#### **ORIGINAL PAPER**



# Temporal landscape of mutational frequencies in SARS-CoV-2 genomes of Bangladesh: possible implications from the ongoing outbreak in Bangladesh

Otun Saha<sup>1</sup> · Israt Islam<sup>1</sup> · Rokaiya Nurani Shatadru<sup>1</sup> · Nadira Naznin Rakhi<sup>1</sup> · Md. Shahadat Hossain<sup>2</sup> · Md. Mizanur Rahaman<sup>1</sup>

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## Abstract

Along with intrinsic evolution, adaptation to selective pressure in new environments might have resulted in the circulatory SARS-CoV-2 strains in response to the geoenvironmental conditions of a country and the demographic profile of its population. With this target, the current study traced the evolutionary route and mutational frequency of 198 Bangladesh-originated SARS-CoV-2 genomic sequences available in the GISAID platform over a period of 13 weeks as of 14 July 2020. The analyses were performed using MEGA X, Swiss Model Repository, Virus Pathogen Resource and Jalview visualization. Our analysis identified that majority of the circulating strains strikingly differ from both the reference genome and the first sequenced genome from Bangladesh. Mutations in nonspecific proteins (NSP2-3, NSP-12(RdRp), NSP-13(Helicase)), S-Spike, ORF3a, and N-Nucleocapsid protein were common in the circulating strains with varying degrees and the most unique mutations (UM) were found in NSP3 (UM-18). But no or limited changes were observed in NSP9, NSP11, Envelope protein (E) and accessory factors (NSP7a, ORF 6, ORF7b) suggesting the possible conserved functions of those proteins in SARS-CoV-2 propagation. However, along with D614G mutation, more than 20 different mutations in the Spike protein were ealso present. However, the mutation accumulation showed a significant association (p = 0.003) with sex and age of the COVID-19-positive cases. So, identification of these mutational accumulation patterns may greatly facilitate vaccine development deciphering the age and the sex-dependent differential susceptibility to COVID-19.

Keywords Mutation · SARS-CoV-2 · Molecular phylogeny · Protein structure · Frequency · Bangladesh

#### Abbreviations

COVID-19	Coronavirus disease 2019
ACE2	Angiotensin converting enzyme 2
MSA	Multiple sequence alignment
SARS	Severe acute respiratory syndrome
SARS-CoV-2	Severe acute respiratory syndrome corona-
	virus 2
SNP	Single nucleotide polymorphisms

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Md. Mizanur Rahaman razu002@du.ac.bd

<sup>1</sup> Department of Microbiology, University of Dhaka, Dhaka 1000, Bangladesh

<sup>2</sup> Department of Biotechnology and Genetic Engineering, Noakhali Science and Technology University, Noakhali 3814, Bangladesh

UM	Unique mutations
WHO	The World Health Organization
GISAID	Global Initiative on Sharing All Influenza
	Data

# Introduction

In the past two decades, Coronaviruses mainly of the  $\beta$ -coronavirus family *Coronaviridae* and the subfamily *Coronavirinae* have been a major subject of deeper investigations due to their emergence, re-emergence and associated public health impact [1, 2]. Among the seven coronaviruses (229E, OC43, NL63, HKU1, SARS-CoV (Severe Acute Respiratory Syndrome Coronavirus), MERS-CoV (Middle East respiratory syndrome Coronavirus) and SARS-CoV-2 responsible for coronavirus disease 2019 (COVID-19)) causing human infections, the newly emerged single-stranded

RNA beta-coronavirus SARS-CoV-2 has been wreaking havoc around the world since its emergence in mid-December 2019 in the Chinese city of Wuhan [1–3] and was first reported from Bangladesh on March 8, 2020. Currently, the COVID-19 disease has 1.9% of case fatality rate in Bangladesh, which is significantly lower than a lot of countries as Mexico, China, Italy, Spain, Canada, etc. [4].

This 29903-kb enveloped virus consists of a 5'-untranslated region (5'-UTR), spike (S), envelope (E), matrix (M), nucleocapsid (N) gene and 3'-UTR<sup>4</sup>, among which E, M, S and N proteins are involved in protecting the genome by forming the structure of the virus [5]. On the other hand, among the 16 nonstructural proteins (NSPs), four NSPs (NSP12, NSP13, NSP14, NSP16) are involved in synthesizing and processing the viral RNA [5], while the remaining proteins are crucial cofactors facilitating the function of viral enzymes [6]. So, the current circulating strain might have evolved through the ongoing evolutionary process of mutations in these genes since its emergence [7]. Errors made by RdRp despite having proofreading activity [8] along with a direct response to selective pressure on the viral genome and homologous recombination may lead to mutational accumulation in the SARS-CoV-2 genome [9], while according to recent studies on mutation analysis, no recombination events were reported [10] and the sequence diversity of SARS-CoV-2 so far is very low [11]. On the contrary, the receptor-binding domain (RBD) in the S protein is the most variable genomic part in the beta-coronavirus group [12, 13], and some sites of S protein might be subjected to positive selection [14]. However, despite these variabilities in the SARS-CoV-2 genome, one key question remains as to whether these mutations have any functional impact on the pathogenicity of SARS-CoV-2. The previous experiences with MERS-CoV and SARS-CoV [15], the close relatives of SARS-CoV-2 [12, 13], showed that a single mutation might be significant enough to confer resistance to neutralizing antibodies against those viruses. Meanwhile, during the rampant spread of SARS-CoV-2 around the world, it has undergone multiple antigenic drifts including several mutations compromising the containment and diagnostics strategies along with the effectivity of repurposed drugs [16], which suggested that the virus will be active and spreading for a year or more before vaccines are available [12, 13]. Besides, based on amino acid changes of the genomes, 3 major clades (S, G, and V) were proposed in many more studies [12, 13, 17]. Another study by Tai et al. suggested that amino acid variations in the genome are associated with the stability of RBD/ACE2 structure [18]. Also, the primer-template mismatches might affect the stability and the functionality of polymerase [19]. On the other hand, a study by Su et al. revealed that the deletion of 382 nucleotides towards the 3' end of the viral genome may have an impact on the viral phenotype [20]. Thus, these mutational analyses justify the potential of mutations in affecting the viral infectivity and adaptability to the new environment as well as explaining the differential rates of infection and mortality worldwide conducive to controlling the pandemic. Meanwhile, the data avalanche, especially the complete genome sequences in Global Initiative on Sharing All Influenza Data (GISAID, https://www.gisaid.org/) has resulted in an unprecedented expeditious effort towards understanding the implications of genome diversity [21, 22] in pathogenicity, drug repositioning [12, 13] or developing diagnostic and preventive strategies [23]. Concurrently with the global sequence data, legionary complete genome sequences have been submitted from Bangladesh in GISAID since the first submission on 14 July, 2020 [24]. So, the current study was designed to investigate the genomic diversity of SARS-CoV-2 strains isolated from the country as well as analyzing the temporal profile of the mutational accumulations in the genome. Ultimately, this study will give an insight into the circulating strains of the country to devise a more effective containment strategy and efficient treatment regimen along with adding values to the global understanding of SARS-CoV-2 genome evolution and molecular basis of its pathogenicity, infectivity and drug/vaccine targets.

### Materials and methods

# Retrieval of SARS-CoV-2 genome sequences from the database

A total of 226 complete genome sequences of SARS-CoV-2 isolated from Bangladesh were retrieved from the GISAID virus database (https://www.gisaid.org/, last access 14 July 2020) along with the collection date and the patient history (Supplementary Material SM1 & Supplementary Table ST1). Alignment of the retrieved genome sequences of the SARS-CoV-2 strains was executed using online based Virus Pathogen Resource (https://www.viprbrc.org/) database and MEGA X tool [25] to remove ambiguous and low-quality sequences. Later, the MSA file was opened with Jalview visualization software to eliminate the redundancy of the studied sequences [26]. Finally, the complete viral genomes sequenced from both male and female patients, reported from Bangladesh were analyzed using the reference genome (NC 045512.2).

# Determination of mutational accumulation and frequencies

The nucleotide positions with corresponding amino acid of each protein were identified using two databases: Swiss Model Repository (https://swissmodel.expasy.org/repos itory/) and the GISAID (https://www.gisaid.org/). An initial analysis was performed to identify the phylogenetic clusters using an analysis tool named Virus Pathogen Database and Analysis Resource (ViPR) and then all the retrieved sequences from GISAID were provided as input in the aforementioned database to collect mutational information in comparison with the reference genome (NC\_045512). Moreover, GISAID was explored for the determination of mutational accumulation and frequency (MF) in the circulating genome for a total of 13 weeks. MF was calculated using the following formula:

 $MF = \frac{\text{Total number of mutations observed in each week}}{\text{Total number of genomes obtained in that specific week}}$ 

#### Ancestral history analysis of SARS-CoV-2 sequences

To infer the evolutionary relationships among the examined sequences, the sequences were aligned with relevant reference sequences retrieved from NCBI database using the neighbor-joining approach [27]. The Molecular Evolutionary Genetics Analysis across Computing Platforms (MEGA X) [25] software was used to construct a phylogenetic tree applying the neighbor-joining method [28] and evolutionary distances were computed using the Kimura–Nei method [29]. The percentage of replicate trees in which the associated taxa clustered together in the bootstrap test (1000 replicates) is shown next to the branches.

#### **Statistical analysis**

Statistical analysis was performed using SPSS software for Windows, version 20.0 (SPSS Inc., Chicago, IL, USA). The association of mutational frequency with age, and sex were computed using the  $\chi^2$  tests. The output from the analysis was considered to be significant at  $p \le 0.05$ .

#### Results

# Genome analysis reveals SARS-CoV-2 ancestral biology

In our study, initially a total no. of 226 complete SARS-CoV-2 genome sequences isolated from the Bangladeshi patients submitted between 18 April and 14 July, 2020 were taken into account for further analysis. Interestingly, the majority of the collected genomes were clade B and/ or L type (SM1 & ST1). From the initially selected 226 genomes, redundant sequences were removed using Jalview visualization software and sequences containing legionary characters (N, R, X, and Y) and sequences without complete patient history were excluded from the study. After completing all of the above screening processes, finally 198 unique SARS-CoV-2 genome sequences were selected for further mutational analyses and the metadata of all the studied

198 sequences are summarized in ST1. The phylogenetic tree of 198 complete sequences reveals that the circulating strains in Bangladesh are different from the reference sequence (NC\_045512 (mark as blue)). The analysis also shows that circulating strains' lineage is divided into several sub-lineages. Phylogenetic analysis also segregated the closely related strain into cluster A to Z with threshold value 0.00005. Cluster A contains six sequences which all are collected in June 2020 (EPI\_ISL\_483627 (12-06-2020), EPI\_ ISL 483627 (16-06-2020), EPI ISL 483635 (17-06-2020), EPI ISL 4836289 (27-06-2020), EPI ISL 483689 (26-06-2020), and EPI\_ISL\_4836214 (14-02-2020). Sequences isolated from April to May, 2020 were grouped into clusters B, W, X, Z). However, sequences collected in June rather than others months were more distant from the reference sequence (Fig. 1). Besides, the majority of the sequences were also more distant from the 1st Bangladeshi reported sequence (mark as red) (Fig. 1).

### **Accumulation of SARS-CoV-2 mutation**

In our analysis, a total number of 13 weeks were considered for the calculation mutation accumulation (Supplementary Table ST2). Because of the presence of one genome (EPI\_ ISL 468077) during the 1st week, it was considered with week 2 and declared these 2 weeks as 1st week (W1). For the determination of the mutational frequency, the genome of SARS-CoV-2 was split into five regions (Fig. 2). Our analysis reveals that during the initial 5 weeks, circulating viral genomes accumulate fewer mutations with low MF except genomic region 2. However, the mutational frequencies augment after 35 days and continued it until week 9. Interestingly, after 9 weeks, MF persisted similar or even marginally down in 10th and 11th weeks (Fig. 3). After week 11, all the regions except R4 seems to be increasing sharply again. Overall, R5 accumulates the highest MF over the time period (13 weeks) followed by R4 and R2 (Fig. 3) and regions 2 (R2) and R3 appears to be more conserved. The structural proteins such as N and S demonstrate the highest mutation rates (p = 0.001) over the time period (13 weeks) (Fig. 4). Interestingly, NSP9, NSP11 proteins did not accumulate any mutation over the time period. Unique mutations (UM) were also calculated and summarized in Table 1. In the analysis, R1 (p = 0.002) followed by R4 (p = 0.004) and R5 (p = 0.003) were observed to have high frequencies of unique mutations (Fig. 5) and in comparison with other weeks, week 9 to 11 showed the highest UMs frequency. Moreover, after the initial 4 weeks, the frequency seems to have significantly increased (p = 0.002) drastically. Notably, the rate of MF had been also observed until week 9 (p=0.003) at an uneven rate. After week 11, UM frequency drops drastically. Most interestingly, after week 12 unique mutation in the region 1 and 5 fell to approximately zero but

Fig. 1 Phylogenetic tree of the studied whole genome sequences of SARS-CoV-2 Bangladesh outbreak. The optimal tree with the sum of branch length = 0.01209279is shown. The tip of branches corresponds to the accession numbers with country originated, sources, released year and week of sequences. The taxon colored with red, green, pink and yellow for denoting April, May, June and July month, respectively. Closely related genome sequences with minimum branch deviation (cut of 0.00005) were represented in clusters (cluster A to Z). Reference sequence (NC\_045512) form Wuhan, China, and 1st declared sequences form Bangladesh were marked as blue and red, respectively. There were a total of 29,011 positions in the final dataset. The tree reveals the history of the common ancestry of all 198 SARS-CoV-2 genome sequences from Bangladesh outbreak. The lines of a tree represent evolutionary lineages. Sequences were grouped by the taxon and shown as red, green, pink and yellow mark colors for April, May, June and July, respectively



0,000050



Fig. 2 Mapping of SARS-CoV-2 genome regions and proteins. The SARS-CoV-2 genome was divided into five regions and the location of each protein in the different regions is schematically presented

Fig. 3 Mutational frequency of five genomic segments of SARS-CoV-2. Mutational frequency was calculated by the ratio of the number of total protein mutations and the number of genome sequences in each week. The SARS-CoV-2 genome was divided into five regions, which are represented as R1-R5. Here, red arrows indicate the significant MF variation over time in the various genomic parts of the predominantly circulating SARS-CoV-2 in Bangladesh



the mutations in the other three regions significantly varied (p = 0.015) (Fig. 2). In terms of proteins, NSP8, NSP9, NSP11, 2'-O-ribose methyltransferase, Matrix, ORF7b had no unique mutations. Moreover, several mutations were found that persisted, (I120F, T412I, L37F, P323L, G204R, R203K, and D614G) for more than 6 weeks (Table 1 and Fig. 5).

# Variability of the spike (S) protein

In our analysis, more than 20 nonsynonymous mutation sites were identified in the S protein, in which 13 (S13I, Q14H, P26L, H49Y, G75V, T75I, S95F, T95I, V127F, D138H, N211Y, Y248H, and S255F) were observed in the N-terminal domain (NTD) (Fig. 6). The fusion peptide region, S' including heptad repeats HR1 and HR2 regions contains 3 mutated regions (G769V, A783S, T791I), 2 (D936Y, S939Y), 1 (K1191N), respectively.

# Sex and age-based mutational accumulation analysis

The sex-based UM analysis revealed that men (70) harbored more frequency than women (36) (Table 2). Among the five segregated regions, R1 (p=0.018) and R4 (p=0.002) accumulated more mutations in men than the other regions. This is also true in case of women, but with a much lower frequency (p<0.05). Protein NSP10, Helicase, 3' to 5' exonuclease, ORF6, ORF7a had no mutation in case of women. NSP2, NSP3 RdRp, ORF8 and N proteins possessed 2–6 unique amino acid mutations per protein in the male-originated virus (Table 1). Moreover, region 3 had the lowest unique mutation frequency in viral sequences retrieved from



Fig. 4 Week-wise comparative amino acid mutational frequency of SARS-CoV-2 proteins. Mutational frequency was calculated by the ratio of the number of total amino acid mutations and the number of genome sequences in each week. W1–W13 represent different weeks

female patients. This aforementioned analysis data suggest differences in COVID-19 infection based on the sex of the infected individual. On the other hand, all age groups (4) accumulated the highest number of mutations in the virus genome R5 (p < 0.05), while the age group of 47–67 years harbors the highest number of mutational accumulation (p = 0.004) followed by the group of 26–46 years (p < 0.05) (Fig. 7). However, the age group 67 to 95 years had the highest mutational frequency in R5 (p = 0.001), while a gradual increase of the mutational frequency was observed in case of age group 26–46 (p < 0.05) and 47 to 67 (p < 0.05) in all regions except R2. Most interestingly, age group 0 to 25 has approximately mutational accumulation rates similar to the age group 26 to 46 years (Fig. 7).

# Discussion

Considering the lack of definitive drug and vaccine against COVID-19, studying SARS-CoV-2 genomes is of great importance to elucidate the molecular basis of pathogenesis and evolution for explaining differences in region-specific mortality rates and individual-dependent susceptibility to SARS-CoV-2. Analysis of 198 high-quality complete genome of SARS-CoV-2 from Bangladesh revealed that the circulating strains are of many sub-lineages harboring the same ancestry as Wuhan virus, although their direct evolution from the reference Wuhan virus was not found. Two previous reports by Parvez et al. [30] and Hasan et al. [31] were consistent with our findings that the contributory strains in the SARS-CoV-2 outbreak in Bangladesh might be arising from the different regions of the world other than China. Besides, that majority of the Bangladeshi isolates were found to fall within the clade B belonging to L type (Supplementary Table ST2). While these types were estimated to be more aggressive and capable of rapid transmission, human intervention had been reported to decrease the relative frequency of the L type [15]. A similar type of A type isolates was also reported circulating into the European countries by Forster et al. [32], while a recent study reported the emergence of European and North American mutant variants in Southeast Asia including Bangladesh [24]. However, mutational frequency analysis of the SARS-CoV-2 whole genomes has shown fluctuations of mutational frequency over time, which can be associated with the increase or decrease rate of infections among the population of Bangladesh [33]. Among the 5 regions of SARS-CoV-2 genomes divided to determine the region of mutational hotspots, regions (R) 1, 4, 5 showed a greater tendency to accumulate mutations (p < 0.05) compared to region 2 and 3. On the other hand, the temporal profile of mutational analysis showed elevated mutation rate in 7th to 10th week and the mutation rate was increasing over time. This finding was also consistent with the study carried out in USA [5]. Regions 2 and 3 of higher conservancy harbored NSP4, NSP 5, NSP6, NSP 7, NSP8, NSP 9, NSP10, and NSP11, while

Week	Region 1			Region 2				Region 3				Region 4			Region 5	15			
	Leader	NSP2	NSP3	NSP4	NSP5	NSP6	NSP7	NSP10	RDRP	Helicase	3'-to-5' 1 exonu- clease	EndoR- Nase	Spike	ORF3a	Enve- lope	ORF6	ORF7a	OFR8	Nucleocaț sid
W1 W2 W3	Q	D409B ND	Q	QN	NI 33B ND	Ð	Ŋ	Q	ŊŊ	Ð	Ŋ	DN	Q	L139J ND	Ŋ	Ð	Ð	Ŋ	
W4			D1108N, 11672S								V459I								
W5	V56A, V121D		N1337S, A889V, G1691C, V843F	D85E							ND	D36G							
9M	ŊŊ	N377D	N51D	Ŋ								A94V	S939Y, Y145del	Q38E				S54P	
Μ	M85del	ŊŊ	A602S					T1011				ŊŊ	F140del	Q		Y95N		V5T, L7G, L4I	
W8	ND		ND			K270E		QN					N211Y			QN			S180T
6M			S1038F, R883G, Y272H, A1803V			ŊŊ			Q224K	1258T			E516Q	W69R	F20L	-	G42V		Q83R, H145N
W10		V469A, V594F, V308M	A1819S, L373M, T13631, Y246C, K462R	E425G, A69V	1106S, R188S, P96S	V120L			S607I	Q470R, Y198H		E68D, M209T	L5181, Y660F	V255del S220N G254stop	E8D			P38R	D3Y
W11 W12		ND	QN	QN	QN	QN			QN	QN	ND	ND	L518I ND	QN	ND		QN	ND	QN
W13	Ŋ	ND	K1130R	QN	ŊŊ	L22I	T81A		D517G A529S	QN	ND	ND	Y248H	E194Q Q38E G188C	ŊŊ	QN	Q62E	Ŋ	QN
Unique muta- tion per region	26			11				10				22			14				

419







R1–R5. B. Unique mutational frequency of five genomic segments of SARS-CoV-2. Mutational frequency was calculated by the ratio of the number of total protein mutations and the number of genome sequences in each week



Fig.6 Mapping of mutations in different domains of spike protein. S1 and S2 are subdomains, N-terminal domain (NTD), C-terminal domain (CTD), receptor binding domain (RBD), fusion peptides

the conservative nature of these proteins was also reported previously [5, 34]. Besides, NSP9 and NSP11 had no record to accumulate any amino acid substitutions over a period of 11 weeks in USA, which was evident in our study in case of NSP9. However, another report by Liang et al. [35] revealed only 2 mutations in nonstructural protein 11. So, our analysis along with others literature conclude that these two nonstructural proteins (NSP9 and NSP11) could serve as potential targets for the diagnostics, treatment or vaccine development of SARS-CoV-2. However, Nucleocapsid and Spike protein harbor maximum number of mutations, which contradicts the finding of the study carried out by Kaushal et al. [5] reporting higher mutation in the region of ORF8 and helicase. However, the mutational frequencies in these regions may positively facilitate the virus to adapt to not only external interactions with host cells, but also internal interactions within the host cells [19]. While the mutation site of N protein does not elicit much antibody response, region 603-634 of the S protein of SARS has been shown to be a major immunodominant epitope in S protein [36]. So,

(FP), heptad repeats (HR1, HR2) regions, while S includes heptad repeats (HR1, HR2) regions. Changes in amino acid (AA) sequence from the reference genome are shown by the arrow

changes in this epitope by mutation could alter the sensitivity of the IgG/IgM tests conducted. These changes are actually due to the positive selection pressure in SARS-CoV-2 [37, 38]. However, despite the high frequency of mutations in the spike protein, the notable escape mutations making the virus capable of escaping the neutralizing antibodies or the mutations affecting ACE2 binding were absent [39]. But considering the effects of mutations in Spike protein on the folding of the RBD thus modulating the viral infection via interacting either with ACE2 receptor or neutralizing antibodies, mutations found in these samples should be analyzed further for their effect on the folding of RBD [40]. Additionally ORF8, ORF7a and ORF7b showed mutations in many SARS-CoV-2 isolates, which might result in significant adaptation of coronavirus from human-to-human transmission as well as in contributing to the viral pathogenesis in the host by inhibiting bone marrow stromal antigen 2 (BST-2), which restricts the release of coronaviruses from affected cells [41, 42]. In this study, signature nonsynonymous mutations leading to amino acid changes of P323L in the RdRp

Table 2 Gender-based unique mutations of five regions that occurred in more than 1 week in SARS-CoV-2 virus

ISP5 NSI	Lasu 90	NSP10	aana	Hallance	2, to 5'	EndeDMass	-11-0		ļ				
			NON	nelicase	e con c exonucle- ase	FIIUUMIVASE	opike	UKFJA	ц	2	∞ ∢	Z	mutations
4 4	0	1	e S	3	2	2	∞	6	-	1 2	4	7	70
		6				19			10				
1 2	1	0	7	0	0	2	5	8	1	0 0	1	0	36
		ç				15			4				
1 2 4	1 0		- 6 0 6	- 1 6 0 0 % 2 3	1 9 3 0 2 0	ase 1 3 3 2 0 2 0 0	ase 1 3 3 2 2 0 2 0 0 2 2	ase 1 3 3 2 2 8 9 2 0 0 2 8 19 5 5	ase 1 3 3 2 2 8 9 9 2 0 0 2 8 8	ase 1 3 3 2 2 8 9 1 9 2 0 0 2 5 8 1 0	$\begin{array}{cccccccccccccccccccccccccccccccccccc$	$\begin{array}{cccccccccccccccccccccccccccccccccccc$	$\begin{array}{cccccccccccccccccccccccccccccccccccc$

421

was found (Supplementary Table ST2), which is involved in the replication of the viral genome.

Moreover, D614G in the spike glycoprotein is also predominant in Bangladesh-originated SARS-CoV-2 genome, which should be of urgent concern considering the dominance of this mutation globally since early February in Europe [34]. Notably, the D614G mutation is close to the furin recognition site for cleavage of the spike protein, which plays an important role in virus entry. So, mutations in S protein including D614G need to be evaluated carefully, as S protein is essential for the entry of the virus in the host cell by binding to the ACE2 receptor leading to the escape from antibody inhibition allowing infected and recovered patients to become infected again [43] and these mutations may have resulted in the evolution of a new subtype with more transmissible ability [44]. Interestingly, one clinical study regarding this specific mutation did not report significant increase of disease severity associated with this mutation [34]. Notably, few other previous studies although suggest the involvement of the diseases severity with the specific mutation (D614, P323L) in the SARS-CoV-2 genome [45]. Most interestingly, in two studies by Shishir et al. and Garvin et al. suggested the involvement of the higher mortality rate in Bangladesh due to the mutation in NSP2, NSP13, and spike protein in the circulating SARS-COV-2 genome in our country, which is in accordance of our study [46, 47].

Several unique mutations in NSP3 followed by S, ORF3a, NSP2, RdRp, helicase, E and N protein were observed in this study. All of the UM-containing regions are very crucial in the virus genome because of their contributions in SARS-CoV-2 virulence as well as pathogenicity [48]. Reports from other countries including Italy show male-to-female ratio being 3:1 in Italy. The rate of accumulating mutations was found to be higher in males than female patients. Interestingly, the infection and mortality rates were also disproportionately higher in males than females of Bangladesh. In terms of mortality, it was 79.24% for males and 20.76% for females [46]. Similar phenomena have also been [49]. The mortality rate was also reported high in males compared to females from China showing 2.4 times higher mortality in males [50], New York State of USA (42% females vs. 58% males [51]. However, age-stratified mortality rate was also evident [51], while the mutational accumulation in this study also showed an age-stratified pattern. The highest number of mutation accumulation was observed in age group of 47–67 years, followed by group of 26 to 46 years, which might explain the infection rate in Bangladesh [33]. On the other hand, the temporal analysis of mutation accumulation also showed mutations (P323L, I120F, D614G, R203K, G204R) that persist over a longer period of time. Such persistent mutations were also found to be circulating in other parts of the worlds, which reveal similar mutationaccumulating behavior of the genomes across the world Fig. 7 Age-based mutational frequency of five genomic segments of SARS-CoV-2. Mutational frequency was calculated by the ratio of the number of total protein mutations and the number of genome sequences in each week. The SARS-CoV-2 genome was divided into five regions, which are represented as R1-R5. All the studied patients were segregated into 4 age groups (0 to 25 years-blue color, 26 to 46 years-green color, 47-67 years-red color, 68 to 95 years-violet color)



[2, 52, 53]. Moreover, RdRp, E, and N genes are the target genes for designing primers and probes in RT-PCR-based SARS-CoV-2 diagnosis [54], owing to their high sequence conservation. Although the effect of primer-template mismatches on laboratory diagnostics of SARS-CoV-2 is not clear totally. So any kind of changes in the RDRP, E and N reasons might play a vital role in the diagnosis of the SARS-CoV-2 [54]. Unfortunately, in our studied genome we have found majority of the genomic variation in the RdRp and N region which might be more alarming. The study by Khan et al. [55] reported 7 sets of genomic diagnostic assay out of 27 assay contain mismatches or mutation which is also supported by our studied results where 5 sets of genomic diagnostic assay contain the following mismatches (Table 3) with having 100% in some cases which is very much alarming for the diagnostic procedure in Bangladesh.

However, our analysis along with literature reviews suggests that the mutational accumulations in the SARS-CoV-2 genome depend on country and continent, while most of the vaccine attempts and diagnostic kits are based on the genome sequence of the original viral isolate from Wuhan. So, the region-specific mutations in the SARS-CoV-2 genome may make these vaccines ineffective [56]. Therefore, continuous monitoring of mutation accumulation and the consequences of these mutations on receptor binding affinity, genome replication and propagation ability, pathogenicity as well as host–pathogen interaction need to be evaluated. On the other hand, RdRp, E, and N genes should be considered as the target genes for designing primers and probes in RT-PCR-based SARS-CoV-2 diagnosis, owing to their high sequence conservation. Supplementary Information The online version contains supplementary material available at https://doi.org/10.1007/s11262-021-01860-x.

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Author contributions OS, RNS, and II carried out the studies (data collection and data analysis). OS drafted the manuscript. OS and MMR developed the hypothesis, supervised the whole work and MMR, MSH, II, NNR and RNS critically reviewed the drafted manuscript. All authors read and approved the final manuscript.

**Data availability** Complete genome sequences or SARS-CoV-2 are available in GISAID dataset along with reference sequences in the NCBI dataset. The accession number and sequences of the studied genomes are available in Supplementary table 1 and Supplementary file 1.

#### Declarations

**Conflict of interest** The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

**Ethical approval** The authors confirm that the ethical policy of the journal, as mentioned on the journal's authors guideline page, was ensured and no ethical approval was required as the study did not collect any sample or questionnaires from animals and humans.

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Primer name	F/P/R <sup>b</sup>	Sequence (50-30) <sup>c</sup> and suggested adjustment	Genome	Nucleotide	Genome	Frequency
			position <sup>d</sup>	Primer		
Charité-ORF1b	R	CARATGTTAAAASACACTATTAGCATA Sug- gested modification from S to A (or R). CAR ATGTTAAAAAACACTATTAGCATA	15,519	S (G/C)	Т	100%
Chan-ORF1ab	Р	TTAAGATGTGGTGCTTGCATACGTAGAC	16,289	С	С	No changes
	R	GTGTGATGTTGAWATGACATGGTC Sug- gested modification from G to A ATGTGA TGTTGAWATGACATGGTC	16,353	C <sup>a</sup>	Т	94%
CN-CDC-N	F	GGGGAACTTCTCCTGCTAGAAT	28,881 28,882 28,883	GGG	AAC some genomes; GGG in some genomes	23%
US-CDC-N-1	Р	ACCCCGCATTACGTTTGGTGGACC	29,311	С	С	No changes
US-CDC-N-3	F	GGGAGCCTTGAATACACCAAAA	28,688	Т	Т	No changes
Young-N	Р	ACCTAGGAACTGGCCCAGAAGCT Sug- gested modification from C to G ACCTAG GAACTGGGCCAGAAGCT	28,621	С	G	100%
NIID-JP-N	R	TGGCAGCTGTGTAGGTCAAC Suggested modification from G to C TGGCACCTGTGT AGGTCAAC	29,277	C <sup>a</sup>	G	100%

#### Table 3 Summary of primer/probe mismatches with SARS-CoV-2 genome

<sup>a</sup>Reverse-complemented

<sup>b</sup>Forward primer (F), probe (P) and reverse primer (R)

<sup>c</sup>The mismatch observed and the suggested adjustment

<sup>d</sup>Positions shown are with reference to NC\_045512.2

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