



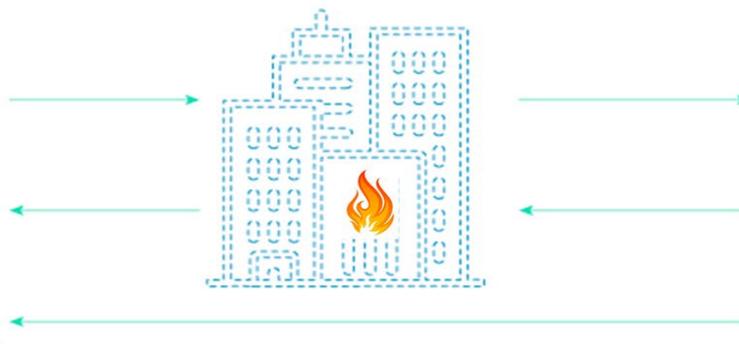
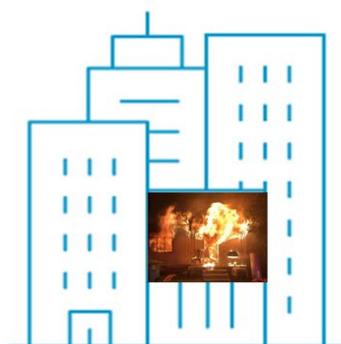
Firefighters' safety in fire: Exploring safety awareness and decision-making aiming at multiple firefighting operations

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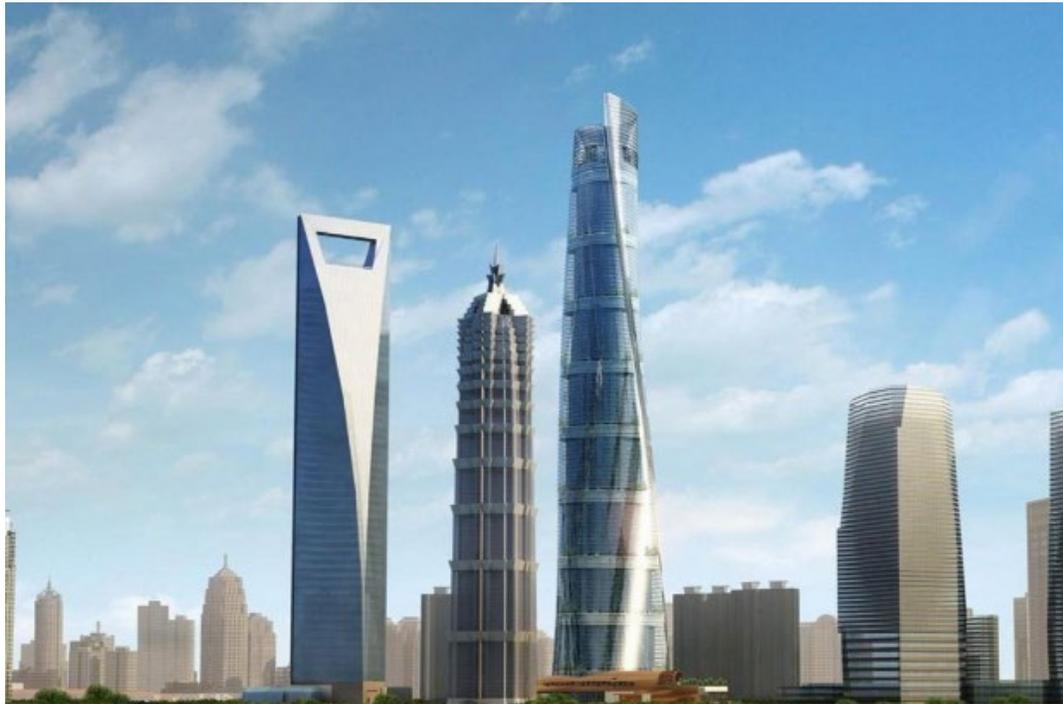


Outline

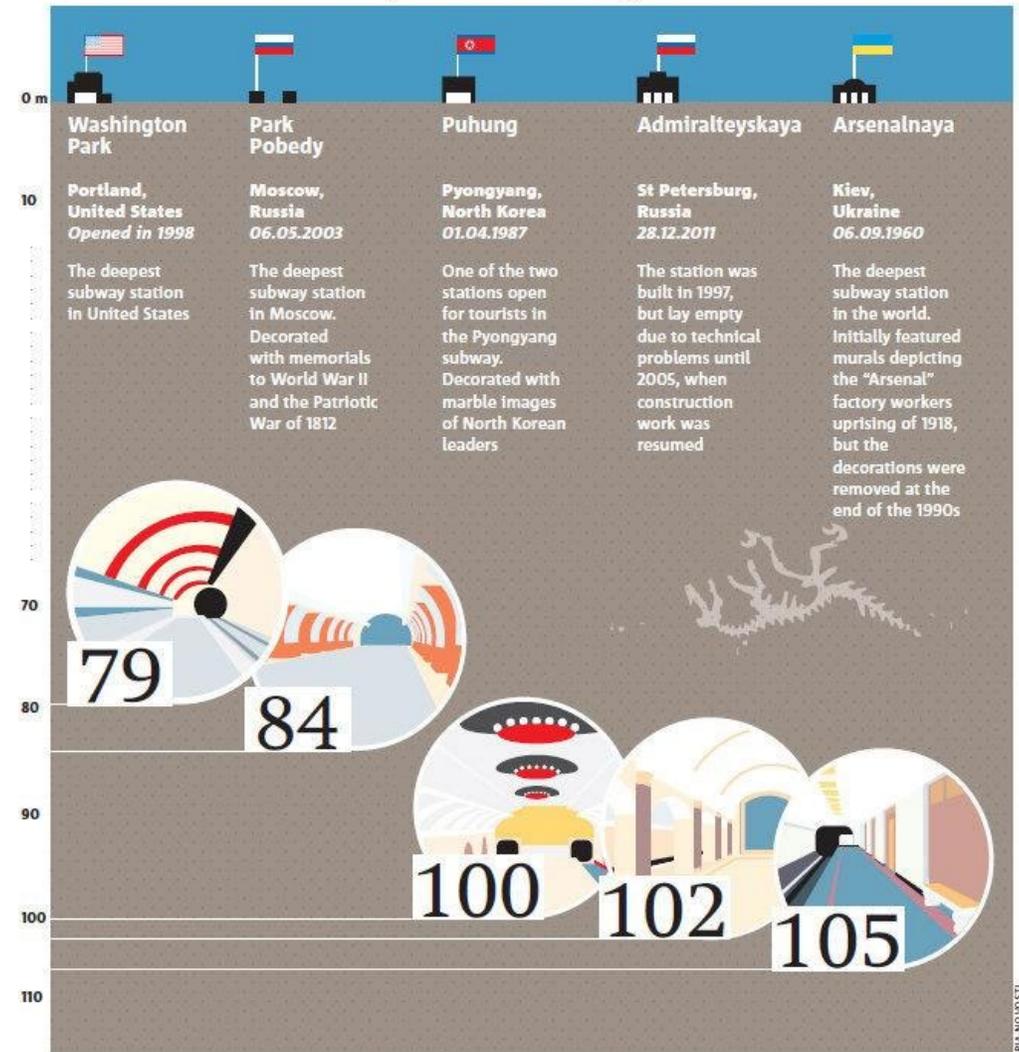
1. Background
2. Previous work on firefighters: SFT
3. Survey and results of firefighters
4. Classification of firefighters based on decision-making preferences

Fire accidents

- Ascending floors
- Deeper underground spaces
- High density of occupants



The world's deepest subway stations



Firefighters' safety issues



Mini-storage fire in Hong Kong, 2016



- There was no occupant injury
- **2 firefighters were dead**
- **11 firefighters were injured**

Firefighters' safety issues



**Two firefighters were dead
when battling a fire**

City library in Porterville, California, 2020



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Safe firefighting time (SFT)

Safe firefighting time: firefighters experience no instantaneous injury or no long-term health issue, either physical or mental

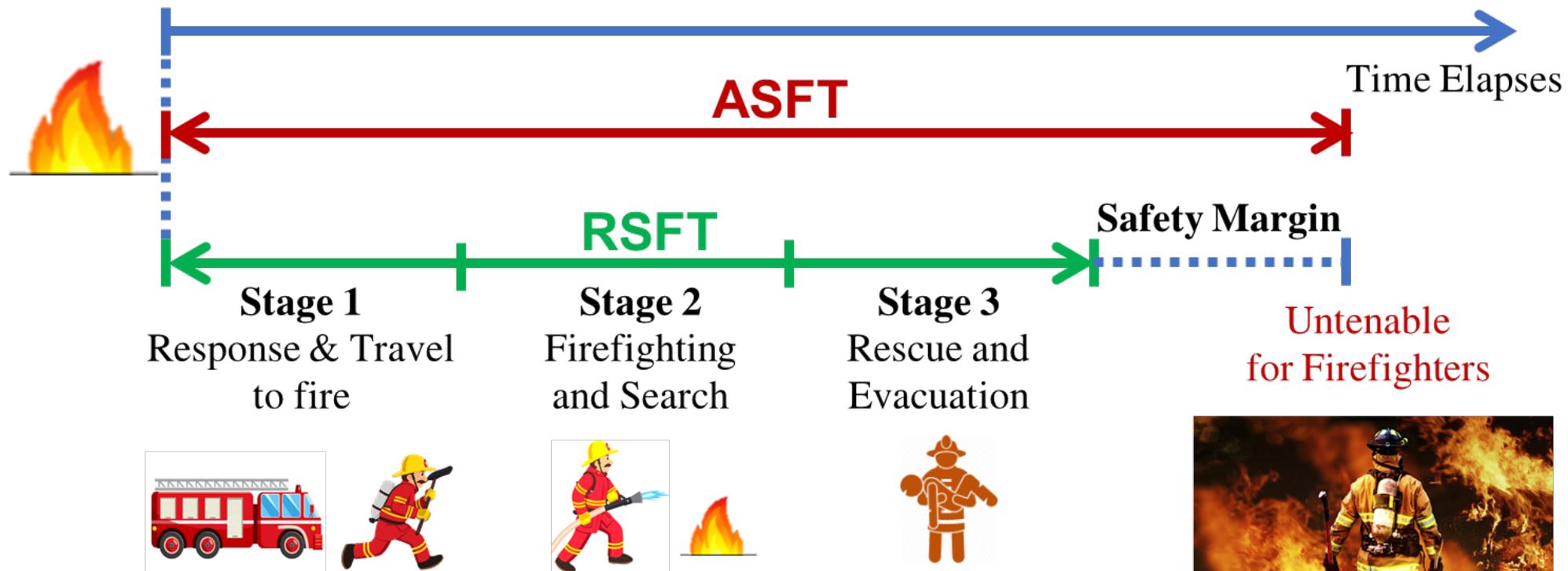
| Aspects | Safe egress time (SET) | Safe firefighting time (SFT) |
|-------------------|------------------------|--|
| Tasks | Evacuation | Firefighting, search, rescue |
| Timeline | A couple of minutes | A few to dozens of minutes |
| Moving path | From inside to outside | From outside to inside, back-and-forth search, and then from inside to outside |
| Evacuation | By themselves | Post-firefighting with loads and injured occupants |
| Influence on fire | Little influence | Big influence on firefighting operations |

Zhang, Y. X., et al. (2023). Design a safe firefighting time (SFT) for major fire disaster emergency response. *International Journal of Disaster Risk Reduction*, 88, 103606.

ASFT & RSFT

ASFT: Available safe firefighting time

RSFT: Required safe firefighting time



ASFT: Available safe firefighting time

ASFT: time that elapses after the fire ignition until the presence of smoke, heat and poisonous gases create untenable conditions for firefighters with professional suits and facilities

$$\text{ASFT} = \min\{T_T, T_R, T_V, T_{CO}\}$$

| ASFT Criteria | Evaluation indicator | Tolerable value (ASFT) | Reference value (ASET) |
|---------------|--|---|------------------------|
| Principle | Temperature (°C) | < 80 | < 60 |
| | Thermal radiation (kW/m ²) | < 5 | < 2.5 |
| Secondary | Visibility (m) | Undetermined | >10 |
| | CO | Not considered (with PPE) < 1000 (rescue task) | < 1000 |

RSFT: Required safe firefighting time

RSFT: time required for the firefighters to fulfill their tasks and withdraw to the safety zone with trapped occupants

$$\text{RSFT} = \sum_{i=1}^n f(M_t, D_j, C, B)$$

n = 3 and i = 1, 2, 3 refer to the firefighting tasks following the timeline.

- *i=1: when firefighters get noticed and arrive at the fire scene*
- *i=2: when firefighters execute their assigned firefighting and searching trapped people in the building*
- *i=3: when firefighters move out of the building and rescue trapped occupants to the outside;*

*M_t : the **movement time** for firefighters*

*D_j : firefighters' different **duties** and tasks;*

*C : the **cooperation** among groups such as communication and support between members;*

*B : the **burden** the firefighters carry during the rescue (firefighting facilities, injured people)*

The rules of safety in fire design

Current design rules:

$$\text{ASET} > \text{RSET}$$

- ASET should be larger than RSET



Modified design rules:

$$\left\{ \begin{array}{l} \text{ASET} > \text{RSET|F} \\ \text{ASFT} > \text{RSFT} \end{array} \right.$$

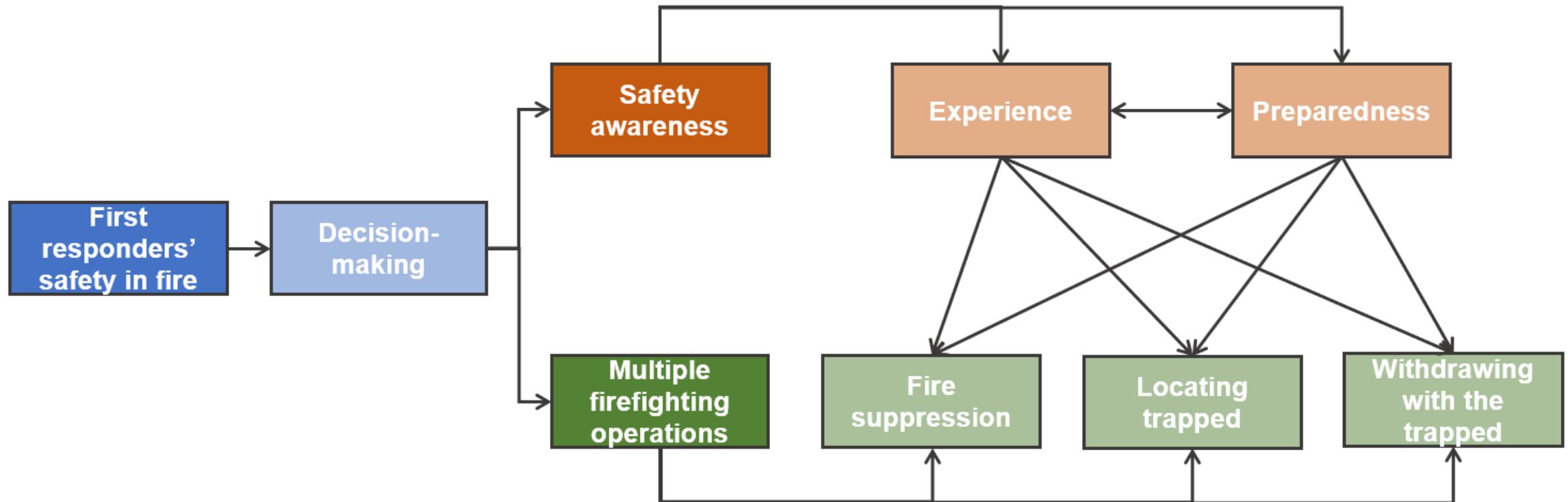
- With firefighting and rescue, RSET could be modified or shortened
- ASFT should be larger than RSFT so that the firefighters' safety could be guaranteed

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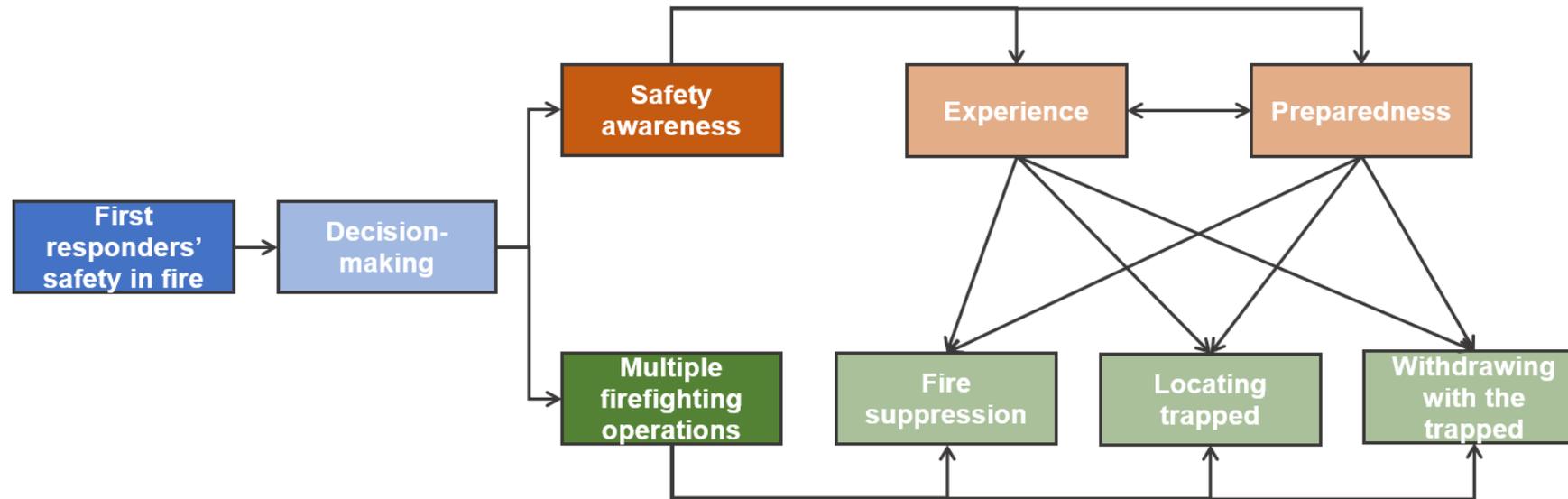
Survey and results of firefighters

- How decision-making influences firefighter safety during operations
- Explore the impact of safety awareness on firefighters' adaptability
- Classify firefighters based on their decision-making preferences



Survey and results of firefighters

- **Experience:** Initial quality and characteristics such as age, years of service, education and injury history
- **Preparedness to targeted fire scenes**
 - four sections: the route to the fire, building layout, fire characteristics, and the status of trapped



Three firefighting operations

- fire suppression
- locating trapped individuals
- withdrawing with the trapped

External factors affecting fire suppression decision-making

- The distance to the fire source
- Fire intensity
- Smoke density
- Hazardous materials
- Team support

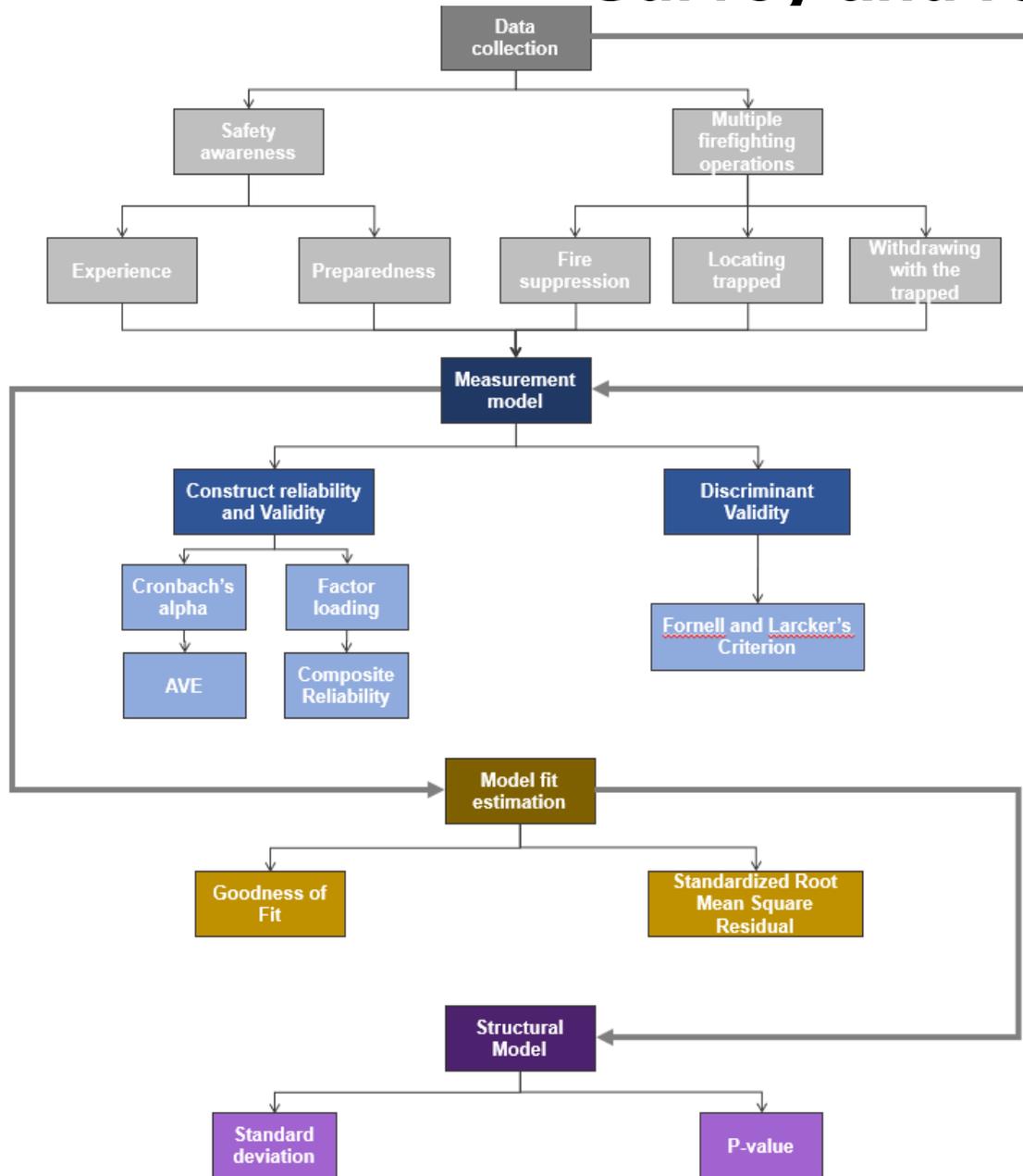
Survey and results of firefighters

Survey collected 141 firefighters in several urban fire brigades, and 129 valid

| Category | Item | No. | Percentage |
|------------------------|---|-----|------------|
| Gender | Male | 129 | 100% |
| | Female | 0 | 0% |
| Age | 18-24 | 65 | 50.39% |
| | 25-30 | 36 | 27.91% |
| | 31-40 | 25 | 19.38% |
| | 41-50 | 2 | 1.55% |
| | >51 | 1 | 0.78% |
| Years in firefighting | 0-2 | 29 | 22.48% |
| | 2-5 | 59 | 45.74% |
| | 5-10 | 31 | 24.03% |
| | 10-20 | 8 | 6.20% |
| | >20 | 3 | 2.32% |
| Education | Below high school | 16 | 12.40% |
| | Diploma's degree | 56 | 43.41% |
| | Bachelor's degree | 45 | 34.88% |
| | Master or doctor | 12 | 9.30% |
| Previous safety issues | No self-injury, nor witness of injuries of others | 68 | 52.71% |
| | No self-injury, but witness of injuries of others | 32 | 24.81% |
| | Minor self-injury | 32 | 24.81% |
| | Major self-injury | 7 | 5.43% |

- **All firefighters are male.**
- **Around 70% of them have experience less than 5 years.**
- **Around 30% of them experienced injury.**

Survey and results of firefighters



Step 1: Data collection of 129 firefighters

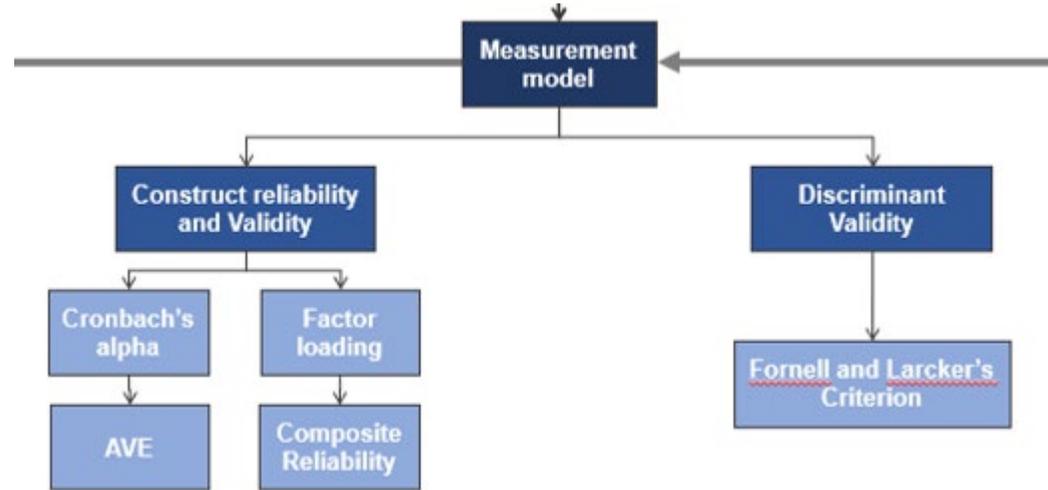
Step 2: Measurement models: to test if each question could represent the construct

Step 3: Model fit estimation: to determine the accuracy of the model

Step 4: Structure equation model: to analyze the relationship among each item

Survey and results of firefighters

Step 2: Measurement models: to test if each question could represent the construct



| Constructs | Factor loading | Cronbach's Alpha | Composite reliability | AVE |
|---------------------|----------------|------------------|-----------------------|------------|
| SA-Experience | 0.672-0.981 | 0.875 | 0.872 | 0.737 |
| SA-Preparedness | 0.851-0.919 | 0.932 | 0.933 | 0.779 |
| FO-Fire suppression | 0.542-0.880 | 0.935 | 0.963 | 0.764 |
| FO-Locating trapped | 0.602-0.839 | 0.963 | 0.967 | 0.806 |
| FO-Withdrawing | 0.519-0.858 | 0.967 | 0.935 | 0.675 |
| Threshold | 0.5 | 0.5 | 0.7 | 0.5 |

Survey and results of firefighters

Step 3: Model fit estimation: to determine the accuracy of the model

- Goodness of fit (GoF)

$$GoF = \sqrt{AVE_{avg} \times R_{avg}^2}$$

0.453 > threshold: 0.36, showing large goodness of fit

- Standardized root mean square residual (SRMR)

0.035 < threshold: 0.08, signifying a good model fit

Step 4: Structure equation model: to analyze the relationship among each item

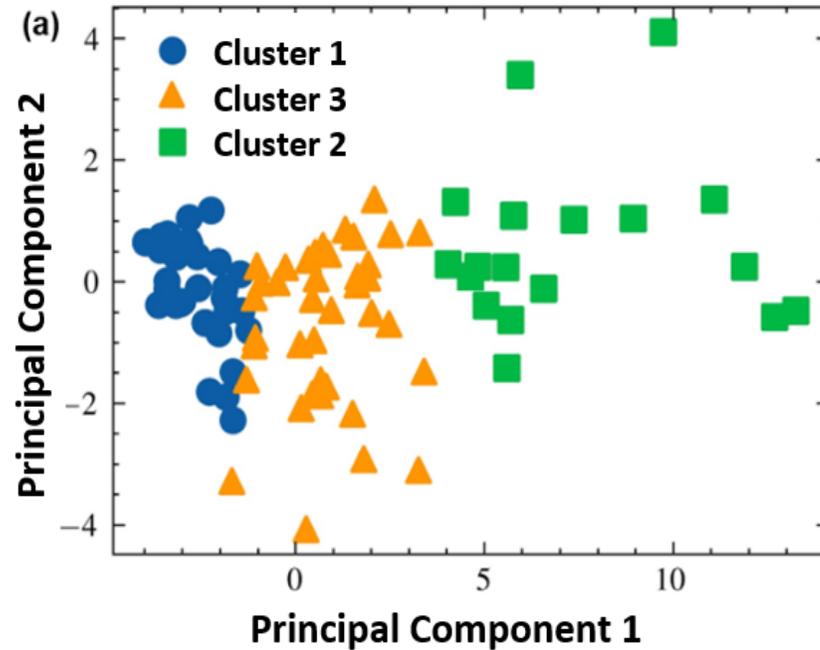
| Hypotheses | Coefficient | STDEV | P-value | Influence |
|---------------------------------|-------------|-------|----------|------------------------|
| Experience → Fire suppression | 0.271 | 0.076 | 0.000*** | Positive |
| Experience → Locating trapped | 0.081 | 0.056 | 0.062 # | Non-Positive |
| Experience → Withdrawing | 0.136 | 0.062 | 0.003** | Medium Positive |
| Preparedness → Fire suppression | 0.124 | 0.071 | 0.001** | Medium Positive |
| Preparedness → Locating trapped | 0.242 | 0.058 | 0.000*** | Positive |
| Preparedness → Withdrawing | 0.145 | 0.064 | 0.000*** | Positive |

Outline

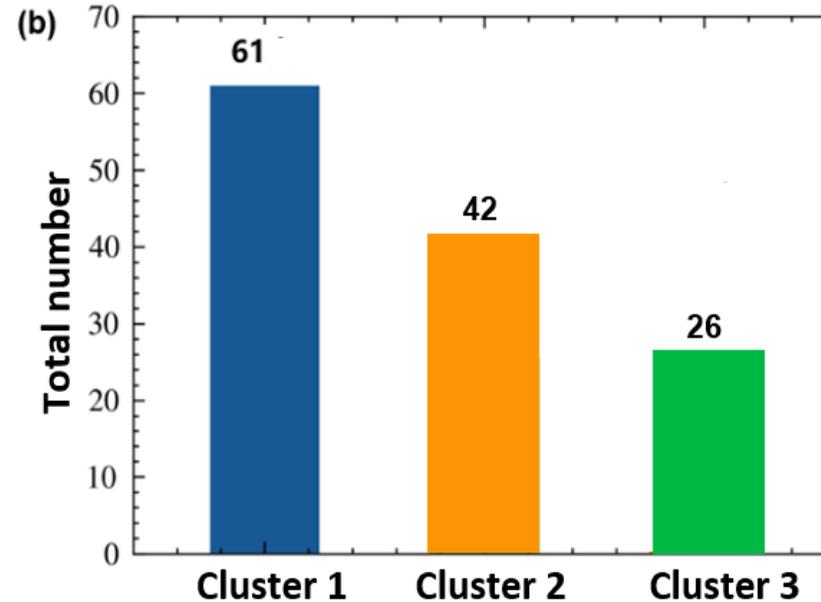
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4. **Classification of firefighters based on decision-making preferences**

Classification of firefighters based on decision-making preferences

Clustering analysis based on K-means



(a) Clustering analysis results;



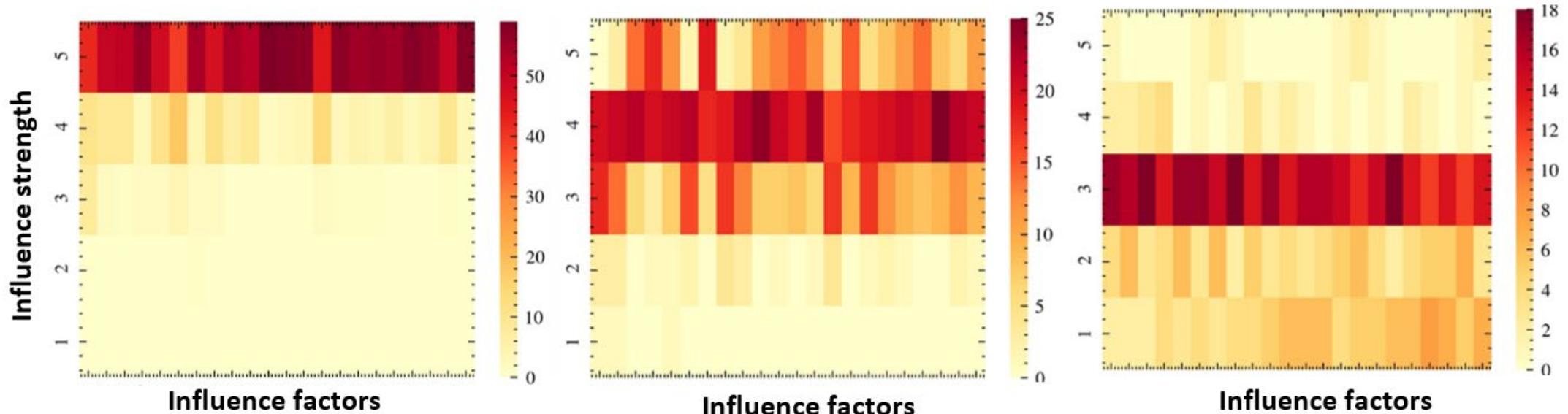
(b) Clustering results statistics

Decision-making answers (22 dimensions) are reduced to two dimension.

129 firefighters are divided into three clusters based on their decision-making answers.

Classification of firefighters based on decision-making preferences

Clustering analysis based on K-means



(a) Cluster 1- Adaptive firefighters

(b) Cluster 2- Average firefighters

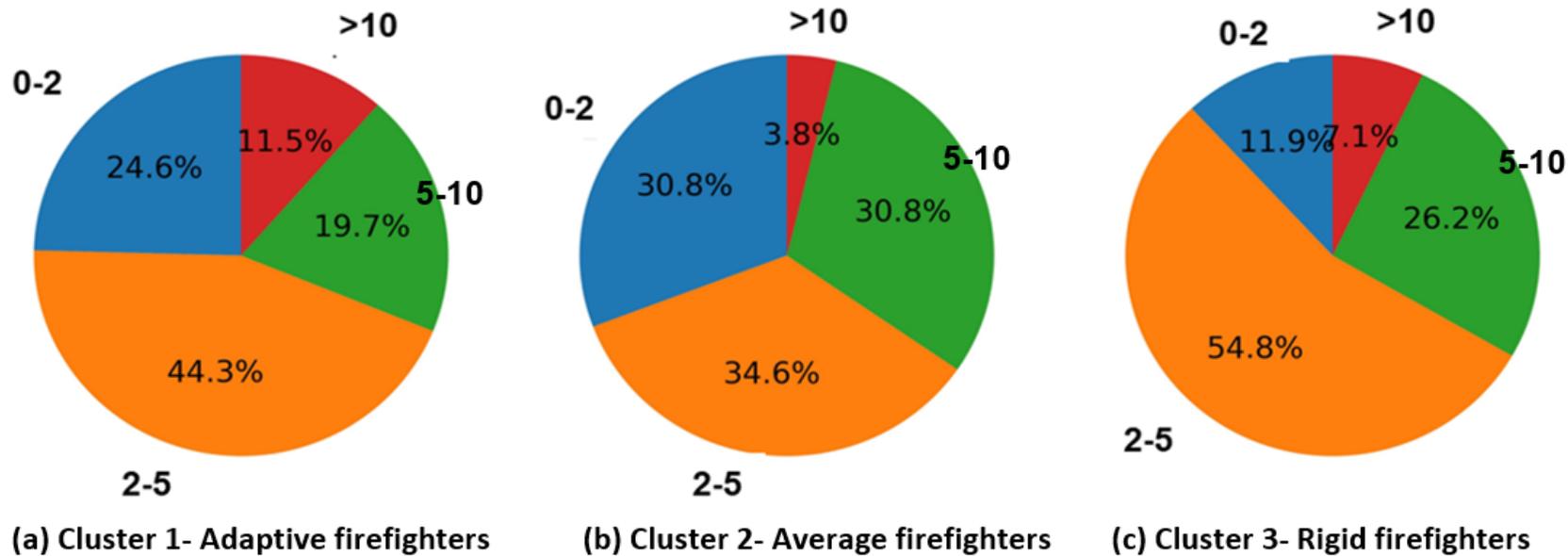
(c) Cluster 3- Rigid firefighters

The impact of fire-related factors on firefighters' decision-making among all three tasks

- Adaptive firefighters: **50%**, are influenced **highly** by external conditions
- Average firefighters: **30%**, are influenced **medium to highly** by external conditions.
- Rigid firefighters: **20%**, are influenced **medium or less** by external conditions.

Classification of firefighters based on decision-making preferences

Classification of firefighters and their experience

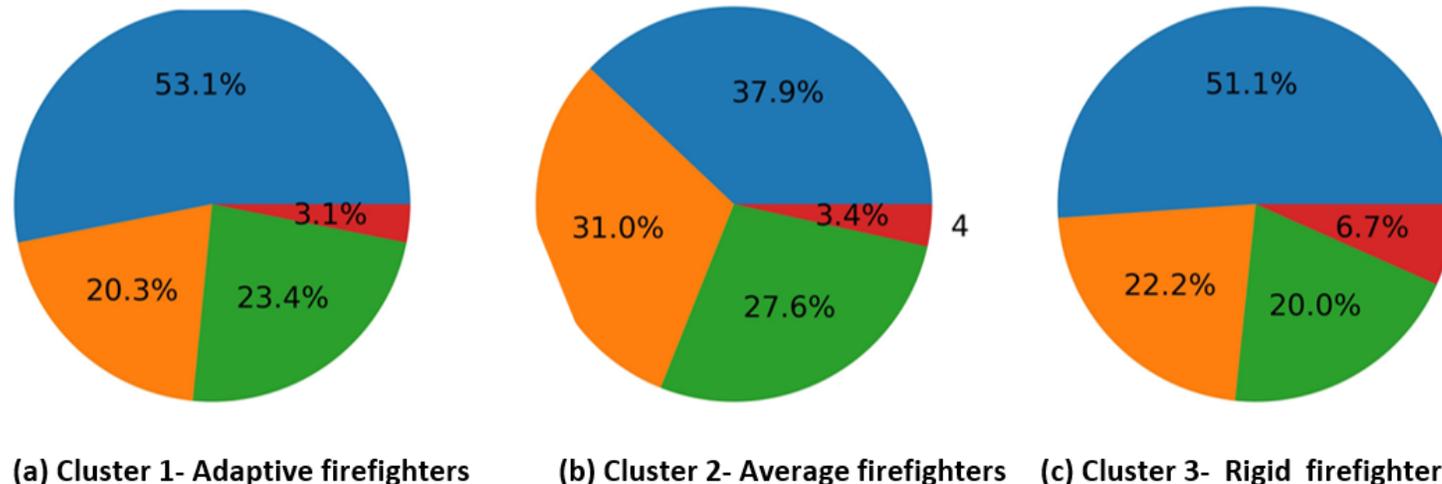
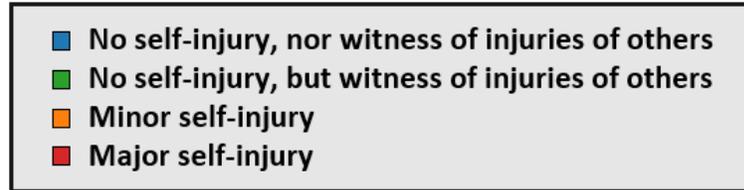


Clusters of firefighters and their years of service

- 11.5% of firefighters in the Adaptive Type (Cluster 1) have **more than 10 years** of experience, **highest percentage**.
- Rigid group has a higher proportion of **less experienced firefighters**, having just **2-5 years of service**.
- **New recruits**, with less than 2 years of service, **rely highly on external factors**.

Classification of firefighters based on decision-making preferences

Classification of firefighters and their experience

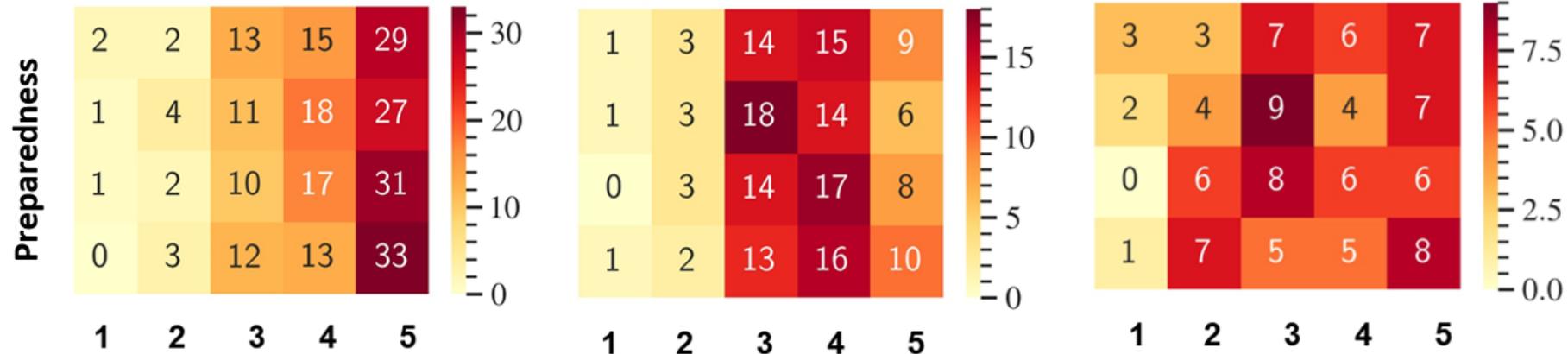


Clusters of firefighters and their pervious safety issues

- **Rigid group** have a higher proportion of injuries than other two clusters.
- **Adaptive group** are the safest with the least injuries

Classification of firefighters based on decision-making preferences

Classification of firefighters and their preparedness



(a) Cluster 1- Adaptive firefighters (b) Cluster 2- Average firefighters (c) Cluster 3- Rigid firefighters

Clusters of firefighters and their preparedness

- Adaptive firefighters are generally **very familiar with** all four types of fire-related information.
- Average firefighters display a range with fire information, **mid-familiar to very familiar**.
- Rigid firefighters fall within the board range of **“unfamiliar” to “very familiar”**.



Conclusions

- 129 firefighters' response to decision-making factors are surveyed.
- Experience is a double-edged sword.
- Preparedness showed strong positive effects across all tasks.
- Firefighters are divided into three clusters: adaptive, average and rigid

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