



# **A Probabilistic Model for Fire Temperature Rise in High-Rise Residential Buildings under the Action of Uncertain Factors**

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Abstract: Due to the randomness of interior combustibles, wall thermal inertia, and opening factor, the fire temperature rise in high-rise residential buildings is uncertain. This study investigated 38 urban high-rise residential buildings, created the probability density functions of fire load density, opening factor, and wall thermal inertia, and constructed random fire scenarios for urban high-rise residential buildings. On this basis, relying on the Latin Hypercube Sampling method, this study further explored the probabilistic model for fire temperature rise in urban high-rise residential buildings under the action of uncertain factors, generated the possible temperature rise curves of fires in urban high-rise residential buildings and their probability distribution, and established the most representative temperature rise curve.

**Keywords:** high-rise residential building; fire; randomness; Latin Hypercube Sampling; probability distribution; temperature rise law

# 1. Introduction

The model for fire temperature rise in high-rise residential buildings is of great significance for the fire protection design, risk assessment, and fire rescue of buildings, offering an important indicator for scientific research on fires in high-rise residential buildings. To date, many scholars have built models for fire temperature rise in buildings, such as the three parametric models for post-flashover temperature rise given by Babrauskas [1,2], Mccaffrey et al. [3], and Law [4]. Among them, Law's model is most commonly used. The equations developed for the model based on many international fire tests have shown that the model can fully reflect fire characteristics during flashover. In other words, fire space and opening characteristics determine the combustion state and room temperature during flashover. Magnusson et al. [5,6] proposed a set of temperature rise curves to describe fires in enclosures. These curves are related to the room opening factor and fire load and are often called "Swedish curves". The temperature rise curves of EUROCODE parameters have been given based on an approximate simulation of Swedish curves. Welch et al. [7] and Lennon and Welch et al. [8] conducted full-scale fire tests in a factory building  $12 \text{ m} \times 12 \text{ m} \times 3.4 \text{ m}$ (length  $\times$  width  $\times$  height) in size at Cardington with the aid of the British Building Research Establishment (BRE). They found that the temperature decay stage during a fire could not be ignored and revised the scope of application of the temperature rise curves of EUROCODE parameters. Based on analyzing fire test data, the American Society of Civil Engineers proposed an empirical model for room temperature rise [9], considering relevant parameters based on thermodynamic theories. The model considers fire load, opening factor, and wall material properties to control fires through ventilation.

However, the above models summarize temperature rise curves in specific fire scenarios. They use a deterministic formula to express fire temperature rise in high-rise residential buildings but have ignored many random factors affecting such models, such as the fire load in buildings and the size of ventilation openings. The Design Guide has explored the



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**Copyright:** © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). randomness of fire scenarios as follows: Structure Fire Safety CIB W14 Workshop Report (Code CIB14) [10], the JCSS Probabilistic Model Code (JCSS) [11], the EUROCODE [6], the Japanese Code [12], and the SFPE Handbook of Fire Protection Engineering (SFPE) [13]. These are accompanied by research from scholars such as Jin et al. [14], Xia et al. [15], Zhang [16], Wang [17], Culver [18], and Melinek [19]. The probability distributions of factors such as fire load in some buildings have also been given. Wen et al. [20] proposed the fire temperature rise formula for large timber buildings considering the influence of building area, building height, fire source power, and other factors on fires. Based on the investigation results, Zhang et al. [21] used fire simulation software (FDS) to calculate the practical heating-up curves of sample bedrooms.

Due to the differences between buildings and the uncertainties with fire occurrence and development, the interior combustibles, wall thermal inertia, and opening factor size of fire-exposed rooms are all random to varying degrees, causing the uncertainty of fire temperature rise in high-rise residential buildings. In that context, this study investigated the random factors of fires in high-rise residential buildings, striving to solve the problem of uncertainties with the model for fire temperature rise in high-rise residential buildings under random factors based on the Latin Hypercube Sampling method.

#### 2. Model for Fire Temperature Rise in High-Rise Residential Buildings

#### 2.1. Key Affecting Factors of Fires

#### 2.1.1. Fire Load Density

Fire load density refers to the total energy released by the combustion of all interior combustibles per unit area. It is an important indicator used to evaluate the fire risk to buildings. It can be calculated from the following formula:

$$q = \frac{\sum m_i h_i}{A},\tag{1}$$

where *q* is fire load density (MJ/m<sup>2</sup>);  $m_i$  is the mass of combustibles (kg);  $h_i$  is the calorific value of the material (MJ/kg) that can be measured using the oxygen bomb calorimetric method; *A* is room area (m<sup>2</sup>).

#### 2.1.2. Opening Factor

Studies have shown that [22] in a post-flashover fire, factor  $A_v \sqrt{H_v}$  (where  $A_v$  is the opening area and  $H_v$  is the opening height) is directly proportional to the rate of mass flow through the opening. The factor is referred to as the ventilation factor. The value of the opening factor is equal to that of the ventilation factor divided by the total interior surface area. The ventilation factor and the opening factor can be calculated from Equations (2)–(4):

$$A_v = \sum A_i,\tag{2}$$

$$H_{\rm v} = \frac{\sum A_i H_i}{A_v},\tag{3}$$

$$\eta = \frac{A_v \sqrt{H_v}}{A_t},\tag{4}$$

where  $A_i$  is the area of the *i*th opening (m<sup>2</sup>);  $H_i$  is the height of the *i*th opening (m);  $A_t$  is the surface area of the room (m<sup>2</sup>);  $\eta$  is the opening factor (m<sup>1/2</sup>).

# 2.1.3. Wall Thermal Inertia

Wall thermal inertia is a dimensionless indicator characterizing the attenuation rate of periodic temperature waves inside enclosures.

The thermal inertia indicator  $\sqrt{k\rho c}$  involves three parameters, i.e., thermal conductivity *k*, density  $\rho$ , and specific heat capacity *c*. Some scholars have studied the thermal inertia

Material	k (W/m⋅K)	ho (kg/m <sup>3</sup> )	c (J/kg·K)	$k\rho c$ (W <sup>2</sup> s/m <sup>4</sup> K <sup>2</sup> )
Aluminum	218	2700	890	$5.2 imes10^8$
Copper	395	8920	385	$1.4 imes10^9$
Steel	45	7820	460	$1.6 imes10^8$
Brick	0.69	1600	840	$9.3 imes10^5$
Concrete	0.8 - 1.4	1900-2300	880	$2 imes 10^6$
Lightweight concrete	0.15	500	1000	$7.5  imes 10^4$
Glass	0.8	2600	840	$1.8 imes10^6$
Cork plate	0.08	500	1000	$4.0 imes10^4$

of common wall materials and summarized their thermal inertia parameters, as provided

 Table 1. Thermal inertia parameters of some materials.

#### 2.2. Standard Temperature Rise Models

in Table 1:

2.2.1. ISO Standard Temperature Rise Model

The standard temperature–time curve given by the International Organization for Standardization in 1991 (i.e., the "ISO 834" curve) has been the most widely used fire temperature rise curve globally in recent years:

$$T = 345\log(8t + 1) + 20,$$

where *T* is mean room temperature (°C); *t* is time (min). However, the standard temperature rise model cannot satisfactorily reflect the randomness of fires.

#### 2.2.2. EUROCODE Model

The EUROCODE model, developed by the European Committee for Standardization based on the temperature rise model built by Magnusson and Thelandersson, gives a room fire temperature–time curve according to fire load density, opening factor, and wall materials' thermophysical properties. The model divides fire development into two stages, i.e., the temperature rise stage and the temperature decline stage. They can be calculated as follows:

ť

Temperature rise stage  $t^* \leq t_m^*$ ,

$$T = 20 + 1325 \left( 1 - 0.324 e^{-0.2t^*} - 0.204 e^{-1.7t^*} - 0.472 e^{-19t^*} \right),$$
(5)

Temperature decline stage  $t^* > t_m^*$ 

$$T_g = T_{gm} - 625(t^* - t_m^*) \qquad t_m^* \le 30 \text{ min},$$
 (6)

$$T_g = T_{gm} - 250(3 - t_m^*)(t^* - t_m^*) \qquad 30 \min < t_m^* \le 120 \min, \tag{7}$$

$$T_g = T_{gm} - 250(t^* - t_m^*)$$
  $t_m^* > 120 \text{ min},$  (8)

$$^{*}=\Gamma \cdot t/60, \tag{9}$$

$$t_m^* = \Gamma \cdot t_m / 60, \tag{10}$$

$$\Gamma = \frac{(\eta/0.04)^2}{\left(\sqrt{k\rho c}/1160\right)^2},$$
(11)

$$t_m = \frac{0.13 \times 10^{-3} q}{\eta} * 60, \tag{12}$$

where  $\sqrt{k\rho c}$  is the wall thermal inertia parameter of fire-exposed rooms. When the room wall is composed of different materials, the weighted mean is taken by the area;  $\eta$  is the opening factor; q is fire load density;  $t_m$  is the duration of the temperature rise stage (min);  $T_{gm}$  is the temperature at  $t_m$ ;  $\Gamma$  is the correction factor.

# 3. Random Factors Investigation of Fires in High-Rise Residential Buildings

According to the EUROCODE model, fire load density, opening factor, and the wall thermal inertia of fire-exposed rooms are all important parameters that affect fire temperature rise in buildings. Moreover, due to the differences between buildings and the uncertainties with fire occurrence and development, the interior combustibles and opening factor size of fire-exposed rooms are somewhat random.

# 3.1. Fire Load Density

High-rise residential buildings were screened according to the Chinese Code [23] and were divided into four categories based on the year of construction: less than 5 years old, 5–10 years old, 15–20 years old, and more than 20 years old. Each category was randomly selected, resulting in 38 buildings. The authors derived the distribution laws of fire load density by investigating and sampling 38 urban high-rise residential buildings and conducting the classified statistics and analysis of samples. The investigation field is shown in Figures 1 and 2:



Figure 1. Combustibles on the balcony.



Figure 2. Combustibles in the living room.

When investigating the fire load density of high-rise residential buildings, the combustion calorific value of various indoor combustible items was calculated. The amount of combustible materials obtained from the investigation and the area of each room were used to calculate the fire load density of different rooms in each residential building. The maximum, minimum, mean, and standard deviation of fire load density were solved for each of the six rooms, i.e., living room, bedroom, kitchen, study, bathroom, and balcony. The statistics for different types of rooms are provided in Table 2:

**Table 2.** Statistics of fire load density for different types of rooms.

Room Type —	Fire Load Density (MJ/m <sup>2</sup> )			
	Maximum	Minimum	Mean	Standard Deviation
Living room	383.33	51.8	181.2	80.05
Bedroom	1180.68	48.04	499.09	192.93
Kitchen	1822.02	110.94	440.98	360.51
Study	432.12	206.67	292.82	86.39
Bathroom	557.42	92	233.03	114.22
Balcony	372	45	133.29	75.28
All rooms	1822.02	45	339.11	246.6

Fitting results showed that fire load density obeyed log-normal distribution. Figure 3 shows the cumulative probability function (CDF) of fire load density for the investigated high-rise residential buildings. The fire load density values corresponding to cumulative probabilities of 50%, 80%, and 90% were 265.84 MJ/m<sup>2</sup>, 498.29 MJ/m<sup>2</sup>, and 616.49 MJ/m<sup>2</sup>, respectively.



Figure 3. CDF of fire load density for high-rise residential buildings.

# 3.2. Ventilation Factor

Similarly, the ventilation factors of different types of rooms in different buildings were also investigated, covering opening height, opening length, the distance from the bottom of the opening to the ground, the distance from the left side of the opening to the left wall, and the distance from the right side of the opening to the right wall. The classified statistics and analysis of samples were conducted, and the ventilation factor's maximum, minimum, mean, and standard deviation values were obtained. The investigation field is shown in Figures 4 and 5. The statistics for different types of rooms are provided in Table 3.



Figure 4. Ventilation opening of the balcony.



Figure 5. Ventilation opening of the living room.

Table 3. Statistics of	ventilation	factor for	different typ	es of rooms.

Room Type —	Ventilation Factor (m <sup>5/2</sup> )			
	Maximum	Minimum	Mean	Standard Deviation
Living room	37.98	0.93	8.38	8.21
Bedroom	18.91	1.51	7.53	4.57
Kitchen	16.99	0.6	4.90	3.35
Study	4.15	1.28	2.75	0.79
Bathroom	4.41	0.18	1.24	1.22
Balcony	71.59	1.52	14.98	17.71
All rooms	71.59	0.18	7.28	8.94

Figure 6 shows the CDF of the ventilation factor for the investigated high-rise residential buildings, where the values corresponding to cumulative probabilities of 50%, 80%, and 90% were  $4.71 \text{ m}^{5/2}$ ,  $0.8 \text{ m}^{5/2}$ , and  $13.46 \text{ m}^{5/2}$ , respectively.



Figure 6. CDF of ventilation factor for high-rise residential buildings.

#### 3.3. Wall Thermal Inertia

Currently, wall materials commonly used for urban high-rise residential buildings mainly include clay bricks (hollow), powder ash air-entrained concrete, and lightweight aggregate concrete, the last of which is most widely applied. According to the literature review, a positive correlation exists between thermal conductivity and density for clay bricks, air-entrained concrete, and lightweight aggregate concrete. Specific heat capacity remains relatively stable and can be taken as a deterministic parameter.

The literature [24] holds that the wall thermal inertia  $\sqrt{k\rho c}$  of fire-exposed rooms obeys uniform distribution. The thermal inertia and statistical characteristics of common building materials are provided in Table 4.

Material	Clay Brick	Air-Entrained Concrete	Lightweight Aggregate Concrete
$\sqrt{k\rho c} (J/m^2 \cdot K \cdot s^{1/2})$	800–950	220-460	1405–2170
Mean of $\sqrt{k\rho c}$ (J/m <sup>2</sup> ·K·s <sup>1/2</sup> )	875	340	1787.5
Standard deviation of $\sqrt{k\rho c} (J/m^2 \cdot K \cdot s^{1/2})$	43.3	69.3	220.8

Table 4. Thermal inertia and statistical characteristics of common building materials.

# 4. Probabilistic Model for Fire Temperature Rise in High-Rise Residential Buildings under the Action of Uncertain Factors

# 4.1. Basic Idea

4.1.1. Latin Hypercube Sampling Method

Monte Carlo simulation can produce a group of random variables with corresponding distribution according to the distribution of each random variable (if the probability distribution of random variables and the limit state equation are predetermined). Then, by substituting them into the limit state equation, the following equation can be produced:

$$z = g(x_1, x_2, x_3 \dots x_n).$$
 (13)

A group of random variables Z can be obtained with N number of tests.

4.1.2. Probabilistic Model for Fire Temperature Rise under the Action of Uncertain Factors

The probabilistic model for fire temperature rise under the action of certain factors can be obtained from the temperature rise model in Section 2.2. However, as the occurrence of a fire is a dual-coupling process with randomness and determinacy, the variables in the mathematical model include fire load density, wall thermal inertia, and opening factor. The probabilistic model for fire temperature rise in high-rise residential buildings is somewhat uncertain and obeys probability distribution.

Therefore, based on Section 4.1.1, the Latin Hypercube Sampling method was used in the computer sampling simulation on the uncertain factors in the temperature rise process. The probability density function (PDF) was employed to describe the randomness of the uncertain factors in the temperature rise process. Then, the expected probability distribution of temperature was determined, as shown in Figure 7. Furthermore, the model's output was analyzed statistically to determine the statistical characteristics of the output, such as the PDF and CDF.



Figure 7. Flow chart of uncertainty analysis in fire temperature rise.

#### 4.2. Random Scenarios Construction

According to the investigation data, fire load density showed a log-normal distribution with a mean of  $339.11 \text{ MJ/m}^2$  and a standard deviation of  $246.60 \text{ MJ/m}^2$ , so its PDF is

$$f(\mathbf{q}) = \frac{1}{0.701\sqrt{2\pi}\mathbf{q}} e^{-\frac{(\ln \mathbf{q} - 5.59)^2}{0.9828}}.$$
 (14)

The opening factor showed a log-normal distribution with a mean of 0.2  $m^{1/2}$  and a standard deviation of 0.2  $m^{1/2}$ , so its PDF is

$$f(\eta) = \frac{1}{0.8326\sqrt{2\pi\eta}} e^{-\frac{(\ln\eta - 1.9560)^2}{1.3863}}.$$
(15)

The wall materials of urban high-rise residential buildings are largely lightweight aggregate concrete. Therefore,  $\sqrt{k\rho c}$  showed a uniform distribution with a mean of 1787.5 J/m<sup>2</sup>·K·s<sup>1/2</sup>, a standard deviation of 220.8 J/m<sup>2</sup>·K·s<sup>1/2</sup>, and a range of [1405, 2170], so its PDF is

$$f\left(\sqrt{k\rho c}\right) = \frac{1}{765}.$$
(16)

In conclusion, the distribution laws of fire load density, opening factor, and wall thermal inertia can be summarized in Table 5:

Table 5. Probability distribution of parameters.

Parameter	Distribution Type	Mean	Standard Deviation
Fire load density (MJ/m <sup>2</sup> )	Log-normal distribution	339.11	246.60
Opening factor $(m^{1/2})$	Log-normal distribution	0.2	0.2
Wall thermal inertia $(J/m^2 \cdot K \cdot s^{1/2})$	Uniform distribution	1787.5	220.8

#### 4.3. Probability Distribution of Temperature Rise Model

Uncertain factors such as fire load density, opening factor, and wall thermal inertia were sampled using MATLAB's Latin Hypercube Sampling method. Sampling was performed 7000 times for the three parameters to guarantee a precision of 99.9%.

#### 4.3.1. Distribution Laws of Temperature Rise Time

The fire load density and opening factor obtained from sampling were substituted into the EUROCODE model to solve the value of  $t_m$ , and the calculated data were used to draw the time probability distribution histogram corresponding to the highest temperature, as shown in Figure 8.





The K–S test was carried out on time required by the highest temperature using SPSS software, and it was found that the logarithm value satisfied normal distribution. Therefore, the time satisfied the log-normal distribution. The time corresponding to the highest temperature satisfied a log-normal distribution with a mean of 26.46 min and a standard deviation of 38.26 min, so its PDF is

$$f(t_m) = \frac{1}{1.081\sqrt{2\pi}t_m} e^{-\frac{(\ln t_m - 2.69)^2}{2.337}}.$$
(17)

where  $t_m$  is the time corresponding to the highest temperature (min).

4.3.2. Distribution Laws of the Highest Temperature

The solved time corresponding to the highest temperature was substituted into Formula (9) to obtain the corrected time  $t^*$ , which was further substituted into Formula (5) to acquire the highest fire temperature, as shown in Figure 9. The highest temperature occurred most frequently within the range of 1100–1200 °C. The mean and standard deviation of the highest temperature were 873.3 °C and 286.3 °C, respectively.





After subjecting the solved data to the K–S test, it was found that they satisfied neither normal distribution nor log-normal distribution. In that case, the distribution histogram was drawn using MATLAB, and the distribution curve was fitted. Taking the highest temperature as the abscissa and frequency as the ordinate, MATLAB was used to solve the fitted equation of the fitted curve with the *cftool* function. Then, Gaussian distribution fitting was performed. It can be observed from the histogram that the discrete degree of data differed between the two sides of the highest point, so the logarithm value was taken to fit the PDF of the highest temperature, as shown in Equation (18):

$$f(T_m) = 0.1474 e^{-\frac{(\ln T_m - 7.172)^2}{1.9966}},$$
(18)

The sum of squares due to error (SSE) between the fitted equation and the original function was 0.007943, i.e., close to 0. Therefore, taking the logarithm value for temperature produced a desirable fitting effect.

#### 4.3.3. Most Representative Temperature Rise Curve

Based on the probability distribution proposed above, the temperature rise curve with the highest probability in the case of a fire in urban high-rise residential buildings can be given. Specifically, the correction factor was 5.31, the maximum temperature rise time was 14.73 min, and the highest temperature was 984 °C. We compared that to the standard temperature rise curve, as shown in Figure 10. According to the picture, compared with the standard temperature curve, there is a turning point in the temperature curve of urban high-rise residential buildings, and the time needed to reach the highest temperature is shorter. By comparing it with the experimental data [25], it was found that there is a turning point of temperature change in both of them, appearing about 900 s after the fire.



(a) Temperature rise curve for urban high-rise residential buildings



# (b) Standard temperature rise curve

**Figure 10.** Comparison of temperature rise curve for urban high-rise residential buildings and standard temperature rise curve.

# 5. Conclusions

Modeling fire temperature rise in high-rise residential buildings offers an important indicator for scientific research on fires in high-rise residential buildings. To date, many scholars have built models for fire temperature rise in buildings. However, these models summarize temperature rise curves in specific fire scenarios. They use a deterministic formula to express the rise of fire temperature in high-rise residential buildings but ignore many random factors affecting such models.

This study investigated 38 urban high-rise residential buildings in Chinese cities with a population of more than 10 million, created the PDFs of fire load density, opening factor, and wall thermal inertia, and constructed random fire scenarios for urban high-rise residential buildings. It was found that fire load density and opening factor showed log-normal distribution for urban high-rise residential buildings, while wall thermal inertia

presented uniform distribution. Fire temperature rise time and correction factor obeyed log-normal distribution.

On this basis, relying on the Latin Hypercube Sampling method, this study further explored the probabilistic model for fire temperature rise in urban high-rise residential buildings under the action of uncertain factors, gave the possible temperature rise curves of fires in urban high-rise residential buildings and their probability distribution, and established the most representative temperature rise curve, with a turning point and highest temperature of 984 °C. The findings of this study are of great significance for the fire protection design, risk assessment, and fire rescue of high-rise residential buildings in China. The method of probabilistic analysis of fire temperature based on survey data used in this article is also helpful to future research on fire development.

**Author Contributions:** All authors contributed significantly to this study. Conceptualization, G.Z.; data curation, J.Y.; formal analysis, T.T.; investigation, L.Z.; methodology, P.D. All authors have read and agreed to the published version of the manuscript.

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