Click here to view linked References

±

# Morphological characterization and reconstruction of fractured heattreated glass

Yuhan Zhu<sup>a,b</sup>, Jian Yang<sup>a,b</sup>, Xing-er Wang<sup>a,b\*</sup>, Dongdong Xie<sup>a,b</sup>, Xiaonan Hou<sup>c</sup>

 <sup>a</sup> State Key Laboratory of Ocean Engineering, Shanghai Jiao Tong University, Shanghai 200240, PR China
 <sup>b</sup> Shanghai Key Laboratory for Digital Maintenance of Buildings and Infrastructure, School of Naval Architecture, Ocean and Civil Engineering, Shanghai Jiao Tong University, Shanghai 200240, PR China
 <sup>c</sup> School of Engineering, Lancaster University, Lancaster, LA1 4YW, UK

1 Abstract: Fracture morphology has insightful information related to the residual effect of fractured 2 structural glass, which is vital in assessing the post-fracture performance of glass members. This 3 study experimentally characterized the fracture morphology of heat-treated glass and developed a 4 novel method of morphology reconstruction, which aims to facilitate the numerical analysis of fractured structural glass. With the development of a computer-vision-based method for transparent 5 6 objects, the morphology information from fragmentation tests was extracted and systematically 7 investigated for monolithic heat-treated glass with various thicknesses, surface compressive stresses 8 and fracture initiation locations, which are considered as the key influencing factors of heat-treated 9 glass fracture. The geometrical features of fragments and their spatial distribution were 10 quantitatively analysed, identifying their correlations with glass properties. The result indicates that 11 the distribution of fragment centroids shows greater dispersion as the tempering level increases, and 12 the fragments tend to be smaller and more rounded. The strain energy release at fracture was also 13 assessed by fracture patterns, showing it presents high sensitivity to the glass thickness and surface 14 compressive stress. Subsequently, a novel approach was proposed for the stochastic reconstruction 15 of fracture morphology, combining feature points distribution and Voronoi tessellation concept. The 16 control parameters are determined by data from the fragmentation tests and the influence of fracture 17 load could be properly considered. The proposed method shows satisfactory outcomes and good 18 agreement with the experimental records, which has further potential in developing refined 19 numerical models by considering more realistic fracture morphology of glass members.

Keywords: Heat-treated glass; Thermally tempered glass; Fracture morphology; Surface
 compressive stress; Spatial distribution; Voronoi tessellation.

1

#### 1 **1. Introduction**

2 Although structural glass, mostly in the form of laminated glass, has been increasingly used in 3 modern architectures [1, 2], safety concern still arises as glass may have sudden failure due to its 4 brittleness [3, 4]. Different factors such as external loads [5, 6] and internal defects [7-9] can result 5 in the fracture of glass layer, which significantly damages the load capacity of structural glass. In 6 engineering practice, damaged glass members are unlikely to have an immediate replacement and 7 might sustain further destructive load, e.g., projectile impact in windstorms [10] and multiple blasts 8 in terrorist attacks [11]. Therefore, it is of great importance to consider the post-fracture state of 9 glass members in the design.

10 In past practice, the sacrificial ply concept is widely adopted in the design of structural glass 11 in post-fracture state. It assumes the glass layer carrying live load to be broken and excludes the 12 residual effect of the fractured layer on the post-fracture performance of glass members [12, 13]. 13 However, this concept results in more consumption of materials and higher costs. It also neglects 14 several negative effects due to the glass fracturing, e.g., the out-of-plane deformation by the 15 expansion of fractured glass which further weakens the load-bearing ability. Furthermore, the 16 fractured glass layer can also yield residual effects on the post-fracture ability of glass members 17 from the following aspects: (a) Fragments are interlocked with neighbouring ones to maintain 18 integrity under the constraints of the interlayer, the cracked glass layer can hence remain a certain 19 load capacity; (b) Fragments bonded to the interlayer can provide tension stiffening effect, which 20 can enhance the post-fracture stiffness [14, 15]; (c) Certain fragment geometry may lead to the 21 localized tearing of the interlayer and facilitate the structural failure [16]; (d) Secondary cracking of 22 large fragments may have unfavourable consequences, including ejection hazard and reduction of 23 load capacity [17, 18]. Thus, the influence of the fractured glass layer should be carefully introduced 24 in cases with significant post-fracture consequences.

By the adhesion to the interlayer, fractured glass layer can still contribute to the residual load capacity of the laminated glass members. It is natural to consider the fracture morphology as a nonnegligible factor, which has been proven by the experimental findings of Zhao et al. [19], showing that the laminated glass with different fracture morphologies had significantly different post-fracture performances.

1 Preliminary investigations have been conducted on the fracture propagation and morphology 2 of glasses with different strengthened techniques. Nielsen et al. [20] identified the propagation and 3 branching principle of cracks according to the observation about the fracture process of thermally tempered glass. Their works subsequently gave the relationship between surface compressive stress 4 and fragments number using fragmentation test [21] as well as that between strain energy and 5 6 fracture morphology [22, 23]. Bradt [24] concluded the importance of the internal and external 7 energy in fracturing development by observing the fracture patterns of glass objects. Tang et al. [25] 8 pointed out that the fracture process and final morphology of chemically strengthened glass were 9 affected by the elastic energy stored inside, which can be correlated to the central tensile stress. Lee 10 et al. [26] also found that the glass thickness and tempering level, which are closely related to the stored energy of glass, had a strong relationship with the fragmentation behaviour. From the studies 11 12 above, it can be seen that the fracture process is affected by the internal energy status of glass 13 materials. According to the theory of glass strengthening, internal strain energy storage is externally 14 correlated to glass thickness and surface compressive stress, which can be acquired directly. Thus, 15 potential factors including glass thickness and tempering level should be considered in the analysis 16 of fracture morphology.

17 Limited works on the description and characterization of fracture morphology can be found so 18 far. Dugnani et al. [27] proposed an analytical model to describe the crack evolution of tempered 19 glass, which can estimate the fragment size with various thicknesses and surface compressive 20 stresses. Molnár et al. [28] developed a theoretical method to describe the propagation of glass 21 fracture, which used Voronoi tessellation for the estimation of crack length. Pourmoghaddam et al. 22 [29, 30] introduced Voronoi tessellation to predict the fragmentation of tempered glass. Wang et al. 23 [16, 31] developed refined numerical models to investigate the post-fracture performance of 24 laminated glass, of which the fracture morphology was involved and generated using Voronoi 25 tessellation with customized generation parameters. Current attempts at Voronoi tessellation show 26 its potential in generating the fracture morphology of glass. However, more in-depth and 27 comprehensive investigations into the statistical and spatial features of morphological parameters 28 are required to obtain applicable parameters and procedures to reconstruct accurate fracture patterns. 29 This study focuses on the experimental characterization and virtual reconstruction of glass 30 fracture morphology. The heat-treated glass dominating the use of structural glass in the

1 construction was considered. Experimental characterization encompasses the fragmentation tests 2 and the feature analysis of morphological parameters. The former tested 81 glass specimens, which 3 were devised with multiple influencing factors, to obtain a dataset of morphological images. A computer-vision-based method was employed to extract the geometrical characteristics from the 4 dataset. A comprehensive study on the statistical and spatial features of glass fracture morphology 5 6 from multiple perspectives was subsequently conducted, which obtained the parameters for 7 reconstructing more realistic morphology. Finally, a stochastic reconstruction method on the basis 8 of the proposed feature points distribution approach and the concept of Voronoi tessellation was 9 developed.

10

## 11

## 2. Fragmentation tests

Fragmentation tests were performed to collect the morphological images of fractured heattreated glass. Three key factors, *i.e.*, glass thickness, surface compressive stress and fracture initiation point, were adopted to identify their influences on the fracture morphology.

#### 15 **2.1 Testing specimens**

16 In this study, 81 monolithic glass specimens in nine groups were manufactured and tested. The 17 plane dimension of specimens was determined to be  $600 \text{ mm} \times 300 \text{ mm}$ . The nominal thicknesses 18 of the specimens were 6, 8 and 12 mm, which were frequently used in practice. The glass specimen 19 was without surface treatment and had edge treatments including polishing before tempering. The 20 glass specimens were manufactured by Henan Zhongbo Glass Co., Ltd following the specific 21 requirement of this study. Each group had three levels of surface compressive stress, which were 22 achieved by adjusting the tempering procedure. The average incremental stress between 23 neighbouring groups was required to be greater than 10 MPa, which can guarantee that the 24 corresponding fracture morphologies present adequate differences.

The actual glass thickness and surface compressive stress of specimens, which can be used to estimate the elastic strain energy of heat-treated glass, were recorded before testing. Glass thickness was measured at the midpoints of two perpendicular edges (points a and b in **Fig. 1**). The surface compressive stress  $\sigma_s$  was measured at four testing points (see points 1 to 4 in **Fig. 1**) by surface stress meter (type JF-1E). The recorded data of glass thickness and surface compressive stress was listed in **Table 1** and **Table 2**, respectively. The arithmetic mean (avg.) as well as the standard deviation (std.) of the measured data were calculated, showing that the specimen thickness and surface compressive stress within the same group have good uniformity. The deviation rate in **Table** 1 shows that the actual measured value is close to the nominal value. **Table 2** also gives other general information of testing specimens. It should be clarified that, as for the specimen number, two digits after "M" represent the nominal glass thickness; *a*, *b*, *c* refer to low, medium and high tempering levels, respectively. The last optional digit denotes the fracture initiation point.



Fig. 1 Distribution of measurement points

9 10

8

11

 Table 1 Thickness of monolithic heat-treated glass specimens

Nominal thickness	Avg. of actual thickness	Std. of glass thickness	Deviation rate
(mm)	(mm)	(mm)	(%)
6	5.88	0.037	2.03
8	7.92	0.045	0.99
12	11.93	0.033	0.60

12

13

Table 2 General information of monolithic heat-treated glass specimens

_							
	Specimen No.	Thickness (mm)	Dimension (mm × mm)	Tempering level	Avg. of σ <sub>s</sub> (MPa)	Std. of $\sigma_s$ (MPa)	Specimen quantity
	M06a(1/2/3)	6	$600 \times 300$	low	76.82	1.89	9
	M06b(1/2/3)	6	$600 \times 300$	medium	91.50	1.17	9
	M06c(1/2/3)	6	$600 \times 300$	high	103.41	2.12	9
	M08a(1/2/3)	8	$600 \times 300$	low	69.53	1.03	9
	M08b(1/2/3)	8	$600 \times 300$	medium	84.56	1.47	9
	M08c(1/2/3)	8	$600 \times 300$	high	103.70	1.42	9
	M12a(1/2/3)	12	$600 \times 300$	low	60.80	1.08	9
	M12b(1/2/3)	12	$600 \times 300$	medium	71.09	1.33	9
	M12c(1/2/3)	12	$600 \times 300$	high	94.20	2.49	9

14

### 15 **2.2 Testing procedure**

16

To facilitate the efficiency of image acquisition, the glass specimens were placed vertically and

1 fixed by the testing apparatus shown in Fig. 2 (a). Because of the transparency of glass material, it 2 is difficult to identify the fracture morphology directly using camera system. The testing apparatus 3 was devised to generate and enhance the projection of fracture morphology on a polycarbonate plate 4 behind the glass specimen. A high-resolution industrial camera (type MV-SUA2000C-T) was then used to collect the morphological images of fractured specimens on the polycarbonate plate. A 5 6 computer-vision-based method was employed to process and extract the featured information of 7 fracture morphology with the open source computer vision library OpenCV [32], following the 8 procedures in Fig. 3. In this workflow, the original photos from the industrial camera are first pre-9 processed to obtain usable images of the fractured glass. Due to the lens distortion of camera and 10 the inevitable inclusion of redundant environmental information in the images obtained from direct 11 photography, distortion correcting and extraneous information cropping must be performed on the 12 original images before identifying fracture morphology. Then the images are further processed with 13 a series of pixel-based operations, including the thresholding method and morphological operation, 14 to identify and extract the locations of cracks. For the output preliminary figures of the fracture 15 morphology, optimization algorithm is designed to eliminate irrational information therein, e.g., 16 isolated lines and closed areas that are significantly too small. The final obtained fracture 17 morphology can be used for data collection and feature analysis.

A drill with sharp diamond tip was used to crack the specimens. Three fracture initiation points at corner (1), midpoint (2) of long edge and the centre (3) were set (**Fig. 2** (b)) to capture the associated influences on fracture morphology.

21



**Fig. 2** The Configurations of fragmentation test

22



Fig. 3 Procedures of fracture morphology processing based on computer vision

4 Fig. 4 shows the fracture morphological image with the fracture initiation point in the centre. 5 The local image with a size of 50 mm  $\times$  50 mm was used to highlight the difference. It can be seen that in the specimens having the same thickness, the fragment density significantly rises with the 6 7 increase of surface compressive stress. Meanwhile, it could be noticed that a pair of butterfly-shaped 8 fragments greatly larger than the surrounding can be found at the origin of cracking in most 9 specimens (marked with red polygons in Fig. 4). The fragment size shows a decreasing trend from the cracking initiation point to the outside, and tends to be uniform away from the cracking point. 10 11 Besides, fragments with large areas or strip shapes, which are common in low tempering level 12 groups, do not appear in the groups with higher surface compressive stress.

13



14



Fig. 4 Fracture morphology of selected heat-treated glass specimens

16

17 Considering that other characteristics are not intuitive, in addition to the fragment density,

statistical analysis on fragment shapes and their spatial distribution should be useful. It is assumed that the factors such as glass thickness, surface compressive stress and the location of fracture initiation can influence the propagation and formation of fracture morphology. The potential effects of these factors are subsequently discussed.

5

## **3. Results and discussion**

6 In this section, a comprehensive analysis was performed to investigate the statistical and spatial 7 features of fracture morphology from the extracted image groups. Crucial features including global 8 and local density, fragment geometrical indexes and fragment centroids under the influence of 9 several key factors (glass thickness, surface compressive stress, fracture initiation point) were 10 analysed. The energy storage and release of glass were invoked to explain the findings.

#### 11 **3.1 Fragment density**

#### 12 **3.1.1 Global fragment density**

13 The representative fragment density of specimens is counted by global fragment density  $\lambda_{\rm G}$  of 14 the whole glass plane, which can be calculated by dividing the fragments number by the panel area. 15 The statistical results are shown in **Table 3**. Linear regression equations were used to fit the global 16 fragment density with the surface compressive stress. The equations and the corresponding 17 coefficients of determination  $R^2$  for each thickness of specimen are as below,

. . . . . . . . . . . . .

6 mm: 
$$y = 0.169 x - 12.122$$
 ( $R^2 = 0.9997$ ) (1)

.

8 mm: 
$$y = 0.104 x - 6.582$$
 ( $R^2 = 1.0000$ ) (2)

12 mm: 
$$y = 0.074 x - 3.923$$
 ( $R^2 = 0.9999$ ) (3)

The data of the experimental results and the corresponding best-fit lines are given in **Fig. 5**, represented by solid markers and solid lines, respectively. The data points of the selected results from other reports [33, 34] are added with non-solid markers.

~

21

22

### **Table 3** Statistics of global fragment density $\lambda_G$ (Unit: mm<sup>-2</sup>)

Thislanses	Tempering level				
Inickness	Low	Medium	High		
6 mm	8.05×10 <sup>-3</sup>	3.34×10 <sup>-2</sup>	5.28×10 <sup>-2</sup>		
8 mm	6.40×10 <sup>-3</sup>	2.22×10 <sup>-2</sup>	4.19×10 <sup>-2</sup>		
12 mm	5.57×10 <sup>-3</sup>	1.34×10 <sup>-2</sup>	3.03×10 <sup>-2</sup>		



1 2

Fig. 5 Relationship between global fragment density and surface compressive stress

From Eqs. (1)-(3) and Fig. 5, it can be seen that for a given thickness, the global fragment density shows linear correlation to the surface compressive stress. Besides, although experimental data from different reports have slight variation in distribution, they basically follow the linear correlation as well.

7 The energy within the heat-treated glass is stored mainly as elastic strain energy. The stresses 8 formed by tempering treatment are distributed parabolically along the thickness direction. The 9 absolute value of surface compressive stress is nearly half of the mid-plane tensile stress [30, 35, 10 36]. The strain energy stored inside is hence mainly related to the tempering level and glass 11 thickness. Heat-treated glass with higher surface compressive stress stores a higher level of strain 12 energy, which indicates more stored energy will be released to generate more cracking surfaces and 13 fragments in fracture process. Thus, it is rational that the fragment density increases with the growth 14 of the surface compressive stress.

Comparing the results of glass specimens with different thicknesses, it can be seen that the curves intersect near the points around 86 MPa. The fragment density of 12 mm thick glass specimens is nearly three times higher than that of 8 mm thick ones, when the surface compressive stresses are 70 MPa. This phenomenon is due to that the thicker heat-treated glass could store larger amount of strain energy, which can be released during the fracture process.

1 However, the relationship between  $\lambda_{\rm G}$  and  $\sigma_{\rm s}$  presents a reverse trend when  $\sigma_{\rm s}$  exceeds 86 MPa. In the glass specimens with higher tempering level, thicker glass obtains lower fragment density. 2 3 This might be explained by the different proportions of strain energy which is released to generate 4 the fragment surfaces at fracturing. Although more strain energy is stored in thicker heat-treated glass with the same tempering level, the energy proportion consumed to generate fragment surfaces 5 6 is smaller, as the energy transferred or secondarily stored via other forms such as fragment expansion 7 occupies a higher proportion at fracturing. Additionally, to generate same fracture morphology, 8 thicker glass corresponds to a larger area of cross-section, implying a higher energy requirement. 9 Statistics and analysis will be provided in detail in section 3.3.

#### 10 **3.1.2 Local fragment intensity**

Local fragment intensity was adopted to describe the disparities of fragment number distributed at different areas of glass specimens. This is due to the various edge effects near fracture initiation points, which greatly affect the branching process of cracks and local morphology. The local fragment intensity of 12 mm thick glass specimens was selected and shown as the form of heatmap in **Fig. 6**. The fracture initiation points were marked with red crosses.

16 It can be seen that the fragment intensity at the fracture initiation point is lower than that from 17 the adjacent areas. This shows the suppression of the cracking near the initiation point. Similar 18 observations were also found in the experiments by Tandon et al [37], which reported that the 19 fragment size decreased with the distance away from the fracture initiation. Besides, when the 20 fracture initiation point is at the symmetric line of the glass specimens (*i.e.*, fracture points 2 and 3), 21 the local fragment intensity presents an evident symmetrical feature (Fig. 6 (b) and (c)). The local 22 intensity also presents a trend of propagating outward from the fracture initiation point in a manner 23 characterized by the alternations of peak and trough. Due to the limitation of specimen size, only 24 one cycle of local intensity variation is achieved in most tests, whilst in specimens fractured at the corner (e.g., Fig. 6 (a)), two cycles of local intensity variation can be roughly observed along the 25 26 diagonal path. The rough locations of the cycles are marked by white dotted lines in the figures.

However, this phenomenon seems to be interrupted in several regions due to complicated factors such as the vibration caused by the cracking load and fracture process, the stress waves and their reflection at the fixed boundary [38, 39], as well as the interaction between cracks and self-

- 1 emitted acoustic waves [40].
- 2

4





5 The results also show that the local intensity at the glass edges is significantly higher, along 6 the edges there are very dense fragments. Due to the limitation of the statistical approach, the 7 intensity heatmap does not accurately reflect the intensity situation near the edges. However, it can 8 be visualized by the actual images of fracture morphology that the fragment intensity at the edges 9 increases significantly. The shape of the fragments also differs from those in the inner region, being 10 relatively more elongated. This may be caused by the complex stress distribution at the edges of the 11 heat-treated glass, due to the edge polishing and the tempering process.

#### **3.2 Geometrical statistics**

The fracture morphology of the heat-treated glass panel is represented by many small fragments. **Fig. 7** shows typical fragments with significantly different shapes in two dimensions (2D) (sharper fragment and blunt fragment). The shape features of the fragments can greatly differ even with similar fragment areas, which depends on the tempering level and the locations of fragments.



Fig. 7 Fragments with different shapes

7 8

9 The fragments can be approximated as prisms with the same thickness, and the value of 10 thickness can be temporarily omitted. In 2D plane, the fragment can be simplified as a polygon and 11 the number of edges is one of its basic geometrical features. Although most cracks in actual fracture 12 morphology are not straight lines, making it difficult to do a straightforward count on the number 13 of fragment edges. A simplified statistical approach was adopted. The common edges of 14 neighbouring regions are considered as straight-line segments (it can be approximated by this way 15 in most cases), the edge number of each fragment polygon can then be determined by counting the 16 number of its neighbouring fragments. A simple example is shown in Fig. 8, the pentagon has five 17 neighbouring regions, corresponding to its five edges (marked with green double vertical bars,

1 disregard the adjacency at the vertexes only).





- 3
- 4 5

Fig. 8 Simplified statistical treatment on the number of fragment edges

6 Statistics show that the edge number of all fragments generated in the fragmentation tests has 7 an average value close to 6 (5.92). The percentages of fragments with various edge numbers are 8 shown by donut chart in **Fig. 9**. It can be seen that the edge number of the fragments ranges mainly 9 from 4 to 7, which accounts for nearly 90%. Amongst the fragment shapes, hexagons have the 10 highest percentage at over 30%, and pentagons share 26.8%. These two shapes have a percentage 11 over 50% of the total number and act as the predominant shapes.

12 Further statistics indicate that the number of hexagonal fragments is the highest in most cases, 13 with 59 out of 81 specimens. In the remaining specimens, 21 specimens have more fragments with 14 five edges than other edge number, except for one group that generates more quadrilateral fragments. 15 It is noted that these remaining specimens are mainly with relatively low tempering level. It might 16 be due to the presence of large isolated fragments that promotes the generation of more fragments 17 with low edge number. Moreover, although the hexagonal fragments are not predominant in these 18 cases, their number is highly close to that of pentagonal fragments and thus to present great 19 significance. This can also be supported by the previous calculation on the average edge number of 20 the fragments. In Fig. 10, the percentage of fragments with various edge numbers is counted in 21 groups according to the thickness and tempering level. Apparently, for the specimens with the same 22 thickness, the percentage of pentagons and hexagons increases significantly with the rise of surface 23 compressive stress. For the groups with lower tempering level, the combined percentage of 24 pentagonal and hexagonal fragments is less than 50%, which can increase to around 60% with higher

- 1 surface compressive stress. Thus, the percentage of fragments with other edge numbers is relatively
- 2 compressed.



Fig. 10 Grouping statistics for the percentage of fragments with various edge numbers

10 Measured by size data, the geometrical features of fragments can be characterized by basic 11 indexes such as area *S* and perimeter *C*. In order to describe the difference of shape features, 1 circularity  $\varphi$  is also introduced. Circularity denotes the roundness of a fragment and its quality being

2 in the shape of circle, which can be calculated as:

$$\varphi = (4\pi S) / C^2 \tag{4}$$

For a fragment with a shape close to a positive circle, the circularity approaches 1, and vice versa
the circularity is close to 0.

5 The correlation between fragment size and shape can be found. Fig. 11 (a) shows the bivariate 6 graph based on the data of area and circularity from group M12a. From the marginal histograms of 7 the probability density (PD), it can be seen that the fragment sizes concentrate within an interval 8 close to 100 mm<sup>2</sup>, with the values of circularity around 0.65. The upward trend in the upper left 9 corner (see the blue arrow) shows that the smaller fragment is more likely to have a circularity 10 relatively higher. Additionally, the bivariate graphs of group M12b and M12c (specimens of the 11 same thickness with different tempering levels) are plotted in Fig. 11 (b) and (c), respectively. It can 12 be seen that the graphs present similar distribution and tendency to that from Fig. 11 (a). The only 13 difference is the reduction and the leftward shift of the concentration interval of area, which is 14 related to the growth of the tempering level.

15 According to the observation in section 3.1, the location of fracture initiation shows influences 16 on the spatial distribution of fragments, leading to different trends of fragments size and shape likely 17 to form in each region. However, its effect on the overall tendency of fragment size cannot be 18 identified directly from the image. The scatter plot of area-perimeter and their probability statistics 19 are then shown in Fig. 12 to find the corresponding effect. The data of different fracture initiation 20 points is marked with different markers, and the graphs are grouped by specimens' thickness and 21 tempering level. Take the statistic of group M06c (Fig. 12 (c)) as an example, most of the data points 22 are located in a limited range, which corresponds to the fragment area less than 70 mm<sup>2</sup> and 23 perimeter less than 55 mm. The data points outside this range are highly sparse, regardless of the 24 fracture initiation of glass specimens. Other graphs have similar characteristics, except that the size distribution of the fragments varies between groups. It is seen that in specimens with the same 25 26 thickness and tempering level, there is no significant difference in the PDs distribution of the 27 fragment geometry parameters with different fracture initiations. Thus, the location of fracture 28 initiation can be considered to have a very limited effect on the favourable distribution range of the 29 fragment size.



Fig. 11 Bivariate analysis about area and circularity





Fig. 12 Effect of cracking initiation location on the fragment geometry

3 It is obvious that the tempering level has significant influences on the distribution of fragment 4 size. For specimens with different levels of surface compressive stress, the fragment geometry 5 parameters are counted in the groups of thickness, and the graphs of their PDs are plotted in Fig. 6 13. From Fig. 13 (a) and (b), it can be seen that with the rising of tempering level, the size of 7 fragments shows a decreasing trend. Take specimens with a thickness of 6 mm as an example, the

peak PD of fragment area decreases from 62.51 mm<sup>2</sup> to 16.61 mm<sup>2</sup>, and the perimeter decreases
from 41.20 mm to 16.86 mm, which indicates the number of fragments generated within the same
area increases correspondingly.

Besides, the reduction in the range of values of the fragment size should be noticed, which indicates a reduction in the dispersion of the fragment size, implying a more uniform shape of the fragments for glass with a higher tempering level. Meanwhile, the fragment circularity gradually increases. Its peak value increases from 0.65 to around 0.75 with the growth of the tempering level, which shows the fragments' shape tending to be circular as the size decreases. In addition, it is noted that the smaller fragment size tends to present a higher circularity value.







Fig. 13 Effect of surface compressive stress on the fragment geometry

Crown	_	6 mm			8 mm			12 mm	
Gloup	M06a	M06b	M06c	M08a	M08b	M08c	M12a	M12b	M12c
Area (mm <sup>2</sup> )	62.51	28.51	16.61	120.41	43.22	22.04	127.18	80.46	33.83
Perimeter (mm)	41.20	22.14	16.86	53.71	29.06	19.67	55.97	38.53	24.46
Circularity	0.652	0.731	0.766	0.650	0.704	0.766	0.657	0.691	0.755

 Table 4 The peak probability density values of the fragments' geometry parameters

1

## 3 **3.3 Total crack length, fracture section and surface energy**

Fractured glass can be considered as the assembly of fragments. From another aspect, fractured glass is generated by the crack branching within intact glass. In a two-dimensional plane, the fracture morphology is featured as many interrelated lines, and the total crack length  $L_{\rm C}$  can be determined from the fragment perimeters, that is

$$L_{\rm C} = \frac{1}{2} \sum C_{\rm i} \cdot C_{\rm S} \tag{5}$$

8 where  $C_{\rm S}$  represents the total edge length of the glass specimen,  $C_{\rm i}$  is the length of each crack.

9 Combined with the glass thickness t, the crack corresponds to the fracture surface in three 10 dimensions (3D). The cross-sectional area of fracture surface  $S_C$  can be roughly estimated as

$$S_{\rm C} = 2tL_{\rm C} \tag{6}$$

11 In this case, each segment of the crack corresponds to two surfaces.

Based on the data of fragments' perimeter, total crack length and cross-sectional area of fracture surface are calculated. **Fig. 14** shows the results with corresponding surface compressive stress. It can be seen that the specimens with the same thickness and tempering level have similar crack lengths, regardless of the fracture initiation point.

16 In the specimens with the same thickness, the total length as well as the cross-sectional area of 17 cracks increase with the growth of surface compressive stress as expected. However, for the 18 specimens with similar surface compressive stress, it should be noticed that the total crack length 19 was not necessarily longer or shorter as the thickness increased, while the thicker glasses always 20 correspond to a higher cross-sectional area of cracks. Take groups M08a (8 mm thick) and M12b 21 (12 mm thick) as examples, in which the specimens have close surface compressive stresses of 22 around 70 MPa. Both the crack length and the cross-sectional area of the thicker specimen are 23 significantly larger than that of the thinner one (41.61 m to 29.41 m and 0.50 m<sup>2</sup> to 0.24 m<sup>2</sup>). 24 Considering the specimens in groups M06c (6 mm thick) and M08c (8 mm thick), which have nearly

the same surface compressive stresses (around 103 MPa). It can be found that the total crack length of the thicker glass (71.27 m) is shorter than the other one (79.50 m), which is opposite to the previous example. Nevertheless, the cross-sectional area of thicker glass (0.57 m<sup>2</sup> on average) is still higher than the thinner one (0.48 m<sup>2</sup> on average). Considering that glass fracture is the result of interfacial separation, it is more reasonable in a physical sense to compare the fracture crosssectional area that considers the thickness.





9 10

8

The fracture process of heat-treated glass is related to the release of strain energy stored in the glass [30, 41]. Most of the released energy is dissipated to generate crack surfaces (crack length in 2D) or transformed into the kinetic energy of the crack front [42, 43]. Thus, the total length of cracks is highly related to the energy released at fracture. Assumed  $\gamma_0$  as the energy required to propagate crack per unit (also called fracture surface energy). Thus, for the specimens with a total fracture cross-sectional area of  $S_{\rm C}$ , the energy  $E_{\rm f}$  to generate the fracture morphology should be

$$E_{\rm f} = \gamma_0 S_{\rm C} = 2\gamma_0 L_{\rm C} t \tag{7}$$

According to the findings in Refs [44, 45], the fracture surface energy  $E_{\rm f}$  can be affected by various factors including glass composition leading to different elastic modulus, temperature, etc. At room temperature, the fracture surface energy ranges from 3.50 to 11 J/m<sup>2</sup> based on experiment results. Besides, through the bond breakage involved in the fracture process [46, 47], the theoretical value of fracture surface energy  $E_{\rm f}$  was derived as 0.62 - 4.99 J/m<sup>2</sup> [48]. However, determining fracture surface energy is not the main concern of this study. The glass specimens used in the 1 fragmentation tests were made of the same raw material and the test was conducted in a controlled

2 environment, which indicates the specimens were expected to have the same fracture surface energy.

3 Therefore,  $\gamma_0$  can be considered as a constant in the analysis and be reserved in the calculations.

4 As the surface compressive stress of heat-treated glass has been measured and collected, the 5 strain energy stored inside the glass per unit cross-sectional area can be obtained as [22],

$$U_0 = \frac{1 - v}{5E} t \sigma_{\rm s}^2 \tag{8}$$

where *E* represents the Young's modulus and *v* represents the Poisson's ratio of glass, which keep
constant in the study due to the use of the same glass material.

8 Through dividing the energy  $U_0$  by the fracture surface energy, the ratio of the energy 9 transferred to generate the fracture morphology can be estimated as

$$\frac{E_{\rm f}}{U_0} = \frac{10\gamma_0 E}{1 \cdot \nu} \cdot \frac{L_{\rm C}}{\sigma_{\rm s}^2} \tag{9}$$

10 where the parameters  $\gamma_0$ , *E* and *v* are constants related to the material properties. The ratio only 11 depends on the value of  $L_C / \sigma_s^2$ , which is defined as the coefficient  $\psi$  of the fracture energy ratio.

In Fig. 15, the correlation between  $\psi$  and surface compressive stress is plotted. Due to the limited number of available data (three data points for each group of thickness), the fitting of the data points is not able to determine the exact value. However, the trend of the coefficient can still be estimated. The coefficient of each group increases first and then decreases with the rising of surface compressive stress. This indicates that the ratio of strain energy transferred to generate the fractures is not constant, and will vary with the strain energy storage.

18



Fig. 15 The variation of the coefficient  $\psi$  with surface compressive stress

2 It is assumed that the release of strain energy is affected by the energy storage and the 3 mechanism of fracture generation. The crack propagation in glass requires the release of potential 4 energy exceeding the fracture surface energy of two new surfaces (each crack has two sides). In the 5 case with lower surface compressive stress, the strain energy stored is relatively lower, indicating a 6 lower energy density inside glass. Thus, difficulties rise to release enough energy for propagating 7 cracks in most areas, which limits the length of the cracks. The energy is remained inside glass due 8 to the reversible deformation before fracture. With the increase of surface compressive stress (which 9 refers to a higher energy density), the energy released is easier to achieve the threshold and to further 10 generate cracks. Thus, the release rate of strain energy increases, which results in the growth of the 11 fragment density. However, the increase of strain energy does not consistently correlate positively 12 to crack generation. Once the density of strain energy reaches a certain value, the fragment size 13 becomes more difficult to decrease despite that there is available energy to promote the fracture 14 process. Influenced by the factors such as size effect and edge effect, the further increase of fragment 15 density requires higher fracture surface energy per unit to trigger. As a result, the variations in Fig. 16 15 show that the coefficient  $\psi$  tends to increase at first and then decrease with increasing the surface 17 compressive stress.

It is observed that the curves move left with thicker specimens, which capture the peak value at a lower surface compressive stress. This is due to that the thicker glass stores more strain energy per unit area with the same surface compressive stress. The thicker glass will limit the generation of larger fragments. Thus, the higher strain energy cannot be more efficiently released.

22 **3.4 Spatial features of fragment centroids** 

1

Distance-based statistical method was introduced for the spatial analysis of fragment centroids patterns. The distribution of planar points can be reflected by the distance between each point and its nearest neighbour point, *i.e.*, nearest neighbour distance  $\eta$ . The nearest neighbour distance can be used to analyse the distribution of fragment centroids, which can promote and evaluate the reconstruction of fracture morphology.

For the point set with a determined global fragment density  $\lambda_{G}$ , the minimum nearest neighbour distance  $\eta_{min}$  shows its distribution trend. When the distribution of points is completely uniform,

 $\eta_{\min}$  reaches the maximin value

$$d_0 = \sqrt{\frac{2}{\sqrt{3}} \cdot \frac{1}{\lambda_{\rm G}}} \tag{10}$$

	1	$a_0 \ln a$ dispersion	n situation, whilst the	$\eta_{\rm min}$ will decrease	
until zero if the points are clustered. Based on this characteristic, the uniform parameter $\alpha$ was					
ntroduced to iden	tify the distribution to	endency of the point	set, which is calcula	ited as	
	5	$\alpha = \eta_{\min} / d_0$	,	(11)	
The value of	$\alpha$ is in the range of [	0, 1]. The point patt	ern shows clustering	when $\alpha$ reaches 0	
vhilst it shows dis	persion when $\alpha$ is clo	ose to 1.			
Take group	M08b as an example	e, the maximum, mi	inimum and average	e values of nearest	
eighbour distance	e are listed in <b>Table 5</b>	. The result finds a s	mall standard deviati	ion which indicates	
6					
-					
he fracture initiat	on location has very	limited influence on	the nearest neighbor	ur distance.	
he fracture initiat	on location has very	limited influence on	the nearest neighbor	ur distance.	
he fracture initiat	on location has very	limited influence on	the nearest neighbor	ur distance.	
he fracture initiat Table 5 Centro	on location has very ds distribution parame	limited influence on eters with different fra	the nearest neighbor	ur distance. s of group M08b	
ne fracture initiat Table 5 Centro Group	tion location has very ds distribution parameters $\eta_{\min}$ (mm)	limited influence on eters with different fra $\eta_{max}$ (mm)	the nearest neighbor acture initiation points $\eta_{avg} (mm)$	ur distance. s of group M08b α	
ne fracture initiat Table 5 Centro Group M08b1	tion location has very ds distribution parameters $\eta_{\min}$ (mm) 2.42	limited influence on eters with different fra $\eta_{max}$ (mm) 9.20	the nearest neighbor acture initiation points $\eta_{avg} (mm)$ 5.20	ur distance. s of group M08b $\frac{\alpha}{0.33}$	
Table 5 Centro Group M08b1 M08b2	tion location has very ds distribution parameters $\eta_{\min}$ (mm) 2.42 2.58	limited influence on eters with different fra $\eta_{max} (mm)$ 9.20 8.93	the nearest neighbor acture initiation points $\eta_{avg} (mm)$ 5.20 5.00	ur distance. s of group M08b $\alpha$ 0.33 0.37	
Table 5 Centro Group M08b1 M08b2 M08b3	tion location has very ds distribution parametric $\eta_{min} (mm)$ 2.42 2.58 2.59	limited influence on eters with different fra $\eta_{max} (mm)$ 9.20 8.93 9.41	acture initiation points $\eta_{avg} (mm)$ 5.20 5.00 5.13	ur distance. s of group M08b α 0.33 0.37 0.35	
Table 5 Centro Group M08b1 M08b2 M08b3 Avg.	tion location has very ds distribution parameter $\eta_{min}$ (mm) 2.42 2.58 2.59 2.53	limited influence on eters with different fra $\eta_{max} (mm)$ 9.20 8.93 9.41 9.18	acture initiation points $\eta_{avg} \text{ (mm)}$ 5.20 5.00 5.13 5.11	ur distance. s of group M08b α 0.33 0.37 0.35 0.35	

13	Therefore, it can be simplified in the parameter statistics of centroids distribution by ignoring
14	the factor of the fracture initiation location. In Table 6, the parameters of fragment centroids
15	distribution are collected according to the specimen thickness and tempering level. It is noted that
16	the nearest neighbour distance shows an overall decreasing trend with the increase of the tempering
17	level in the case of determined thickness, which is also a reflection of the increasing density of
18	fragment centroids. In particular for $\eta_{\min}$ , its value is found to be roughly linearly correlated with
19	the surface compressive stress, as shown in Fig. 16. The fitted linear regression equations are as
20	follows,

6 mm: 
$$y = -0.018 x + 3.866$$
 ( $R^2 = 0.9974$ ) (12)

8 mm: 
$$y = -0.020 x + 4.294$$
 ( $R^2 = 0.9861$ ) (13)

12 mm: 
$$y = -0.018 x + 3.990$$
 ( $R^2 = 0.9420$ ) (14)

21 According to the value of  $R^2$ , the equations are well-fitted to the experimental observations. Besides,

1 the corresponding value of  $d_0$  and  $\alpha$  are also given in **Table 6**. It can be seen that  $\alpha$  increases from

2 nearly 0.2 to 0.4, showing that the degree of uniformity grows with the rise of the tempering level.

3 4

Table 6 Parameter statistics of fragment centroids distribution
---

Group	$\eta_{\min} (\mathrm{mm})$	$\eta_{\max}$ (mm)	$\eta_{\rm avg} ({\rm mm})$	$d_0 (\mathrm{mm})$	α
M06a	2.51	19.86	7.34	12.01	0.21
M06b	2.23	7.64	4.23	5.89	0.38
M06c	2.04	5.75	3.46	4.68	0.44
M08a	2.91	19.20	8.45	13.46	0.22
M08b	2.53	9.18	5.11	7.22	0.35
M08c	2.21	6.36	3.84	5.25	0.42
M12a	3.06	20.29	9.07	14.49	0.21
M12b	2.61	11.89	6.40	9.31	0.28
M12c	2.37	7.34	4.41	6.18	0.38

5



Fig. 16 Relationship between minimum nearest neighbour distance and surface compressive stress
7

## 8 4. Reconstruction of fracture morphology

9 In this section, a novel approach to stochastically construct the fracture morphology of heat-10 treated glass was proposed. The generation procedure can be classified into two steps. First, simulate 11 the spatial distribution of feature points to locate the fragments. Second, the principle of Voronoi 12 tessellation was introduced to partition the 2D plane according to the feature points and further 13 determine the boundaries of fragments. The proposed method was evaluated to verify its 14 effectiveness and applicability.

#### 15 **4.1 Simulation of feature points**

16 Reconstructing the fracture morphology of heat-treated glass can facilitate the development of

a refined numerical model, which has more accurate local features of fractured glass. In most cases,
it is sufficient to reproduce the fragments distribution at a global scale. The key step is to generate
the point set (*i.e.*, a set of feature points) that can be used to determine the spatial positions of glass
fragments.

5 Several potential methods can be used to simulate the points distribution including Poisson 6 point process, Matérn hard-core point processes (MHCP) [49, 50] and Poisson disk sampling [51]. 7 However, their outputs were found to be not satisfactory. According to the characteristics of fragment distribution, an enhanced and practical approach of point simulation was proposed in this 8 9 study (Fig. 17). Global fragment density  $\lambda_G$  and minimum nearest neighbour distance  $\eta_{\min}$  are 10 considered as the key control parameters of the feature points simulation. Firstly, points should be 11 evenly distributed on the plane based on a spacing of  $d_0$  calculated by  $\lambda_G$  with Eq. (10). Afterward, 12 movement along a random direction with a random distance is assigned separately to each point. 13 The moveable range of each point is determined by  $\eta_{\min}$  (can be obtained from the fragmentation 14 tests data), which is a circle (*i.e.*, the purple circle in Fig. 17) with a radius of

$$r_{\rm c} = (d_0 - \eta_{\rm min}) / 2 \tag{15}$$

This random movement could also be considered as simulating a Poisson point process on the circle. The determined points are considered as the core points of the fragments. The theoretical value of the maximum nearest neighbour distance  $\eta_{max}$  can be deduced as

$$\eta_{\max} = d_0 + r_c \tag{16}$$

18 according to the illustration in **Fig. 17**.



Fig. 17 Simulation of the feature points

2 It is a matter of concern for the acquisition of the two key control parameters,  $\lambda_{\rm G}$  and  $\eta_{\rm min}$ , in 3 the point simulation approach. As mentioned in sections 3.1 and 3.4, it has been acknowledged that 4 both  $\lambda_{\rm G}$  and  $\eta_{\rm min}$  have linear correlations with surface compressive stress  $\sigma_{\rm s}$ , and the equations 5 reflecting the correlations are acquired by the fragmentation tests (*i.e.*, Eqs. (1)-(3) and Eqs. (12)-6 (14)). Thus the values of  $\lambda_G$  and  $\eta_{\min}$  can be obtained once  $\sigma_s$  is determined, as  $\sigma_s$  can be measured 7 by non-destructive method with a surface stress meter in applications. It should be noted the 8 equations might only be applicable to the glass of the same manufacturer. For glass from different 9 sources, the equations are suggested to be reacquired.

The proposed method can effectively control the global fragment density and the point spacing. In **Table 7**, the experimental results from the fragmentation tests and the theoretical values calculated by Eq. (16) of  $\eta_{\text{max}}$  are compared. It can be seen that the deviations of most cases are within a small range. As for the only group with a deviation rate over 10%, M06a, a larger deviation is rational due to its more significant differences in fragment shapes at low tempering level.

15 16

1

**Table 7** The comparison between experimental and theoretical values of  $\eta_{\text{max}}$ 

Group	Experimental $\eta_{\max}$ (mm)	Theoretical $\eta_{\text{max}}$ (mm)	Deviation value (mm)	Deviation rate (%)
M06a	19.86	16.75	3.11	18.57
M06b	7.64	7.72	0.08	1.04
M06c	5.75	6.00	0.25	4.17
M08a	19.20	18.74	0.46	2.45
M08b	9.18	9.56	0.38	3.97
M08c	6.36	6.77	0.41	6.06
M12a	20.29	20.20	0.09	0.45
M12b	11.89	12.66	0.77	6.08
M12c	7.34	8.08	0.74	9.16

17

To evaluate the point patterns from different simulation methods, experimental data of group M06b is taken to perform the comparative study, of which  $\eta_{min}$  is set as a fixed parameter. The spatial statistics toward simulation results are shown in **Table 8**. It can be seen that the results of MHCP and Poisson disk sampling have evident deviations from the experimental data, whereas the proposed approach presents higher overall accuracy of all examined parameters.

Table 8 Comparison of selected points distribution methods

Data	$\lambda_{\rm G}~(\rm mm^{-2})$	$\eta_{\min}$ (mm)	$\eta_{\max}$ (mm)	α
Experimental data	3.34×10 <sup>-2</sup>	2.23	7.64	0.38
MHCP	2.42×10 <sup>-2</sup>	2.23	12.69	0.32
Poisson disk	11.75×10 <sup>-2</sup>	2.23	3.91	0.71
Proposed method	3.52×10 <sup>-2</sup>	2.29	7.62	0.40

23

The nearest neighbour distance distribution function, which is also commonly referred to as the *G* function [50], was subsequently introduced to quantitatively analyse and visualize the overall situation of the nearest neighbour distance  $\eta$ . *G* function is the cumulative distribution function (the integration of probability density function) of the nearest neighbour distance, indicating the rate less than the given distance *d* amongst the whole data, defined as

$$G(d) = \sum_{i=1}^{n} \frac{\phi_i^d}{n}$$
(17)

$$\phi_i^d = \begin{cases} 1 & \text{if } \eta_i \le d \\ 0 & \text{otherwise} \end{cases}$$
(18)

8 where  $\phi_i^d$  is an indicator function following Eq. (18) that judges if the nearest neighbour distance  $\eta_i$ 9 of the randomly chosen point *i* is less than or equal to the value *d*.

10 The curves of *G* function can be used to evaluate the point pattern. Comparing the *G* function 11 curves of simulated and experimental point patterns in **Fig. 18**, it can be seen that the curves are in 12 good agreement.

In addition, *G* function can be used to identify whether the point pattern tends to be clustered or dispersed [52]. It has been acknowledged that *G* function has a theoretical expectation [49, 53] of

$$G(d) = 1 - e^{\lambda \pi d^2} \tag{19}$$

16 while the underlying point process is a complete spatial randomness (CSR) process, which can be 17 taken as the criterion to assess the trend of point distribution. For a given point process, it indicates 18 that the point process is clustering if its *G* function plot is above the expectation, while the point 19 process tends to be dispersed if the plot is below expectation. In this equation,  $\lambda$  is the intensity of 20 the point process (mean point number per unit area). It can be seen in **Fig. 18** that the *G* function 21 plots of simulated (solid curve) and experimental data (dashed curve) are both below the expectation 22 curve of CSR (dotted curve), showing a dispersive trend of the point process.



Fig. 18 Comparison between reconstructed feature points and experimental data (based on *G* function)
 2

3 The above work introduces the feature points distribution method, which achieves the first target to deploy points with identical density at a global scale, disregarding the influence of fracture 4 5 initiation. It has been acknowledged that the location of fracture initiation has limited influence. 6 Thus, in most cases for general analysis, fracture initiation does not need to be considered, and the 7 basic scheme of feature point distribution is sufficient. Unless in the cases of fracture morphology reconstruction with higher accuracy requirements, the influence of fracture initiation might be 8 9 involved. According to the discussion on local fragment intensity in section 3.1.2, the location of 10 fracture initiation yields influences on the distribution of fragments. Therefore, the improvements 11 of feature points simulation are performed by considering the fracture initiation location as the 12 influencing factor. In the improvements, the local fragment intensity was introduced to finely control 13 point distribution in each region, and the relationship between local fragment intensity and its 14 distance from the fracture initiation points was considered for the controlling of the points 15 simulation process.

16 It has been noticed from the heatmaps in **Fig. 6** that the variation of local fragment intensity is 17 phased, depending on the distance to the fracture initiation, and is centrosymmetric. Thus, the glass 18 plane can be partitioned into a series of concentric circles with the fracture initiation point as the centre, and the fragment distribution is examined separately to obtain the values of  $\lambda_G$  and  $\eta_{min}$  within 19 20 each region. The principle of partition is to divide the continuous part with close intensity into the 21 same region as far as possible. With the values of  $\lambda_G$  and  $\eta_{\min}$ , feature points can be simulated within 22 each region separately. The obtained distribution of feature points can reflect the local characteristics, 23 which are influenced by the fracture initiation. In further consideration, the radius difference of the concentric circles could be minimized so the plane partition can be refined. This can be interpreted 24

as a differential form extension of the points simulation method at a global scale, and thus to satisfy
 the requirement for the distribution of fragment feature points considering the local reality.

3 Due to the local fragment intensity adopting the value based on the distance from the fracture 4 initiation point, it is natural to introduce polar coordinates to determine the simulation parameters for the feature points deployment, and then transfer them into Cartesian coordinates. Fig. 19 shows 5 6 an example of feature points simulation in polar coordinates system, in which the local fragment 7 intensity grows with the distance increases from the fracture initiation point. It should be noted that the left graph with blue dots shows the points being placed evenly considering local intensity, while 8 9 the right graph with orange dots is obtained by the blue dots with random movement according to 10 the restriction of  $\eta_{\min}$ . The red cross in the lower left corner represents the location of fracture 11 initiation.

12



13

Fig. 19 Feature points simulation considering cracking initiation (partial as a demo)

14

#### 15 **4.2 Fragment boundaries determination by Voronoi tessellation**

Following by confirming the locations of fragments by simulating the set of feature points, the 2D plane needs to be partitioned based on the determined feature points to define the intersected boundaries of the fragments.

Voronoi tessellation shows the potential to describe structures on micro and macro scales [31, 54]. As mentioned in references [28, 55, 56], Voronoi tessellation is likely to be suitable to describe the fracture pattern of bulk solid material with residual stress. Heat-treated glass with high surface compressive stress maps with such characteristics. Thus, Voronoi tessellation was employed in the fracture morphology reconstruction of heat-treated glass. The classic Voronoi tessellation in 2D provides a principle of partitioning the plane *E* into a series of convex polygons based on the given 1 set *P* of seed points  $p_i \in P$ . For each point  $p_i$  a Voronoi polygon  $R_i$  is generated as defined below 2 [57, 58],

$$R_{i} = \{x \in E \mid d(x, p_{i}) \leq d(x, p_{j}) \text{ for all } j \neq i\}$$

$$(20)$$

where *d* denotes Euclidean distance. Each polygon  $R_i$  contains only one seed point  $p_i$ , making any location inside  $R_i$  closer to  $p_i$  than any other seed points in set *P* [59, 60]. Besides, hexagon is the most common polygon in Voronoi tessellation rather than polygons with other edge numbers [61], which coincides with the statistical findings on the edge number of fragments mentioned in section 3.2.

8 Based on a specimen from group M08b2, Fig. 20 gives the comparison of actual and 9 reconstructed fracture morphologies of three typical regions with different characteristics (marked 10 as region 1, 2, and 3) to examine the applicability of the Voronoi tessellation. The actual fragments 11 are denoted by blue irregular curves and the reconstructed fragment boundaries can be characterized 12 by black lines. The solid dots are the centroids (also defined as the feature points, act as seed points 13 in Voronoi tessellation) of the fragments. It can be seen that the Voronoi tessellation achieves well 14 satisfaction to reproduce the fracture morphology after the feature points are determined. It is noted 15 that the constructed morphology of regions with higher fragments circularity seems to be closer to 16 the actual one than that with lower fragments circularity, e.g., comparing region 1 and region 2 with 17 region 3 in the given demo. This is beneficial when simulating the fracture morphology of fully 18 tempered glass which has a high value of average fragment circularity.





Fig. 20 The demonstration of Voronoi tessellation based on one specimen of group M08b2

3 PDs of the geometrical parameters from the reconstructed morphology were analysed and compared with those from the experimental data of a specimen from group M12c3 (Fig. 21). It is 4 5 found that in the fracture morphology via Voronoi tessellation, the generated results can cover the 6 major intervals of the geometrical parameters of fragments in the actual one. This comparison 7 indicates that the reconstructed fragments by Voronoi concept can well simulate the actual situation. 8 However, the generated results are also seen to present a narrower distribution band of the 9 geometrical parameters, which suggests that the number of fragments having too large, small size 10 or more irregular shapes from the simulated case is significantly lower than that from experimental

1 data. Differing from the finding that the value of geometrical parameters S and C at peak PD from 2 the simulation is highly close to that from the experiment, the deviation of circularity is 3 comparatively greater showing that the generated fragments are commonly more "blunt and circular" 4 than the realistic ones. This might be caused by that the classic Voronoi tessellation partitions the plane with straight lines, whilst the actual morphology is more frequent to be with irregular curves. 5 6 Furthermore, the plane partition principles of Voronoi tessellation require that any point in the 7 divided polygonal area should be closer to the corresponding seed than any other seed in the 8 remaining polygons, which results in the suppression of generating slender fragments with extreme 9 sizes and small circularity. This can be found in Fig. 20, especially in the selected region 3 (multiple 10 slender fragments can be found in this region).

11





12 13

In summary, with the given location of actual fragments (defined by the feature points), it is appropriate to partition the glass plane and determine the boundaries of the fragments by the concept of Voronoi tessellation.

### 17 **4.3 Output and evaluation of the reconstruction approach**

Based on the works above, the complete approach of fracture morphology reconstruction can be concluded. The reconstruction procedures are as follows: 1) simulate and distribute the point set at the given plane as the feature points for the fragments, and then 2) partition the plane into elements following the principles of Voronoi tessellation, to create fragment boundaries. The output of the reconstruction approach is demonstrated and evaluated herein.

Based on the statistical data of group M06b (with the surface compressive stress of 91.50 MPa), an attempt to reconstruct the fracture morphology was carried out on a plane with the same size as the actual specimen. **Fig. 22** shows the reconstructed result, which shares a high similarity to the fracture morphology of the reference glass. Further, the reconstructed results vary within a rational
 range due to the introduction of random parameters in the feature points deployment. This also
 coincides with the generation randomness of cracks in reality.

4



- 5
- 6 7

Fig. 22 Reconstruction output referring to group M06b without considering fracture initiation

8 For the purpose of evaluation, the fracture morphologies of all tested groups were reconstructed 9 stochastically according to the statistical results obtained from fragmentation tests afterwards. **Table** 10 **9** gives the peak values of PDs from the reconstructed morphology and the experimental one. The 11 standard deviation is commonly within 5%, which shows that the reconstruction results can well 12 present the main features of the fracture morphology.

- 13
- 14

Table 9 Peak PDs of the reconstructed morphology and its comparison with experimental data

Crosse	A	rea (mm <sup>2</sup> )	Peri	meter (mm)	Circularity	
Group	Peak	Deviation	Peak	Deviation	Peak	Deviation
M06a	4.83	0.70	3.78	0.06	0.841	0.197
M06b	3.40	0.05	3.05	0.05	0.868	0.148
M06c	2.94	0.13	2.81	0.01	0.875	0.111
M08a	5.06	0.27	3.89	0.09	0.841	0.196
M08b	3.82	0.05	3.26	0.11	0.864	0.163
M08c	3.18	0.09	2.93	0.05	0.873	0.115
M12a	5.20	0.36	3.97	0.06	0.842	0.181
M12b	4.32	0.07	3.52	0.13	0.853	0.162
M12c	3.51	0.02	3.10	0.10	0.867	0.116

1 In addition, if the location of fracture initiation is determined, the feature points for the 2 reconstruction process can be deployed considering its influence as mentioned in section 4.1. The 3 reconstruction output is suitable to the situation with the requirement of high accuracy. However, it should be noted that the determination of the local intensity of feature points requires more testing 4 5 data and further statistics. Herein, a reconstruction output demonstration of fracture morphology 6 with a specified fracture initiation point (fractured at the lower left corner denoted by a cross marker) 7 is shown in Fig. 23. The demo one has a size of 400 mm  $\times$  300 mm. The local intensity variation is 8 considered in the simulation of feature points, based on the experimental data of group M12b. The 9 reconstruction result reproduces the observation that the fragment intensity generally grows with 10 increasing the distance from the fracture initiation point, showing the influence of fracture load on 11 the fracture morphology of heat-treated glass.

12



- 13
- 14 15

Fig. 23 Reconstruction output demo of fracture morphology considering fracture initiation

16 In general, the developed reconstruction process considering the global density and the 17 neighbour distance of fragments is believed to be adequate for most application scenarios. It is 18 unnecessary to over-consider the differences in the local distribution of fragments, which are mainly 19 caused by the effect of the fracture initiation. Particularly, in the cases of large specimens, the 20 influence of fracture initiation will be diminished. In such situations, it is only necessary to obtain 21 the relationships of surface compressive stress with the parameters  $\lambda_G$  and  $\eta_{min}$ . The relevant data 22 can be acquired from the pre-experiment or provided by the manufacturers. In real applications 23 afterwards, the values of  $\lambda_{\rm G}$  and  $\eta_{\rm min}$  could be obtained with the non-destructive measurement of surface compressive stress by surface stress meter, and the fragmentation tests (or other destructive tests) are no longer necessary. In certain cases, the reconstructed morphology might be overuniformly distributed and the influence of the fracture initiation location should hence be considered find more precise analysis is demanded. For this purpose, detailed sub-regional data should be collected in pre-performed fragmentation tests to identify local distribution features of fragments, to provide support for the refined reconstruction of fracture morphology.

### 7 5. Concluding remarks

8 The information contained in the fracture morphology of glass is significant for understanding 9 the post-fracture performances of structural glass, which is mainly composed by heat-treated glass. 10 This study characterized the fracture morphology of heat-treated glass and proposed a novel method 11 to reconstruct the morphology. Fragmentation tests of heat-treated glass with common-used 12 thicknesses and a wide range of surface compressive stress are conducted, to investigate the 13 morphological features and the corresponding influencing principles. A computer-vision-aided 14 method towards transparent objects was developed for the identification of glass fracture 15 morphology. Then the spatial distribution and geometrical features of fragment elements in fracture morphology, as well as the graphical patterns of fracture morphology, are collected and analysed in 16 17 detail. The results indicate that the statistical and spatial features of fracture morphology on global 18 scale are highly related to the inherent properties of heat-treated glass, but are less likely to be 19 affected by external factors such as the location of fracture initiation, although the fracture pattern 20 may still be locally affected by the fracture initiation load in a limited range. Correlations between 21 typical parameters of fracture morphology and surface compressive stress were quantitatively 22 presented to be linear. Meanwhile, the strain energy release in the fracture process is not constant 23 for different types of specimens. A coefficient reflecting the energy release was introduced for 24 assessment purposes. The release rate tends to increase and then decrease with growing surface 25 compressive stress, and the glass thickness also limits the crack generation, which is approximately 26 equivalent to the release of strain energy.

Based on the characterisation of fracture morphology, a novel reconstruction method was developed for describing the spatial and statistical features of fracture morphology. The method combined a new deployment approach of fragment feature points and the Voronoi tessellation

1 concept. In the reconstruction process, the inherent properties of glass and the local effects of the 2 fracture load can be properly considered, and the control parameters are determined by data from 3 fragmentation tests. The proposed method shows good satisfaction in reproducing fracture 4 morphology, and its quantitative statistical indicators agree well with the experimental data. The deviation of selected indicators is less than 5%. This suggests that the characteristics of the fracture 5 6 morphology of heat-treated glass can be well presented by the proposed method, which might 7 contribute to the investigation into the post-fracture behaviour of structural glass components in 8 future works via the following three aspects.

9 (1) Through the introduction of predefined fracture patterns stochastically generated by the 10 reconstruction method, refined numerical models can be established, which meet the demand of 11 more mechanical analysis while being less constrained by experimental conditions. Also, the 12 refinement of the fracture morphology reconstruction can be further improved. Effects including the 13 variety of surface compressive stress at different locations, edge effects as well as initial defects of 14 glass are worth being considered. Nevertheless this means higher cost in characterization and a 15 balance should be found between the accuracy of the reconstruction and its practical value.

(2) The images or data of fracture morphology can be combined with the artificial intelligence based approach and the mechanical model to seek a smart, fast and physical based algorithm to
 estimate the stress-strain growth and the tearing initian due to the local morpholgy of fractured
 structural glass components without running numerical models.

(3) The fracture morphology links to the strain energy release of glass and further the out-ofplane deformation of glass components due to the expansion of fractured glass. It can hence be used
to give more accurate prediction on the local deformation after a large-size glass component
fractures, which might trigger the buckling failure in certain cases.

24

## 25 Acknowledgement

This study was supported by the National Natural Science Foundation of China (grant numbers 51908352, 52078293) and the Science and Technology Innovation Plan of Shanghai Science and Technology Commission (grant number 20dz1201301).

## 1 References

- [1] O'Regan C. Structural use of glass in buildings. 2nd edition. London: Institution Of Structural
   Engineers; 2014.
- [2] Mauro JC, Zanotto ED. Two centuries of glass research: historical trends, current status, and grand
  challenges for the future. Int J Appl Glass Sci. 2014;5(3):313-27.
  https://doi.org/10.1111/ijag.12087.
- Guin J-P, Wiederhorn SM. Fracture of silicate glasses: Ductile or brittle? Phys Rev Lett.
   2004;92(21):215502. https://doi.org/10.1103/PhysRevLett.92.215502.
- 9 [4] Wang X-e, Yang J, Liu Q-f, Zhang Y-m, Zhao C. A comparative study of numerical modelling
  10 techniques for the fracture of brittle materials with specific reference to glass. Eng Struct.
  11 2017;152:493-505. <u>https://doi.org/10.1016/j.engstruct.2017.08.050</u>.
- [5] Choi Y, Eon Lee S, Jung J-W, Hong J-W. Collision mechanism of unmanned aerial vehicles onto
  glass panels. Int J Micro Air Veh. 2021;13:17568293211060504.
- 14 <u>https://doi.org/10.1177/17568293211060504</u>.
- 15 [6] Hidallana-Gamage HD, Thambiratnam DP, Perera NJ. Failure analysis of laminated glass panels
  subjected to blast loads. Eng Fail Anal. 2014;36:14-29.
  https://doi.org/10.1016/j.engfailanal.2013.09.018.
- [7] Callewaert D, Belis J, Vandebroek M, Van Impe R. Spontaneous failure of a passable laminated
   glass floor element. Eng Fail Anal. 2011;18(7):1889-99.
   https://doi.org/10.1016/j.engfailanal.2011.07.010.
- [8] Kasper A, Pyeonglae N, Yuan Z. Spontaneous cracking of thermally toughened safety glass Part
   two: nickel sulphide inclusions identified in annealed glass. Glass Struct Eng. 2019;4(3):315-43.
   https://doi.org/10.1007/s40940-018-00092-0.
- [9] Pisano G, Bonati A, Royer Carfagni G. How the risk of failure in lifetime of tempered glass
  depends on the size of NiS inclusions and heat soak test duration. J Am Ceram Soc.
  2021;104(1):383-403. https://doi.org/10.1111/jace.17413.
- [10] Zhang X, Hao H, Ma G. Laboratory test and numerical simulation of laminated glass window
   vulnerability to debris impact. Int J Impact Eng. 2013;55:49-62.
   https://doi.org/10.1016/j.ijimpeng.2013.01.002.
- [11] Pelfrene J, Kuntsche JK, Van Dam S, Van Paepegem W, Schneider J. Critical assessment of the
   post-breakage performance of blast loaded laminated glazing: experiments and simulations. Int J
   Impact Eng. 2016;88(88):61-71. https://doi.org/10.1016/j.ijimpeng.2015.09.008.
- [12] Dharani LR, Ji F, Behr RA, Minor JE, Kremer PA. Breakage prediction of laminated glass using
  the "sacrificial ply" design concept. J Architect Eng. 2004;10(4):126-35.
  https://doi.org/10.1061/(ASCE)1076-0431(2004)10:4(126).
- [13] Foraboschi P. Hybrid laminated-glass plate: Design and assessment. Compos Struct.
   2013;106:250-63. <u>https://doi.org/10.1016/j.compstruct.2013.05.041</u>.
- [14] Biolzi L, Orlando M, Piscitelli LR, Spinelli P. Static and dynamic response of progressively
   damaged ionoplast laminated glass beams. Compos Struct. 2016;157:337-47.
   https://doi.org/10.1016/j.compstruct.2016.09.004.
- [15] Galuppi L, Royer-Carfagni G. The post-breakage response of laminated heat-treated glass under in
   plane and out of plane loading. Compos B Eng. 2018;147:227-39.
- 43 <u>https://doi.org/10.1016/j.compositesb.2018.04.005</u>.

1	[16]	Wang X-e, Yang J, Pan Z, Wang F, Meng Y, Zhu Y. Exploratory investigation into the post-fracture
2		model of laminated tempered glass using combined Voronoi-FDEM approach. Int J Mech Sci.
3		2021;190:105989. https://doi.org/10.1016/j.ijmecsci.2020.105989.
4	[17]	Bermbach T, Teich M, Gebbeken N. Experimental investigation of energy dissipation mechanisms
5		in laminated safety glass for combined blast-temperature loading scenarios. Glass Struct Eng.
6		2016;1(1):331-50. https://doi.org/10.1007/s40940-016-0029-y.
7	[18]	Wang X-e, Yang J, Chong WTA, Qiao P, Peng S, Huang X. Post-fracture performance of
8		laminated glass panels under consecutive hard body impacts. Compos Struct. 2020;254:112777.
9		https://doi.org/10.1016/j.compstruct.2020.112777.
10	[19]	Zhao C, Yang J, Wang X, Azim I. Experimental investigation into the post-breakage performance
11		of pre-cracked laminated glass plates. Constr Build Mater. 2019;224:996-1006.
12		https://doi.org/10.1016/j.conbuildmat.2019.07.286.
13	[20]	Nielsen JH, Olesen JF, Stang H. The Fracture Process of Tempered Soda-Lime-Silica Glass. Exp
14		Mech. 2008;49(6):855-70. https://doi.org/10.1007/s11340-008-9200-y.
15	[21]	Nielsen JH, Olesen JF, Stang H. Characterization of the residual stress state in commercially fully
16		toughened glass. J Mater Civil Eng. 2010;22(2):179-85. https://doi.org/10.1061/(Asce)0899-
17		<u>1561(2010)22:2(179</u> ).
18	[22]	Nielsen JH. Remaining stress-state and strain-energy in tempered glass fragments. Glass Struct
19		Eng. 2017;2(1):45-56. https://doi.org/10.1007/s40940-016-0036-z.
20	[23]	Nielsen JH, Bjarrum M. Deformations and strain energy in fragments of tempered glass:
21		experimental and numerical investigation. Glass Struct Eng. 2017;2(2):133-46.
22		https://doi.org/10.1007/s40940-017-0043-8.
23	[24]	Bradt RC. The Fractography and Crack Patterns of Broken Glass. J Fail Anal Prev. 2011;11(2):79-
24		96. https://doi.org/10.1007/s11668-011-9432-5.
25	[25]	Tang Z, Abrams MB, Mauro JC, Zoeller LR, Venkataraman N, Hu G. High-speed camera study of
26		Stage III crack propagation in chemically strengthened glass. Appl Phys A Mater Sci Process.
27		2014;116(2):471-7. https://doi.org/10.1007/s00339-014-8370-y.
28	[26]	Lee H, Cho S, Yoon K, Lee J. Glass Thickness and Fragmentation Behavior in Stressed Glasses.
29		New J Glass Ceram. 2012;02(04):116-21. https://doi.org/10.4236/njgc.2012.24020.
30	[27]	Dugnani R, Zednik RJ, Verghese P. Analytical model of dynamic crack evolution in tempered and
31		strengthened glass plates. Int J Fract. 2014;190(1-2):75-86. https://doi.org/10.1007/s10704-014-
32		<u>9975-z</u> .
33	[28]	Molnár G, Ferentzi M, Weltsch Z, Szebényi G, Borbás L, Bojtár I. Fragmentation of wedge loaded
34		tempered structural glass. Glass Struct Eng. 2016;1(2):385-94. https://doi.org/10.1007/s40940-
35		<u>016-0010-9</u> .
36	[29]	Pourmoghaddam N, Kraus MA, Schneider J, Siebert G. The geometrical properties of random 2D
37		Voronoi tesselations for the prediction of the tempered glass fracture pattern. ce/papers. 2018;2(5-
38		6):325-39. https://doi.org/10.1002/cepa.934.
39	[30]	Pourmoghaddam N, Kraus MA, Schneider J, Siebert G. Relationship between strain energy and
40		fracture pattern morphology of thermally tempered glass for the prediction of the 2D macro-scale
41		fragmentation of glass. Glass Struct Eng. 2018;4(2):257-75. https://doi.org/10.1007/s40940-018-
42		<u>00091-1</u> .
43	[31]	Wang X-e, Yang J, Huang X, Wang F, Zhu Y. Voronoi-FDEM concept for modelling post-fracture
44		response of progressively damaged structural glass. Eng Comput. 2021:1-14.

1		https://doi.org/10.1007/s00366-021-01318-6.
2	[32]	Bradski G. The OpenCV Library. Dr Dobb's Journal of Software Tools. 2000.
3	[33]	Mognato E, Barbieri A, Schiavonato M, Pace M, del Vetro-Venezia S-SS. Thermally toughened
4		safety glass: correlation between flexural strength, fragmentation and surface compressive stress.
5		Glass Performance Days. 2011:115-8.
6	[34]	Pourmoghaddam N, Schneider J. Experimental investigation into the fragment size of tempered
7		glass. Glass Struct Eng. 2018;3(2):167-81. https://doi.org/10.1007/s40940-018-0062-0.
8	[35]	Mognato E, Brocca S, Barbieri A. Thermally processed glass: correlation between surface
9		compression, mechanical and fragmentation test. Glass Performance Days. 2017;2017:8-11.
10	[36]	Zaccaria M, Overend M. Nondestructive safety evaluation of thermally tempered glass. J Mater
11		Civil Eng. 2020;32(4):04020043. https://doi.org/10.1061/(Asce)Mt.1943-5533.0003086.
12	[37]	Tandon R, Glass SJ. Fracture initiation and fragmentation in chemically tempered glass. J Eur
13		Ceram Soc. 2015;35(1):285-95. https://doi.org/10.1016/j.jeurceramsoc.2014.07.031.
14	[38]	Ha YD, Bobaru F. Characteristics of dynamic brittle fracture captured with peridynamics. Eng
15		Fract Mech. 2011;78(6):1156-68. https://doi.org/10.1016/j.engfracmech.2010.11.020.
16	[39]	Hu W, Wang Y, Yu J, Yen C-F, Bobaru F. Impact damage on a thin glass plate with a thin
17		polycarbonate backing. Int J Impact Eng. 2013;62:152-65.
18		https://doi.org/10.1016/j.ijimpeng.2013.07.001.
19	[40]	Massy D, Mazen F, Landru D, Mohamed NB, Tardif S, Reinhardt A, et al. Crack front interaction
20		with self-emitted acoustic waves. Phys Rev Lett. 2018;121(19):195501.
21		https://doi.org/10.1103/PhysRevLett.121.195501.
22	[41]	Bos F, editor Elastic strain energy release at failure and its consequence for structural glass testing
23		and design. Challenging Glass Conference Proceedings; 2016.
24	[42]	Bradt RC. Glass fracture patterns and the (G,R) vs Delta C diagram. J Non-Cryst Solids.
25		2012;358(24):3459-64. https://doi.org/10.1016/j.jnoncrysol.2012.01.067.
26	[43]	Bradt RC. Applying fractography and fracture mechanics to the energy and mass of crack growth
27		for glass in the mirror region. J Eur Ceram Soc. 2014;34(14):3255-62.
28		https://doi.org/10.1016/j.jeurceramsoc.2014.04.036.
29	[44]	Wiederhorn SM. Fracture surface energy of glass. J Am Ceram Soc. 1969;52(2):99-105.
30		https://doi.org/10.1111/j.1151-2916.1969.tb13350.x.
31	[45]	OKAFOR C, Martin DM. The Effect of Temperature on the Fracture - Surface Energy of A Waste
32		Disposal Glass. J Am Ceram Soc. 1982;65(2):87-90. https://doi.org/10.1111/j.1151-
33		<u>2916.1982.tb10363.x</u> .
34	[46]	Jensen HM. Crack initiation and growth in brittle bonds. Eng Fract Mech. 2003;70(13):1611-21.
35		https://doi.org/10.1016/S0013-7944(02)00200-X.
36	[47]	Aguiar AR, Patriota TV. Brittle Fracture Modeling Using Ordinary State-Based Peridynamics with
37		Continuous Bond-Breakage Damage. J Peridyn Nonlocal Model. 2021:1-40.
38		https://doi.org/10.1007/s42102-021-00057-y.
39	[48]	Rouxel T. Fracture surface energy and toughness of inorganic glasses. Scr Mater. 2017;137:109-
40		13. <u>https://doi.org/10.1016/j.scriptamat.2017.05.005</u> .
41	[49]	Illian J, Penttinen A, Stoyan H, Stoyan D. Statistical analysis and modelling of spatial point
42		patterns: John Wiley & Sons; 2008.
43	[50]	Baddeley A, Rubak E, Turner R. Spatial point patterns: methodology and applications with R.
44		New York: CRC press; 2015. https://doi.org/10.1201/b19708.

1	[51] Cook RL. Stochastic sampling in computer graphics. ACM Trans Graph. 1986;5(1):51–72.
2	https://doi.org/10.1145/7529.8927.
3	[52] Grekousis G. Spatial Analysis Methods and Practice: Describe – Explore – Explain through GIS.
4	Cambridge: Cambridge University Press; 2020. https://doi.org/10.1017/9781108614528.
5	[53] Bivand RS, Pebesma EJ, Gómez-Rubio V. Applied spatial data analysis with R. New York:
6	Springer; 2013. https://doi.org/10.1007/978-1-4614-7618-4.
7	[54] Ren N, Shang B, Guan P, Hu L. General structural and dynamic characteristics beneficial to glass-
8	forming ability of Fe-based glass-forming liquids. J Non-Cryst Solids. 2018;481:116-22.
9	https://doi.org/10.1016/j.jnoncrysol.2017.10.029.
10	[55] Kim K, Rutqvist J, Nakagawa S, Birkholzer J. TOUGH-RBSN simulator for hydraulic fracture
11	propagation within fractured media: Model validations against laboratory experiments. Comput
12	Geosci. 2017;108:72-85. https://doi.org/10.1016/j.cageo.2017.05.011.
13	[56] Hirobe S, Imakita K, Aizawa H, Kato Y, Urata S, Oguni K. Mathematical model and numerical
14	analysis method for dynamic fracture in a residual stress field. Phys Rev E. 2021;104(2):025001.
15	https://doi.org/10.1103/PhysRevE.104.025001.
16	[57] Green PJ, Sibson R. Computing Dirichlet tessellations in the plane. The computer journal.
17	1978;21(2):168-73. https://doi.org/10.1093/comjnl/21.2.168.
18	[58] Moller J. Lectures on random Voronoi tessellations. New York: Springer New York; 1994.
19	https://doi.org/10.1007/978-1-4612-2652-9.
20	[59] Aurenhammer F, Klein R. Voronoi Diagrams. In: Sack J-R, Urrutia J, editors. Handbook of
21	computational geometry. Amsterdam, Netherlands; 2000. p. 201-90.
22	[60] Burrough PA, McDonnell RA, Lloyd CD. Principles of geographical information systems: Oxford
23	university press; 2015.
24	[61] Lucarini V. From symmetry breaking to Poisson point process in 2D Voronoi tessellations: the
25	generic nature of hexagons. J Stat Phys. 2008;130(6):1047-62. https://doi.org/10.1007/s10955-
26	<u>007-9475-x</u> .
27	

## **CRediT** authorship contribution statement

Yuhan Zhu: Writing - original draft, Investigation, Data curation, Software. Jian Yang: Writing - review & editing, Funding acquisition. Xing-er Wang: Writing - review & editing, Supervision, Funding acquisition. Dongdong Xie: Data curation, Validation. Xiaonan Hou: Writing - review & editing.

#### **Declaration of interests**

⊠The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

□The authors declare the following financial interests/personal relationships which may be considered as potential competing interests: