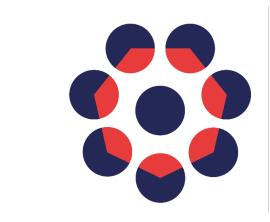
HAaC-ER: A Disaster Response System Based on Human-Agent Collectives Institution Institution Institution

Sarvapali D Ramchurn, Trung Dong Huynh, Edwin Simpson, Yuki Ikuno, Wenchao Jiang, Joel E. Fischer, Steven Reece, Jack Flann, Feng Wu, Luc Moreau, Stephen J. Roberts, Tom Rodden, Nicholas R Jennings

### КК **Physical Sciences Research Council**



UKRI Trustworthy Autonomous **Systems Hub** 

## **The Four Pillars of Human-Agent Collectives**



 $\left( \cdot \circ \cdot \right)$ 

#### **Flexible Autonomy**

• Control shifts dynamically between human and agent(s).

Engineering and

• Hand-over points defined through interaction design rather than pre-scripted.

#### Agile Teaming

- Teams of humans and agents form dynamically.
- Human or agent may be in charge of different teams.
- Teams change as per the needs of the task at hand.

#### **Incentive Engineering**

- Humans and agents need to be incentivised to take action.
- Incentives typically chosen to maximise social welfare.

## Human-Agent Collectives for Disaster Response

## CrowdScanner



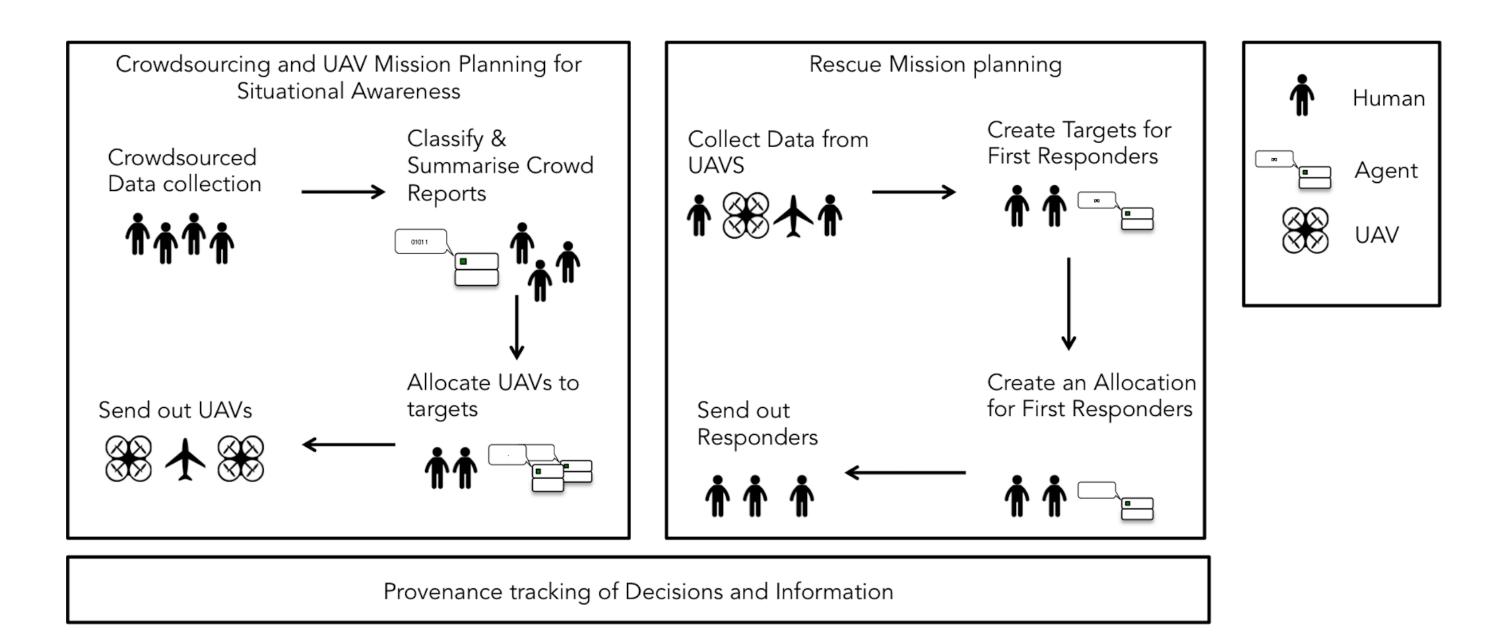


Emergency responders face numerous challenges in gathering situational awareness and responding to emergencies.

#### HAC-ER solves the following problems:

- Providing situational awareness from potentially inaccurate crowdsourced reports
- Coordinating multiple UAVs to identify • casualties

# **The OODA Loop in HAC-ER**



#### **Crowd Report Interpretation**

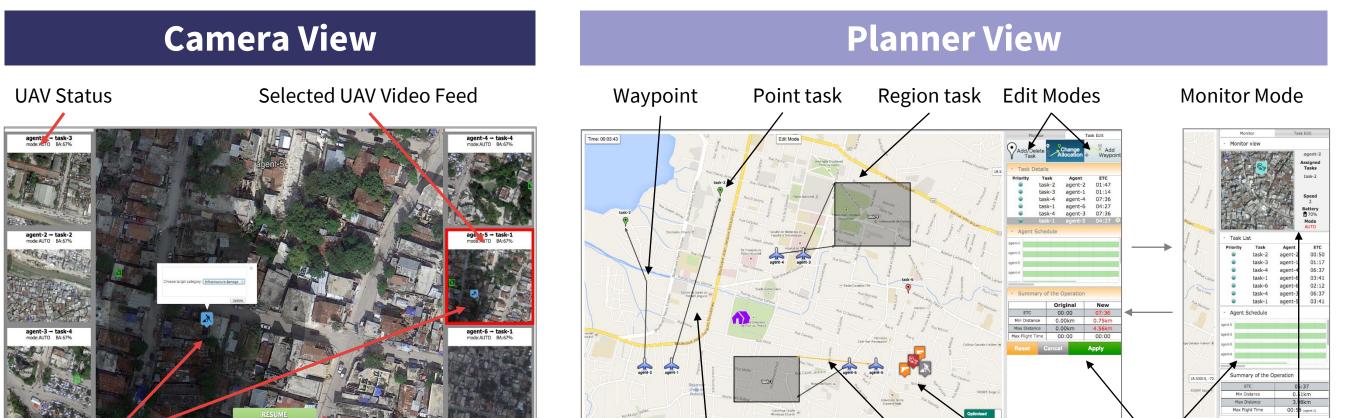
- Online (imperfect) Crowds + Machine Learning (BCC+ NLP)
- Hire+Fire algorithm to recruit the best workers and get the best interpretation

#### Heatmap creation

- Gaussian Process to model disaster
- Use classification output to generate • intensity
- Heatmap of targets can then be used by UAV/Human Teams to prioritise areas



### **Multi-UAV Controller**



Two loops interleaving human and machine decision making:

- **Crowdscanner**: human-machine collaboration for report classification and heatmap generation.
- Multi-UAV controller: flexible autonomy for human-machine task allocation to multiple UAVs
- AtomicOrchid: human-agent task planning for live deployments



Max-sum Manual Cluster of UAV Unidentified Resume Plan Allocation Detected Allocation status Target /Stop status (black line) Targets (orange line)

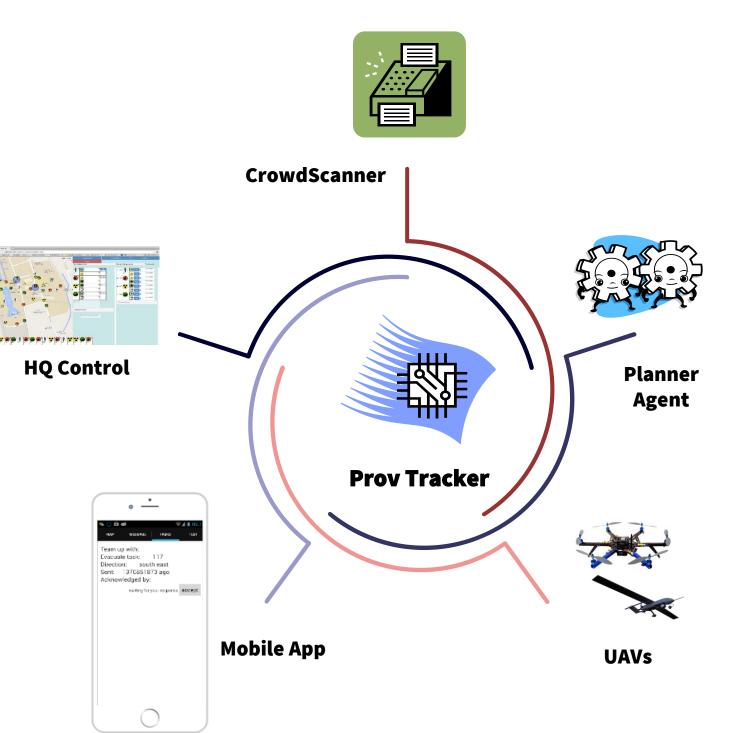
Humans prioritise targets to gather 1<sup>st</sup> hand information and UAVs run max-sum for target allocation. Flexible autonomy interfaces for humanagent interaction:

- Humans confirm targets through camera view (and teleoperate if needed)
- Correct max-sum plans
- React to UAV drop-outs through mixed-initiative re-planning
- Transfer of control between Silver, UAVs, and Bronze operators
- UAVs Targets confirmed for Responders to be deployed
- Trialled with 40 participants (IJCAI to appear)

# **Mixed-Initiative Task Allocation**

### **Prov-Tracker**

### **Post-hoc analysis**



Human-Agent Silver team allocate tasks to Bronze responder team Agent uses Multi-agent Markov Decision Process • Computes best task for each responder, and best path for each task





- Learning from what happened
- Identifying best practices, dependencies, etc.

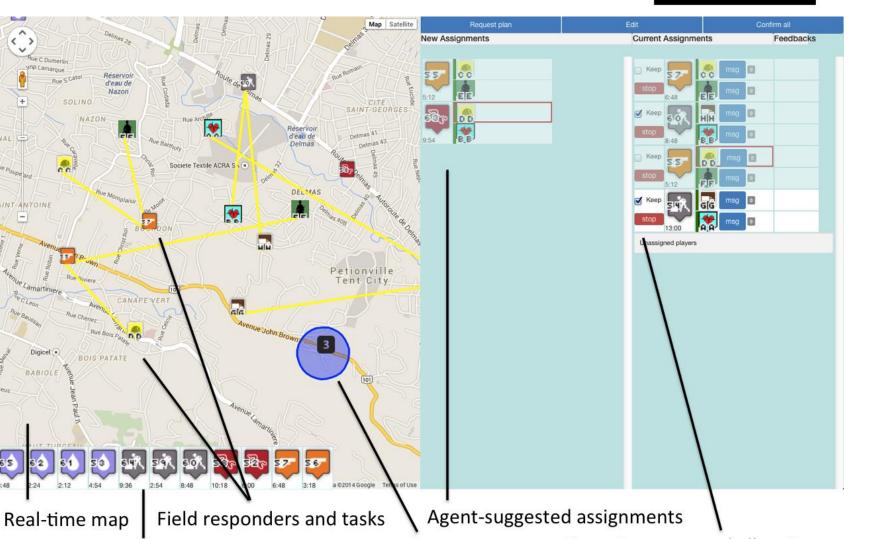
### **Provenance Analytics**

- Machine learning to identify patterns in provenance
- Identifying instruction messages (78% accuracy)

### **Timely Decision Support**

- Live monitoring of provenance for changes
- Ensures the whole system  $\bullet$ reacts to changes

- Takes into account task deadlines
- Models environment (buildings and lakes are obstacles)



Drop-off zone Operator-approved allocations Tasks list with deadlines





**Crisis and Disaster Response**