# COMMENTARY



# False-Negative RT-PCR Findings and Double Mutant Variant as Factors of an Overwhelming Second Wave of COVID-19 in India: an Emerging Global Health Disaster

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### Abstract

RT-PCR is considered to be the standard gold diagnostic test for detecting COVID-19 causing SARS-CoV-2. Recent reports and recent pieces of evidence from scientific literature, however, tell a different story. There have been speculations of SARS-CoV-2 escaping the RT-PCR because of the series of mutations it has gone through. It is possible that host-dependent RNA editing and high person-to-person transmission have equipped the virus with mutations enabling it to spread faster and even evade the RT-PCR. Added to this is burnout among healthcare workers and technicians handling the RT-PCR machines and sampling. All of these factors may be working in unison to result in the deluge of false-negative cases India is facing during the second COVID-19 wave. The mutant strains are spreading to other parts, posing challenges to the whole world. These circumstances warrant supplementary diagnostic tests such as serological and radiological findings to deal with cases of high clinical suspicion. Even one misdiagnosed COVID-19 patient poses a risk to hundreds of others in the vicinity. Healthcare workers' burnout also has to be dealt with. Erroneous staff should be re-trained.

Keywords COVID-19 · Double mutant · Second wave · SARS-CoV-2 · India

Abbreviations		CDC	Centers for Disease Control and
COVID-19	Coronavirus disease 2019		Prevention
WHO	World Health Organization	HIV	Human immunodeficiency virus
SARS-CoV-2	Severe acute respiratory syndrome corona-		
	virus 2		
RT-PCR	Reverse transcription-polymerase chain	Introductio	on
	reaction		

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Almost 6 months after the peak of the first wave of coronavirus disease 2019 (COVID-19) in India in September 2020, the surge in COVID-19 cases started again in the first week of March 2021. As of 28 August 2021, the COVID-19 positive cases summed up to 32,649,947 and are still counting with daily reported cases soaring to over 40,000 and death toll rising to 437,370 with over 500 deaths per day. Due to the second wave of COVID-19 in India, the test rate was significantly increased to meet the demand, and a total of 516,887,602 samples were tested as of 27 August 2021 [1]. In these unprecedented situations, India is combating the second wave of COVID-19 with an unusual ascent of daily cases.

This unexpected exponential surge of cases can be attributed to the rampant false-negative results of COVID-19 in the country and the newly identified B.1.617, a double mutant variant of severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2), which was first detected in India. These, together with increased infection rate, have created a situation of patient overload and increased oxygen demand in hospitals in the country. The WHO has classified all the identified variants of SARS-CoV-2 into two definitive categories-variants of interest (VOI) and variants of concern (VOC). The list of VOCs designated by the WHO includes alpha, beta, gamma, and delta. Currently designated VOIs include eta, lota, kappa, and lambda. As per the WHO's weekly epidemiological update on COVID-19, as of 24 August 2021, the alpha variant has spread to 192 countries, beta to 141 countries, gamma to 86 countries, and delta to 163 countries. All the variants have shown increased transmissibility. In addition, the delta variant has been found to have similar transmissibility between vaccinated and unvaccinated individuals.

# Discussion

#### Negative RT-PCR and the Second Wave of COVID-19

Owing to the expeditious transmission of COVID-19 and escalating number of cases, accurate and rapid detection of the virus or the disease is extremely essential for controlling the roots of infection, aiding the patients to prevent further progression, and reducing the severity of disease by creating a window for adequate treatment [2]. This faulty detection of real positive cases seems to be one of the potential causes for the rise in the COVID-19 cases at some places due to the indirect spread of infection from the false-negative persons.

The false-negative outcomes for SARS-CoV-2 from the respiratory samples of the patients are fluctuating between 1 and 30% [3]. These false-negative results can happen due to various reasons that may include too early or too late testing in the pathogenic process of the virus, suboptimal or poor specimen collection procedures, improper specimen types, scanty analytic sensitivity, negligible viral load, or changeability in the viral shedding. The consequences of these false-negative results could be serious, probably paving a way towards the positive case aggregations leading to negative outcomes and amplified transmission rates across the community [3]. The false-negative results also tend to prevent the person from taking the necessary precautions or treatment required; hence, he/she will be a potential carrier or transmitter of infection in the community, leading to the generation of infected case clusters and hotspots of COVID-19 [4].

#### Principle and Limitations of RT-PCR

Real-time reverse transcription-polymerase chain reaction (RT-PCR) is a nuclear-derived method that detects pathogens' genetic material, usually DNA. Since COVID-19 is an RNA virus, RNA is reversely transcripted into DNA using specific enzymes, and obtained DNA is amplified into multiple copies.

The samples from nasopharyngeal or oropharyngeal swabs collected from the patients are kept in specific solutions to eliminate unwanted substances like proteins and fats. The remaining genetic material mixture is placed in an RT-PCR machine. The machine amplifies the DNA into nearly 35 billion copies (from each strand of RNA) by undergoing 35 cycles (standard count). Then, marker labels that are attached to DNA strands release fluorescent dyes. The amount of dye is measured by a computer and displayed on the screen using real-time. The amount of dye in the sample is tracked after each cycle, and if the amount of fluorescent dye reaches a certain level, the presence of the virus can be confirmed. The number of cycles it takes to reach that certain level determines the severity of infection. A low number of cycles indicates severe infection [5, 6].

According to the Centers for Disease Control and Prevention (CDC), the negative results do not interdict COVID-19 infection, and collection of multiple specimens is recommended. Similarly, the presence of viral RNA may not be a confirmatory indication for clinical symptoms developed in a patient. False-positive and false-negative results highly depend on the prevalence of disease in the human body. The higher the prevalence of disease, the more chances of falsenegative results, and vice-versa. Regarding the reliability of the test for detection of COVID-19, RT-PCR is considered the standard gold test due to its high specificity and significant sensitivity [2]. However, few authors have reported that the sensitivity of RT-PCR could be as low as 38%, almost like a chance. IgM and IgG serology tests have been reported across the globe and under being used, but the specificity and sensitivity of serology tests is also not high [7].

#### **Mutations and Associated False-Negative Results**

The release of the first SARS-CoV-2 genome sequence occurred on 10 January 2020, which paved the way for developing complementary RT-PCR assays [8]. However, due to high transmission cycles, the virus may have mutated, posing a threat to the sensitivity of RT-PCR as the reagents for the kits were also developed then.

The SARS-CoV-2 is an enveloped ssRNA virus, which generally tends to have very high mutation rates. However, human coronaviruses have an RNA polymerase with 3' to 5' proofreading activity that allows them to replicate with "high-fidelity" and thus, its mutation rate is moderate [8-10]. The mutation rate of SARS-CoV-2 is ~2 nucleotides per month in contrast to that of influenza (4 nucleotides per month) or HIV (8 nucleotides per month) [11]. However, host-dependent RNA editing [9] and high rate of person-to-person transmissibility [8, 12] cannot be left out of the picture.

Physicians closely studying the second wave in India have claimed that bronchoalveolar lavage performed on RT-PCR negative patients presenting with definitive symptoms of COVID-19 yielded COVID-19 positive results. A doctor in the same report said that approximately 15 to 20% of COVID-19 patients are presenting with the above condition, and it is becoming a dilemma for the physicians [13]. In another report, a scientist argued that mutations in the SARS-CoV-2 may have made it capable of evading RT-PCR testing and that there is a need to re-configure the kits urgently [14]. There are reports where chest computed tomography (CT) findings are clearly indicative of COVID-19 (ground-glass opacity and grey patches), but repeated RT-PCR tests have yielded negative results. Although it is being speculated that since RT-PCR has a sensitivity of 70%, it is the remaining portion of patients that are getting false-negative results [13–17]. However, these reports have surfaced only recently, so the possibility of mutant(s) of SARS-CoV-2 causing this cannot be neglected completely. According to a news report, the data shared by the National Institute of Virology, India, almost 61% of the samples collected from the Indian state of Maharashtra were positive for the presence of the double mutant strain B.1.617 [18]. The Global Times reported that eleven Chinese crew members became positive with a mutant Indian strain of the SARS-CoV-2 [19].

Several studies have hinted out that the inevitable genetic evolution and mutation of SARS-CoV-2 can compromise the sensitivity of RT-PCR diagnostic kits [8, 10–12, 20–23]. The diagnostic assays used in RT-PCR have high specificity, due to which even a few mutations can lead to substantial loss of sensitivity [23]. Most of the mutations of SARS-CoV-2 occur on the Nucleocapsid (N) gene target, primers, and probes of which are extensively used around the world for the detection of this virus [21].

Various recent literature and scientific evidence support the rationale of mutations leading to increased false-negative RT-PCR results for SARS-CoV-2. A study found that an SNP (Single Nucleotide Polymorphism) in the N gene interfered with the detection through commercial diagnostic assays in a SARS-CoV-2 positive patient [23]. An analysis in a study also showed that there were mutations/mismatches in primer/probe binding regions of 7 out of 27 assays that were studied [10]. Another study detected the presence of a mutation in the N gene of SARS-CoV-2 in 3 patients, which affected its detection by commercial assays [12]. Reports claim that single mutation in forward N gene primer binding site, prevalent across the world, decreased the RT-PCR sensitivity for SARS-CoV-2 [22]. A study that had genotyped 31,421 SARS-CoV-2 genome isolates has also revealed that per se, "all of the current COVID-19 diagnostic targets have undergone mutations" [24]. Another study that investigated the impact of Intra-host Single Nucleotide Variants (iSNVs) and Single Nucleotide Polymorphisms (SNPs) on the probes and primers commonly used in RT-PCR found that most of the probes had iSNVs and SNPs [9]. Although this did not affect target hybridization in the study, our rationale is that mutations like these could increase the chances of falsenegative results being obtained upon RT-PCR.

If the mutational profile and data could be integrated into developing PCR arrays, higher sensitivity for primer and probe hybridization could be achieved [9]. This also implies that having multiple gene targets in RT-PCR could vastly reduce the risk of loss of sensitivity due to the inevitable mutations in the virus [15, 16, 18, 20].

# Collapsing Healthcare and Rampant False-Negative Results

The weakening of a country's healthcare system, its management, and the available medical infrastructure have been the most important contributing facets to the increasing morbidity and mortality due to COVID-19. The recent deterioration of the healthcare sector has further amplified false-negative RT-PCR results, and as a result has led to a rise in misdiagnoses, causing an increased risk of infection transmission. The fundamental cause for the false-negative test results among the COVID-19 patients during these times can be attributed much to the erroneous lab personnel who are having an acutely aggravated workload amidst the second wave. Collapsing healthcare and false-negative RT-PCR results are, therefore, now a part of a vicious cycle further fueling one another. False-negative RT-PCR results have been attributed to several pre-analytical, analytical, and post-analytical causes [25].

RT-PCR being extensively employed for mass testing has led to a scarcity of skilled personnel as well as snowballing rates of healthcare workforce burnout which include physicians and medical technicians among many others [26, 27]. As a result of the amalgamation of increased workload, risk of transmission, and shortage of necessary resources, the physical and mental health of healthcare workers has been severely affected [28]. Physicians' and healthcare workers' feeling of exhaustion may also be further accentuated in the future due to the growing backlog of healthcare services and procedures, which must also be given due consideration.

An immediate outcome of shortage of skilled personnel and burnout may include an improper collection of specimens giving rise to insufficient viral load required for detection, improper transportation, improper handling of samples, inefficient extraction of RNA, and the inept removal of amplification inhibitors from the specimens [2, 29–31]. The above factors may also be influenced by the lack of equipment, material, bio-safety labeling, and instrumentation required for effective RT-PCR testing due to overburdened healthcare. The viral load in the specimen being fluctuant during the progression of the disease continues to perplex the timing of specimen collection, further contributing to false-negative results [31, 32].

As the SARS-CoV-2 RT-PCR is increasingly being applied to the asymptomatic population, avoidable repeat testing is becoming more prevalent. This consistently strains the supply chain network causing a delay in the turnaround time for the results, and more crucially leading to a paucity of tests for those who may need testing the most [33]. The multiplying demand has placed undue pressure on the principal manufacturing units causing disruption of overall logistics, leading to failure of delivery of the material required for diagnostic testing to the general population. [34].

## **Action Plan and Recommendations**

RNA-based viruses change variants frequently and COVID-19 is no exception. To tackle this, genomic sequencing capacities should be ramped up so as to facilitate surveillance of emerging variants. Also, the limitations that exist in sampling strategies worldwide should be reduced. It is also possible that while the diagnostic kits do not change much over time, the virus is undergoing a myriad of mutations which may also give rise to variants/mutants that can evade the RT-PCR or at least substantially affect its sensitivity. There is a need to constantly watch out for such mutants/variants. Along with that, supplementary diagnostic tests like chest high-resolution CT scan and inflammatory markers (CRP, D-dimer, LDH, ferritin, IL-6) should be considered of great diagnostic value in a case of high clinical suspicion with a negative RT-PCR test report.

If the patient has clinical symptoms of COVID-19 and tests negative in RT-PCR, then multiple nasal and pharyngeal swabs at different times should be tested. Laboratory data, clinical symptoms, and CT images should be altogether considered to confirm the viral infection. The irrational results in RT-PCR can be minimized by following reasonable sampling procedures, standard laboratories, and premium quality RT-PCR kits [2]. Though RT-PCR is based on conserved sequences, primers in different genes can be affected by variations of viral RNA sequences.

#### Conclusion

The growing menace of increasing false-negative results in SARS-CoV-2 RT-PCR should be dealt with urgently. Even one falsely negative patient could put at risk the lives of hundreds of people in the vicinity. Additionally, the presence of double mutant B.1.617 variant is also a potential contributing factor to the exponential surge of COVID-19 cases in India as it has shown to be transmissible similarly in vaccinated and unvaccinated individuals. The B.1.617.2 (double mutant variant, delta variant) has been classified as a variant of concern. These factors are hampering the efforts of governments all over the world to contain the spread of COVID-19.

Changes in the viral nucleic acid and protein sequences put at risk the utility of certain in vitro diagnostic assays if the mutation occurs in an area critical for primer or antibody binding in RT-PCR and immunoassays. As the new variants of the SARS-CoV-2, including B.1.617, arise, it is the need of the hour that the PCR and diagnostic assays be re-configured and optimized. Multiple gene targets should be identified, and PCR assays should be reconfigured to use them. Extensive research/clinical trials should be sought in this direction. Data for the genome of the mutant variants of the virus should be readily available and infection prevention and control (IPC) measures as well as public health and social measures (PHSM) should change accordingly so as to accommodate additional preventive measures against the variants.

In addition, healthcare workers' burnout has to be looked at. Provisions should be made to recruit additional technical staff for handling various equipment and train them simultaneously. A possible reason for the high rate of false-negative RT-PCR results is improperly trained personnel who fail to take samples appropriately and lack basic training. Such staff should be re-trained.

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#### Declarations

Ethics Approval and Consent to Participate Not applicable.

Consent for Publication All authors agreed to publish this manuscript.

Conflict of Interest The authors declare no competing interests.

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