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TONGJI UNIVERSITY



土木工程學院  
COLLEGE OF CIVIL ENGINEERING

# Real-time Early Warning of Fire-Induced Collapse of Steel Building Structures: Theory and Test Validation

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# 01 Background

*Steel structures are widely used*



Public buildings



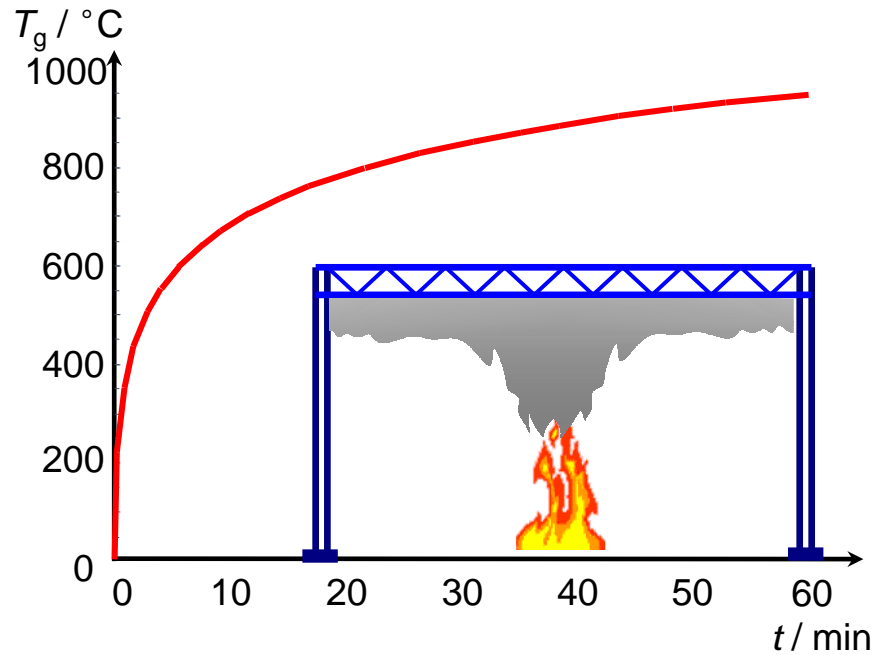
Industrial buildings

- **Advantages:** *Good* load-bearing capacity; *Large* internal space
- **Disadvantages:** *Low* in redundancy; *Poor* in fire resistance

***Building collapse accidents*** under fire in China  
Statistic data of 2019

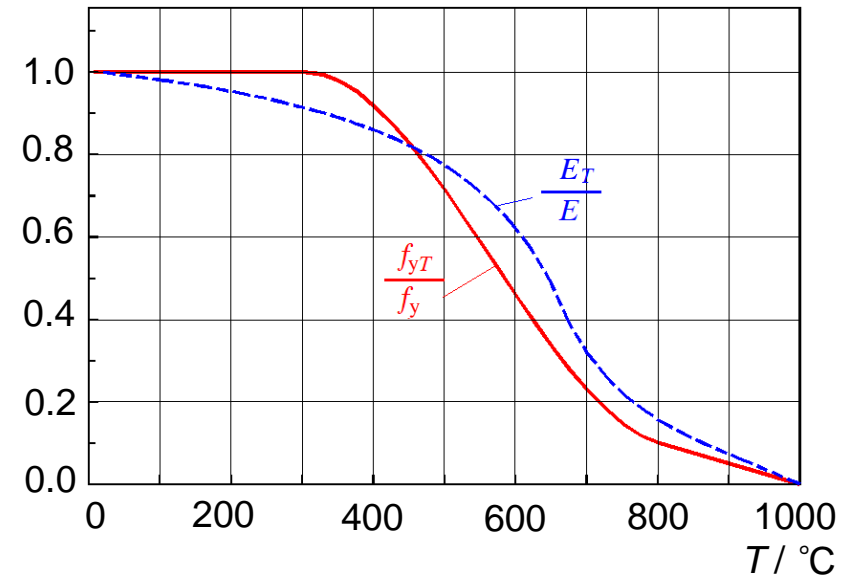
Type	Industrial	Public	Residential	Hospital & School	Office
Proportion (%)	55.6	22.2	11.1	7.4	3.7

# 01 Background



*Rapid temperature development of building fires*

Reduction factor of  $f_y$  or  $E$



*Material property degradation of steel at elevated temperatures*

# 01 Background



# 01 Background



Lives of firefighters being  
***at risk under unexpected collapse*** \*

*\* if unable to evacuate timely*

***Many cases of firefighter deaths*** caused by  
building collapse in fire

Building	Location	Time	Type	Situation	Casualties
Plasco Building	Tehran	2017	Steel	Total collapse	30 firefighters
Bowling alley	Taoyuan	2015	Steel	Roof collapse	6 firefighters
Factory building	Shanghai	2014	Steel	Total collapse	2 firefighters
Factory building	Wenzhou	2013	Steel	Total collapse	5 firefighters
Sofa super store	California	2007	Steel	Total collapse	9 firefighters

# 01 Background

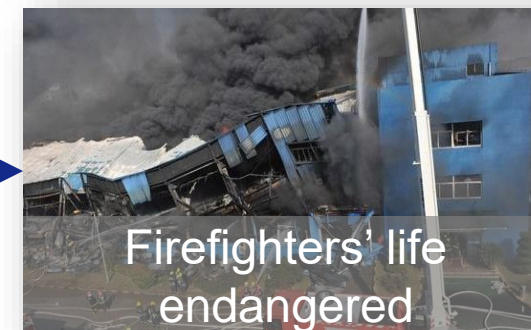
*Early warning fire-induced collapse of buildings is a critical demand for firefighters to make **scientific decision** in firefighting*



**Collapse judging too early**

**Scientifically warning collapse**

**Collapse judging too late**



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## 02 Early-warning approach

### Estimation

#### Aim

Serve *structural design*

#### Characteristics

- Can be *conducted offline*
- **Conservative conditions**
  - *Fire scenario*
  - *Load condition*
  - *Material properties*

### Early warning

#### Aim

Serve *firefighting*

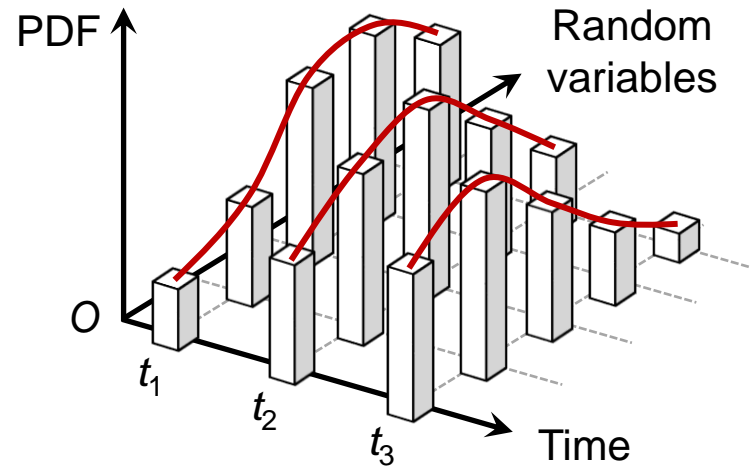
#### Characteristics

- Must be *on-site conducted*
- **Actual conditions**
  - *Uncertain at fire scenes*
  - *Influential to results*
  - *Hard to quantify*

Early warning of fire-induced collapse must consider *uncertainties* in *real time*

# 02 Early-warning approach

## Uncertainties future evolution

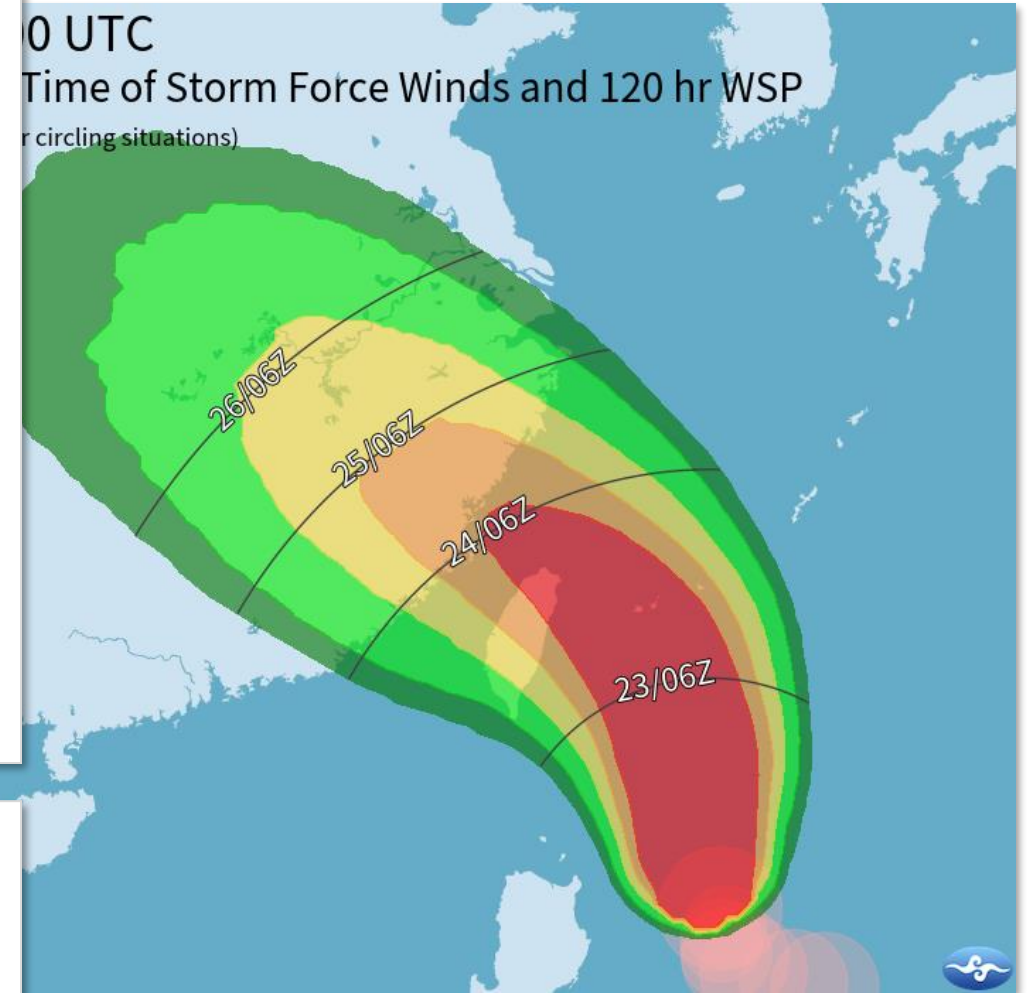


- Quantified based on *prior knowledge*
  - *Physical laws*
  - *Summarized mechanisms etc.*
- Should be *probabilistic*

## Uncertainties at current state

- Quantified based on *measured data*
- Can be *deterministic*

## Inspiration from typhoon prediction

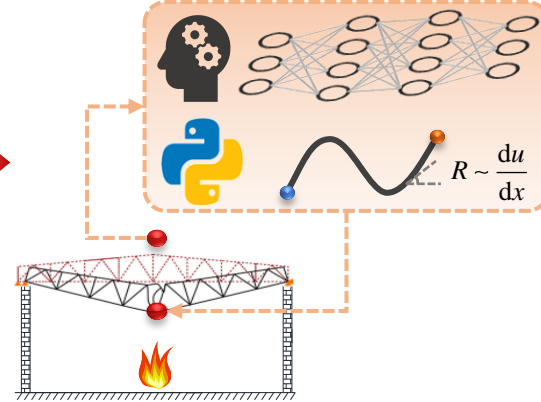


# 02 Early-warning approach

## Real-time monitoring



## On-line analysis

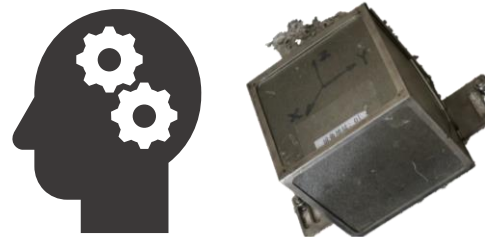


## Instant forecasting



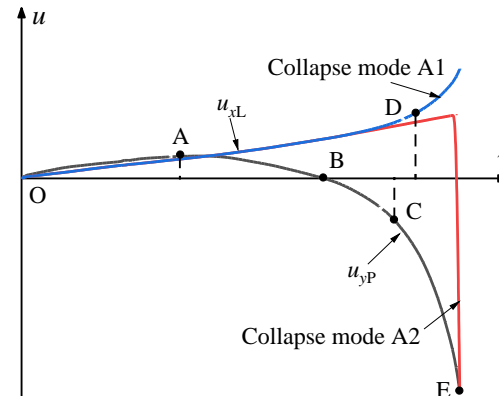
## Current uncertainties

ML and new sensors  
as *key techniques*



## Uncertainty evolution

Physical law & theory  
as *prior knowledge*



## Scientific guidance

Rescue efficiency  $\updownarrow$   
Casualties



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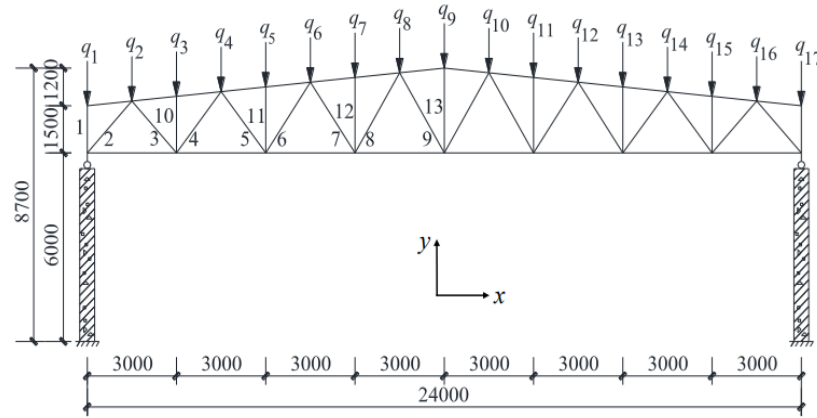
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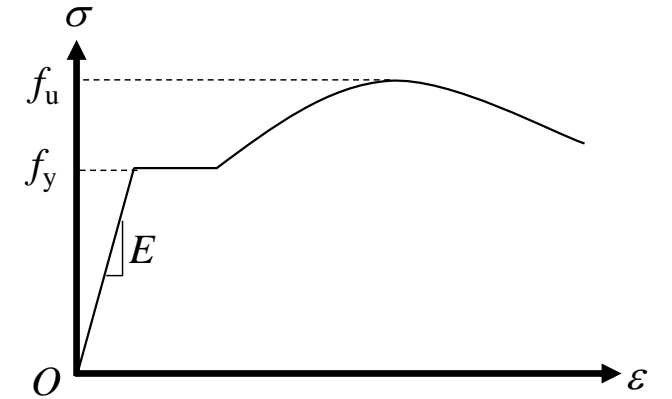
# Systematic parametric analysis considering *various uncertainties*

## 03 Early-warning theory

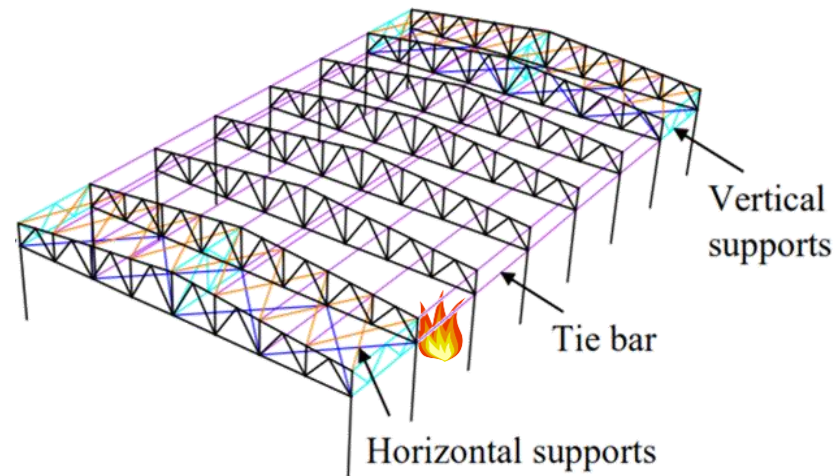
*Analysis scheme*



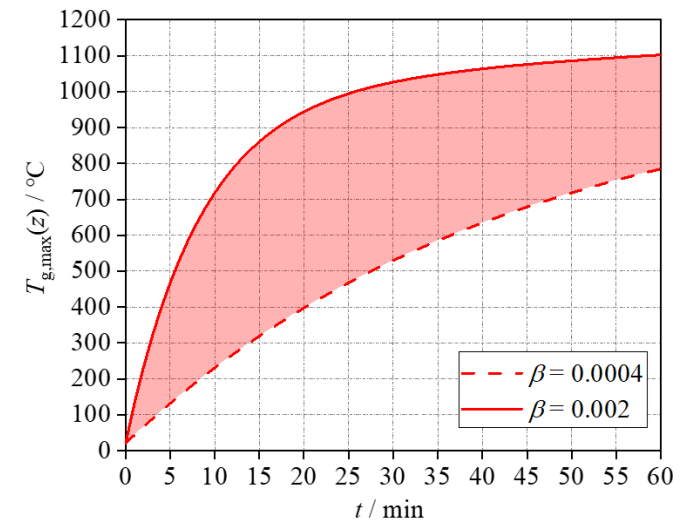
Random load and boundary conditions



Random material properties



Random fire locations

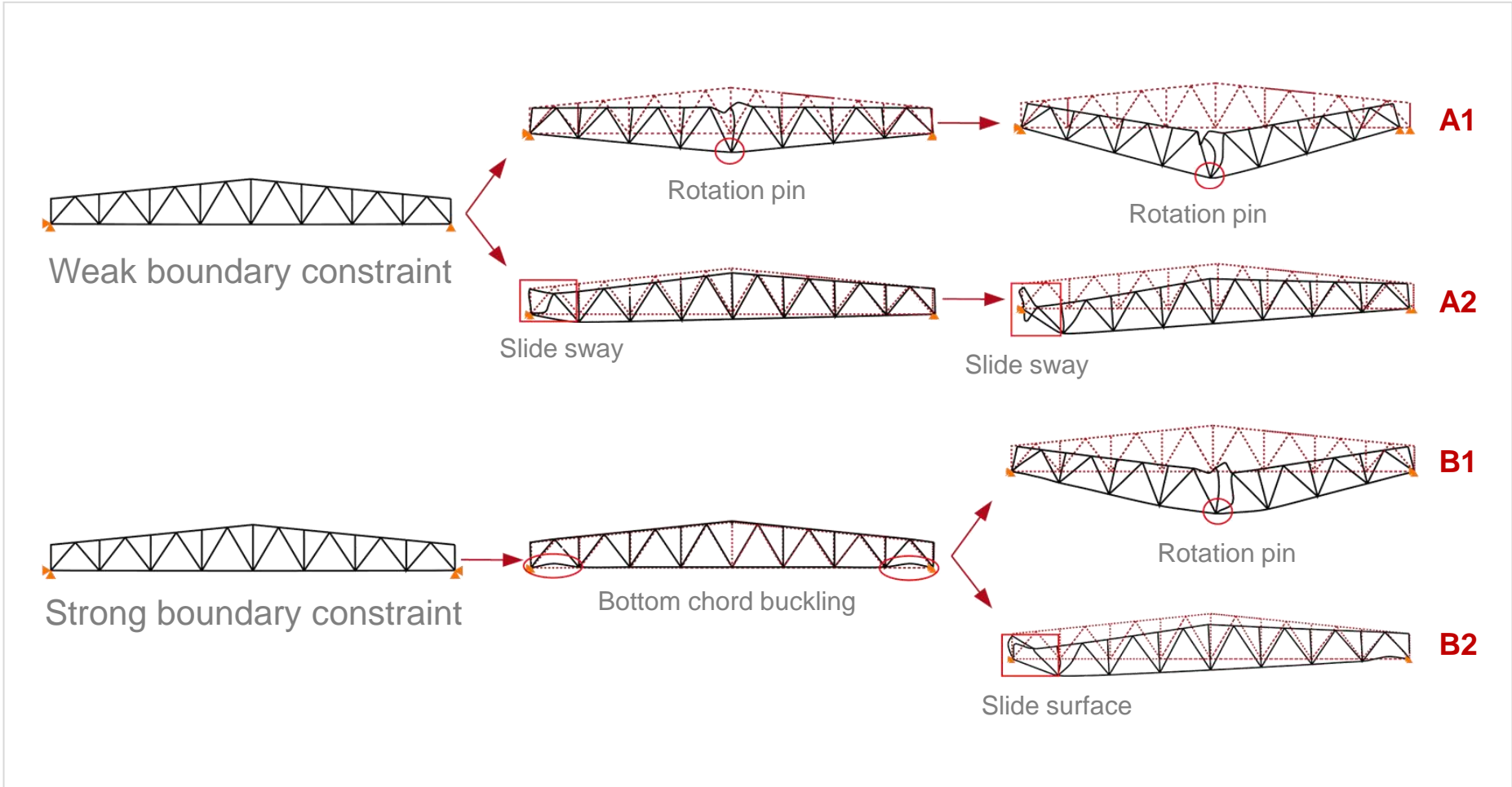


Random heat release rates

# 03 Early-warning theory

Limited potential  
collapse modes

Collapse modes are *limited* under random fire & structural conditions

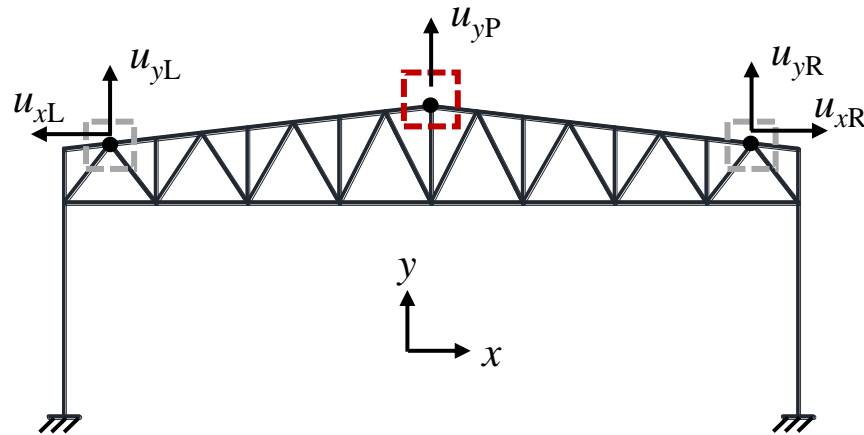


# Evolution of KPPs of steel trusses up to collapse exhibits *unique laws*

## 03 Early-warning theory

Key Physical  
Parameters (KPPs)  
and variation laws

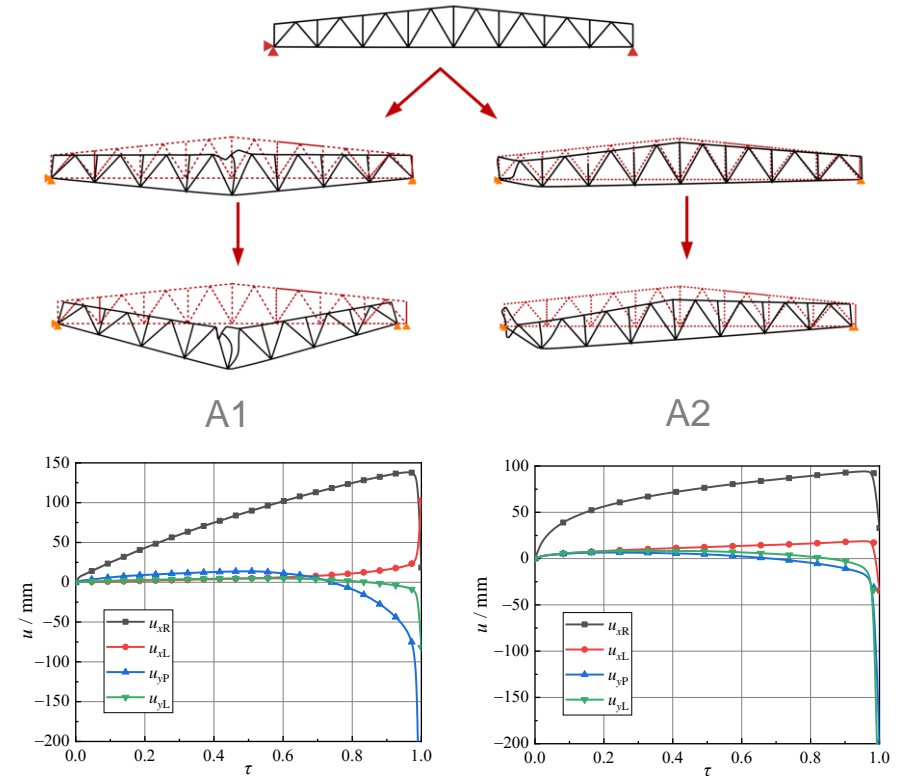
### KPPs of steel trusses



### Selection principle

- Reflect effects of *uncertainties*
- Represent actual *collapse state*
- Can be obtained *at fire scenes*

### KPP evolution for modes A



Similar for collapse modes B1 & B2

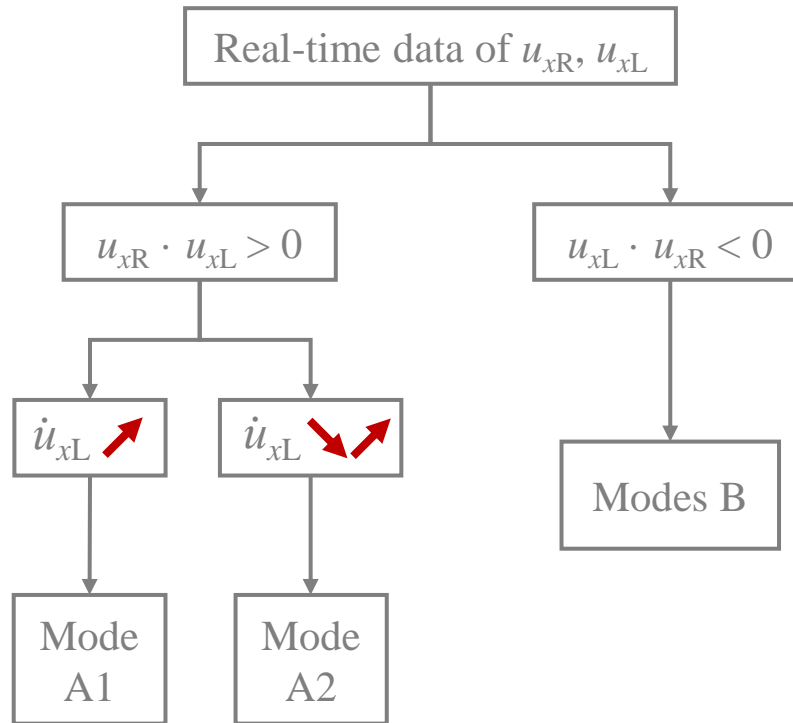
# Evolution of KPPs of steel trusses up to collapse exhibits *unique laws*

03

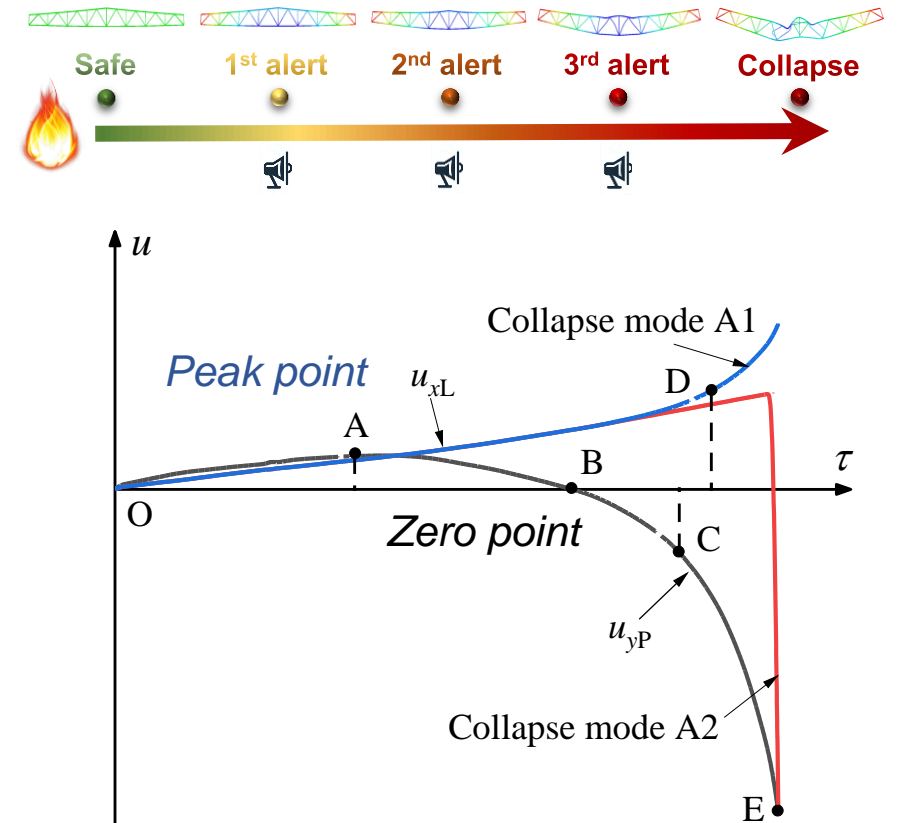
## Early-warning theory

Key Physical Parameters (KPPs) and variation laws

### Judging actual collapse mode



### Judging actual collapse state



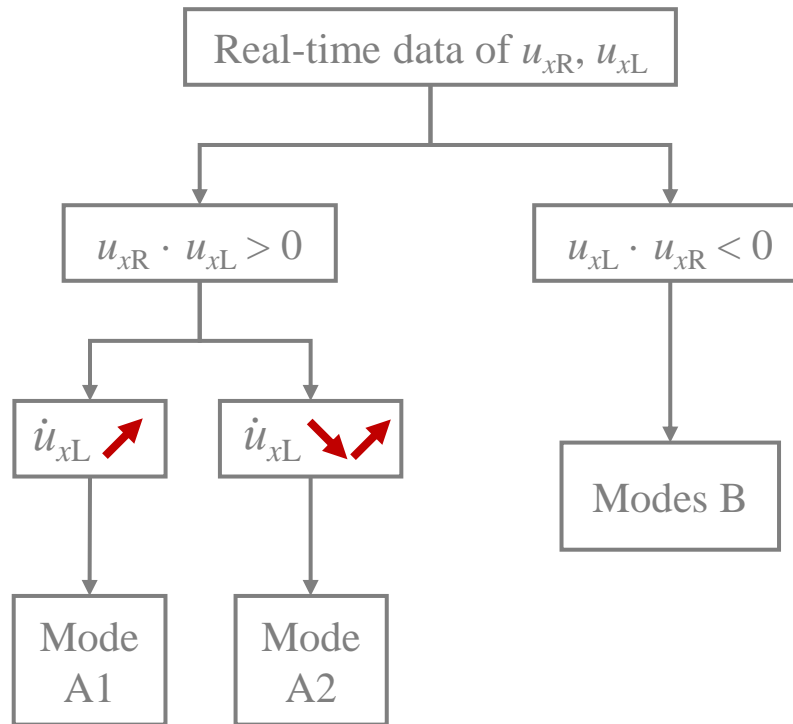
# Evolution of KPPs of steel trusses up to collapse exhibits *unique laws*

03

## Early-warning theory

Key Physical Parameters (KPPs) and variation laws

### Judging actual collapse mode



### Judging actual collapse state

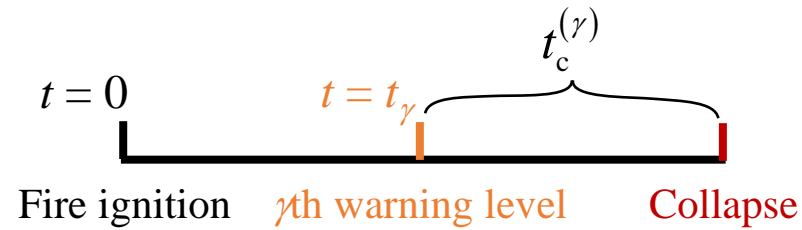


Level	Criteria	Remarks
Safe	No points	/
1st	Point A	A: $\dot{u}_{yP} = 0$
2nd	Point B	B: $u_{yP} = 0$
3rd	Point C or D	C: $\dot{u}_{yP} = 2 \times \dot{u}_{yP}^A$ D: $\dot{u}_{xL} = 2 \times \dot{u}_{xL}^A$

# 03 Early-warning theory

Prediction of  
remaining time to  
collapse (RTC)

## Problem description



## Dimensionless time ratio

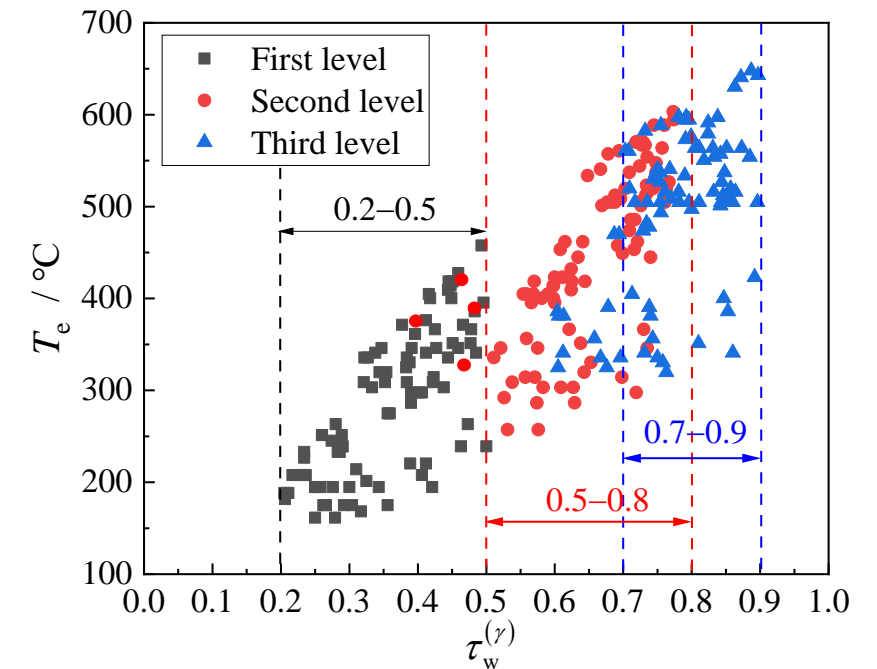
$$\tau_w^{(\gamma)} = \frac{t_\gamma}{t_\gamma + t_c^{(\gamma)}} \quad \tau_R^{(\gamma)} = \frac{t_c^{(\gamma)}}{t_\gamma} = \frac{1}{\tau_w^{(\gamma)}} - 1$$

RTC/early-warning time ratios  
less affected by actual fire exposure time

$$\text{RTC} \quad \boxed{t_c^{(\gamma)}} = \tau_R^{(\gamma)} \cdot \boxed{t_\gamma} \quad \text{Fire exposure time}$$

Determined *at fire scene*

## Pre-determination of time ratios



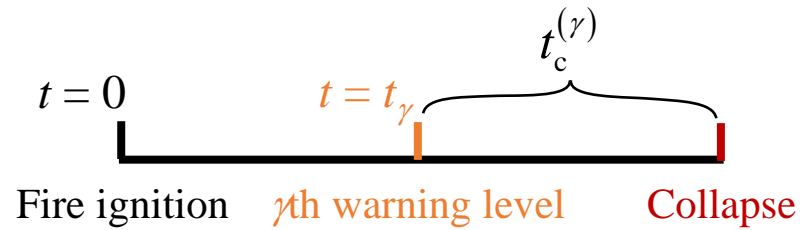
Discrete distribution of time ratios due to  
uncertainties  
Values with confidence levels can be pre-determined

# 03 Early-warning theory

Prediction of  
remaining time to  
collapse (RTC)

## The RTC can be forecast based on the *reliability theory*

### Problem description



### Dimensionless time ratio

$$\tau_w^{(\gamma)} = \frac{t_\gamma}{t_\gamma + t_c^{(\gamma)}} \quad \tau_R^{(\gamma)} = \frac{t_c^{(\gamma)}}{t_\gamma} = \frac{1}{\tau_w^{(\gamma)}} - 1$$

RTC/early-warning time ratios  
less affected by actual fire exposure time

$$\frac{\text{RTC}}{t_c^{(\gamma)}} = \tau_R^{(\gamma)} \cdot \frac{t_\gamma}{t_\gamma} \quad \text{Fire exposure time Determined at fire scene}$$

### Pre-determination of time ratios

$\alpha$	$\tau_w^{(1)}$	$\tau_R^{(1)}$	$\tau_w^{(2)}$	$\tau_R^{(2)}$	$\tau_w^{(3)}$	$\tau_R^{(3)}$
30%	0.33	2.03	0.54	0.85	0.83	0.20
40%	0.36	1.78	0.57	0.75	0.85	0.18
50%	0.39	1.56	0.65	0.54	0.86	0.16
60%	0.45	1.22	0.70	0.43	0.89	0.12
70%	0.47	1.13	0.74	0.35	0.90	0.11
80%	0.52	0.92	0.75	0.33	0.91	0.10
90%	0.58	0.72	0.78	0.28	0.93	0.08

Discrete distribution of time ratios due to  
uncertainties  
Values with confidence levels can be pre-determined

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## 04 Early-warning techniques

Some KPPs are  
hard to measure  
directly at fire  
scenes



Traditional contact measurement  
Devices are *prone to be destroyed in fire*



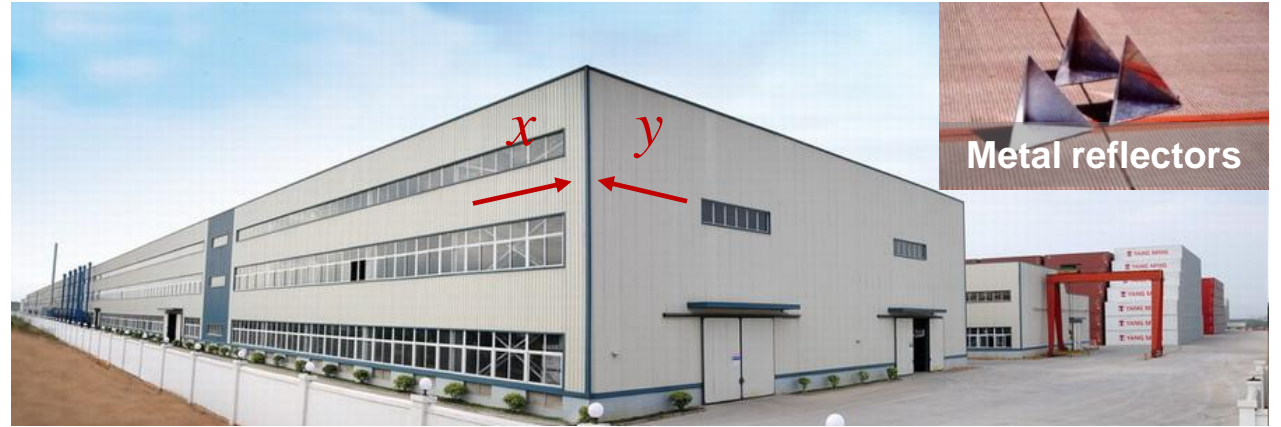
Optical non-contact measurement  
Technique is highly *sensitive to smoke*

## 04 Early-warning techniques

*Advantages of  
microwave radars*

### **Conclusion:**

Microwave radars are  
able to measure  
KPPs in fire



Microwave radar to measure KPPs at fire scene

**Accuracy:** 0.1–0.01 mm

**Working distance:**  $\geq 100$  m

**Workable** at dense smoke and high-temperature scenes

# 04 Early-warning techniques

*Limits of microwave  
radar*

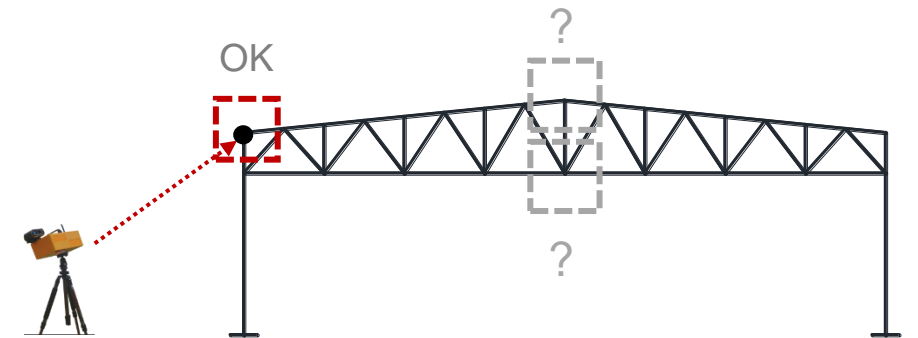
## Conclusion:

Microwave radars alone are unable to acquire complete set of KPPs in fire



Microwave radars need to “see” the position for measurement

*\* Requiring high platform*

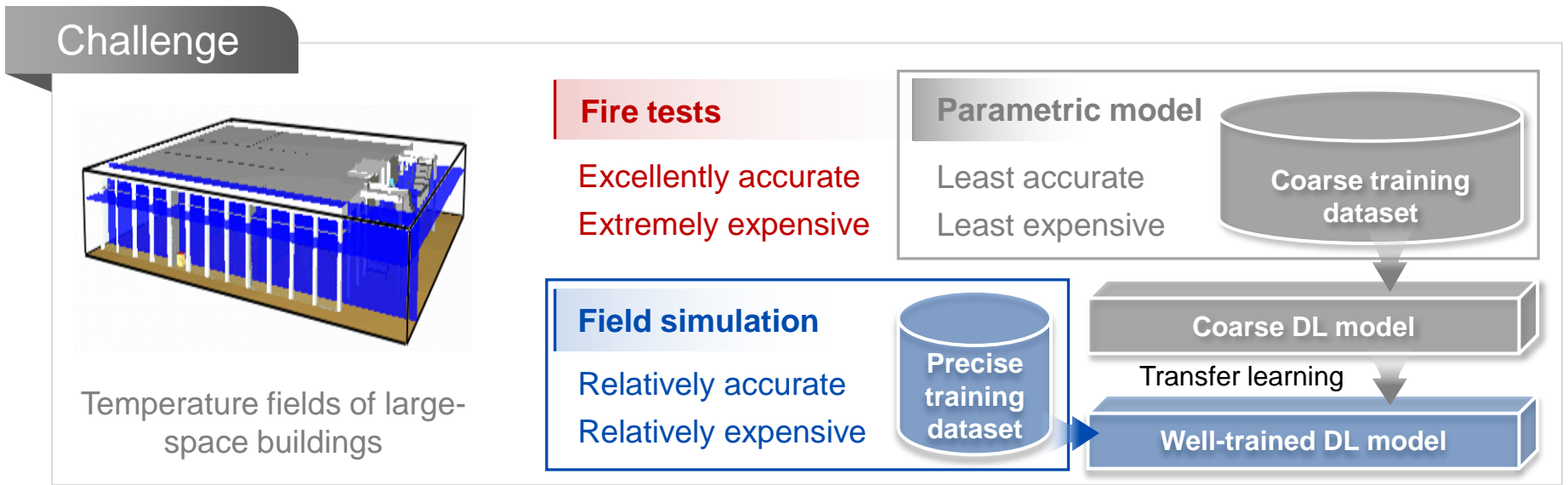
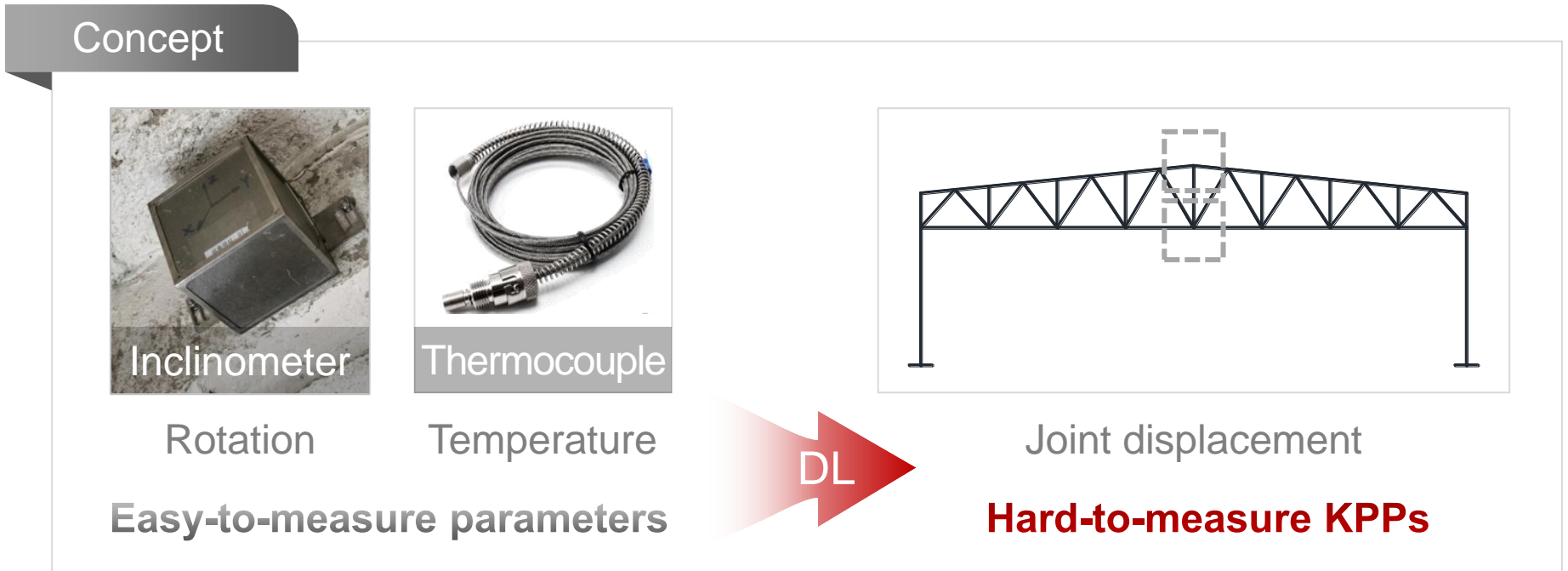


What about the ***top or interior joints*** of the building?

# 04 Early-warning techniques

*Solution*

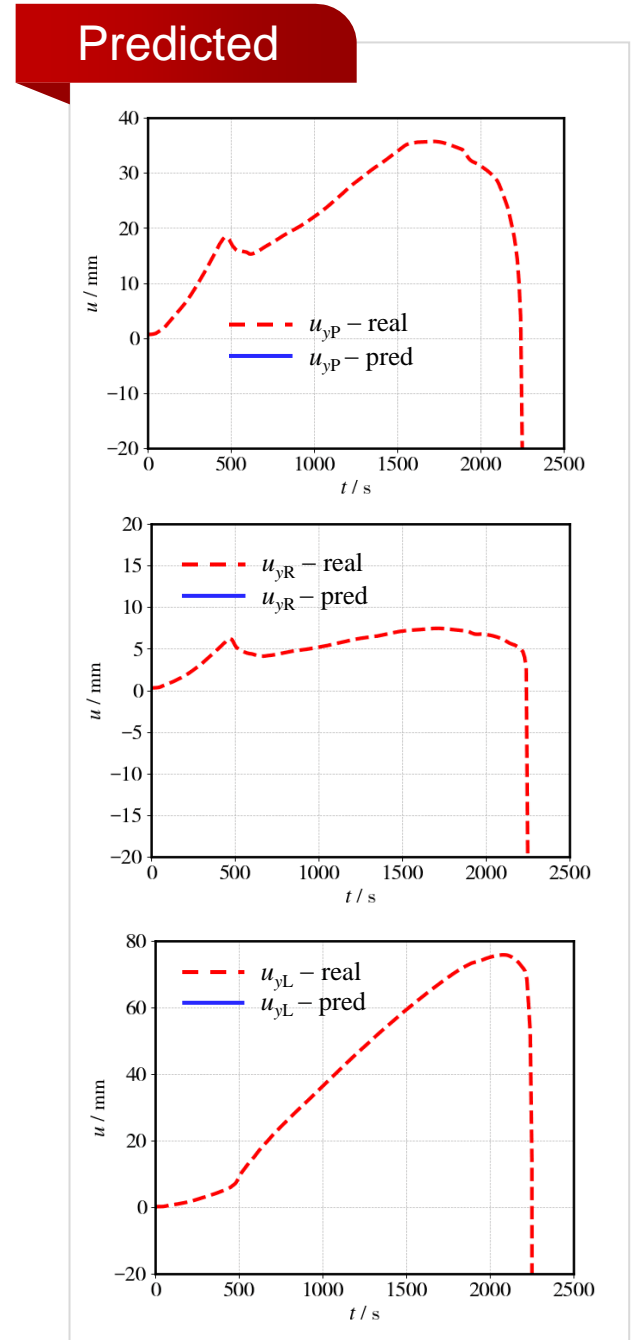
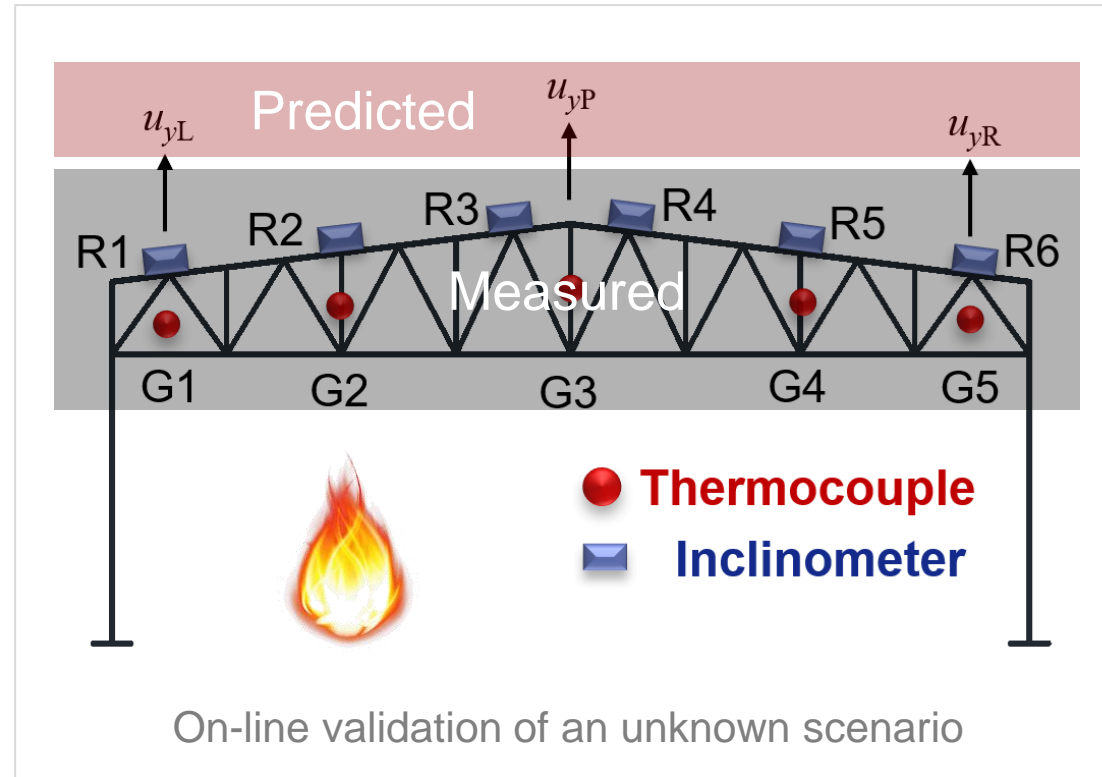
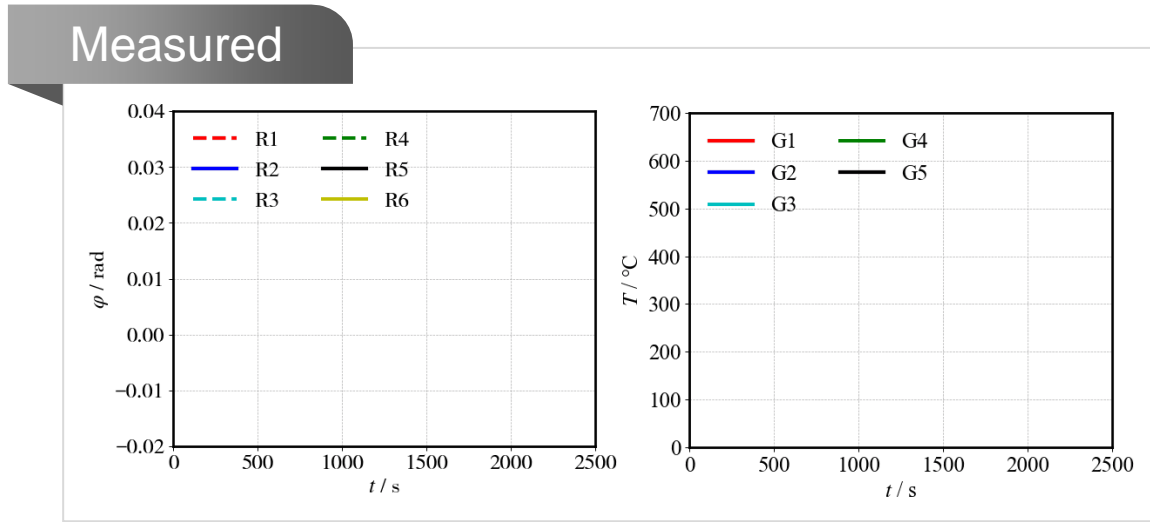
**Conclusion:**  
Pre-embedded thermocouples and inclinometers to acquire complete sets of KPPs



# 04 Early-warning techniques

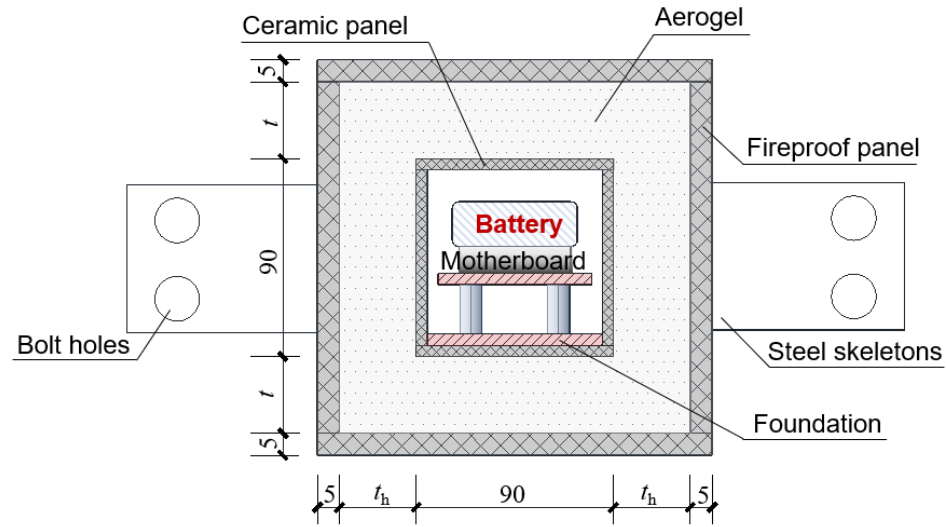
## DL Method Results

**Conclusion:**  
Real-time, accurate  
prediction of KPPs

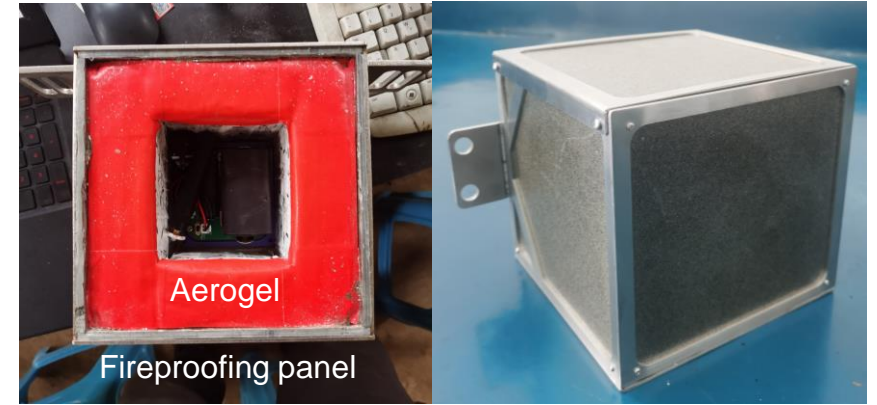


# 04 Early-warning techniques

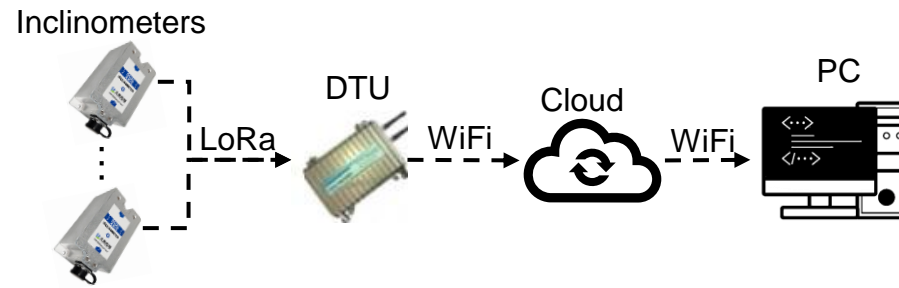
*Development of  
fire resistant  
inclinometers*



Configuration



Developed product



Wireless data communication

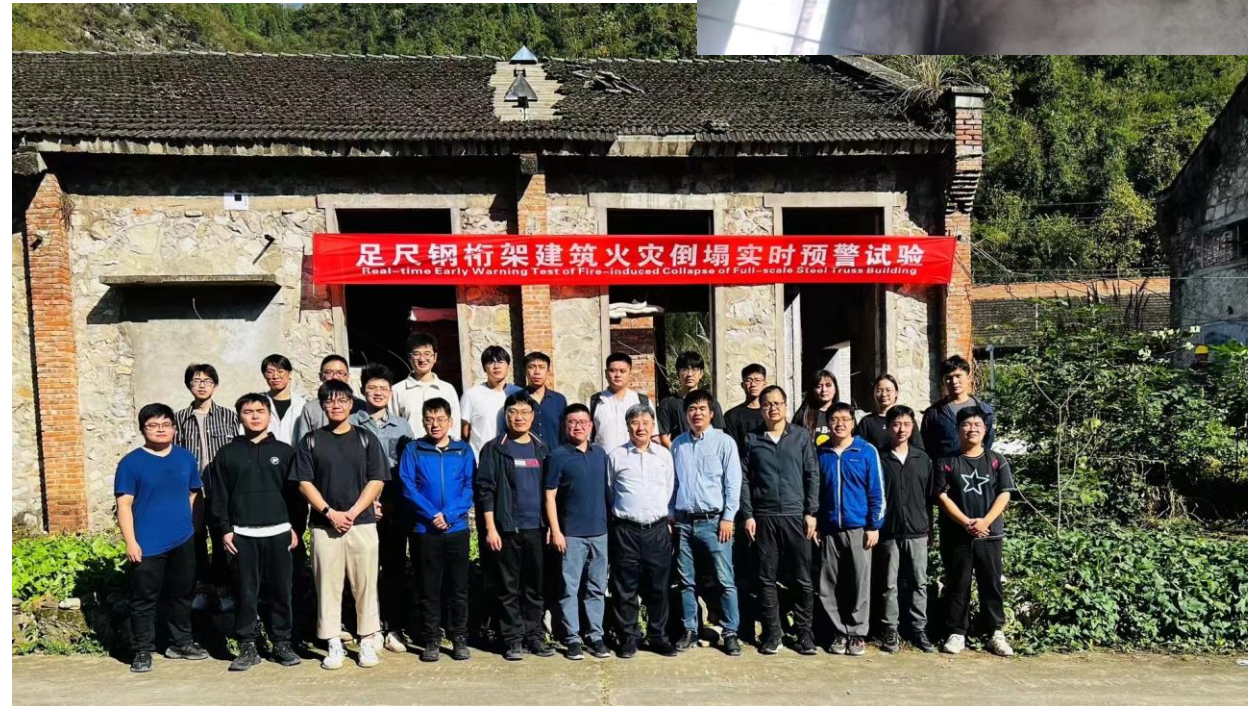
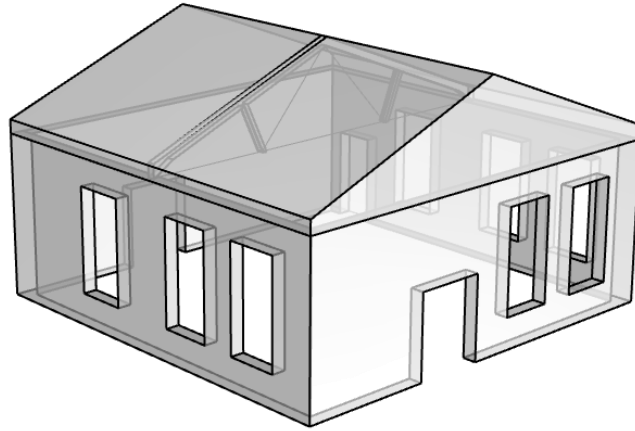
LoRa: long range radio  
(low power consumption and high  
penetration)

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# 05 Experimental validation

*Basic information*

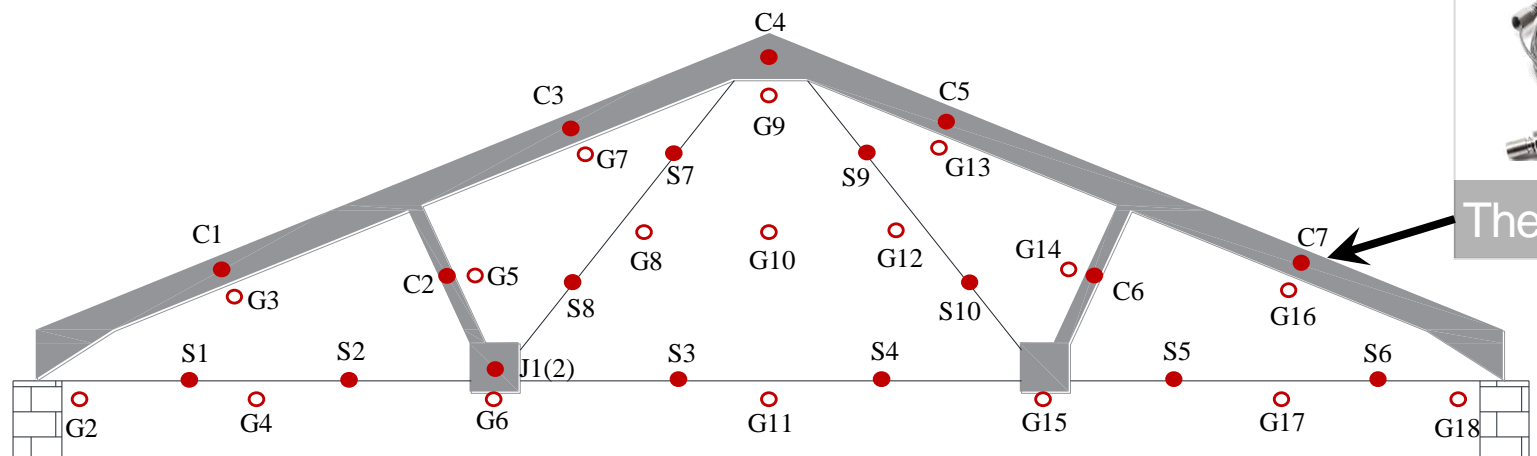
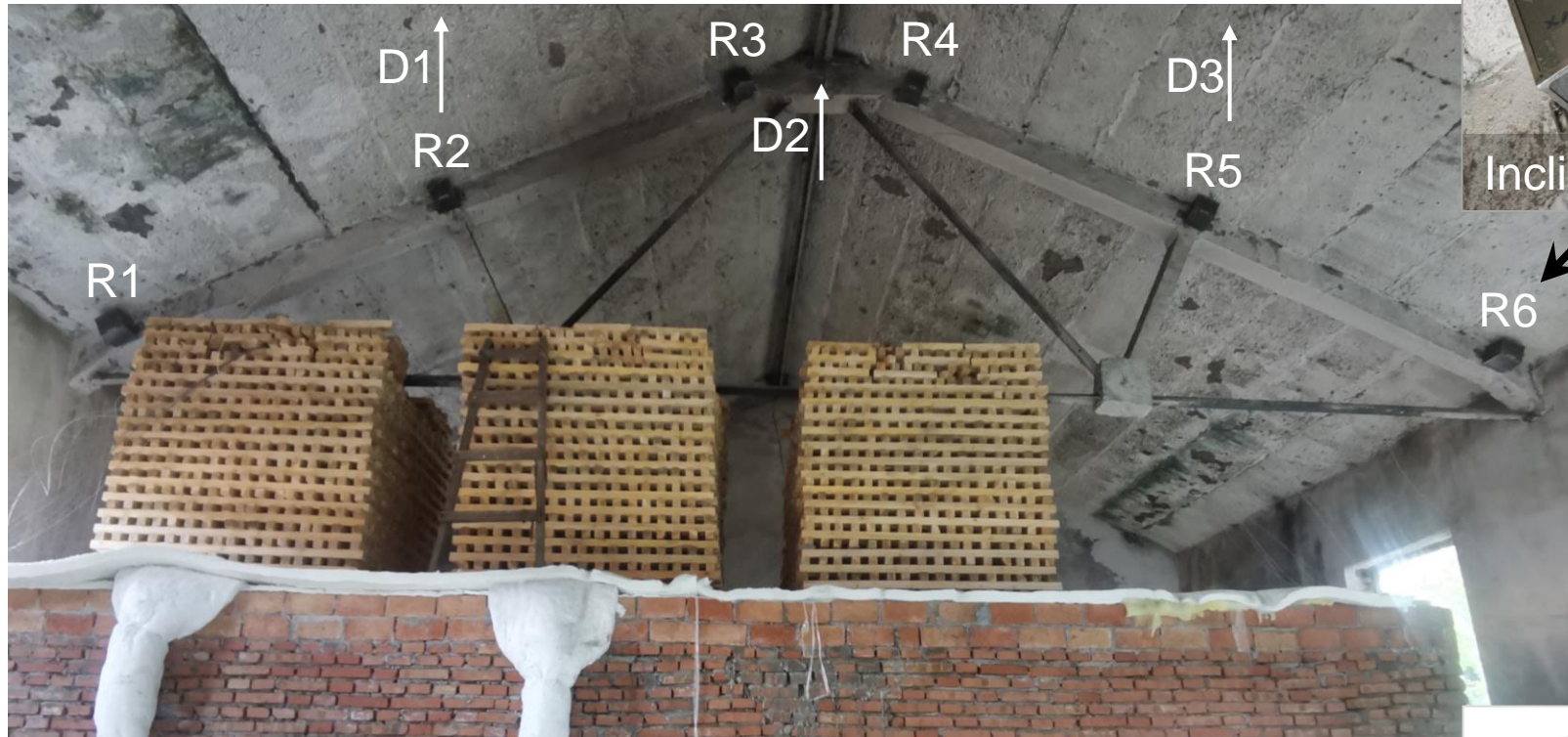


**Fire test on a real building with steel truss roof**

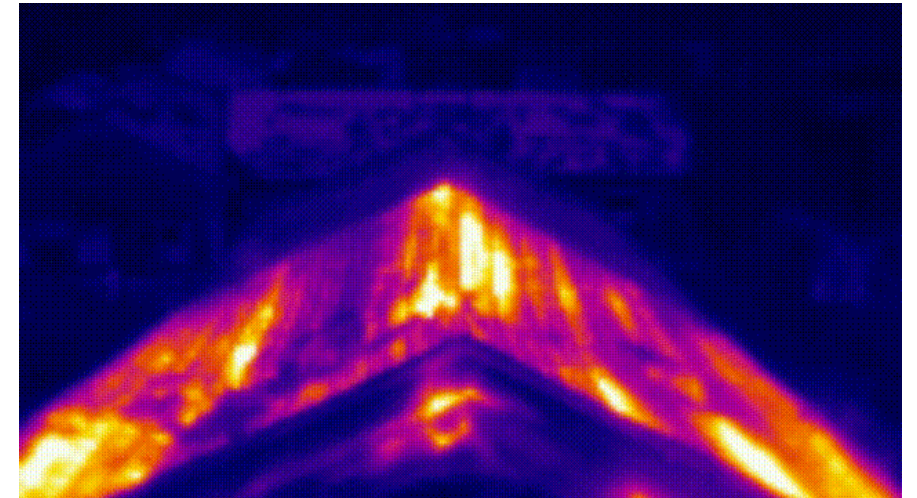
Real loads and material properties cannot be determined accurately before test

# 05 Experimental validation

*Measurement  
devices*



05  
Experimental  
validation  
*Collapse moment*



# 05 Experimental validation

Real-time early-  
warning results



Time	Relative time / s	Incident	Predicted RTC / s	Real RTC / s
10:07:06	0	Open system	/	/
10:09:16	130	Ignition	/	/
10:17:48	642	1 <sup>st</sup> warning	≥ 1972	3621
10:22:54	948	2 <sup>nd</sup> warning	≥ 1327	3315
11:05:30	3504	3 <sup>rd</sup> warning	≥ 596	759

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**Conclusions**

- **An early-warning system for fire-induced collapse of steel structures** featuring “**real-time data acquisition, on-line analysis and instant forecasting**” has been developed and validated through a real fire test.
- Steel trusses exposed to fire have **limited collapse modes**. Displacements of key joints, denoted as KPPs, exhibit **unique evolution laws** for a specific collapse mode.
- **Three-level early-warning alerts** can be issued for fire-induced collapse, based on the occurrence of **feature points** of **KPP-time curves**.
- **Hard-to-measure KPPs** can be obtained in real time using easy-to-measure parameters via **DL models**.



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Thank you for your guidance!

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