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Investigation of structural evolution in the Cu–Zr metallic glass at cryogenic temperatures by using molecular dynamics simulations

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Abstract

In the present work, investigation of structural evolution of $Cu_{33}Zr_{67}$ specimen during the cooling process from 2500 down to the 300 K, 200 K, 150 K, 100 K, 50 K, and 10 K has been performed at cooling rate of 5 K/ps using molecular dynamics simulation. The pair distribution function (PDF) reveals that $Zr-Zr$ pair causes the splitting of the first peak of the $Cu_{32}Zr_{67}$ glass at a lower temperature with an increase in height. Splitting of the frst and second peaks supports the presence of the inhomogeneous structure with a statistical average of crystal-like and disordered structural regions in the Cu₃₃Zr₆₇ glass. Voronoi cluster analysis indicated that quasi icosahedral clusters such as $\langle 284 \rangle$, $\langle 0285 \rangle$, and $\langle 0282 \rangle$; mixed-type cluster such as $<$ 0364 $>$; and crystal-like clusters such as $<$ 0446 $>$ are responsible for stabilization of glassy phase at 300 K, 200 K, 150 K, 100 K, 50 K, and 10 K. Similarly, the maximum population of the Cu-centered and Zr-centered<0286>quasi icosahedral clusters support the stability of the glassy phase over the studied temperature range. Besides, the maximum population of Cu-centered $<$ 0367 $>$ and Zr-centered $<$ 0364 $>$, $<$ 0367 $>$, $<$ 0363 $>$, and $<$ 0365 $>$ mixed-type clusters and Cu-centered <0448 > and Zr-centered <0448 >, <0445 >, <0446 >, and <0444 > crystal-like clusters support the possibility of the presence of intermediate phase of $CuZr₂$ at lower temperatures as observed from PDFs. Mean square displacement (MSD) for the Cu₃₃Zr₆₇ glass shows that the diffusion coefficient of Cu and Zr atoms reduces with decreasing temperature from 300 to 10 K. Diversity parameter (d) was found to decrease with decreasing temperature.

Keywords Molecular dynamics (MD) simulations · Cryogenic temperatures · Voronoi clusters · Mean square displacement (MSD) · Diversity (d)

Introduction

It is known that the excellent mechanical properties of metallic glasses (MGs) such as high elasticity and strength, high corrosion resistance, and hardness are overshadowed by their intrinsic brittleness [\[1,](#page-18-0) [2\]](#page-18-1). Therefore, improving the ductility, plasticity, and hardness of the MGs has been subject of immense interest $[1, 2]$ $[1, 2]$ $[1, 2]$. In recent years, different

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nanostructures have been widely used as reinforcement materials to improve the mechanical properties for polymers [[3,](#page-18-2) [4](#page-18-3)] and metallic glasses [\[1](#page-18-0), [5–](#page-18-4)[7\]](#page-18-5). Earlier studies to improve the mechanical properties of $Cu_{25}Zr_{75}$, $Cu_{50}Zr_{50}$, and $Cu_{75}Zr_{25}$ MGs have shown that the reinforcement by nanofllers is independent of the chemical compositions of the alloys $[1, 6, 7]$ $[1, 6, 7]$ $[1, 6, 7]$ $[1, 6, 7]$ $[1, 6, 7]$ $[1, 6, 7]$ $[1, 6, 7]$. On the other hand, attempts were also made to improve the strength and increase the fracture toughness of the alloys for cryogenic structural applications [[8\]](#page-18-7). Although the high strength of the material can be achieved by reducing thermal activation at cryogenic temperatures, it is difficult to achieve improved toughness in ordinary alloys [\[8](#page-18-7)[–10](#page-19-0)]. Besides, earlier reports [[11–](#page-19-1)[14](#page-19-2)] have shown the possibility to achieve high strength with improved ductility in bulk metallic glasses (BMGs) at low temperatures. High yield strength along with high fracture toughness at cryogenic temperatures in BMGs is achievable by reducing shear–band viscosity, shear–slip velocity, and the stress drop in the serrated fow [\[12](#page-19-3), [13](#page-19-4)]. Therefore, the knowledge

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of the efect of thermal activation of metallic glasses (MGs) on the change of physical properties is necessary for predicting the material behavior for their practical applications [\[15\]](#page-19-5). Recent studies have suggested that the medium-range order (MRO) clusters are connected via a fractal network with a dimension of 2.31 in BMGs [[16,](#page-19-6) [17](#page-19-7)]. These clusters are responsible for the stable glassy phase thereby providing resistance to the nucleation and growth of crystalline phases [\[18](#page-19-8), [19](#page-19-9)]. In particular, it has shown that the presence of full icosahedra $< 00,120 >$ is one of the most important Voronoi clusters (VCs) for the stability of the MGs [[20,](#page-19-10) [21](#page-19-11)]. The VC < 00120 > is responsible for the slowing down of relaxation dynamics compared to other polyhedral [\[20](#page-19-10), [21](#page-19-11)]. Recently, Cu–Zr binary glasses [[22–](#page-19-12)[25\]](#page-19-13) have been investigated for their mechanical properties such as tensile strength, surface damage under the impact of a nanosized projectile. Additionally, CuZr-based BMGs [[26–](#page-19-14)[28\]](#page-19-15) were also studied due to their enhanced mechanical properties at room temperature. However, the fundamental understanding of the glass-forming mechanism and its efect on properties is still unclear at cryogenics. This alloy provides a large compositional range from 25 to 72 at % of Cu to explore the structural dynamics at the atomic level and its relationship with glass-forming ability (GFA) [\[29](#page-19-16), [30](#page-19-17)].

Earlier, Kluge, and Schober [[31](#page-19-18), [32\]](#page-19-19) have studied the diffusion and jump length in the $Cu_{33}Zr_{67}$ glass from 2000 to 700 K with diferent cooling rates. Similarly, Han and Schober [[33](#page-19-20)] and Liu et al. [\[34\]](#page-19-21) have reported the diffusion studies in the temperature range of 2400 to 1200 K and 2000 to 800 K, respectively, in $Cu_{33,3}Zr_{66,7}$ glass. However, the study of this glassy alloy was not addressed at lower temperatures which have created a lack of understanding in glass behavior under cryogenic conditions. The signifcance of the low-temperature applications and the importance of the Cu₃₃Zr₆₇ glass have motivated us to perform the lowtemperature studies of the Cu₃₃Zr₆₇ glass from 300 to 10 K and address the structural evolution at the atomic scale using molecular dynamics (MD) simulations. In the present work, MD has been used to address the GFA and the structural evolution with temperature. Our overall goal of the present study is to address the underlying physical mechanism responsible for the structural rearrangements during cooling from 300 to 10 K in $Cu_{33}Zr_{67}$ alloy and its role in GFA. The role of diferent Voronoi polyhedral clusters behind the glass-forming mechanism at the atomic scale has also been evaluated.

Computational details

An investigation of structure evolution during the cooling process from 300 to 10 K was performed for $Cu_{33}Zr_{67}$ by MD simulations using Large-scale Atomic/Molecular Massively Parallel Simulator (LAMMPS) platform [[35\]](#page-19-22). Embedded atom method (EAM) interatomic potential developed by Mendelev et al. [[36](#page-19-23)] has been used. A simulation box of 10 nm \times 10 nm \times 10 nm dimensions containing approximately 87,808 atoms has been constructed by applying the periodic boundary condition. The motion equations were solved by the velocity–Verlet algorithm in the velocity form [[37](#page-19-24)]. The isothermal–isobaric ensemble (i.e., NPT) with a constant atom number (*N*), pressure (*P*), and temperature (*T*) have been used. The temperature is controlled by Nose–Hoover thermostat [\[38\]](#page-19-25), and zero pressure is maintained using Nose–Hoover barostat [[39,](#page-19-26) [40](#page-19-27)], respectively. The specimen has been heated from 300 to 2500 K with a time step of 0.002 ps at a heating rate of 5 K/ps. Further, the specimen has been equilibrated at 2500 K for 50 ps and then cooled down to 300 K, 200 K, 150 K, 100 K, 50 K, and 10 K at a cooling rate of 5 K/ ps. From the literature survey [[1,](#page-18-0) [6](#page-18-6), [7,](#page-18-5) [19–](#page-19-9)[25](#page-19-13), [29](#page-19-16)[–34,](#page-19-21) [37,](#page-19-24) [40–](#page-19-27)[43](#page-19-28)], it has been observed that $Cu-Zr$ binary MGs and Cu-Zr-based MGs have been quenched at different temperatures with a wider cooling rate (R_C) ranging from 0.04 to 500 K/ps. Among them, $Cu_{33}Zr_{67}$ was studied at *R*_C of 0.04 K/ps, 0.2 K/ps, 1 K/ps, and 5 K/ps, 25 K/ps by Kluge et al. [[31,](#page-19-18) [32](#page-19-19)]. Similarly, Han et al. [[33\]](#page-19-20) and Liu et al. [[34](#page-19-21)] investigated the $Cu_{33,3}Zr_{66,6}MGs$ at R_C of 1 K/ ps and 0.4 K/ps, respectively. Being large in atomic size $(Zr_{\text{radius}}, 1.603 \text{ Å})$ [[44](#page-20-0)] compared to that of Cu (Cu_{radius} , 1.278 Å) [[44\]](#page-20-0), it was presumed that the introduction of Zr in Cu will re-structure the geometry of the Cu leading to the new geometrical arrangement at atomic scale in binary $Cu_{33}Zr_{67}$ MG. Moreover, Zhang et al.[\[41\]](#page-19-29) have reported that the orientation of the crystalline structure becomes more prominent at lower cooling rate, i.e., 10 K/ ps for 2D Cu. Considering all these aspects, it was proposed that the use of lower cooling rate, i.e., 5 K/ps, would provide significant structural evolution at lower temperatures. On the other hand, $Cu_{46}Zr_{54}$ [[45](#page-20-1)] and Cu– $Zr-Ag$ [[46](#page-20-2)] MGs have been studied at the same heating rate (R_h) and cooling rate (R_c) in addition to the different R_C to study their effect on thermal properties of the system. Like R_C , there is a critical heating rate (R_h) to maintain the amorphous structure while heating to the liquid state [[47](#page-20-3)]. It indicates the lowest heating rate required to avoid devitrification when heating a perfect amorphous sample to a liquid in equilibrium [[47](#page-20-3)]. Earlier $[47-49]$ $[47-49]$, it was reported that the difference in R_C and *R*h causes asymmetry in crystallization and divarication. Therefore, to avoid any such discrepancy and to investigate the structural evolution in $Cu_{33}Zr_{67}$ as function of temperature alone in the present work, both R_h and R_C were kept identical, i.e., 5 K/ps. The structural details have been retrieved by pair distribution function (PDF) [[50](#page-20-5), [51\]](#page-20-6), coordination number (CN), and Voronoi cluster

(VC) analysis [[29,](#page-19-16) [52,](#page-20-7) [53\]](#page-20-8). Mean square displacement (MSD) [\[54\]](#page-20-9) studies for Cu and Zr atoms have also been performed in the temperature range of 300 to 10 K. MSD will provide information on the atomic diffusion of the different atomic species such as Cu and Zr. Equation ([1\)](#page-2-0) is for the calculation of MSD [[54](#page-20-9)].

$$
MSD = \left\langle r^2(t) \right\rangle = \left\langle \frac{1}{N} \sum_{i=0}^{N} \left(r_i(t) - r_i(0) \right)^2 \right\rangle \tag{1}
$$

In Eq. ([1\)](#page-2-0), *N* represents the number of atoms, *t* is the time duration, and $r_i(t) - r_i(0)$ is the vector distance traveled by a specifc atom over the time duration. Besides, diversity (*d*) in the clusters at diferent temperatures is also evaluated.

Fig. 1 Total and partial PDFs of $Cu_{33}Zr_{67}$ MGs. The inset is a 3D configuration of $Cu_{33}Zr_{67}$ MG. The red and blue balls represent Cu and Zr atoms, respectively

Results and discussion

Pair distribution functions (PDFs)

For obtaining interatomic distances and coordination number (CNs) of the rapidly quenched specimen of the Cu₃₃Zr₆₇ MG, total pair distribution function (PDF) and partial pair distribution function (pPDF) have been studied. Figure [1](#page-2-1) shows the typical nature of the total and pPDF at 300 K with the 3D specimen structure of the $Cu_{33}Zr_{67}$ glassy alloy. Variations in total PDFs of the liquid to the glassy state of $Cu_{33}Zr_{67}$ with decreasing temperature have been illustrated in Fig. [2.](#page-2-2)

Splitting of the frst peak with a sharp increase in its height has been observed in Fig. [2,](#page-2-2) while quenching the liquid melt from 2500 to 10 K. The height of the second sub-peak was found to be increasing monotonically irrespective of the frst sub-peak when the temperature decreases from 300 to 10 K. Similarly, the evolution of the splitting of the second peak has also been noticed at 300 K compared to that of 2500 K. The frst sub-peak of the second main peak has been found to increase monotonously as the temperature decreases down to 10 K from 300 K irrespective of the second sub-peak. Besides, a small peak between the frst and second main peaks is found to grow with decreasing temperature. To elucidate the splitting mechanism of the frst and second peaks, pPDFs have been carried out for Cu–Cu, Cu–Zr, and Zr–Zr pairs as shown in Fig. [3](#page-4-0) Identical illustration, as observed in Fig. [2,](#page-2-2) of the increasing magnitude of the frst peak and its splitting has been observed in $g_{Zr-Zr}(r)$ as shown in Fig. [3c.](#page-4-0) Like Fig. [2,](#page-2-2) splitting of the second peak has been noticed for $g_{Cu-Cu}(r)$ and $g_{Zr-Zr}(r)$ in Fig. [3a and c](#page-4-0) respectively. Splitting of the second peak of the PDF and pPDF is the indicator of the formation of the glassy state [\[34](#page-19-21)]. Growth of the frst sub-peak with lowering temperature was found to be more pronounced compared to

Fig. 3 Partial PDFs of $Cu_{33}Zr_{67}$ MG for **a** $g_{Cu-Cu}(r)$, **b** $g_{Cu-Zr}(r)$, and **c** g_{Zr-Zr}(r) at 300 K, 200 K, 150 K, 100 K, 50 K, 10 K obtained using MD simulations. **a1**, **b1**, and **c1** represent partial $g(r)$ for $g_{Cu-Cu}(r)$, $g_{\text{Cu-Zr}}(r)$, and $g_{\text{Zr-Zr}}(r)$ in the range of 1.8 to 3.4 Å, 2.2 to 3.2 Å, and 2.6 to 3.8 Å, respectively

that of the second sub-peak in $g_{Cu-Cu}(r)$ and $g_{Zr-Zr}(r)$. Unlike $g_{Cu-Cu}(r)$ and $g_{Zr-Zr}(r)$, no splitting of the second peak has been observed for g_{Cu-Zr} (r) in Fig. [3b.](#page-4-0) However, at 300 K onwards, two small unusual peaks were found to emerge at the minimum of the frst peak on the higher *R* side of $g_{Cu-Zr}(r)$ as noticed in Fig. [3b](#page-4-0). The second sub-peak was found to increase with lowering the temperature compared to that of the frst sub-peak. An increase in height of one such peak has also been noticed for $g_{Zr-Zr}(r)$ in Fig. [3c.](#page-4-0) From these observations, it can be presumed that with lowering the temperature from 300 to 10 K, atoms are trying to arrange themselves in some order fashion leading to the coexistence of the crystal-like and disordered structural region which will be discussed in detail in the section "Proposed crystal structure evolution during cooling from 300 to 10 K." Besides, in Fig. [3a](#page-4-0)1, b1, and c1, intensity and height of the peaks at diferent temperatures have been enlarged. These fgures show that the peak of the $g_{C_{II}-C_{II}}(r)$ shifts towards the lower *R* value with decreasing temperatures. Similarly, the peak of the $g_{Cu-Zr}(r)$ is found to shift towards higher *R* values with decreasing temperature. On the other hand, splitting of the first peak in the opposite directions for $g_{Zr-2r}(r)$ can be seen in Fig. [3](#page-4-0)c1. Competition of first peaks in $g_{Cu-Cu}(r)$, $g_{Cu-Zr}(r)$, and $g_{Zr-Zr}(r)$ to grow in opposite directions with decreasing temperature is responsible for splitting of the frst peak in total PDF as shown in Fig. [2.](#page-2-2) To shed a light on such peculiar behavior, in Fig. [4,](#page-4-1) variations in interatomic distances

Fig. 4 Variation in interatomic distances obtained by MD simulations at 300 K, 200 K, 150 K, 100 K, 50 K, 10 K for $Cu_{33}Zr_{67}$ MG

obtained from MD simulations with temperature are plotted. Interatomic distance is found to decrease for Cu–Cu pair and increase for Cu–Zr pair with decreasing temperature, respectively, as shown in Fig. [4](#page-4-1). For Zr–Zr pair, identical behavior of variation in the interatomic distance with temperature as that of Cu–Cu pair has been observed. These results support the shifting of peaks for Cu–Cu, Cu–Zr, and Zr–Zr with temperature as shown in Fig. [3a](#page-4-0)-c.

The diference of the Cu–Cu, Cu–Zr, and Zr–Zr pPDFs causes the splitting of the frst peak of the total PDF at 300 K represented in Fig. [2.](#page-2-2) From Fig. [2,](#page-2-2) it can be seen that in total PDF, splitting of the second peak begins at $1.42\sigma_1$ and 1.79 σ_1 . σ_1 = 3.05 Å is the first peak position as shown in Fig. [2](#page-2-2). The distances r_{Cu-Cu} , r_{Cu-Zr} , and r_{Zr-Zr} are estimated from the first peak maxima of the $g_{ii}(r)$. At 300 K, the distance of r_{Cu-Cu} , r_{Cu-Zr} , and r_{Zr-Zr} obtained from Fig. [3](#page-4-0)a-c is 2.51 Å, 2.79 Å, and 3.13 Å, respectively, which is in good agreement with the experimental data ($r_{CuCu} = 2.47$ Å, r_{CuZr} = 2.85 Å, and r_{ZrZr} = 3.20 Å) for the Cu₅₀Zr₅₀ MG [\[29](#page-19-16)]. Earlier reports [\[55,](#page-20-10) [56\]](#page-20-11) have shown that the first peak position is mainly determined by the Zr–Zr partials in the Zr-rich liquids. The *R* values close to the Zr–Zr bond length corresponds to the Zr-rich liquid [[57\]](#page-20-12). It appears that when the peak in g(r) is dominated by one of the partials, it follows the temperature dependence of those partials which can shift to the smaller/larger *R* with increasing/decreasing temperature. The relative growth rates and contributions of the partials may result in a contraction or expansion of the frst shell [\[56](#page-20-11)]. In the present work, the value of peak position at 300 K obtained from MD simulations is 3.05 Å which is close to that of Zr–Zr partials. Therefore, it can be said that the total g(r) follows the temperature dependence of Zr–Zr partials.

Further, the splitting of the second peak was found to begin at an identical temperature of 300 K as observed in the $g_{Cu-Cu}(r)$ and $g_{Zr-Zr(r)}$ pPDFs, as displayed in Fig. [3a](#page-4-0) and Fig. [3c](#page-4-0). Besides, the interatomic distances at which splitting of the second peak begins are also calculated. It was found that splitting has emerged at $1.83\sigma_1$ and $2.17\sigma_1$ for the Cu–Cu pairs and 1.78 σ_3 and 1.94 σ_3 for the Zr–Zr pairs, respectively, where $\sigma_1 = 2.51$ Å and $\sigma_3 = 3.13$ Å are the first peak position, respectively, in the Cu–Cu and Zr–Zr pPDFs. However, no splitting of the second peak for the Cu–Zr pair has been observed. Present calculations match well with available literature [[29](#page-19-16), [52](#page-20-7), [58](#page-20-13)] and refect the universality of PDFs in MGs. Table [1](#page-5-0) shows that atomic distances Cu–Cu, Cu–Zr, and Zr–Zr are less than that of Goldsmith radius [[44,](#page-20-0) [59](#page-20-14)] of the crystalline positions. It is known that when frst neighbor distances are shorter than crystalline positions, the atoms in the short-range order (SRO) regime acquired the position with minimum local energy and stabilizes the glassy phase [[60\]](#page-20-15). It shows that the present EAM interatomic potential $[36]$ $[36]$ $[36]$ is suitable to explain the structure of $Cu_{33}Zr_{67}$ MG. Besides, small shoulder peaks

Table 1 Comparative analysis of interatomic distances *R* (Å) of Cu‒Cu, Cu‒Zr, Zr‒Zr as obtained by MD simulations for the $Cu_{33}Zr_{67}$ glassy ribbons at 10 K, 50 K, 100 K, 150 K, 200 K, and 300 K

 $R_{i,j}$ =interatomic distances calculated from the interatomic radius of the individual element as given in [[44](#page-20-0), [59](#page-20-14)]

are found to grow between frst and second peaks on right at [3](#page-4-0)00 K onwards as shown in Fig. 3b and c for g_{Cu-Zr} and g_{Zr-Zr} , respectively. With further decrease in temperature, the peak intensities of the right shoulder boost and split into two sub-peaks as shown in Fig. [3b](#page-4-0) thereby showing the initiation of the ordered structure. The growth of the right sub-peak becomes more pronounced with decreasing temperature thereby supporting the possibility of orientation in the ordered structure at the atomic scale. In an earlier report [\[60](#page-20-15)], it has been stated that such a bump might result from the presence of atoms between the frst and second coordination shells during cooling. This suggests that some of the atoms move towards each other thereby pushing other atoms between the frst and second neighbor distance in the SRO regime [\[60](#page-20-15)]. The splitting of the second peaks for the Cu–Cu and Zr–Zr pairs at lower temperature supports the formation of the $Cu_{33}Zr_{67}$ glass [\[41](#page-19-29), [42\]](#page-19-30). The growth in the height of the two sub-peaks can be attributed to the atomic rearrangement during cooling. For Zr–Zr pair, the second peak shifts to the right with an increase in height during the cooling process with no splitting. This shows the diferent environments of the Cu and Zr atoms in the $Cu_{33}Zr_{67}$ glass.

Earlier, it was reported that the Cu–Zr system exhibits longer Zr–Zr bonds, intermediate Cu–Zr, and short Cu–Cu in the frst coordinating shell [\[35,](#page-19-22) [52](#page-20-7)]. These observations are consistent with the present fndings as shown in Table [1](#page-5-0) and can be confirmed with those of $\sigma_1 = 2.51$ Å, $\sigma_2 = 2.79$ Å, and σ_3 = 3.13 Å. In addition to the first shell, longer-range pair correlations such as second and third atomic shells have also been analyzed. The substantial diferences in the pPDFs $g_{Cu-Cu}(r)$, $g_{Cu-Zr}(r)$, and $g_{Zr-Zr(r)}$ between the liquid and glass states can be remarkably noticed as shown in Fig. [3](#page-4-0)a-c. The pPDFs in the liquid at 2500 K show a signifcant degree of similarity, while at 10 K, plots show distinct variation. It was observed that the second shell for Cu–Cu and Zr–Zr partials shows a large degree of peak splitting. On the other hand, the Cu–Zr partial shows a considerable diference when comparing the liquid to the glassy state with the splitting of the peak at the frst minima as shown in Fig. [3](#page-4-0)b. Strong temperature

Table 2 Interatomic distances $R(A)$ at the first peak, second peak, and third peak for $Cu_{33}Zr_{67}$ MG

Temperature First peak		Second peak	Third peak	
			1st sub-peak 2nd sub-peak	
2500 K	2.95	5.5		NA
300 K	3.05	4.33	5.46	7.92
200 K	3.02	4.46	5.46	7.92
150K	3.03	4.36	5.48	7.92
100K	3.06	4.19	5.46	7.93
50 K	3.03	4.12	5.47	7.94
10 K	3.04	4.12	5.47	7.96

dependence of the separation of the peaks and their relative intensities has been observed as illustrated in Fig. [2](#page-2-2) and Fig. [3](#page-4-0)a-c. The fuctuation in the height of the partial pairs beyond 7 Å is reasonably higher for the glass state. This shows the structural re-ordering of the glass in the second and third atomic shells [\[61\]](#page-20-16). Moreover, the interatomic distances of the second and third shells were found to shift to smaller *R* by lowering the temperature from 2500 to 10 K for Cu–Cu and Zr–Zr pair. On the other hand, these peaks were found to shift towards the higher *R* by lowering the temperature from 2500 to 10 K for Cu–Zr. These changes in the pPDFs show the variation in the atomic ordering up to 10 Å. This could be stated as the densifcation of the atomic packing by lowering the temperature [[62\]](#page-20-17). The values of interatomic distances at the frst peak, second peak, and third peak for $Cu_{33}Zr_{67}$, Cu–Cu, Cu–Zr, and Zr–Zr are given in Tables [2,](#page-5-1) [3](#page-6-0)[4](#page-6-1) to [5](#page-6-2), respectively. From Fig. $3a1 - c1$ $3a1 - c1$, it can be seen that the diferent directions of the growth of the frst peaks are responsible for the splitting of the frst peaks with decreasing temperature in total PDF as shown in Fig. [2](#page-2-2). Based on the evolution trend of frst and second peaks with varying cooling rates and cooling temperatures, Zhang et al. [[41\]](#page-19-29) have suggested that the splitting of the frst and second peaks can be viewed as an embryonic form of the crystal peak. Zhang et al. [[41\]](#page-19-29), as shown in Fig. [5,](#page-6-3)

Table 3 Interatomic distances $R(A)$ at the first peak, second peak, and third peak for Cu-Cu

		Temperature First peak Second peak	Third peak	
			1st sub-peak 2nd sub-peak	
2500 K	2.48	5.05		7.92
300K	2.51	4.59	5.44	7.84
200 K	2.51	4.58	5.39	7.83
150K	2.52	4.52	5.39	7.78
100K	2.49	4.55	5.41	7.84
50 K	2.52	4.54	5.41	7.84
10K	2.49	4.55	5.42	7.90

Table 4 Interatomic distances $R(A)$ at the first peak, second peak, and third peak for Cu‒Zr

Temperature	First peak	Third peak Second peak	
2500 K	2.73	5.77	NA
300 K	2.79	5.35	7.81
200 K	2.79	5.36	7.82
150K	2.79	5.38	7.88
100K	2.79	5.38	7.84
50 K	2.81	5.41	7.85
10K	2.81	5.43	7.85

Table 5 Interatomic distances R (\AA) at the first peak, second peak, and third peak for Zr‒Zr

plotted the fraction of the crystal-like regions with the temperature at diferent cooling rates. Zhang et al. [\[41\]](#page-19-29) have divided the region into three zones as shown in Fig. [5](#page-6-3). As shown in Fig. [2,](#page-2-2) it can be concluded that the shoulder peaks between frst and second peaks and two sub-peaks on the second peak support the presence of short- or medium-range ordered structures in $Cu_{33}Zr_{67}$ MG. With this consensus, it can be concluded that there is a formation of some short- to medium-range ordered structure at cryogenics which leads to the coexistence of the disordered and crystal-like structure.

Fig. 5 Relationship between the fraction of the crystal-like region and the splitting of the second peak with diferent cooling rates: black line, 500 K/ps; red line, 250 K/ps; blue line, 100 K/ps; brown line, 50 K/ps; purple line, 25 K/ps; and dark blue line, 10 K/ps [\[41\]](#page-19-29). (Reproduced with permission from AIP Publishing House)

Proposed crystal structure evolution during cooling from 300 to 10 K

Wang et al. [[63](#page-20-18)] have reported that the BMGs can be quenched compositionally neighboring the intermetallic compounds as close as 0.5 at.% [\[63\]](#page-20-18). Wang et al. [\[63](#page-20-18)] termed these BMG formers as "intermetallic glass" and showed that the liquid alloy neighboring the intermetallic compounds acquired lower Gibbs free energy compared to that of the compounds themselves [\[63,](#page-20-18) [64](#page-20-19)]. From the phase diagram as shown in Fig. 6×65 6×65 6×65 , it can be seen that the intermetallic phase $CuZr₂$ with tetragonal crystal structure exists near the same point where the glass-forming composition $Cu_{33}Zr_{67}$ is present. Therefore, it can be presumed that the low-temperature crystallization leads to the initiation of the development of the CuZr₂ phase. This can be presumed from the growth of the small peak between the frst and second peaks of the total PDF of the $Cu_{33}Zr_{67}$ MG as seen in Fig. [2](#page-2-2) and the presence of the crystal-like and disordered structural regions as seen in Fig. [4.](#page-4-1) Therefore, it could be suggested that the low-temperature treatment can be extended to the Cu–Zr binary MGs to improve the structural properties in addition to other reinforcement strategies [[1](#page-18-0), [6](#page-18-6), [7](#page-18-5)].

Atomic‑level structure analysis

From earlier reports [[29,](#page-19-16) [52](#page-20-7), [53](#page-20-8), [62\]](#page-20-17), it has been observed that the Voronoi cluster analysis is an efective way to identify the building units of atomic structures. Details about the **Fig. 6** Cu–Zr binary phase diagram, showing the evolution of critical sizes of intermetallic glass formers near each intermetallic compound, as well as the location of eutectic glass formers in the system with glass-forming rage [[63](#page-20-18)]. (Reproduced with permission from ELSEVIER Publishing House)

Fig. 7 Coordination number (CN) along with its corresponding population fraction for $Cu_{33}Zr_{67}$ MG at (a) 300 K, (b) 200 K, (c) 150 K, (d) 100 K, (e) 50 K, (f) 10 K, respectively

Voronoi tessellations can be found in [[29,](#page-19-16) [52,](#page-20-7) [53\]](#page-20-8). Figure 7 shows the plots of coordination number (CN) for $Cu_{33}Zr_{67}$ MG at (a) 300 K, (b) 200 K, (c) 150 K, (d) 100 K, (e) 50 K, and (f) 10 K, respectively. From Fig. [7](#page-7-1), it can be observed that at all studied temperatures $CN = 15$ has maximum population fraction followed by $CN = 14, 13, 16,$ and 12. $CN = 11$ and 17 have low population fraction compared to them. From Table 6 , it can be seen that with decreasing temperature from 300 to 10 K, the fraction of $CN = 12-15$ increases whereas the fraction of $CN = 16-17$ decreases. Moreover, a very small decrease in the fraction of $CN = 11$ has been observed. Table [6](#page-7-2) shows that with lowering the temperature, the tendency of atomic confguration evolution increases by 0.22%, 25%, 0.29%, and 0.16%, respectively, for $CN = 12, 13, 14,$ and 15. On the other hand, $CN = 16$ and 17 decrease by 0.64% and 0.26%, respectively. Therefore, the cluster evaluation in $Cu_{33}Zr_{67}$ can be ascribed as the coordinated clusters with CN 16 and 17 with a large bond length between center atoms, and the atoms in a shell declined into

Table 7 Variation in Voronoi polyhedra (VPs) (%) with its corresponding population fractions (%) for $Cu_{33}Zr_{67}$ MG at 300 K, 200 K, 150 K, 100 K, 50 K, 10 K

CN	VPs	$10~\mathrm{K}$	50 K	$100~\mathrm{K}$	150 K	$200~\mathrm{K}$	300 K
10	< 0280	0.4	0.4	0.4	0.4	0.4	0.4
	< 0361	0.2	0.2	$0.2\,$	0.2	$0.2\,$	$0.2\,$
11	< 0281	2.4	2.4	2.4	2.3	2.3	2.2
	< 0362 >	0.4	0.4	0.4	0.4	0.4	0.4
	< 0443	0.4	0.5	0.5	0.5	0.4	0.5
12	< 00,120	0.8	$0.7\,$	$\rm 0.8$	$\rm 0.8$	$0.7\,$	$0.7\,$
	< 0282 >	3.3	3.2	3.2	3.2	3.1	$3.0\,$
	< 0363 >	2.5	2.3	2.4	2.3	2.3	2.3
	< 0444	1.0	1.1	1.1	$1.1\,$	1.1	1.1
	< 0525 >	0.3	0.3	0.3	0.2	$0.3\,$	0.3
13	< 01, 102 >	$1.8\,$	$1.8\,$	1.8	1.7	1.7	$1.7\,$
	< 0283 >	$0.9\,$	0.9	$0.9\,$	$\rm 0.8$	$0.9\,$	$\rm 0.8$
	< 0364 >	$4.8\,$	4.7	$4.8\,$	4.6	4.5	4.4
	< 0445 >	1.3	1.2	1.2	1.3	1.2	1.2
	< 0526 >	$0.7\,$	$0.7\,$	$0.7\,$	$0.7\,$	$0.7\,$	$0.7\,$
14	< 00, 122 >	0.5	0.4	0.5	0.5	0.4	0.4
	< 01, 103	$1.8\,$	$1.8\,$	$1.8\,$	$1.7\,$	1.7	1.6
	< 0284 >	4.3	4.2	4.2	4.2	4.0	$4.0\,$
	< 0365 >	3.1	3.2	3.1	3.1	$3.0\,$	3.1
	< 0383 >	0.1	0.1	0.1	0.1	0.1	0.1
	< 0446 >	2.6	2.6	2.6	2.6	2.7	$2.5\,$
	< 0464	0.2	0.2	0.2	0.2	0.2	$0.2\,$
	< 0608 >	0.3	0.3	0.3	0.3	0.3	$0.2\,$
15	< 01, 104 >	2.1	2.1	1.9	2.0	1.9	1.9
	< 00,123 >	0.4	0.3	0.4	0.4	0.3	0.3
	< 0285 >	3.6	3.6	$3.5\,$	3.4	3.4	3.2
	< 0366	3.1	3.1	3.2	3.1	$3.0\,$	3.0
	< 0447	1.7	$1.7\,$	$1.7\,$	$1.7\,$	1.6	$1.7\,$
	< 0528 >	0.2	$0.2\,$	0.2	0.2	0.2	$0.2\,$
16	< 00, 124 >	$0.1\,$	$0.1\,$	$0.1\,$	$0.1\,$	0.1	$0.1\,$
	< 01, 105 >	0.6	0.7	0.7	0.7	0.7	0.7
	< 0286 >	1.3	1.4	1.4	1.4	1.4	1.4
	< 0367 >	1.0	1.0	1.1	1.1	1.0	1.0
	< 0448 >	0.6	0.6	0.6	0.6	0.7	0.7
17	< 01, 106 >	0.1	0.1	0.1	0.1	0.1	0.1
	< 0287	$0.2\,$	$0.2\,$	0.2	0.2	$0.2\,$	$0.2\,$
	< 0368 >	$0.2\,$	$0.2\,$	0.2	0.2	0.2	$0.2\,$
	< 0449	0.1	0.1	0.1	0.1	0.1	0.1

a coordinated cluster of CN with 12–15 with smaller bond lengths upon cooling [[56\]](#page-20-11). It is known that the icosahedral cluster has 12 neighboring atoms and has a $CN = 12 [66, 67]$ $CN = 12 [66, 67]$ $CN = 12 [66, 67]$ $CN = 12 [66, 67]$. The population fraction of atoms with $CN = 12$ for $Cu_{33}Zr_{67}$ was found to be constant throughout the temperature range of $10-300$ K with a small variation of 0.1%. In the present investigation, CN analysis of $Cu_{33}Zr_{67}$ has shown the higher population fraction of $CN = 12$ at 10 K indicating the higher GFA of the specimen. Considering the Cu and Zr atoms as the center of the polyhedron, distribution of CN, and diferent Voronoi clusters (VC), analysis for the $Cu_{33}Zr_{67}$ MG at 300 K, 200 K, 150 K, 100 K, 50 K, and 10 K has been evaluated. Figure [8](#page-8-0) shows the variation in Cu- and Zr-centered CN at various temperatures. From Fig. [8,](#page-8-0) it can be seen that $CN = 15$ and 16 are the most dominating at all temperatures centered on Cu and Zr atoms. Zr-centered polyhedra are mainly CNs with 13, 14, 15, 16, 17, and even 18 for liquid $Cu_{64}Zr_{36}$ and are decreased with further increasing Zr content [[60](#page-20-15)]. The presence of Cu-centered CNs of 13 and 14 has also been expected in some BMGs [[60](#page-20-15), [68\]](#page-20-23). From the common neighbor analysis [\[60](#page-20-15)], it has been unfolded that the presence of complex geometries in Cu–Zr MG is a result of the packing among nearby atoms as well as related to the chemical bonding.

Hidden topological orders in Cu33Zr67 metallic glass

Diferent characteristic constant sequences correspond to the diferent lattice structures [[42](#page-19-30)]. Henceforth, to understand the different topological ordering in the $Cu_{33}Zr_{67}$ MG, the scaled peak positions of the partial PDFs have been analyzed. Ratio R_i/R_1 ($i = 2,3,4$) in Cu–Cu pPDFs chooses the characteristic constants of the fcc lattice structure. For Cu–Zr pPDFs, it has been observed that the values of R_2/R_1 and R_3/R_1 follow bcc and fcc orders, respectively. Similar results were also observed in Zr–Zr partial PDFs. It has been observed that the R_2/R_1 and R_i/R_1 (*i*=3,4) follow fcc order and bcc order, respectively. Hence, in Cu–Zr and Zr–Zr pPDFs, the hidden order follows both fcc order and bcc order. Thus, three diferent hidden orders are identifed in

 $Cu_{33}Zr_{67}$ glasses. Considering the present analysis, it can be stated that all three partial PDFs, as shown in Fig. [3](#page-4-0)a-c, are distinct indicating the diferent range of atomic packing orders in Cu–Cu, Cu–Zr, and Zr–Zr, respectively. The existence of diferent topological order in pPDFs can be attributed to the splitting of the frst peak and second peak in total PDF as shown in Fig. [2.](#page-2-2) This analysis supports the good GFA of the Cu–Zr MGs in the present work.

Voronoi clusters (VC) in Cu₃₃Zr₆₇

Voronoi analysis has revealed that there are 38 VCs in the $Cu_{33}Zr_{67}$ MG having CN of 10–17 at the studied temperature range. From Table [7](#page-8-1), it can be seen that the population of the VCs<0281>,<0282>,<0363>,<0364>,<0284>, $<$ 0365>, $<$ 0446> $<$ 01104>, $<$ 0285>, and $<$ 0366> was more than 2%. Besides, the population fraction of VCs $0444 > 0.1102 > 0.1445 > 0.1103 > 0.1447 > 0.1447$ 286 , and \lt 0367 $>$ was in the range of 1 to 2%. Among them, $<$ 0364 $>$ was found to have a maximum population of 4.4% and 4.8% at 300 K and 10 K, respectively. On the other hand, $\langle 0.0124 \rangle$ $\langle 0.01106 \rangle$, and $\langle 0.0449 \rangle$ were found to have the lowest population of 0.1% over the complete temperature range. A list of VCs over the temperature range can be found in Table [7](#page-8-1). Further, these VCs have been classifed into perfect icosahedra, quasi icosahedral, mixed-type clusters, and crystal-like clusters as proposed by Hwang [\[69](#page-20-24)] as listed in Table [8.](#page-9-0) Table [8](#page-9-0) show that the quasi icosahedral VCs such as<01102>,<01103>,<01104>,<0281>,<0282>,< 0284 , 0285 , and 0286 ; mixed-type cluster such as $<$ 0363 >, $<$ 0364 >, $<$ 0365 >, $<$ 0366 >, and $<$ 0367 >; and crystal-like cluster such as $\langle 0444 \rangle$, $\langle 0445 \rangle$, $\langle 0446 \rangle$, and $<$ 0447 $>$ majorly contribute to the formation of the glass and the splitting of the peaks (first and second) for $Cu_{33}Zr_{67}$ with decreasing temperature. For the present investigation, VCs with a fraction of more than 1% are considered. From Table [8,](#page-9-0) it can be noticed that the population fraction of quasi icosahedral VCs such as $\langle 01102 \rangle$, $\langle 01103 \rangle$, $\langle 011$ 04>,<0281>,<0282>,<0284>, and<0285>increases as the temperature decreases down to 10 K. Among them, $<$ 0284 > , $<$ 0285 > , and $<$ 0283 > are the top VCs with maximum population fraction which increases with decreasing temperature. Similarly, it can be seen that the population fraction of the mixed-type clusters such as $\langle 0.363 \rangle$, $\langle 0.364 \rangle$ >,<0365>, and<0366>increases with decreasing temperature. However,<0364>,<0366>, and<0365>have large fraction compared to other VCs. Uneven rise and fall in the population fraction of these can be seen in Fig. [9.](#page-10-0) Besides, a crystal-like cluster such as $<$ 0445 $>$ and $<$ 0446 $>$ increa ses with lowering the temperature. However, $<$ 0446 > has a large population fraction among other crystal-like VCs, and $< 0447 >$ has the second largest population. Both the

Fig. 9 Variation in population fraction (%) of **a** quasi icosahedral, **b** mixed-type, **c** crystal-like Voronoi clusters at 10 K, 50 K, 100 K, 150 K, 200 K, 300 K

Table 9 Classifcation of VPs $(\%)$ based on Hwang $[69]$ $[69]$ $[69]$ criteria at Cu- and Zr-centered atoms for $Cu_{33}Zr_{67}$ MG

VCs are found to have an almost constant population over the studied temperatures. Further, quasi icosahedral VC such as < 0286 > and mixed-type cluster such as < 0367 > were found to decrease with lowering temperature as can be seen from Table [8.](#page-9-0) Moreover, the population fraction of mixedtype clusters such as $<$ 0367 > was found to increase first from 300 to 100 K and then decrease with a further fall of temperature from 100 to 10 K. Besides, crystal-like VC such as < 0447 > remains constant at all studied temperatures. However, the population fraction of the perfect icosahedra $< 00120>$ is almost constant (i.e., 0.7–0.8%) in the temperature range of $10-300$ K. Therefore, in Fig. [8,](#page-8-0) only those VCs are plotted for which the population fraction is more than or equal to 1%.

Further, to clarify the role of both Cu- and Zr-centered polyhedral, VCs are classifed into Cu-centered and Zr-centered as illustrated in Table [9](#page-11-0). Figure [10](#page-12-0)a shows that Cucentered quasi icosahedral VCs < 0286 > and <01105 > are constant with decreasing temperature from 300 to 50 K and slightly decreased further at 10 K. Moreover, Zr quasi icosahedral VCs such as $\langle 0.286 \rangle$, $\langle 0.282 \rangle$, and < 01105 > are majorly contributing towards the glass formation in Cu₃₃Zr₆₇ as seen in Fig. [10](#page-12-0)b. It can be seen tha $t < 0.0286$ > and < 0.01105 > remain constant over the temperature range of 300 K to 50 K and decrease slightly at 10 K. Similarly, $<$ 0282 $>$ remains constant as the temperature decreases from 300 to 100 K and then attains a minimum at 50 K. Further, with a decrease in temperature down to 10 K, a population fraction of < 0282 increases to its room temperature fraction. Figure [10c](#page-12-0) shows that $< 0.367 >$ has the highest population fraction of mixed-type VCs at Cu center compared to other VCs. It can be observed that the fraction of $<$ 0367 $>$ first increases and then decreases with lowering the temperature. At 100 K and $150K, < 0367$ > has the highest population fraction than other temperatures. From Fig. [10](#page-12-0)d, it can be seen that $\langle 0.0364 \rangle$, $\langle 0.0367 \rangle$, $\langle 0.0367 \rangle$ 363 , and $<$ 0365 > are the major mixed-type cluster at Zr center. Although a fraction of <0364 > decreased at 200 K, it remains constant and maximum compared to other clusters. Similarly, the fraction of $<$ 0367 $>$ increases first and then

Fig. 10 a and **b** Quasi icosahedral-type Voronoi clusters at Cu- and Zr-centered atoms, **c** and **d** mixed-type Voronoi clusters at Cu- and Zr-centered atoms, **e** and **f** crystal-like Voronoi clusters at Cu- and Zr-centered atoms

Table 10 Diffusion coefficient (*D*) of the Cu and Zr atom in the Cu₃₃Zr₆₇ MG at 10 K, 50 K, 100 K, 150 K, 200 K, and 300 K

D is in \AA^2/ps

decreases as seen in Fig. [10](#page-12-0)d and remains the second largest population fraction of Zr-centered mixed-type VCs. From Fig. [10](#page-12-0)e, it can be seen that there is only one $< 0448 > Cu$ centered crystal-like VC with maximum population fraction compared to other VCs. It can be seen that at 150 K,

population fraction decreases and remains constant throughout the temperature range. Four Zr-centered crystal-like VCs such as < 0448 , < 0445 , < 0446 , and < 0444 , have been found with maximum population fraction at all studied temperatures compared to other VCs. It can be seen that **Fig. 13** Variation in Shannon information (*S*) and diversity (*d*) with temperature in $Cu_{33}Zr_{67}$ MGs

fraction of $<$ 0448 $>$ decreased at 150 K and remained constant over the temperature range of 150 to 10 K. Similarly, the population fraction of $<$ 0445 $>$ decreased at 100 K and remained constant up to 10 K. Besides, $<$ 0446 $>$ and $<$ 04 44>show rise and fall of population fraction at diferent temperatures.

Mean square displacement (MSD)

The mean square displacement (MSD) of the Cu and Zr atoms has been calculated for the $Cu_{33}Zr_{67}$ metallic glass at diferent temperatures such as at 10 K, 50 K, 100 K, 150 K, 200 K, and300K. The variation of MSD for Cu and Zr atoms with time has been shown in Fig. [11](#page-13-0). Typical behavior of the plots as reported by Sun et al. [[43\]](#page-19-28) for the $Cu₆₀Zr₄₀$ metallic glass can be viewed in Fig. [11](#page-13-0) for both Cu and Zr atoms at 300 K, 200 K, and 150 K. Besides, MSD decreases sharply and remains almost constant at 100 K, 50 K, and 10 K, respectively, as seen from Fig. [11](#page-13-0). The disappearance of the plateau below 150 K suggests that the atoms are trapped in the cages and no long-range difusion has been obtained on the studied timescale. This can be evident from the calculation of the diffusion coefficient (D) . Figure [12](#page-13-1) shows the temperature dependence of the *D* for Cu as well as Zr atoms in the glassy state. It has been observed that *D* of Cu and Zr decreases as 1/T increased. This behavior is identical to that of $Cu_{60}Zr_{40}$ glass as reported by Sun et al. [[43\]](#page-19-28) thereby showing the universal behavior of the *D* for Cu and Zr, respectively. The diffusion coefficient of Cu was found to be more compared to that of Zr. It is due to the smaller atomic radius of the Cu (1.278 Å) compared to that of the Zr (1.603 Å) [[44\]](#page-20-0). Numerical values of the diffusion coefficient (*D*) are given in Table [10.](#page-13-2) A non-Arrhenius behavior of the difusivity with temperature has been evaluated. The difusivity in the highly undercooled state is an important property to understand the phase competition, glass transition, and microstructural response corresponding to the diferent processing conditions and vitrifcation [[70\]](#page-20-25). For Al–Sm glassy alloy, rapid growth of local clusters, i.e., short-range ordering (SRO), has been observed by Wang et al. [\[70](#page-20-25)]. Similar observations were noted for the $Al_{450}Sm_{50}$ by Sun et al. [[71](#page-20-26)]. It is reported that these clusters are energetically favorable; therefore, it can be presumed that the atoms in these clusters could be less mobile and the rapid enhancement of SRO in the undercooled liquid state will slow down the dynamics making the deviation of the diffusivity from the Arrhenius equation [[70](#page-20-25)]. Therefore, non-Arrhenius behavior of the difusivity in the present work is likely caused by the local structural ordering as discussed in the PDF and pPDFs. This supports the present fndings of the possibility of the evolution of the CuZr₂ structure at a lower temperature in the $Cu_{33}Zr_{67}$ glass.

Diversity(d) Considering the importance of the diversity (*d*) in the evolution of the structures in the metallic glasses [[72,](#page-20-27) [73](#page-20-28)], in the present work, *d* is calculated for $Cu_{33}Zr_{67}$ MG at diferent temperatures. Mathematically, it can be expressed as [\[72](#page-20-27), [73\]](#page-20-28)

Table 11 Shannon information (*S*) and diversity (*d*) of Cu₃₃Zr₆₇ glass at diferent temperatures

Shannon information (S)	Diversity (d)
3.185	24.176
3.187	24.221
3.196	24.441
3197	24.457
3198	24.482
3.201	24.548

Fig.14 Variation in diversity (*d*) of quasi icosahedral-type Voronoi clusters with temperature in $Cu_{33}Zr_{67}$ MGs

Fig. 15 Variation in diversity (*d*) of mixed-type Voronoi clusters with temperature in $Cu_{33}Zr_{67}$ MGs

Fig. 16 Variation in diversity (*d*) of crystal-like Voronoi clusters with temperature in $Cu_{33}Zr_{67}$ MGs

Table 12 Diversity (*d*) of $Cu_{33}Zr_{67}$ glass for quasi icosahedral-type, mixed-type, and crystal-like clusters at diferent temperatures

Temperature (K)	Diversity (d)				
	Ouasi icosahedral- type clusters	Mixed-type clusters	Crystal- like clusters		
10	9.178	5.183	6.746		
50	9.292	5.184	6.841		
100	9.293	5.210	6.841		
150	9.248	5.240	6.717		
200	9.347	5.229	6.776		
300	9.336	5.243	6.948		

$$
d = \exp(S) \tag{2}
$$

$$
S = -\sum_{i} p_i \ln p_i \tag{3}
$$

In Eq. ([3\)](#page-15-0), *S* is the Shannon information and p_i is the fraction of Voronoi clusters.

Wei et al. [[72\]](#page-20-27) have considered $S = 0$ and $d = 1$ for the single local structure, i.e., perfect crystal structure. Statistical results have shown that $d > 100$ for glass-forming compositions and $d < 10$ for crystalline states. $10 < d < 100$ shows the intermediate structural diversities. In the present work, fraction p_i for each of the clusters has been calculated by normalizing the fractions given in Tables [7](#page-8-1) to [9.](#page-11-0) For example, in Table [7](#page-8-1), the addition of fractions of all clusters at 10 K was carried out, and then each of the fractions of the individual clusters was divided by the total sum. A similar approach was carried out for the rest of the calculations.

Shannon information (*S*) was calculated by putting these fractions in Eq. (3) , and then diversity was calculated using Eq. ([2\)](#page-15-1). Figure [13](#page-14-0) shows the variation in *S* and *d* as a function of temperature. This shows that with decreasing temperature from 300 to 10 K, *S* and *d* decrease refecting the probability of the localization of the atoms. The numerical value of d (10 $< d < 100$), as shown in Table [11,](#page-15-2) reflects the presence of the intermediate structural diversities in $Cu_{33}Zr_{67}$ glass at the studied temperature ranges. Diversity was found to decrease by 40.2% from 300 to 10 K. These results support the reduction in the diffusion coefficient (D). Further, *d* was calculated for quasi icosahedral type, mixedtype, and crystal-like clusters as given in Table [8](#page-9-0) to explore their role in the diversity of the glassy structure in $Cu_{33}Zr_{67}$ at low temperature.

Figure [14,](#page-15-3) Fig. [15](#page-15-4), and Fig. [16](#page-15-5) show the variation in diversity for quasi icosahedral-type, mixed-type, and crystal-like clusters with temperature. Numerical values given in Table [12](#page-15-6) have shown that $d < 10$. From Table [12](#page-15-6), it can be seen that there is a decrease in *d* by 15.8%, 6%, and 20.2% for quasi icosahedral-type, mixed-type, and crystallike clusters, respectively. Among these clusters, mixedtype clusters have lower diversity favoring the formation of ordered structure. This result supports the probability of the embryonic development of the CuZr₂ phase in Cu₃₃Zr₆₇ at low temperatures as discussed in the section "Proposed crystal structure evolution during cooling from 300 to 10 K" and Fig. [5](#page-6-3) and Fig. [6](#page-7-0). Based on the Hwang [\[69](#page-20-24)] classifcation scheme, some of the VPs were omitted to calculate *S* and *d* at all studied temperatures. Therefore, some abrupt changes at 150 K in diversity have been observed for quasi icosahedral-type Voronoi clusters, mixed-type Voronoi clusters, and crystal-like Voronoi clusters in Fig. [14](#page-15-3), Fig. [15,](#page-15-4) and Fig. [16,](#page-15-5) respectively. These VPs are $\langle 0.280 \rangle$, $\langle 0.0361 \rangle$ >,<0383>,<0464>,<0528>,<0608>,<00,122>,< 00,123 >, and < 00,124 > . These VPS < 0280 >, < 00,122 $>$, <00,123 >, <00,124 >, and <0361 > and <0383 > have been classifed into quasi icosahedral-type Voronoi clusters and mixed-type Voronoi clusters, respectively. Similarly, $VPs < 0.464$, < 0.528 , and < 0.608 $>$ can be classified as crystal-like Voronoi clusters. *S* and *d* values of these VPs for each of these cluster type are calculated. For quasi icosahedral-type Voronoi clusters, *S* and *d* values are 1.09 and 2.97. For mixed-type Voronoi clusters, *S* and *d* are 0.35 and 1.42, respectively. Similarly, for crystal-like Voronoi clusters, *S* and *d* are 0.78 and 2.18, respectively. It is important to note that diversity (*d*) for quasi icosahedral-type Voronoi clusters and crystal-like Voronoi clusters is more than 2. Therefore, the omission of these VPs based on the Hwang [\[69\]](#page-20-24) scheme has resulted in the drop in the *d* value at 150 K as can be seen from Fig. [14](#page-15-3) and Fig. [16.](#page-15-5) However, for mixedtype Voronoi clusters, *d* is less than 1.5, and therefore small higher value is noticed as seen in Fig. [15](#page-15-4). However, when these VPs are considered collectively as shown in Fig. [13,](#page-14-0) their individual characteristic gets disappeared and represents the average behavior for the system as a whole. From Fig. [17](#page-18-8)a, c and e, it can be seen that there is no conclusive trend in the diversity for quasi icosahedral-type, mixed-type, and crystal-like clusters at Cu-centered atoms. Diversity for quasi icosahedral-type cluster was found to remain constant over a temperature range from 300 to 50 K and suddenly attains its maximum at 10 k with an increase in *d* by 3%. Similarly, a linear decrease in *d* for mixed-type cluster was noticed from 300 to 50 K as shown in Fig. [17](#page-18-8)c which attained its maximum at 10 K with an increase of 65.9% in *d*. Besides, *d* remained constant from 300 to 200 K and dropped to its minimum by 21% at 150 K for crystal-like clusters. No change in the minimum value of *d* was further observed from 150 to 10 K as shown in Fig. [17](#page-18-8)e. Unlike Cu-centered cluster, a rise of 9.1%, 13%, and 23.1% was observed in *d* with decreasing temperature for Zr-centered quasi icosahedral-type, mixed-type, and crystal-like clusters as shown in Fig.[17b](#page-18-8), d and f. By analyzing diferent trends for *d* in Fig. [17](#page-18-8) and numerical values in Table [13,](#page-18-9) it can be proposed that the decrease in *d* with temperature as observed in Fig. [13](#page-14-0) to Fig. [16](#page-15-5) is a collective behavior of low-diversity clusters such as Cu-centered quasi icosahedral clusters and Zr-centered mixed-type clusters.

Conclusions

In the present work, the dynamics of the structural evolution of the rapidly quenched $Cu_{33}Zr_{67}$ glass have been investigated by MD simulations at cryogenic temperatures 10–300 K. Splitting of the first and second peaks with decreasing temperature is found to be more pronounced. The presence of a shoulder on the high *R* side of the second peak has suggested the existence of the icosahedral short-range order (ISRO) in the $Cu_{33}Zr_{67}$ glass. A quasi-two-dimensional model supports the splitting of the first and second peaks in the $Cu_{33}Zr_{67}$. Zr–Zr pair is found responsible for the splitting of the first peak of the $Cu_{33}Zr_{67}$ glass at a lower temperature. The consensus of these observations has approved the validity of the EAM potentials used in the present work at cryogenics. Further, the Voronoi tessellation method has shown that quasi icosahedral such as $\langle 284 \rangle$, $\langle 0285 \rangle$, and $\langle 0282 \rangle$; mixedtype cluster such as < 0364 >; and crystal-like cluster such as $\langle 0.446 \rangle$ are responsible for the stabilization of the present glassy phase in the $Cu_{33}Zr_{67}$ glass. On the other hand, Cu-centered and Zr-centered < 0286 > quasi icosahedral VC has maximum population fraction

Fig. 17 Variation in diversity (*d*) in **a** and **b** quasi icosahedral-type ◂ Voronoi clusters at Cu- and Zr-centered atoms, **c** and **d** mixed-type Voronoi clusters at Cu- and Zr-centered atoms, **e** and **f** crystal-like Voronoi clusters at Cu- and Zr-centered atom with temperature

thereby supporting the stability of the glassy phase over the studied temperature range. Besides, the maximum population fraction of Cu-centered < 0367 > and Zr-centered <0364 >, <0367 >, <0363 >, and <0365 > mixedtype clusters and Cu-centered $< 0448 >$ and Zr-centered < $0448 > 0.445 > 0.446 > 0.$ and < 0444 > crystal-like clusters support the possibility of the presence of intermediate phase of $CuZr₂$ at lower temperatures as observed from MD simulations. Relatively high atomic packing efficiency in the Zr-centered clusters has been identified in the $Cu_{33}Zr_{67}$ glass, and these compact clusters possess the local highest regularity, contributing to the stability of this glass. Further, mean square displacement (MSD) studies have shown that the diffusion coefficient of both Cu and Zr decreases with that of temperature. A smaller atomic radius provides a higher diffusion coefficient of the Cu compared to that of the Zr. Reduction in diversity with temperature has been noticed. A decrease in *d* is found to be the collective behavior of low-diversity clusters such as Cu-centered quasi icosahedral clusters and Zr-centered mixed-type clusters. The present MD simulations have provided the pathway for the critical evolution of the structural dynamics of the Cu–Zr metallic glass at cryogenic temperatures.

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Author contribution All the authors are actively involved in conceptualization; data curation; formal analysis; investigation; methodology; resources; software; supervision; validation; visualization; writing original manuscript draft; and writing—review and editing.

Data availability The data that support the fndings of this study are available from the corresponding author upon reasonable request.

Code availability On reasonable request, it will be available.

Declarations

Competing interests The authors declare no competing interests.

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Table 13 Diversity (*d*) of $Cu_{33}Zr_{67}$ glass at Cu-centered and Zr-centered atoms for quasi icosahedral-type, mixed-type, and crystal-like clusters at diferent temperatures

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