



# **AGNI-NAR: AN ASYNCHRONOUS GRAPH MODEL FOR SIMULATING BUILT ENVIRONMENT DAMAGE IN THE WILDLAND URBAN INTERFACE**

**Hussam Mahmoud**

**George T. Abell Professor in Infrastructure**

**Department of Civil and Environmental Engineering  
Colorado State University**



- **Motivations**
- **Vulnerability**
- **Damage Assessment**
- **Communicating Risk**
- **Discussion and Future Work**
- **Questions**



# Motivation

*Large Losses and Probabilistic Risk Assessment*

# Wildfires as a Global Issue

- Yearly expenditures on managing wildfires exceed US\$1 billion
- Current fire suppression tactics of wildland fires have led to a rise in the frequency of high-intensity fires

Wildfires are a part of nature, and we simply need to co-exist with fires



2025 Palisades Fire in LA (photo credit: David

How fires propagate in communities is largely unknown

Mahmoud (2023), *Nature*



Increase in frequency of extreme fire events and population living in the Wildland Urban Interface (WUI) regions



- Every community has specific characteristics – *‘One size fits all solution is probably not the most optimal approach’*



- Need tools/models to better understand fire behavior in extreme events and its impact on communities



- Developing effective fire mitigation strategies for communities require appropriate modeling frameworks



The developed tools need to be computational friendly such that they can be utilized with minimal data and in real-time

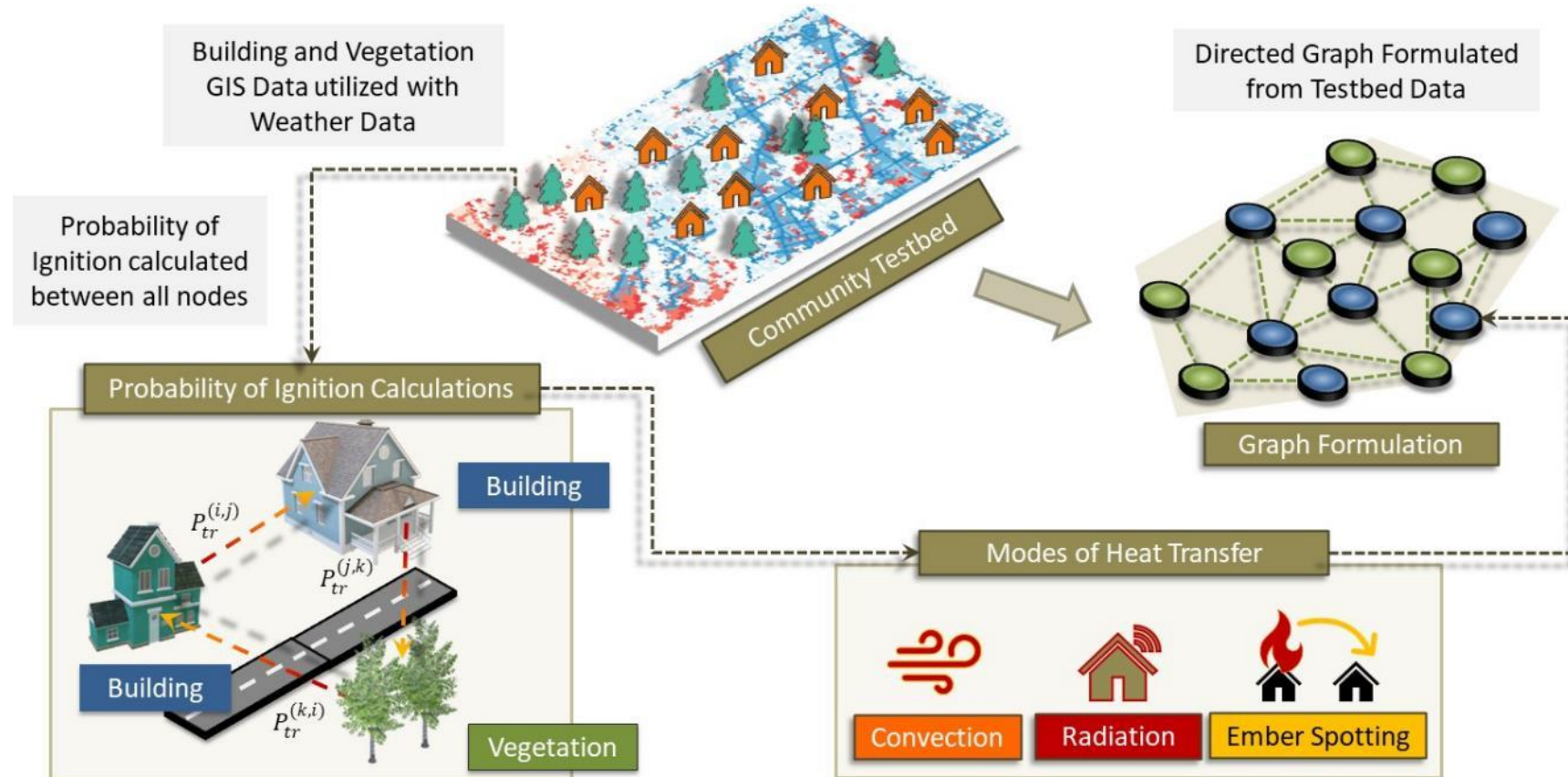
*The pressing need lies in exploring alternative directions to quantify WUI risk of communities*



## **Vulnerability**

*Wildland and Community Propagation Models*

# Graph Theory Application (1)

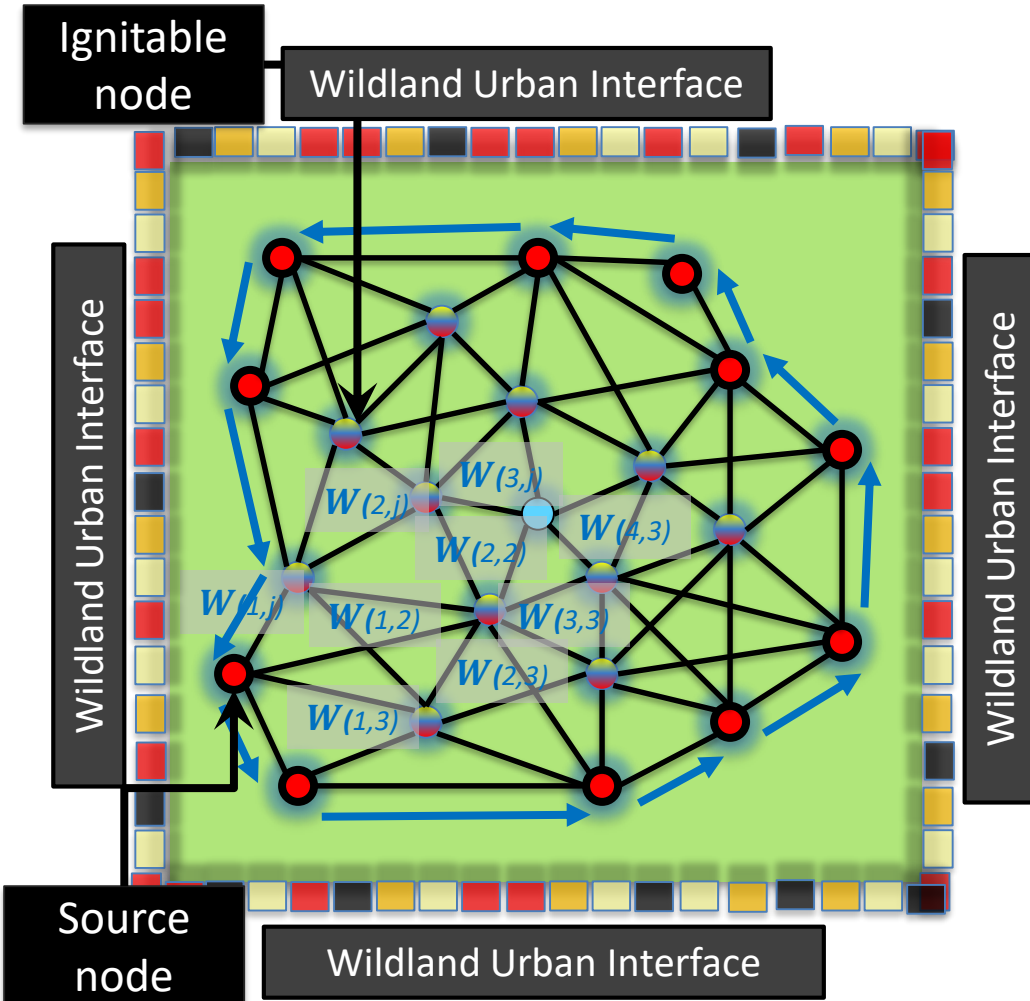


- **Two analysis can be conducted with the AGNI-NAR model**
  - Most probable path to calculate the fire boundary.
  - Relative vulnerability to determine likelihood of damage for a given fire boundary.

# Graph Theory Application (2)

*Discontinuous Fuels inside Communities !*

*Discontinuous Propagation inside Communities !*



Step 1

Identify ignitable objects and boundary nodes to develop corresponding graph

Step 2

Calculate weights ( $W(a,b)$ ) for each edge

Step 3

Identify most probable paths

Step 4

Calculate probability of ignition ( $P_i$ ) from most probable paths for each boundary node



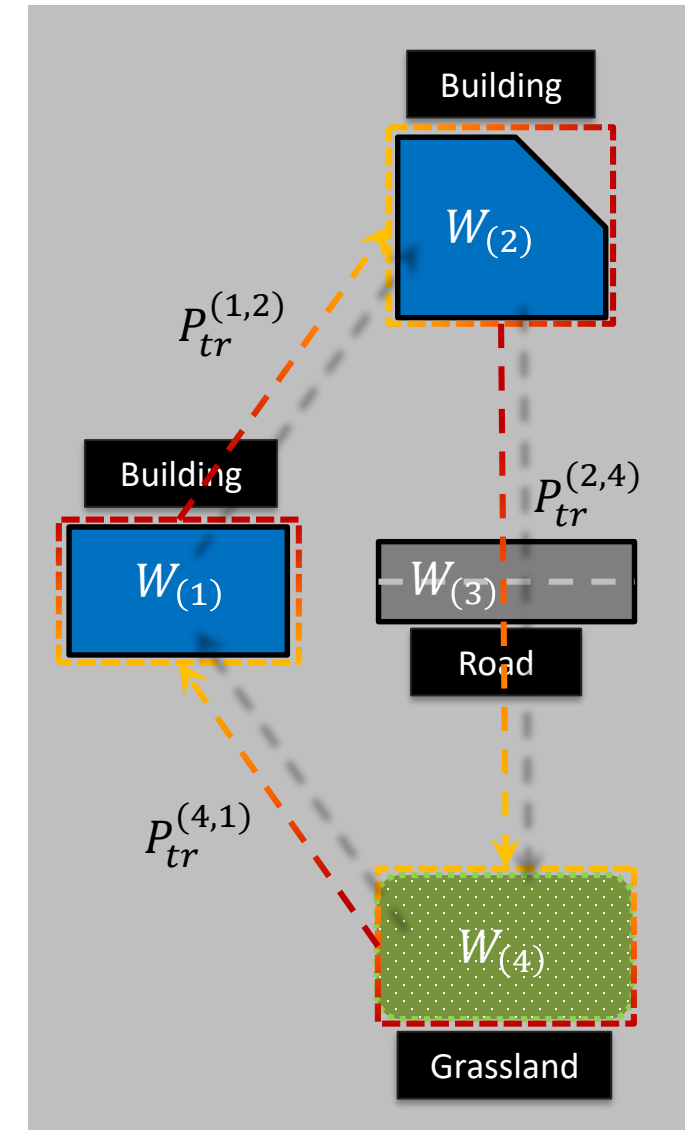
# Probability of Ignition

- Each node classified into '**Ignitable**' or '**Non-Ignitable**'
- Probability of ignition between 2 nodes defined as

$$P_{tr}^{(i,j)} = \begin{cases} \min(P_{total}^{(i,j)}, 1) & \text{if } \{j \neq W_{(m)} : i = W_{(m)}\}_{m \in \mathbb{R}} \\ P_{cond}^{(i,j)} & \text{if } \{j = W_{(m)} : i = W_{(m)}\}_{m \in \mathbb{R}} \end{cases}$$

$$P_{total}^{(i,j)} = (P_{conv}^{(i,j)} \cup P_{rad}^{(i,j)} \cup P_{ember}^{(i,j)})$$

$P_{conv}^{(i,j)}$  = Probability of ignition due to Convection  
 $P_{rad}^{(i,j)}$  = Probability of ignition due to Radiation  
 $P_{ember}^{(i,j)}$  = Probability of ignition due to Ember Spotting  
 $P_{cond}^{(i,j)}$  = Probability of ignition due to Conduction  
 $W_{(m)}$  = Node set for Way  $m$



# Convection and Ember Model

**Convection Model**

$$P_{conv}^{(i,j)} = f \left( d^{(i,j)}, F_{cc}^{(i,j)}, h_f^{(i)}, \theta_f \right)$$

Distance between nodes

Effect of wind direction

Flame height

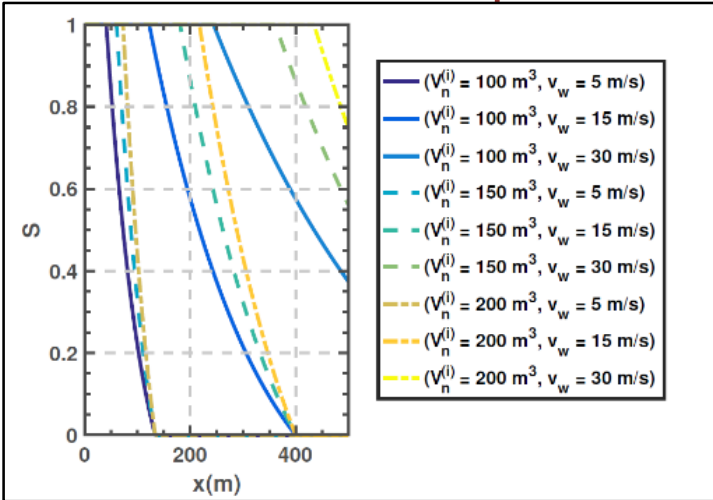
Flame angle

Access probability

**Ember Model**

$$P_{ember}^{(i,j)} = h \left( P_{acc}^{(i,j)}, F_{cc}^{(i,j)}, g^{(i,j)} \right)$$

Effect of wind direction



**Ember distribution**

$$g^{(i,j)} = S \left( V_n^{(i)}, d^{(i,j)}, v_w \right)$$

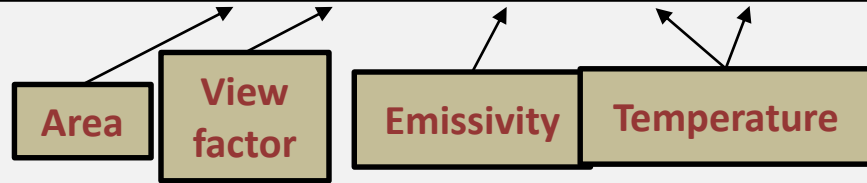
Volume of node

Distance between nodes

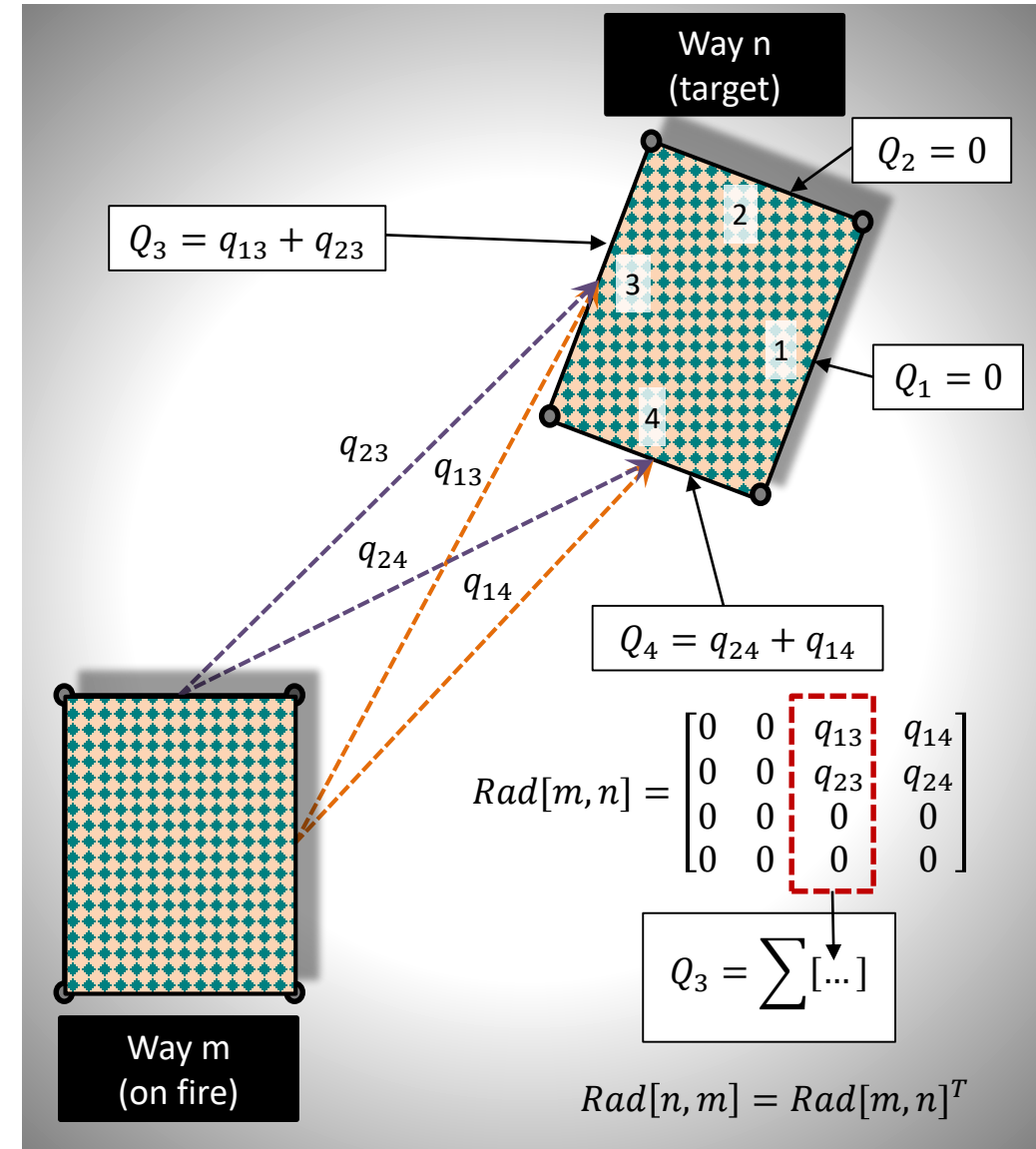
Wind velocity

- Stefan-Boltzmann law used to calculate **radiation flux**

$$q_{(k,l)}^{(m,n)} = \left( A_{(k)}^{(m)} v_{f(k,l)}^{(m,n)} \epsilon_{(k)}^{(m)} \sigma (T_f^4 - T_a^4) \right)$$



- Interaction between each possible source-target **surface pair** evaluated
- Independent view** factors found due to varying relative surface inclination & size
- Net flux on each surface obtained as sum of flux from all surfaces of source way





## Damage Assessment

*Survivability Likelihood*

# Damage Prediction for Camp Fire

Observed Damage

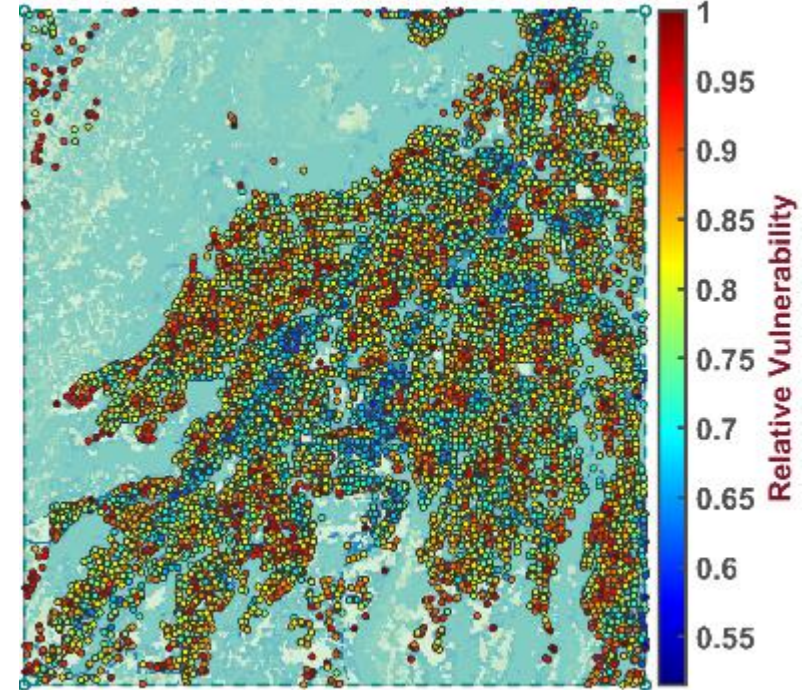
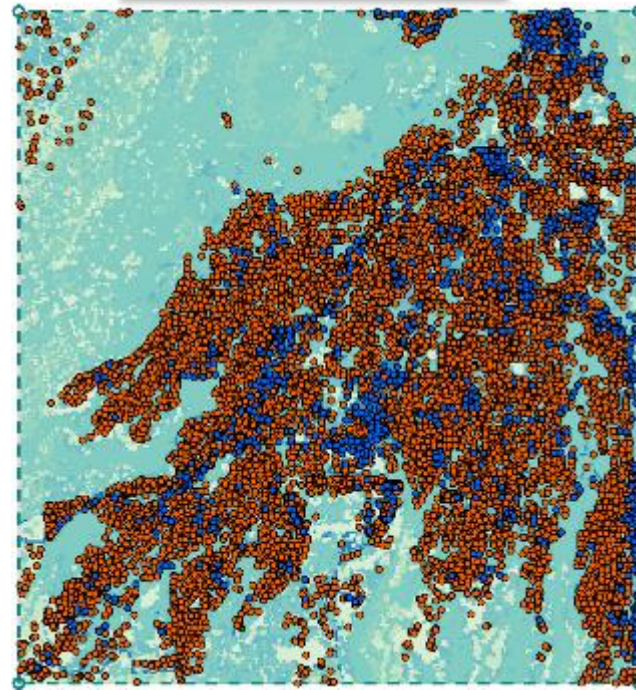
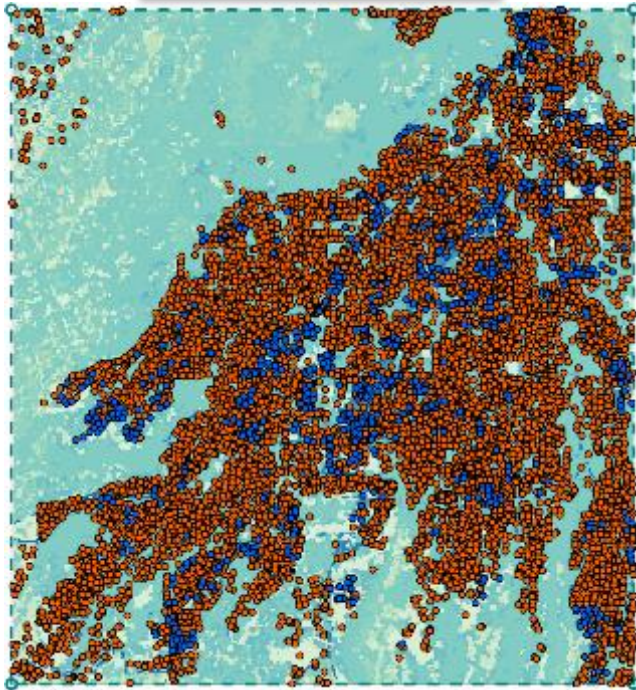
Calculated Damage

Relative Vulnerability

Destroyed



Undamaged



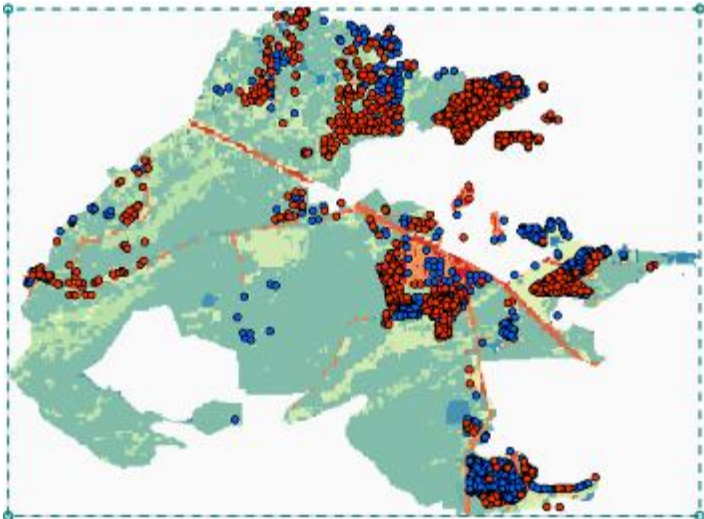
Chulahwat et al. (2022) *Sci. Rep.*

85% accuracy between observed and predicted damage

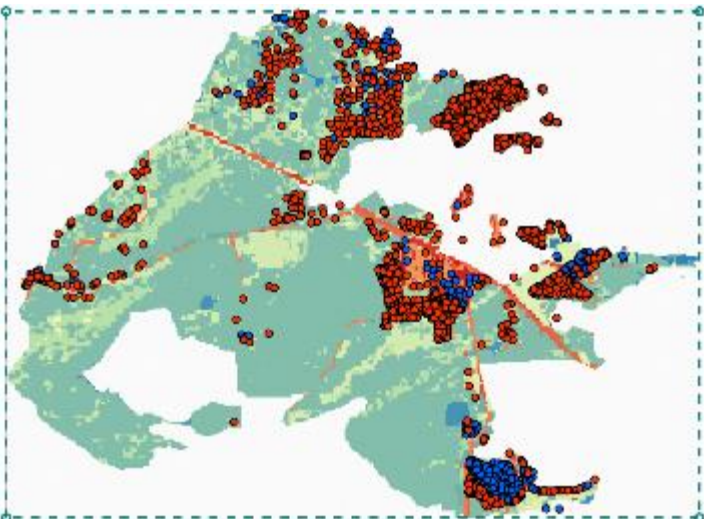
# Damage Prediction for Marshall Fire

Destroyed  
Undamaged

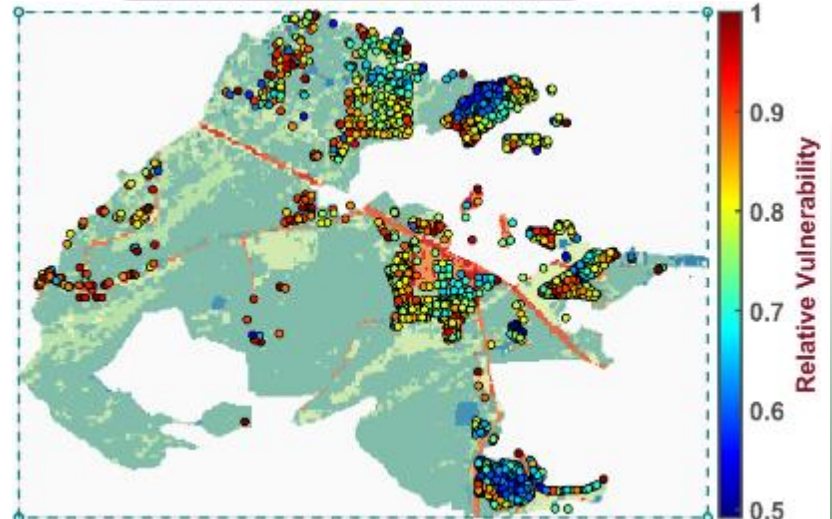
Observed Damage



Calculated Damage



Relative Vulnerability



Chulahwat and Mahmoud (2023) *Nat. Haz. Rev.*

72% accuracy between observed and predicted damage

# Damage Prediction for Marshall Fire (1)

## Zoomed-In Areas of the Affected Region

Observed Damage

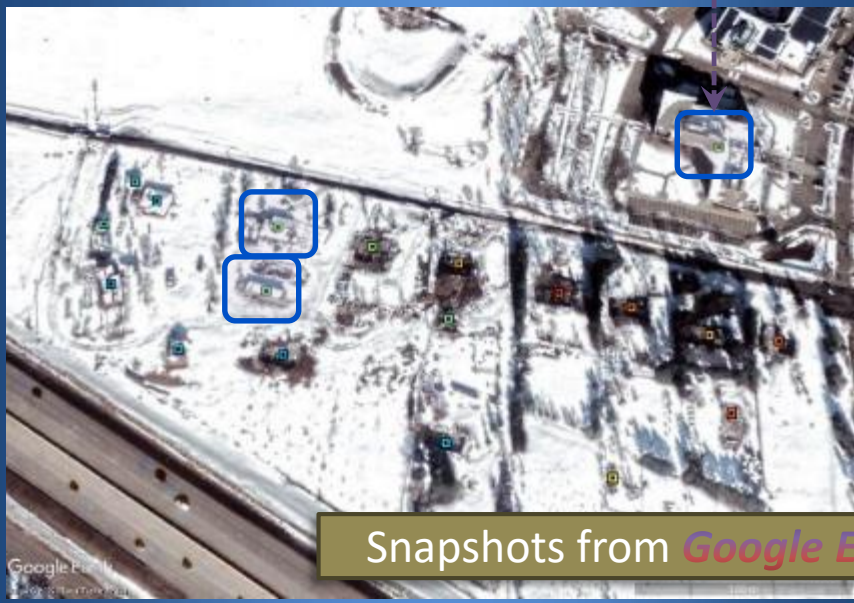


Calculated Damage



Zoomed-in comparisons are good although some local behavior is not captured such as firefighting efforts and the impact of defensible space fuel due to lack of data

# Damage Prediction for Marshall Fire (2)



Snapshots from *Google Earth* time-lapse after Marshall Fire





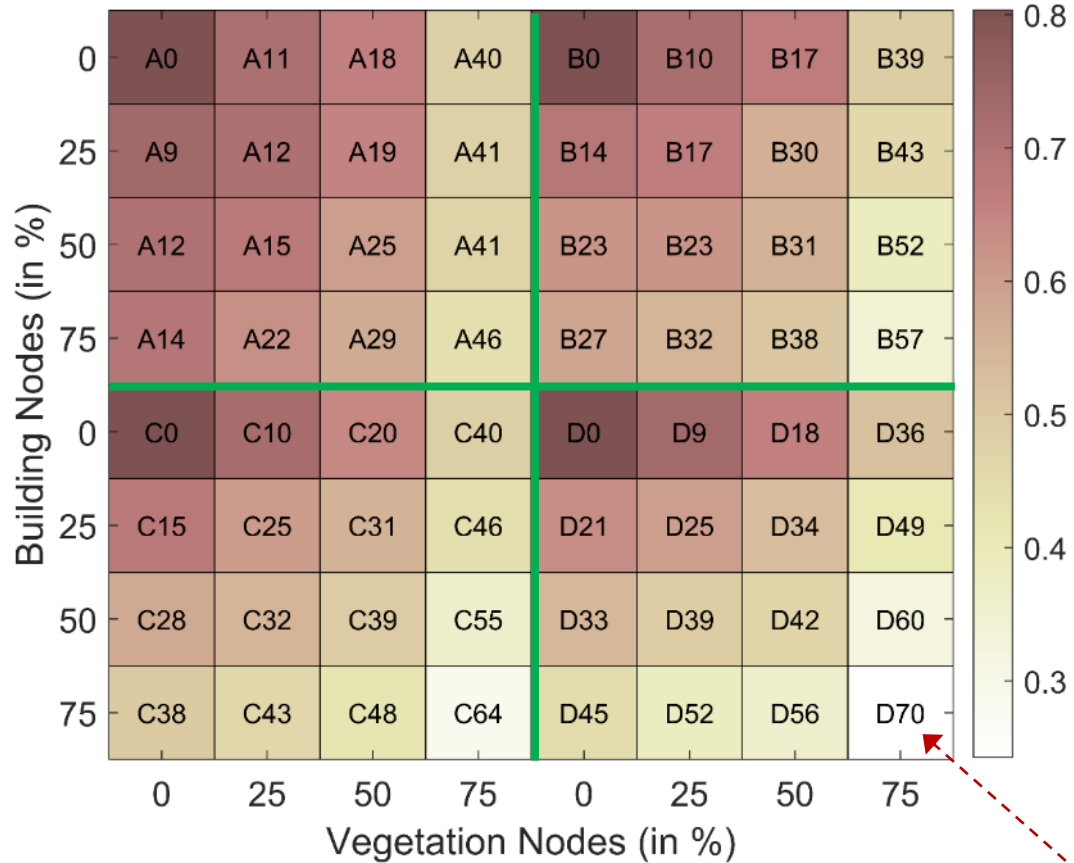
# Vulnerability and Risk Reduction

*Targeted Mitigation*

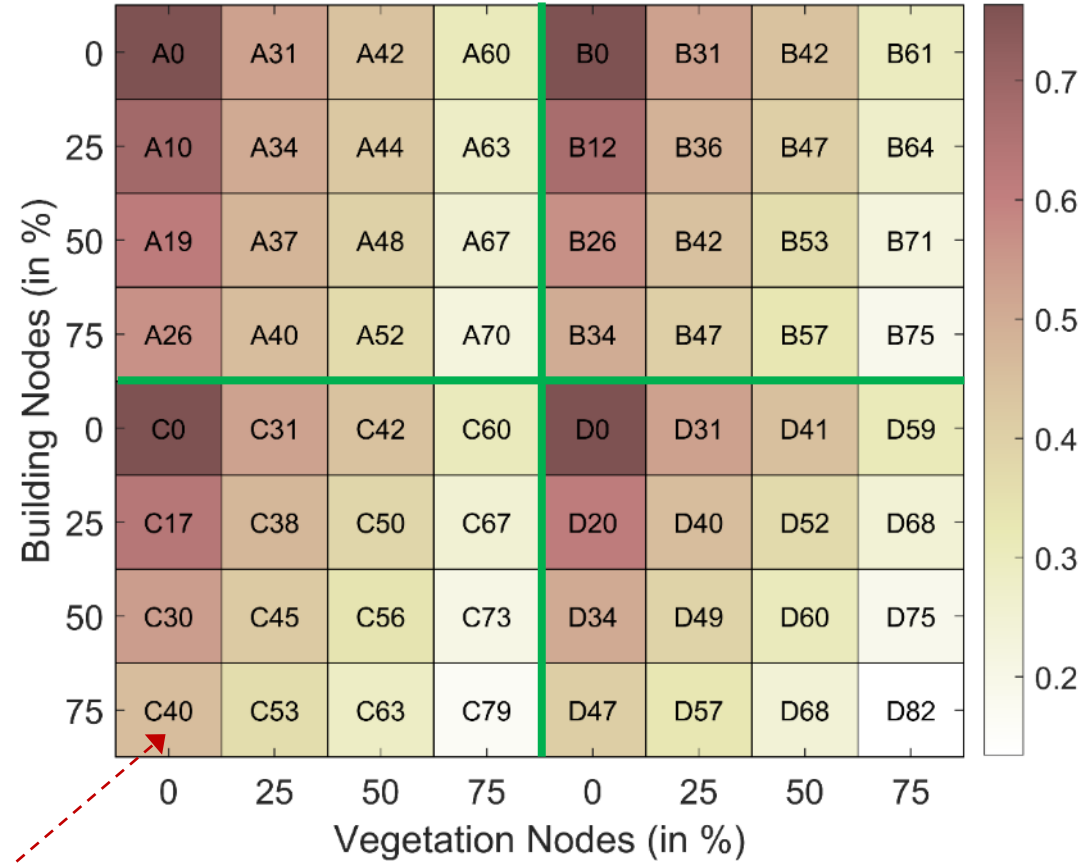
# Sensitivity Analysis Results

Building Hardening Strength A = 25% B = 50% C = 75% D = 100%

2018 Camp Wildfire



2020 Marshall Wildfire

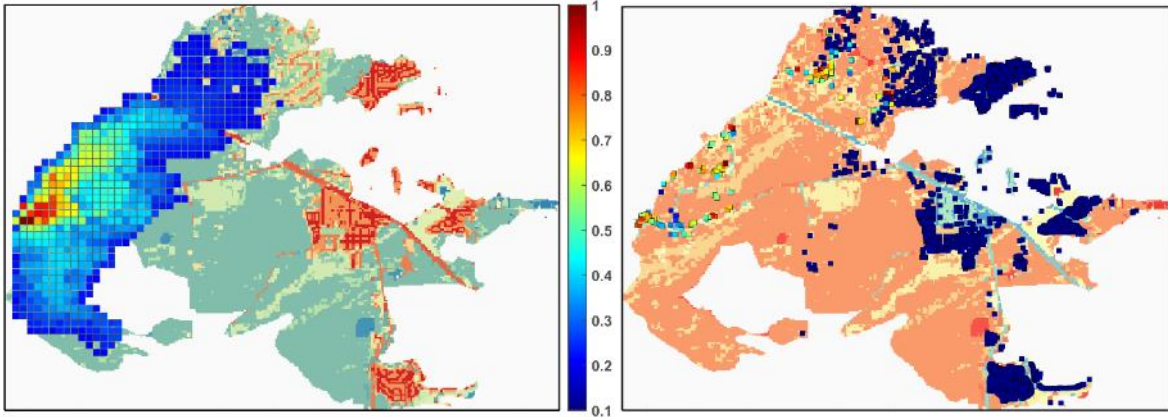


Percentage Reduction in Mean Vulnerability from the case when no mitigations are applied

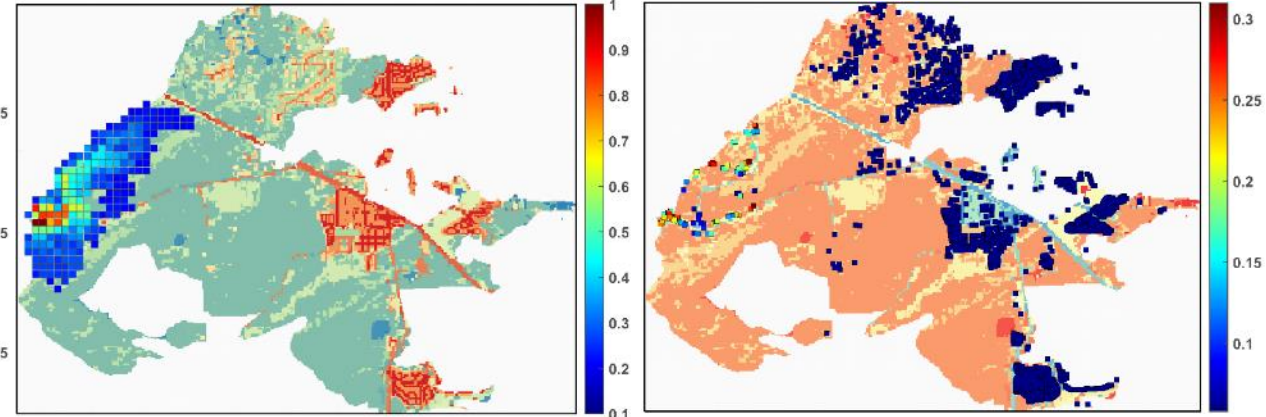
# Wildfire Mitigation (Marshall Fire)

Wind Speed considered **10 m/s** with wind direction the same as Marshall fire

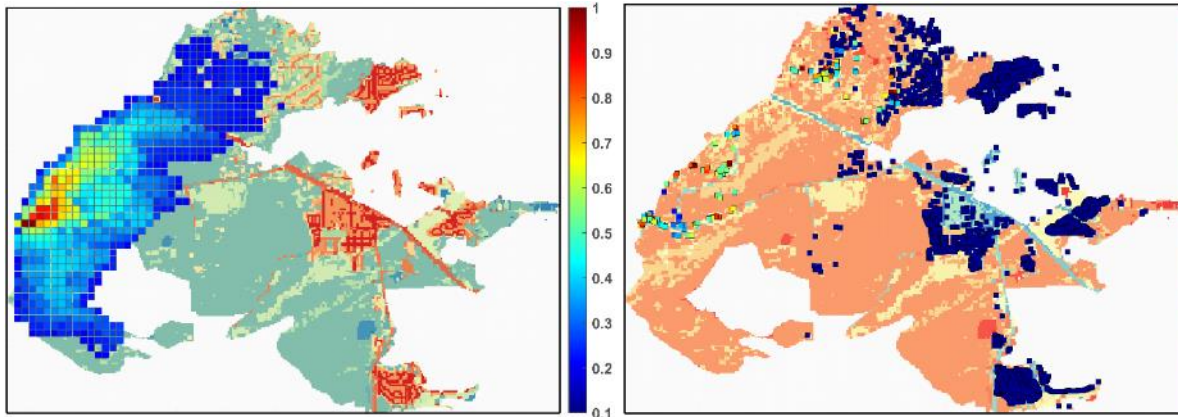
Building Mitigation = 0 % Vegetation Mitigation = 0 %



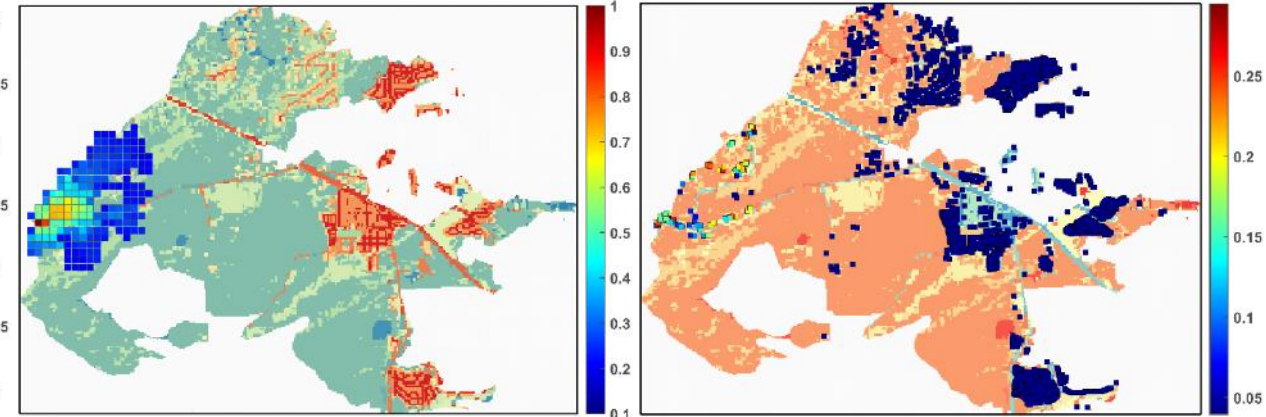
Building Mitigation = 0 % Vegetation Mitigation = 50 %



Building Mitigation = 50 % Vegetation Mitigation = 0 %

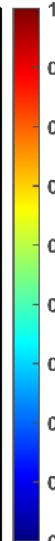
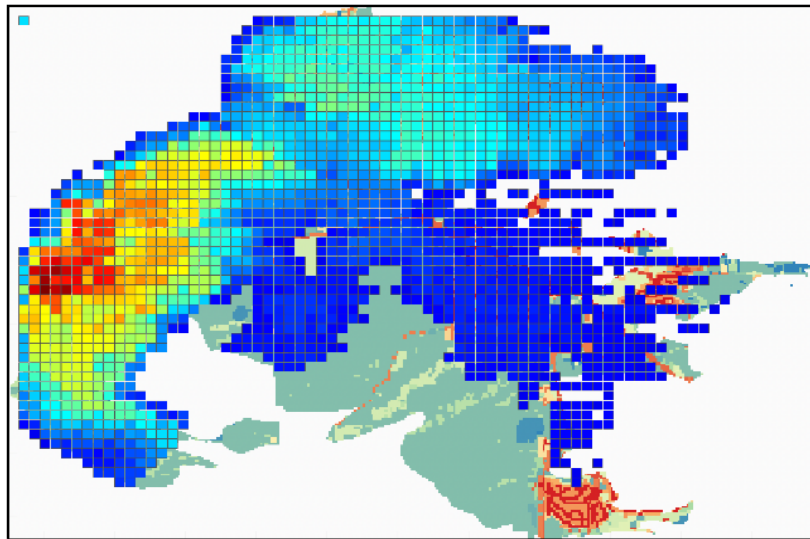


Building Mitigation = 50 % Vegetation Mitigation = 50 %

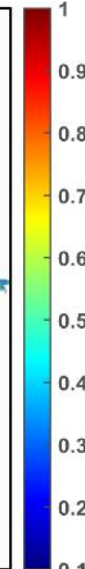
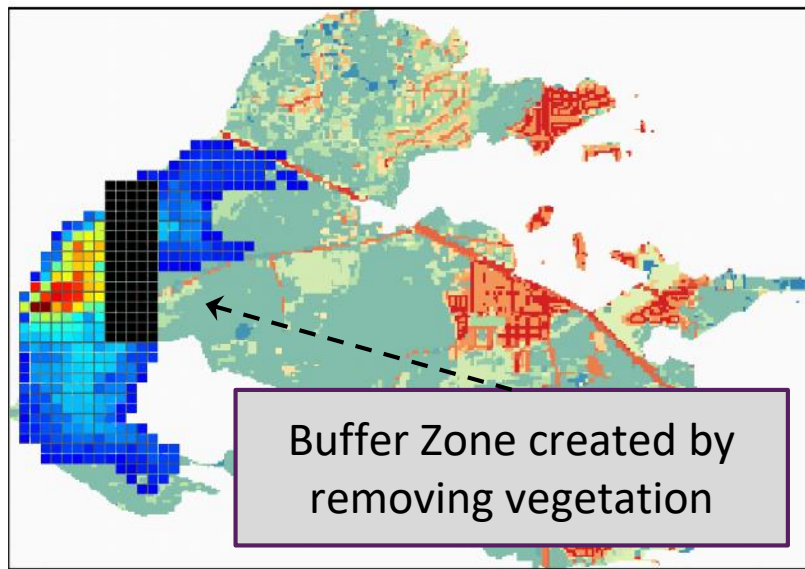
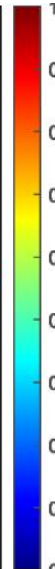
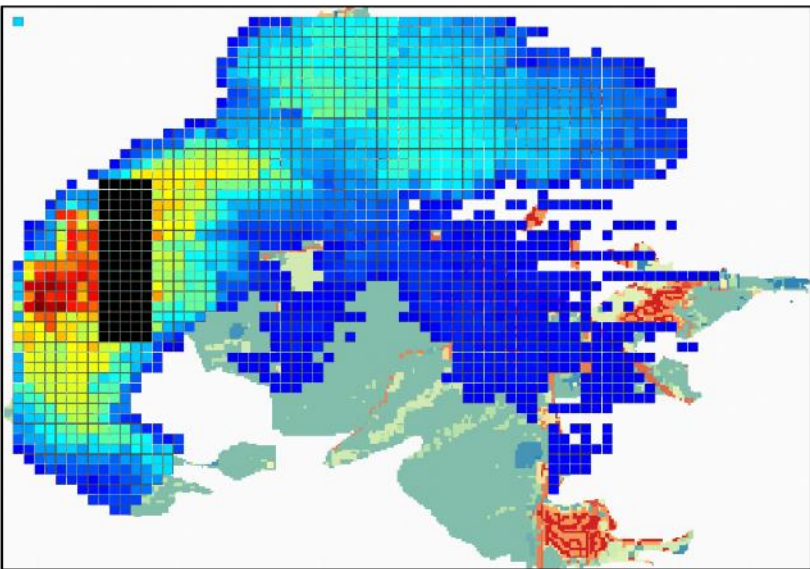
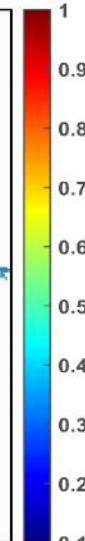
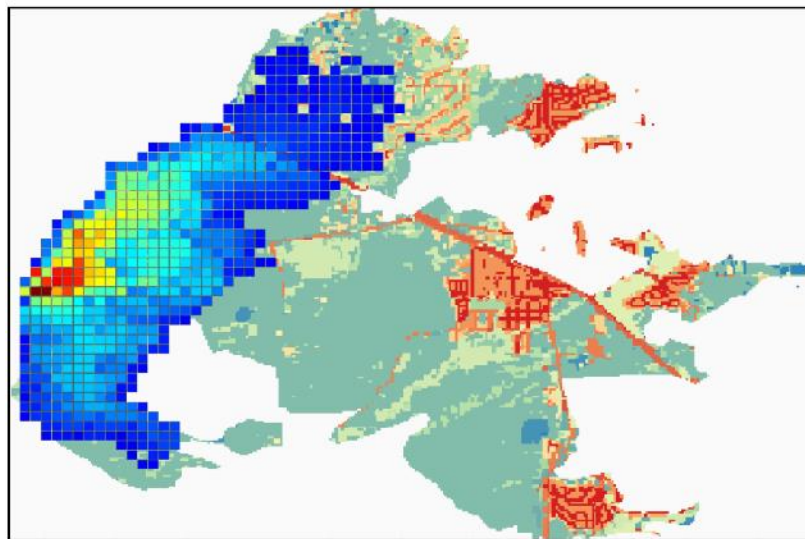


# Vegetation Mitigation

Wind Speed = 20 m/s



Wind Speed = 10 m/s



Buffer Zone created by removing vegetation

- Wildfire propagation shown after introduction of a buffer zone (750 x 2500 m) created by removing vegetation areas
- The results demonstrate that the effectiveness of the buffer zone reduces significantly at higher wind speeds

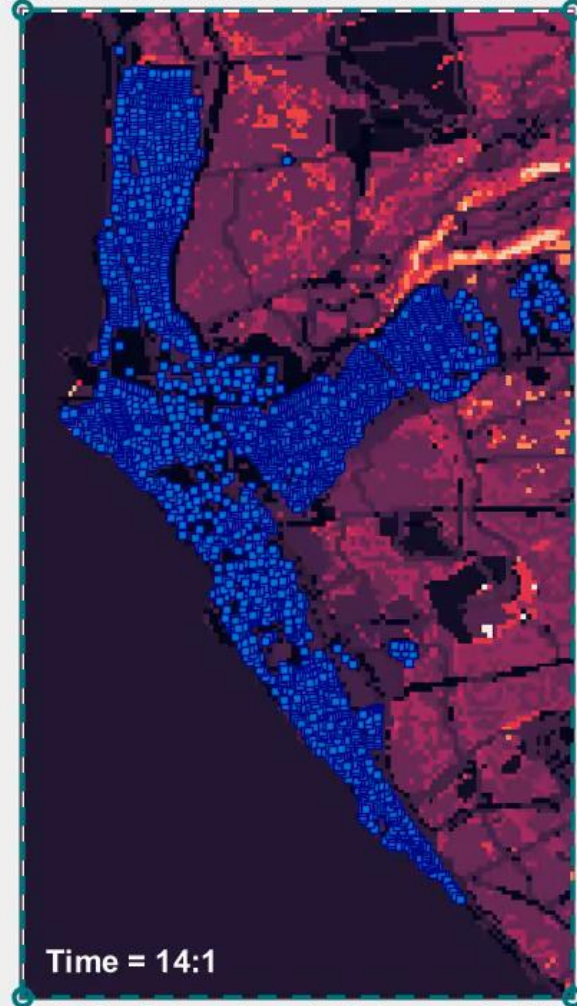


## **Future Work**

*Fire Mitigation Policies*

# Time-Dependent Propagation – Lahaina 2023

AGNI-NAR Model Simulation



Time = 14:1

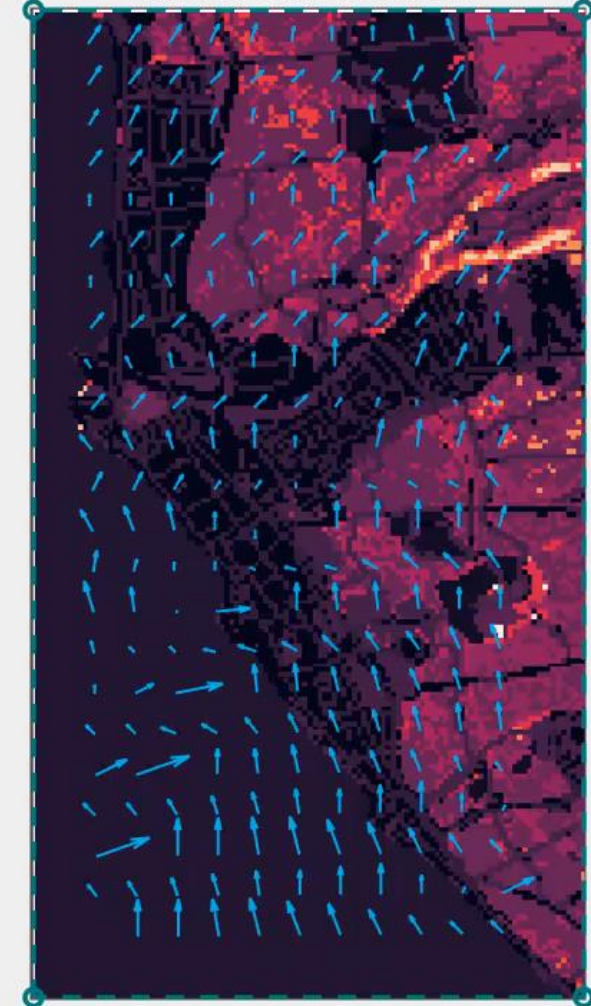
© Chulahwat and Mahmoud 2024

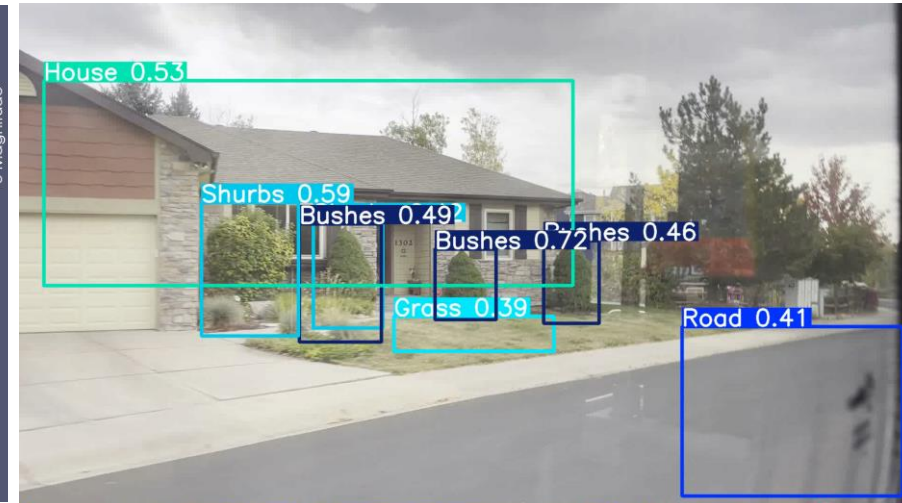
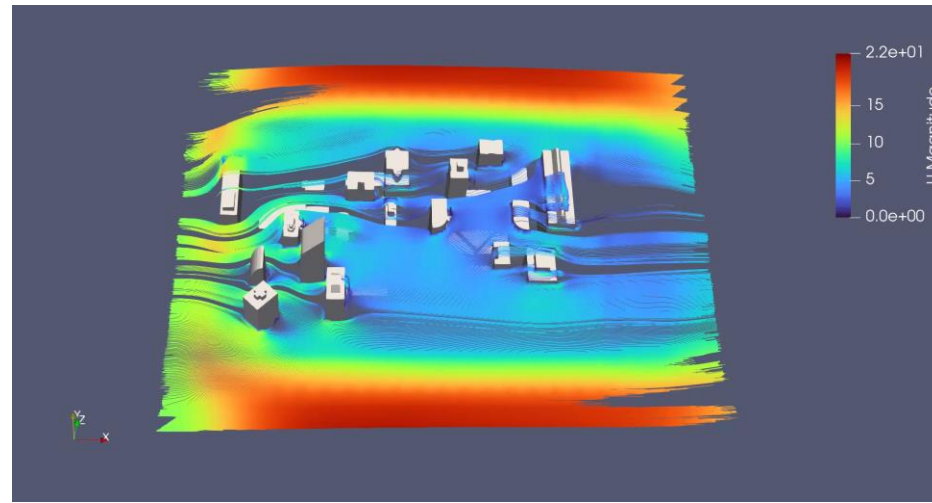
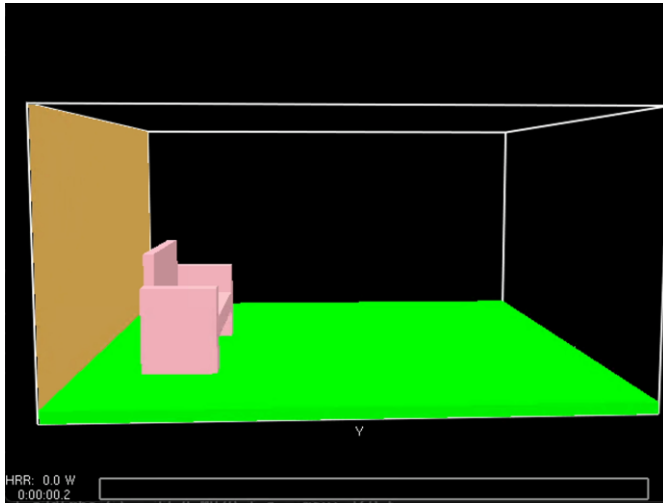
FSRI Incident Data



Time = 14:1

Wind Simulation





Need to capture local interaction and modify the graph accordingly

Need more detailed wind field at the community level

Need to automate data collection and include people in the process

- Vulnerability versus risk.
- The role of urban growth and climate change.
- Balancing acceptable structural losses and ecological health.
- The social dilemma of enforcing mitigations.

# THANK YOU!



QUESTIONS?

For more information

[hussam.mahmoud@colostate.edu](mailto:hussam.mahmoud@colostate.edu)

Or visit us at

<http://www.engr.colostate.edu/~hmahmoud>

GORDON AND BETTY  
**MOORE**  
FOUNDATION

