SMAC-FIRE: Closed-Loop Sensing, **Modeling and Communications for WildFIRE** A. Lee Swindlehurst, Alec Petersen, Tirtha Banerjee, Hamid Jafarkani (UC Irvine), Ahmed Eltawil (KAUST) Janice Coen (Nat'l Center for Atmospheric Research), Zak Kassas (Ohio State) Cyber-Physical Systems Principal Investigator's Meeting – November 8-9, 2022

<u>Challenge</u>: Integrate UAVs, sensors, wildfire models, communications infrastructure for: <u>Solutions</u>: Current fire models & communication needs \Rightarrow sensor deployment, closed-loop UAV path planning. UAV/sensor data (hot-spot localization, ember tracking, perimeter monitoring, etc) \Rightarrow fire model updates.



A Reinforcement Learning Approach for



Path Planning in Wildland Burn Environments

Start#2

<u>Weathe</u>

idded (5-25 km

atmospheric

analyses or

forecast

<u>Convective-scale</u>

weather mode

simulates the atmospheric state

over complex terrain

in nested domains

that refine from 10 -

0.1 km grid spacing

Evolving fine

scale airflow

Fire-induced

winds and fire

phenomena

Fire energy

release rate

For a specified target position and orientation of the UAS, the objective



CAWFE[®] Modeling System

Coupled Numerical Weather Prediction –

Wildland Fire Model

Simulation of weather at 100s of m + fire behavior

Wind components

relative humidity

Sensible and latent

heat fluxes + smoke

Spatial map of

fuel models

Dead and live fuel

fuel moisture

<u>Terrair</u>

<u>elevation</u>

30 - 1/3 arc

Fire

gnition location

and time

or spatial fire

map

Fire behavior

<u>model</u>

calculates surface fire

spread rate, fuel

consumption rate,

crown fire initiation,

crown fire spread rate,

smoke production

Evolving fire

perimeter

Smoke

production,

plume, and transport that

varies with fire

behavior

- Issues: Visibility due to forest canopy, calibration/alignment of multiple LiDAR cameras
- pile burn data used for particle image velocimetry on embers
- ember tracking: one key to longer range fire spread

- characterized ember size, shape & density from real fuels - identified shortcomings of ember generation & lofting models
- **Operational Firebrand Models vs. Observations**



Larger embers display a greater variation in shape Large embers resemble irregular polygons with added noise Ember shape models could incorporate a mixture of spheres, disks and cylinders





Operational models rely on stead-state mean plume eqns. We measure high intermittency in ember velocities, especially early in the fire—turbulence and plume time-dependence is important



heat release rate and don't account for intermittency However we observe extreme intermittency in the ember count time-series There is no correlation between the fluctuating components of the flame height (i.e. HRR) and the ember Ember generation mechanisms not wholly coupled to the



- CPS tools developed here can support disaster management for other applications in remote, harsh environments
- Wildfire management & incident response is a huge problem in the western U.S., better

f(x) - non-linear fire propagation model

communication connectivity and more accurate fire prediction models can save hundreds

- of lives and millions of \$\$ in property damage
- K-12 "Game of Drones" activity

Outreach Activities:

- Boulder County Firefighter refresher course
- Orange County Firefighter Association drone training



Future Directions: Autonomous coordination of multiple drones, maintaining connectivity, handling large data volumes, real-time data flow to command center

Optimizing UAV trajectory, power allocation, and sensing while keeping communication interference at bay and minimizing energy consumption

 $\kappa = 60.5$

 $\kappa = 3.15$

- What is the best mechanism for using UAV/sensor data to inform fire behavior model?
- Parsing the large data sets is a challenge, as is calibration especially for optical (LiDAR) cameras
- Ember generation & flow model must be incorporated into fire behavior models
- Localized measurement of wind speed and direction is important for fire prediction, how to do this over a large area with few drones?

Noisy UAV observations Missing observations replaced with interpolation Predicted perimeter (simulation model) Predicted perimeter (ensemble KF, data assimilation)



