The System Modeling and Analysis of **Resiliency in STEReO** (SMARt-STEReO) Seguoia Andrade^{1, 2} Eleni Spirakis² Daniel Hulse³, Hannah Walsh³, and Misty Davies³

HX5 LLC.¹; USRA²; NASA Ames Research Center³

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Motivation



- Wildfires increasing in size and number from 1984-2011 [2]
- Aerial Firefighting and suppression:
 - Account for 26% of firefighter deaths from 2000-2013[3]
- STEReO: Scalable Traffic for Emergency Response Operations
 - Leverage new technology to improve safety and performance



Introduction and Background

- Resilience: prevention, adaption, and recovery
- Existing Models: BehavePlus, FARSITE, DEVS-FIRE, etc.
- SMARt-STEReO Model: integrated fire propagation and suppression model, allows for resilience analysis and inclusion of emerging operations, such as UAS



Model Development: Wildfire Operations

- Present Day Wildfire Response:
 - Airplanes airtankers, aerial supervisor, surveillance
 - Helicopters surveillance, drops, delivery
 - Engines direct attack, dust abatement, refills
 - Dozers fire line construction
 - Ground Crews fire line construction
 - Comms radio, line-of-sight

Emerging Fire Fighting: STEReO



Model Development: Outputs





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Model Development: Outputs





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Research Questions: Q1-Q3

- Q1. What is the appropriate scope of applications that the model is currently verified and valid for?
- ≻ Q2.
 - a) Is there a difference in performance, in terms of metrics such as acres burned, when UAS is added into wildfire response?
 - b) If so, is this difference apparent in both nominal and off-nominal conditions?
- ≻ Q3.

- a) Does the addition of UAS in wildfire response increase resilience in the system in response to an individual fault?
- b) If so, what is the effect size?



Verification and Validation Efforts: Q1

Fire propagation:Windspeed, slope

- Suppression Verification
 - State awareness, rate of fire line construction, rate of injury, assets



Experimental Analysis: Set-up

- Monte Carlo simulation for 2,000 grids with random fuel distribution
- > Injection of 2 separate faults at t=20:
 - Major: major mechanical failure to aerial supervisor
 - Minor: critical tool breaking for ground crew1
- Performance measured in acres burned

> Resilience:

10

Nominal_{acres burned} – Faulty_{acres burned}





Experimental Analysis: Q2

Q2: Is there a difference in performance when UAS is added?

- > Major fault:
 - Fault → more acres burned compared to nominal (F=1538.7; P<0.001***)</p>
 - ➤ UAS → fewer acres burned compared to baseline (F = 170.8; P < 0.001^{***})
 - > UAS + faulty or nominal \rightarrow fewer acres burned (F = 39.9; P < 0.001^{***})





Experimental Analysis: Q2

Q2: Is there a difference in performance when UAS is added?

- Minor Fault
 - ➤ Fault → no significant difference in acres burned compared to nominal (F=0.1116; P=0.733)
 - ► UAS → fewer acres burned compared to baseline (F = 117.7; P < 0.001***)</p>
 - ➤ UAS + faulty or nominal → no significant difference in acres burned (F = 0.095; P=0.758)





Experimental Analysis: Q3

Q3: Does the addition of UAS increase resilience?

- > Major fault:
 - > UAS \rightarrow increased resilience
 - > $(T = -6.315, p < 0.001^{***}, d = 0.183)$
- Minor fault:
 - No significant difference
 - (T = -0.309, p > 0.05, Cohen's d = 0.010)





Discussion

- > Q1: model is sufficient for these experiments
- Q2: Performance gains from UAS; etc., generalize over fault scenarios
- Q3: Resilience gains from UAS depend on the severity of the fault injected.

type of fault	model name	total% burned	total% fire	edges % burned	edges % fire	acres burned
major fault	baseline	-6.310 ± 9.110	-0.903 ± 3.241	-5.329 ± 7.833	-1.006 ± 3.294	-62.830 ± 90.801
major fault	with UAS	-4.807 ± 7.450	-0.817 ± 2.973	-2.955 ± 5.946	-0.520 ± 2.406	-47.665 ± 73.864
minor fault	baseline	-0.028 ± 2.743	-0.040 ± 1.393	-0.226 ± 3.093	-0.033 ± 1.309	-0.269 ± 27.327
minor fault	with UAS	-0.004 ± 2.524	0.010 ± 1.459	-0.295 ± 2.939	-0.083 ± 1.204	-0.017 ± 25.063



Conclusions and Future Work

- Developed integrated model of fire propagation and response with ability to simulate:
 - Performance of operational concepts under a wide range of scenarios
 - Performance of operational concepts under faults for resilience quantification

- Limitations and Future Work:
 - Ongoing verification and validation efforts
 - Model improvements
 - Different types of resiliency analysis
 - Adaptive stress testing



Contact Information

Emails:

- Sequoia.r.Andrade@nasa.gov
- Sequoiaandrade@gmail.com
- spirakis@stanford.edu
- <u>daniel.e.hulse@nasa.gov</u>
- hannah.s.walsh@nasa.gov
- ➢ misty.d.davies@nasa.gov

- Additional Resources:
 - SMARt-STEReO ConOps: <u>https://ntrs.nasa.gov/citations/20205</u> 007665
 - SMARt-STEReO Model Description: <u>https://ntrs.nasa.gov/citations/20205</u> 007481
 - Fmdtools: <u>https://github.com/DesignEngrLab/f</u> <u>mdtools</u>
 - Robust Software Engineering:

https://ti.arc.nasa.gov/tech/rse/



References

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- [2] Dennison, P. E., S. C. Brewer, J. D. Arnold, and M. A. Moritz (2014), Large wildfire trends in the western United States, 1984–2011, Geophys. Res. Lett., 41, 2928–2933, doi:10.1002/2014GL059576.
- [3] C. R. Butler, M. B. O'Connor and J. M. Lincoln, "Aviation-Related Wildland Firefighter Fatalities — United States, 2000–2013," Morbidity and Mortality Weekly Report (MMWR), vol. 64, no. 29, pp. 793-796, 2015.





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