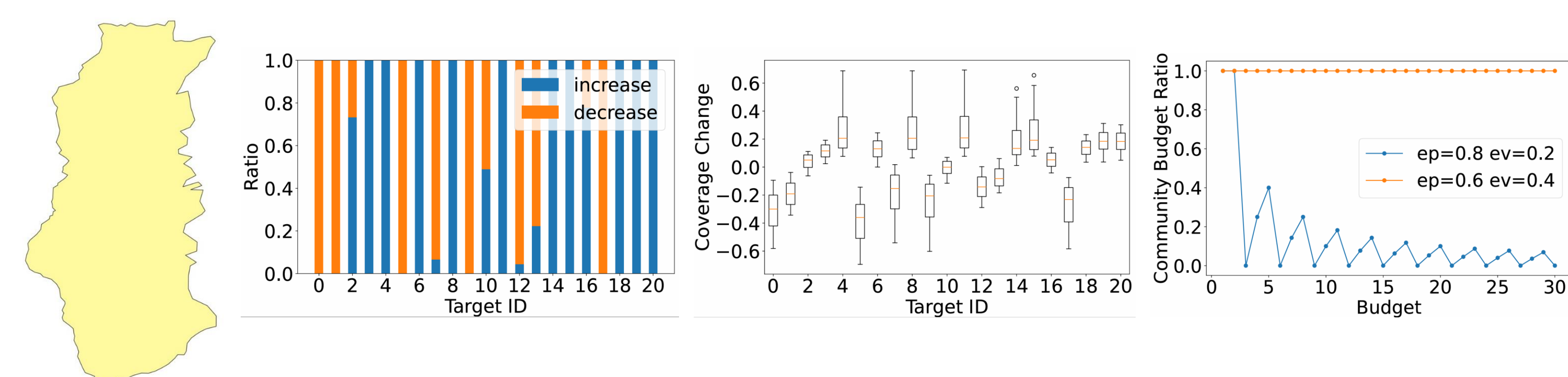
## Experiments



1. The runtime of TDBS is **significantly lower**.
2. TDBS results at precision  $10^{-3}$  are **accurate enough** for practical use.
3. The performance of TDBS and HW are **more stable** than MILP.

## Case Study

We applied RACPP to a protected area in Northeast China



1. If the generated defensive strategies are followed, defenders' utility is expected to improve **25.9%-152.6%**, with an average of **83.1%**.
2. When there are extra funds to recruit more rangers or villagers, defenders should decide based on their **cost-effectiveness ratio**.