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Wastewater to clinical case (WC) ratio of COVID-19 identifies insufficient clinical testing, onset of new variants of concern and population immunity in urban communities

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HIGHLIGHTS

- Wastewater surveillance to clinical test relation requires further understanding.
- WC ratio gives information on clinical testing adequacy and true case incidence.
- WC ratio detects waning or onset of more infectious variants of SARS-CoV-2.
- Daily monitoring of the WC ratio reveals onset of changes in disease transmission.
- Shifts in WC ratio may inform on a pathogen’s ease of spread or severity.

ABSTRACT

Clinical testing has been the cornerstone of public health monitoring and infection control efforts in communities throughout the COVID-19 pandemic. With the anticipated reduction of clinical testing as the disease moves into an endemic state, SARS-CoV-2 wastewater surveillance (WWS) will have greater value as an important diagnostic tool. An in-depth analysis and understanding of the metrics derived from WWS is required to interpret and utilize WWS-acquired data effectively (McClary-Gutierrez et al., 2021; O’Keeffe, 2021). In this study, the SARS-CoV-2 wastewater signal to clinical cases (WC) ratio was investigated across seven cities in Canada over periods ranging from 8 to 21 months. This work demonstrates that significant increases in the WC ratio occurred when clinical testing eligibility was modified to appointment-only testing, identifying a period of insufficient clinical testing (resulting in a reduction to testing access and a reduction in the number of daily tests) in these communities, despite increases in the wastewater
1. Introduction

Severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) has had profound effects around the world, claiming millions of lives and significantly impacting public health since its initial identification in December 2019 (World Health Organization, 2021). The virus is an enveloped, positive-sense RNA virus and, like other coronaviruses, predominantly causes respiratory and intestinal tract infections (Chen et al., 2020; Xu et al., 2020; Zou et al., 2020). SARS-CoV-2 infections in humans can cause acute respiratory illness leading to elevated mortality and morbidity rates (Challen et al., 2021; Fajnzylber et al., 2020; O’Driscoll et al., 2021). Early in the COVID-19 pandemic, molecular diagnostic assays based on the reverse transcription quantitative polymerase chain reaction (RT-qPCR) technology were rapidly developed (Zhu et al., 2020) and became the principal testing method used to determine if patients were infected with SARS-CoV-2. Other testing methodologies and technologies, such as rapid antigen testing and LAMP RT-PCR, were also used globally. However, RT-qPCR testing remains the gold standard due to its sensitivity and specificity, particularly at lower viral loads (Hirotsu et al., 2020; Uhteg et al., 2020). Clinical testing in most jurisdictions around the world, including Canada, has predominantly targeted symptomatic individuals (Long et al., 2020; Oran and Topol, 2020; Rivett et al., 2020). The incubation period of SARS-CoV-2, together with the inherent lag associated with the RT-qPCR clinical testing and reporting pipeline (typically measured in days) generates a significant delay between infection incidence and the reporting of results, potentially delaying life-saving public health actions.

Wastewater surveillance (WWS) has emerged as an exemplary early indicator of the incidence and disease burden of SARS-CoV-2 in the community (Ahmed et al., 2020; Al Huraimel et al., 2020; Balboa et al., 2021; Caio and Francis, 2021; Cavany et al., 2022; D’Aoust et al., 2021a; Medema et al., 2020; Randazzo et al., 2020). In the first year of the pandemic, research on the pathogenicity of SARS-CoV-2 revealed that fecal shedding of viral RNA is frequent, where approximately 30–90 % of cases feature fecal shedding (Cheung et al., 2020; Fontana et al., 2020; Hua et al., 2020; Huang et al., 2020; Jones et al., 2020; Ling et al., 2020; Parasa et al., 2020; Santos et al., 2020). Thus, community-level measurements of the viral signal in wastewater are thought to act as a proxy for community SARS-CoV-2 burden (Bibby et al., 2021; D’Aoust et al., 2021a; Karthikeyan et al., 2021; La Rosa et al., 2020; Olesen et al., 2021; Quillian et al., 2020). In addition, following wastewater-based viral signal over time provides near real-time information on the virus dynamics such as incidence, prevalence, and disease burden (Ahmed et al., 2020; Bivins et al., 2020; Chakraborty et al., 2021; D’Aoust et al., 2021c; Medema et al., 2020; Peccia et al., 2020; Randazzo et al., 2020; Sherchan et al., 2020; Wu et al., 2020). Furthermore, sequencing of wastewater or variant-specific RT-qPCR assays can also detect and track the emergence/re-emergence of variants of interest/variants under investigation/variants of concern (VUI/VUI/VOC) (Graber et al., 2021; Lee et al., 2021; Peterson et al., 2021; Yaniv et al., 2021).

With the growing amount of data available from multiple locations and COVID-19 resurgence, there now exists an opportunity to explore the relationships between clinical reporting and WWS results to better understand and interpret patterns of both (McClary-Gutierrez et al., 2021; O’Keeffe, 2021). With this data, there is clear potential for hypothesis-driven approaches to identify mechanisms underlying relationships between clinical testing patterns and observed SARS-CoV-2 viral signal in wastewater and between communities and facilities (Bibby et al., 2021). It is hypothesized that analyzing the change in the intrinsic relationship existing between measured SARS-CoV-2 viral signal in wastewater and reported daily new positive clinical tests may reveal additional information regarding testing strategy effectiveness in approximating true disease incidence in a community. This relationship, called the WC ratio, was first proposed by Xiao et al. (2022). As the ratio has the wastewater titers in the numerator and the reported new clinical cases in the denominator, Xiao et al. (2022) proposed that surveying the relative shifts in the WC ratio may yield information regarding clinical testing. They also reported that an increased WC ratio could be attributed to insufficient testing in the general population (i.e. testing not sufficient to capture the exponential growth of actual COVID-19 cases).

In this study, the WC ratio was analyzed over periods of 8 to 21 months in the seven Canadian cities/regions to help identify occurrences of major epidemiological importance during the COVID-19 pandemic. Four major epidemiological events were identified through retrospective analysis and were as follows: i) a period of insufficient clinical testing during a change in clinical testing strategy (i.e., walk-in testing changed to appointment-based testing); ii) the emergence of a more infectious VOC (Alpha) in the context of low vaccine- or naturally-acquired community immunity; iii) the emergence of a more transmissible and virulent VOC (Delta) in the context of high community immunity, and iv) the emergence of a more transmissible VOC (Omicron) in the context of immunity escape in a susceptible community. Furthermore, possible confounding factors such as the age, demographics, and vaccination/immunization rates of reported new clinical cases were also considered to assure that observed trends were not affected by these elements. The objective of this study was therefore to investigate and quantify the ability of the WC ratio to identify major epidemiological occurrences and further elucidate the relationship existing between WWS and reported clinical cases to complement and enhance the value of WWS and enhance its usefulness as an applied diagnostic technology.

2. Materials and methods

Analytical testing completed in this study occurred in four different laboratories throughout Canada, and as such specific methodologies, site-specific sampling schedules, sample processing, extraction, and quantification techniques differ slightly between the various cities/regions. Before starting, all employed methodologies were compared as part of a broader pan-Canadian interlaboratory study (Chik et al., 2021) and determined to be of similar performance under the tested conditions. A list of the testing periods included in this study and the major epidemiological events identified at each testing site is shown below in Table 1. The major epidemiological events selected for consideration as part of this study were selected on the basis of either: i) enactment or change in governmental policies impacting clinical testing, and ii) onset of a novel VOC in the community (as determined via an allelic proportionality in wastewater of 40–60 %). Furthermore, a summary of the characteristics of each water resource recovery facility (WRRF) is shown in Supplementary Material (Table S1). The studied data sets for most locations stopped in August 2021, however, the studied data set in Ottawa (most frequently sampled and tested) was chosen to be extended into the Omicron VOC onset.
were included for each extraction. RNA was finally eluted in 100 μL of RNase-free water.

2.1.2. Ottawa

24-hour composite samples (500–1000 mL) of post-grit influent were collected from three water resource recovery facilities in the City of Ottawa, including Ashbridge’s Bay (TAB), Highland Creek (THC), and North Toronto (TNT) at frequencies of three to five times per week between Feb. 11th, 2021, and Nov. 22nd, 2021. After arriving at the laboratory at the University of Ottawa for analysis. In this study, samples were analyzed from Apr. 8th, 2020, until Jan. 5th, 2022. Primary sludge samples were first homogenized well by mixing and then 40 mL of each sludge sample was concentrated by centrifugation for 45 min at 10,000 × g. The supernatant was discarded, and the remaining wet pellet was transferred to a 2 mL screw-cap microcentrifuge tube and further centrifuged at 13,000 × g for 3 min with no deceleration/brake applied. The majority of the supernatant was discarded, and the remaining sample was centrifuged again at 12,000 × g for 5 min with no deceleration/brake applied. The remaining supernatant was decanted/pipetted out and the wet weight of the resulting pellet was recorded. Up to 250 mg of the pellet was used for RNA extraction using the RNase PowerMicrobiome Kit (Qiagen, Germantown, MD) with the addition of 100 μL of TRIZol (Thermo Fisher, Ottawa, Canada) to the pellet before bead beating. RNA was finally eluted in 100 μL of RNase-free water.

2.1.3. Kitchener, Peel, and Waterloo

24-hour composite samples (500–1000 mL) of post-grit influent were collected from the following locations: (Kitchener) Region of Waterloo's water resource recovery facility (Dec. 7th, 2020, to Sep. 15th, 2021), (Peel) Clarkson water resource recovery facility (Aug. 8th, 2020, to Sep. 15th, 2021) and G.E. Booth water resource recovery facility (Jul. 20th, 2020, to Aug. 30th, 2021), and (Waterloo) Waterloo water resource recovery facility (Dec. 7th, 2020, to Sep. 15th, 2021). Samples were collected at a frequency of three to five times per week. Samples were aliquoted into 250 mL HDPE bottles (Systems Plus, Baden, Canada) and transported on ice to the University of Waterloo. Upon arrival, the sample bottles were well mixed, and a 40 mL aliquot was poured into 50 mL centrifuge tubes containing 4 μg PEG-8000 and 0.9 g NaCl and mixed on an orbital shaker at 4 °C for 2 h before being stored at 4 °C overnight. The samples were then centrifuged at 12,000 × g at 4 °C for 90 min with no deceleration/brake applied. The majority of the supernatant was discarded, and the remaining sample was centrifuged again at 12,000 × g at 4 °C for 5 min with no deceleration/brake applied. The remaining supernatant was decanted/pipetted out and the wet weight of the resulting pellet was recorded. Up to 250 mg of the pellet was used for RNA extraction using the RNase PowerMicrobiome Kit (Qiagen, Germantown, MD) with the addition of 100 μL of TRIZol (Thermo Fisher, Ottawa, Canada) to the pellet before bead beating. RNA was finally eluted in 100 μL of RNase-free water.

2.1.4. Edmonton and Calgary

24-hour composite samples (500 mL) of post-grit wastewater influent were collected from the following locations: (Edmonton) EPCOR Gold Bar Wastewater Treatment (May 18th, 2020, to Sep. 26th, 2021) and the city of Calgary water resource recovery facility (May 17th, 2020, to Sep. 21st, 2021). Samples were collected at a frequency of three to five times per week. Wastewater concentration and RNA extraction were performed as previously described (Qiu et al., 2021). Briefly, 100 mL wastewater samples were spiked with 100 μL of a suspension of human coronavirus (HCoV) strain 229E (10⁵ IU/mL titrated by TCID50) to monitor virus recovery. The spiked samples were adjusted to a pH of 9.6–10 using 5 N NaOH, mixed vigorously for 30 s, and then centrifuged at 4500 × g for 10 min to pellet solids. The liquid fraction was then transferred into a new container, adjusted to pH 7–7.5 using 1.2 N HCl, and then concentrated by ultrafiltration using a Centricon Plus-70™ filter with a pore size or Nominal Molecular Weight Limit (NMWL) of 30 KDa (Merck Millipore, Carrrigstown, Ireland) at 3000 × g for 10 min at 4 °C. The concentrated sample was adjusted to a final volume of 1 mL by adding phosphate-buffered saline (PBS) and stored at −70 °C until RNA extraction. Viral RNA was extracted from ultrafiltration
wastewater concentrates using the MagMAX™-96 Viral RNA isolation kit (Thermo Fisher Scientific, Ottawa, Canada) and the King Fisher™ Flex Purification System (Thermo Fisher Scientific, Ottawa, Canada) using 400 μl of wastewater concentrate as input. RNA was finally eluted in 100 μl of elution buffer.

2.2. RT-qPCR quantification of SARS-CoV-2, pepper mild mottle virus, Alpha, Delta, and Omicron VOCs in wastewater

Singleplex RT-qPCR quantification of SARS-CoV-2 targets and Pepper Mild Mottle Virus (PMMoV) was performed in the four laboratories analyzing samples for this study. A summary of the targeted SARS-CoV-2 genes, RT-qPCR reaction characteristics, and QA/QC controls utilized in each laboratory during this study are shown below in Table 2. All probes and primers utilized in this study are included in the Supplementary Material (Table S2). For viral signal normalization, the copies of SARS-CoV-2 (N1/N2) detected per reaction were normalized against the quantified copies of PMMoV from corresponding samples. Observed slight differences between the ALOQ in this study between labs is likely caused by standard material used, preparation of standards and differences in primer and probe concentrations, an issue previously outlined in the literature (Bivins et al., 2021).

### Table 2

| Ottawa | Toronto | Kitchener, Peel, and Waterloo | Edmonton and Calgary |
|--------|---------|-----------------------------|---------------------|
| Targeted SARS-CoV-2 regions | N1, N2, ND3L (Alpha), D63G (Delta), P13L (Omicron) | N1, N2, ND3L (Alpha), D63G/N200 (Delta) | N1, N2, E, ND3L (Alpha), D63G (Delta) |
| Targeted biological normalizer | PMMoV | PMMoV | PMMoV |
| RNA template volume (μL) | 3 (SARS-CoV-2 targets) / 1.5 (PMMoV) | 4 | 5 |
| Total RT-qPCR reaction volume (μL) | 10 | 10 | 20 |
| Supermix used | TaqMan™ 1-Step Fast Virus Master Mix (ABI) | TaqMan™ 1-Step Fast Virus Master Mix (ABI) | TaqPath™ 1-Step RT-qPCR Master Mix (ABI) |
| Standard utilized | Exact Diagnostics SARS-CoV-2 RNA standard (COV019) | Custom concatenated plasmid containing N1, N2, and PMMoV gene regions | Exact Diagnostics SARS-CoV-2 RNA standard (COV019) |
| Standard curve points | 5-6 | 5-6 | 5-6 |
| Endogenous spike in | VSV | – | – |
| Corrected for recovery efficiency? | No | No | No |
| Inhibition check? | Yes, via dilution | Yes, via dilution | Yes, via dilution |
| Assay limit of detection (ALOQ) (copies/reaction) | 3.2 (N1), 6.1 (N2), 7.6 (PMMoV) | 1.6 (N1), 1.6 (N2) | – |
| RT-qPCR conditions (All targets) | Reverse trans.: 5 min. @ 50 °C, 1 cycle | Reverse trans.: 5 min. @ 50 °C, 1 cycle | Reverse trans.: 15 min. @ 50 °C, 1 cycle Initial denat.: 2 min. @ 95 °C, 1 cycle Denaturation: 3 s. @ 95 °C, 45 cycles |
| Initial denat.: 20 s. @ 95 °C, 1 cycle | Initial denat.: 20 s. @ 95 °C, 1 cycle | Initial denat.: 20 s. @ 95 °C, 45 cycles |
| Anneal/ext.: 30 s. @ 60 °C, 45 cycles | Anneal/ext.: 30 s. @ 60 °C, 45 cycles | Anneal/ext.: 60 s. @ 60 °C, 45 cycles |
| Primer and probe concentrations | 500 μM (primers) | 500 μM (primers) | 500 μM (primers) |
| 125 μM (probes) | 125 μM (probes) | 125 μM (probes) |
| Replicate exclusion threshold | Ct ≥ 0.5 | Ct ≥ 0.5 | Ct ≥ 0.5 |
| Standard curve acceptance characteristics | R² ≥ 0.95, 90 % ≤ Eff. ≤ 120 % | R² ≥ 0.95, 95 % ≤ Eff. ≤ 105 % | R² ≥ 0.95, 95 % ≤ Eff. ≤ 105 % |
| Other QA/QC performed | Extraction blank, no extrapolation of values, negative controls | Extraction blank, negative controls, positive controls | Extraction blank, no extrapolation of values, negative controls, positive controls, no RT controls |

2.3. Epidemiological data

Daily epidemiological data including new daily testing, reported positive COVID-19 cases, and demographics of new infections were obtained throughout the study via Ottawa Public Health’s online portal (Ottawa Public Health, 2021), Public Health Ontario’s COVID-19 online data tool (Public Health Ontario, 2021), and the COVID-19 surveillance database of the Government of Alberta (Government of Alberta, 2021). The epidemiological data were provided per geographical area by the various public health units (known in certain jurisdictions as public health agencies) to best match the seweredness of each studied location. Stratified by geographic areas or sites having wastewater-based SARS-CoV-2 surveillance included in this study. Vaccination information was obtained via Public Health Ontario’s COVID-19 online data tool (Public Health Ontario, 2021) for locations in Ontario, and from the Government of Canada’s COVID-19 vaccination coverage information page (Government of Canada, 2021).
2.4. Statistical analysis

The Pearson's product-moment correlation coefficient (Pearson's r) was calculated to evaluate the strength of the relationship between PMMoV normalized SARS-CoV-2 viral signal measured in wastewater and reported clinical cases throughout the study. Furthermore, to establish if changes occurred in the WC ratio values during key epidemiological occurrences, the Mann-Whitney U test was performed on the 15-day periods preceding and following the key epidemiological occurrences. A non-parametric test (Mann-Whitney U test) was employed to establish significance in changes of the WC ratio during key epidemiological occurrences to remove distribution effects. In this study, due to the variance in distribution shape, the distribution means will carry more statistical significance than the p-value. A regression analysis and subsequent analysis of the residuals were also performed between the 7-day midpoint average daily new reported clinical cases and the 7-day midpoint average observed viral signal in wastewater to establish if any outliers existed.

2.5. Calculation of the WC ratio

The WC ratio in this study was calculated by using the PMMoV-normalized SARS-CoV-2 viral signal (arithmetic mean of the technical triplicates of the N1 and N2 gene region's measured viral signal in wastewater, in copies/copies PMMoV) and dividing this value by the reported number of new COVID-19 clinical cases on the same day (non-retrospective/corrected), similar to what was described previously in the literature (Xiao et al., 2022). No lead-lag correction was applied to the calculations of the WC ratio (Cavany et al., 2022; D'Aoust et al., 2021a; Galani et al., 2022; Olesen et al., 2021).

2.6. Calculation of VOC allelic proportions

The allelic proportions of different SARS-CoV-2 VOCs were calculated by dividing measured VOC-associated viral copies/g by the universal/non-mutated equivalent genomic region viral copies/g, to obtain a percentage/proportion, as previously described (Graber et al., 2021). This calculation allows to track what percentage of the viral signal observed in wastewater is attributable to the presence of circulating VOCs.

2.7. Standardisation of SARS-CoV-2 measurements for comparison of curves

The viral signal was first standardized to be of a similar scale (on the same axis) by multiplying the PMMoV-normalized viral signal measurements in Ottawa and Toronto by 100,000, Kitchener by 300,000, Waterloo by 500,000, not modifying the measurement of Peel, and dividing the measurements of Edmonton and Calgary by 1000. This was performed to facilitate initial graphical comparison of results by community, and to aid with plotting/graphing.

3. Results and discussion

3.1. Overview of SARS-CoV-2 surveillance at studied sites

Surveillance of SARS-CoV-2 viral signal at the studied sites began on different dates due to the different laboratories employed to support WWS across the study cities. Ottawa samples consisted of primary sludge, whereas samples for all other tested locations were post-grit influent wastewater. This could potentially influence the PMMoV quantification and the corresponding calculated WC ratio because of a higher weight-normalized concentration of PMMoV found in primary sludge solids as compared to post-grit influent wastewater (D’Aoust et al., 2021b; LaTurner et al., 2021; Mercier et al., 2022; Nagarkar et al., 2022; Verily Life Sciences, 2021; Wolfe et al., 2021). Additionally, other factors such as the intra-day variations of laboratory measurements, the inherent variations present due to the technology employed (PCR), and the various normalization techniques (or lack thereof) may also impact reported results. Finally, for the purpose of the analyses performed in this study, shedding rate was also assumed to be relatively constant throughout the analyzed periods, due to each period analyzed in this study corresponding to a single SARS-CoV-2 dominant strain/variant (Bertels et al., 2022; Crank et al., 2022). The measured viral signals (normalized with PMMoV for all locations in Ontario, non-normalized for locations in Alberta) are shown to have a relatively good visual agreement with clinical data throughout the studied periods (Fig. 1a). The COVID-19 pandemic in Canada has so far been characterized by a surge of COVID-19 cases in the early pre-vaccination stage of the pandemic (March 2020) followed by four subsequent resurgences (Fig. 1a) in September 2020, December 2020, March 2021, and December 2021. The scale-standardized viral signal observed in wastewater at all seven tested sites demonstrates a good general agreement with the observed 7-day midpoint average for new COVID-19 clinical cases reported by their respective public health units over the separate resurgence periods, as determined via correlation analysis. An alternative version of Fig. 1, with all viral signals reported in copies/L, is also included in the Supplementary Material (Fig. S5). A summary of the Pearson’s r correlation analyses for the viral signal and clinical cases shown in Fig. 1 is shown in the Supplementary Material (Table S3).

Mass immunization campaigns began in Canada in December 2020 for essential healthcare workers and the most vulnerable in the community (elderly and the immunocompromised). Vaccine rollout was relatively limited in early 2021, but vaccination rates increased rapidly throughout spring and summer. Facemask mandates were present throughout almost the entirety of the studied period, and intermittent gathering restrictions were also imposed intermittently. All studied communities reached a full immunization rate of at least 60 % by Sept. 1st, 2021, and a full immunization rate (two approved vaccine doses) of at least 70 % by Nov. 1st, 2021 (Fig. 1b).

3.2. The WC ratio as an indicator of key epidemiological occurrences in the cities

When performing this particular analysis in all seven studied communities, significant changes in the WC ratio were hypothesized as being indicative of four major events: 1) a change in the clinical testing strategy that introduced the requirement to book a COVID-19 test appointment (5 out of 7 sites were in provinces that invoked this testing strategy); 2) the onset of the B.1.1.7 VOC during periods of low community immunity (all 7 sites were testing during this period), 3) the onset of the B.1.617.2 (Delta) VOC during periods of high community immunity (all 7 sites were testing during this period), and 4) the onset of the B.1.1.529 (omicron) VOC during periods of high community immunization rates (75 %+), with a VOC which has demonstrated immunity escape (a single site was testing during this period).Event #1: WC ratio as an indicator of change in clinical testing strategy

Throughout the pandemic, public health units have adjusted their clinical testing strategies to better track the rate of incidence and prevalence of SARS-CoV-2 in their communities and help infer additional information, such as an approximate number of active disease cases and the pathogen's reproduction rate (China Center for Disease Control, 2020; Hoseinpour Dehordi et al., 2020; Hyafil and Morina, 2020; Khalilae et al., 2021; Kolifarhood et al., 2020; Pan et al., 2020). PCR-based clinical testing methods have been the primary metric of COVID-19 rates of incidence and prevalence in communities for public health professionals. However, RT-PCR nucleic acid clinical tests are not without limitations; first, individuals may decline clinical testing or refuse to seek medical treatment during a pandemic despite being symptomatic, complicating both tracking of cases and contact tracing (Novoa et al., 2021), and second, RT-PCR test results may suffer from a substantial false-negative rate, especially when considering the time of testing in relation to symptom onset and the type of sample collected (sputum, stool, nasopharyngeal, oropharyngeal, etc.) (da Rocha Araujo, 2020; Hatchette, 2009; Wikramaratna et al., 2020).

An epidemiologically important event occurred when changes in clinical testing strategies were effected in the province of Ontario (affecting Ottawa, Kitchener, Toronto, Peel and Waterloo), Canada on October 6th,
2020. In response to an increasing backlog of tests, and to ensure individuals could get tested at a specific time with minimal wait (Crawley et al., 2020), provincial guidelines and the framework for the initiation of SARS-CoV-2 RT-PCR clinical testing were changed from an open-access, walk-in format to one in which individuals were required to book an appointment before testing. This change in testing strategy presented a significant, if brief, barrier for Ontario residents wanting to be tested for COVID-19 by necessitating online bookings, which made it more difficult for groups of the general population to access testing resources. Regular and consistent WWS had already been introduced in Ottawa during this period and, as such, a quantitative analysis of the effects of changes in testing strategies was performed. While the change occurred in 5 of the 7 locations, the effects of the change were only studied in Ottawa as other locations either had not started their WWS, or were at the very beginning, and critical complementary data such as clinical testing information was missing.

When comparing the preceding 15-day period (Sept. 21st, 2020 – Oct. 5th, 2020) before the testing strategy change and the next 15-day period after enactment of the change (Oct. 6th, 2020 – Oct. 21st, 2020) in Ottawa the number of clinical tests performed on the general population decreased by an average of 23.2 % (Fig. 2). Concurrently, the local public health units reported a corresponding decrease of 16.8 % in detected new clinical cases of COVID-19 in Ottawa (Fig. 2). During the same period, Ottawa's normalized viral signal (average of N1-N2 viral copies/copies PMMoV) reported an increase of 55.9 %, and the corresponding WC ratio increased by over 189 % (Fig. 2). The significant increase in the WC ratio in Ottawa occurred due to both increased wastewater signal and decreasing numbers of
reported new clinical cases occurring simultaneously, thereby amplifying the increase in the WC ratio. During this period, variant testing in Ottawa’s wastewater confirmed that no known major VOC was circulating in the general population, and an analysis of the age demographic of new cases (Fig. S1) showed no statistically significant difference during the 30-day sample set. Furthermore, no vaccines were available to the general public during this first studied period. Based on the observed increase (>50%) in the WC ratio observed in Ottawa, it is hypothesized that the WC ratio may be an indicator of issues, such as flawed or difficult to access clinical testing resources, or overall insufficient clinical testing in relation to wastewater viral signal. This agrees with the findings and observations presented by Xiao et al. (2022). To determine the statistical significance of the change in WC ratio in Ottawa during the studied period, a non-parametric Mann-Whitney U test was performed, and the corresponding p-value was calculated. In Ottawa, the WC ratio before the change in strategy had a mean of $4.8 \times 10^{-6}$ (IQR = $2.8 \times 10^{-6} - 6.1 \times 10^{-6}$), while the mean after the change in testing strategy was $1.4 \times 10^{-5}$ (IQR = $8.2 \times 10^{-6} - 1.4 \times 10^{-5}$). As hypothesized, changes in the testing strategy correlated with an increase in WC ratio (p-value < 9 x 10^{-5}).

While clinical testing currently remains the frontline measure of choice for the surveillance and tracking of COVID-19 incidence in the community, these findings strongly suggest that current and future disease surveillance efforts will benefit immensely from a multi-pronged surveillance approach incorporating more than the potentially biased case rates of clinically acquired diseases. COVID-19 and pandemic-potential diseases have been difficult to accurately track using traditional clinical testing methods as they are generally less effective at surveying disease burden due to many contributing factors, including testing capacity, the ability, and the desire of individuals to be tested (Gonsalves and Yamey, 2020; Jaiswal et al., 2020; Malinverni and Brigagao, 2020; Uscinski et al., 2020). It will continue to be difficult to conduct the widespread, mandatory disease surveillance of a population that is necessary to obtain information that could be interpreted as fully random and representative of the true rate of incidence of disease (McDermott and Newman, 2020; Pouwels et al., 2021; Rubin, 2020; Shao et al., 2020). In this context, it therefore appears highly useful to utilize WWS and the WC ratio to complement traditional clinical testing results. WWS and the resulting measured viral load can be used as a confirmatory measure of actual rates of disease burden in the community, while rapid changes in the WC ratio may help identify periods of inadequate or altered clinical testing. Specifically, observing changes in the relative WC ratio may allow for the detection of changes in reported clinical cases that are not linked to actual changes in viral load in the community but are instead linked to shifts in testing rules and regulations, testing strategies, or fundamental changes in the disease vector. It is however important to also consider potential variations and uncertainties present in WWS (Ahmed et al., 2022; Li et al., 2021; Wade et al., 2022), as these will also have an impact on the WC ratio. It is hypothesized that in this study, due to trends observed during the change in testing strategies, is it likely that reported clinical cases may have been underreported in Ottawa following the modification to the testing strategies applied in these communities.

**Fig. 2.** Comparison of the number of daily SARS-CoV-2 RT-PCR nucleic acid clinical tests performed and corresponding daily new COVID-19 positive cases, the daily viral signal measured through a SARS-CoV-2 wastewater surveillance program and the corresponding wastewater/clinical cases ratio (WC) during the same period in Ottawa.
3.3. Event #2: WC ratio as an indicator of the onset of the B.1.1.7 (Alpha) variant of concern

SARS-CoV-2, being an RNA virus, is susceptible to mutations that can cause changes in its epidemiological characteristics, such as increased infectivity and/or virulence in comparison to its ancestral lineages (Burki, 2021; Drake and Holland, 1999; Duffy, 2018; Holmes and Rambaut, 2004). Throughout the COVID-19 pandemic, mutations of the SARS-CoV-2 spike (S) protein, referred to colloquially as D614G and N501Y, became hallmarks of the B.1.1.7 VOC, now referred to as the Alpha VOC. The onset of the Alpha VOC resulted in increased transmission of COVID-19 in the community (Frampton et al., 2021; Galloway et al., 2021; Graham et al., 2021), potentially affecting both observed viral load via WWS and new daily reported COVID-19 cases in the community by the public health unit. The period of onset of the Alpha VOC in the seven studied communities was confirmed via RT-qPCR allelic proportion determination (Fig. 3) using a previously developed and validated assay (Grabber et al., 2021). The onset of the Alpha VOC in a community was defined as such by determining when a consistent B.1.1.7 VOC allelic proportionality of between 40 and 60 % of the SARS-CoV-2 viral signal in wastewater was reached and subsequently exceeded.

Using Ottawa as an initial test case, when comparing the average of the preceding 15-day period and the average of the next 15-day period after the period of onset of the B.1.1.7 VOC, the number of clinical tests performed on the general population increased by 19.6 % (Fig. 3a) and the local public health team reported a corresponding increase of 188.3 % in the detection new daily clinical cases of COVID-19 (Fig. 3b). During the same period, normalized WWS reported a more modest increase of 70.8 % in measured viral signal (average of N1-N2 viral copies/copies PMMoV). Furthermore, the WC ratio decreased by 56.3 % (Fig. 3c). During the studied period, the onset of the Alpha VOC led to an observed change in the relationship between the number of reported COVID-19 cases and the observed WWS viral signal, and its hypothesized that the Alpha VOC may have altered viral fecal shedding dynamics in terms of viral load in fecal matter over time (Miura et al., 2021). An analysis of the age demographic of new cases and changes in community immunization (Fig. S2) showed no statistically significant difference during the studied 30-day period. The percentage of the total population fully immunized (2 doses +) increased from 2 % to 2.3 % during the studied 30-day period, but due to the time required for immuno-competence development and overall very low immunization rate, it is understood that vaccination was not likely to be an important factor in affecting reported clinical cases or viral fecal shedding dynamics during this period (Public Health Ontario, 2021).

A summary of proportional observed changes in the preceding 15-day period and following 15-day period in reported clinical cases of COVID-19, measured viral signal in wastewater and WC ratio at all seven tested locations is shown in the Supplementary Material (Table S4). Individually, proportional changes in reported clinical cases and measured SARS-CoV-2 viral signal in wastewater varied, however, in six of seven tested locations during this period, a marked decrease in the observed WC ratio (average

![Fig. 3. Comparison of a. the number of daily SARS-CoV-2 RT-PCR nucleic acid clinical tests performed and corresponding daily new COVID-19 positive cases in Ottawa, Canada, b. the daily viral signal measured through a SARS-CoV-2 wastewater surveillance program servicing approx. 91 % of the City of Ottawa’s population (pop.: 1.1 M) and c. the corresponding wastewater/clinical cases ratio (WC) during the same period, overlaid with the progression of the allelic expression of the B.1.1.7 (Alpha) VOC in wastewater.](image-url)
decrease of 41.6 %) was observed, which may signal the emergence of the B.1.1.7 VOC as the dominant source of new infections (Fig. 4). Only in Calgary did the WC ratio increase (6.4 %) during the onset of the B.1.1.7 VOC. This trend in the decrease of the WC ratio potentially signifying important chances in disease dynamics is consistent with observations by Xiao et al. (2022) for the Boston area during the period where the Alpha VOC became dominant in wastewater (Lee et al., 2021). It has been suggested in the literature that there may be increased viral loading in symptomatic individuals caused by the Alpha variant as compared to the wild type of SARS-CoV-2 based on data obtained from nonhuman primates (Rosenke et al., 2021). However, there is not yet a consensus on this matter for human subjects (Badu et al., 2021; Zhu et al., 2021). The decrease in the WC ratio could also have been caused by a greater increase in transmissibility of the disease without a corresponding increase in fecal shedding (unequal variance in viral load in tissue and secretions), increased awareness in the general population, or increased severity of symptoms thereby leading more infected individuals to seek clinical testing, resulting in a lower WC ratio after the onset.

Mann-Whitney U tests were performed on each data set during the Alpha VOC onset to investigate the shifts in WC ratios in the studied locations. The results of the tests, along with accompanying interpretation, are shown below in Table 3. It is important to note that in this study, non-parametric Mann-Whitney U tests were chosen as the preferred analysis method over other parametric tests to establish if a statistical change occurred before and after the studied major epidemiological events. This choice was made due to the non-normal distribution of WC ratio values. However, the Mann-Whitney U test and the interpretation of the p-value may be limited as the shape of the analyzed distributions are unlikely to be similar (as observed with the observable changes in WC ratio values over time). In this instance, more weight should be given to the comparison of the mean rank over the p-value.

3.4. Event #3: WC ratio as an indicator of the onset of the B.1.617.2 (Delta) variant of concern

Mutations in the SARS-CoV-2 genome at the N-terminal domain (NTD) and receptor-binding domain (RBD) locations led to the rise of the B.1.617 lineage first identified in October 2020 in India (Cherian et al., 2021; Yadav et al., 2021), culminating in the dominance of the Delta variant (B.1.617.2) in new COVID-19 infections in most locations in North America, including Canada. The Delta variant is characterized by increased transmissibility and virulence compared to the Alpha variant (Kannan et al., 2021; Liu et al., 2021; Planas et al., 2021). The periods of onset of the Delta VOC in the four studied communities with available data (Ottawa, Kitchener, Peel, and Waterloo) were confirmed via RT-qPCR allelic proportion determination of the D63G portion of the genome using an assay developed and validated in-house. These periods of onset were defined as reaching a B.1.617.2 VOC allelic proportion of 40–60 % of the SARS-CoV-2 viral signal in wastewater and subsequently exceeding this proportionality.

Using Ottawa as an initial test case, when comparing the average of the preceding 15-day period and the average of the next 15-day period after the onset of the B.1.617.2 VOC a modest increase (14.0 %) in clinical tests that were performed was observed (Fig. 5a). Meanwhile, during the same period, the reported new clinical cases of COVID-19 more than doubled, increasing by 121.1 % of the original value. This trend was similar to what was observed during the onset of the Alpha variant for both the number of clinical tests performed and new daily COVID-19 cases in Ottawa. However, the total numbers of new reported COVID-19 cases per day were substantially lower by approximately one order of magnitude during the onset of the Delta variant. Specifically, a 15-day average of 9.1 new cases per day was observed during the onset of the Delta variant, while the 15-day average was 117.3 new cases per day during Alpha variant onset. These differences in observed new COVID-19 cases in the community were likely driven by immunization effects; as of Mar. 23th, 2021 (onset of Alpha variant), only 2.2 % of the population in Ottawa was fully immunized, compared to 63.1 % in Jul. 31st, 2021 (onset of the Delta variant) (Public Health Ontario, 2021). During the same period, the normalized WWS signal increased by 45.8 % (average of N1-N2 viral copies/copies PMMoV), which is similar to the trend observed during the onset of the Alpha variant (44.5 % increase). These combined factors led to a slight decrease of only 18.7 % in the WC ratio during the onset of the Delta variant compared to a significantly larger decrease of 56.3 % during the Alpha variant onset. An analysis of the age demographic of new cases and changes in community immunization (Fig. S3) showed no statistically significant difference during the studied 30-day period. It is hypothesized that immunization impact dampened both increases in reported new COVID-19 cases...
Table 3  
Mean WC ratio and interquartile ranges (1st and 3rd quartiles) before and after the Alpha VOC onset along with the results of Mann-Whitney U tests performed on the WC ratio data sets to evaluate the significance of shifts before and after the Alpha VOC onset. The resulting p-value, and textual interpretation are also shown to establish if the WC ratio shift was statistically significant.

| Location | Mean WC ratio (before)/(after) | IQR (1st / 3rd quartiles) | Mann-Whitney U test p-value | Interpretation |
|----------|--------------------------------|---------------------------|----------------------------|----------------|
| Ottawa   | $1.4 \times 10^{-5} / 6.3 \times 10^{-6}$ | $4.5 \times 10^{-6} - 2.4 \times 10^{-5}$ / $1.7 \times 10^{-6} - 2.7 \times 10^{-6}$ | 0.254 | As hypothesized, decreases in the WC ratio occurred during the Alpha onset, however the Mann Whitney U test could not establish statistical significance ($p < 0.1$). |
| Toronto  | $2.9 \times 10^{-5} / 2.1 \times 10^{-6}$ | $4.1 \times 10^{-6} - 8.5 \times 10^{-5}$ / $2.4 \times 10^{-6} - 3.6 \times 10^{-5}$ | 0.165 | As hypothesized, decreases in the WC ratio occurred during the Alpha onset however the Mann Whitney U test could not establish statistical significance ($p < 0.1$). Lower frequency of testing could have had an impact on the test results. |
| Kitchener | $4.7 \times 10^{-5} / 2.9 \times 10^{-6}$ | $1.6 \times 10^{-6} - 6.3 \times 10^{-6}$ / $2.1 \times 10^{-6} - 3.5 \times 10^{-6}$ | 0.886 | As hypothesized, decreases in the WC ratio occurred during the Alpha onset however the Mann Whitney U test could not establish statistical significance ($p < 0.1$). Lower frequency of testing could have had an impact on the test results. |
| Peel     | $0.29 / 0.14$ | $0.21 - 0.37 / 0.10 - 0.16$ | 0.886 | As hypothesized, decreases in the WC ratio occurred during the Alpha onset, however the Mann Whitney U test could not establish statistical significance ($p < 0.1$). Lower frequency of testing could have had an impact on the test results. |
| Waterloo | $3.6 \times 10^{-5} / 2.4 \times 10^{-6}$ | $2.0 \times 10^{-6} - 3.7 \times 10^{-6}$ / $1.0 \times 10^{-6} - 2.9 \times 10^{-6}$ | 0.223 | As hypothesized, decreases in the WC ratio occurred during the Alpha onset, however the Mann Whitney U test could not establish statistical significance ($p < 0.1$). Lower frequency of testing could have had an impact on the test results. |
| Edmonton | $1.8 \times 10^{5} / 1.5 \times 10^{5}$ | $1.1 \times 10^{5} - 2.1 \times 10^{5}$ / $1.9 \times 10^{5} - 3.0 \times 10^{5}$ | 0.347 | As hypothesized, decreases in the WC ratio occurred during the Alpha onset, however the Mann Whitney U test could not establish statistical significance ($p < 0.1$). Lower frequency of testing or lack of normalization for flow/dilution effects could have had an impact on the test results. |
| Calgary  | $3.2 \times 10^{3} / 3.4 \times 10^{3}$ | $1.1 \times 10^{3} - 2.1 \times 10^{3}$ / $1.9 \times 10^{3} - 3.0 \times 10^{3}$ | 0.391 | Contrary to hypothesized, increases in the WC ratio occurred during the Alpha onset, however the Mann Whitney U test could not establish statistical significance ($p < 0.1$). Lower frequency of testing or lack of normalization for flow/dilution effects could have had an impact on the test results. |

Fig. 5. Comparison of a. the number of daily SARS-CoV-2 RT-PCR nucleic acid clinical tests performed and corresponding daily new COVID-19 positive cases in Ottawa, Canada, b. the daily viral signal measured through a SARS-CoV-2 wastewater surveillance program servicing approx. 91 % of the City of Ottawa’s population (pop.: 1.1M) and c. the corresponding wastewater/clinical cases ratio (WC) during the same period, overlaid with the corresponding progression of the allelic expression of the B.1.617.2 (Delta) VOC in wastewater.
and viral signal in wastewater, effectively dampening the expected effects of the onset of a new, more infectious variant of SARS-CoV-2 on the WC ratio. Accordingly, communities with lower rates of immunization could be expected to exhibit greater reductions of the WC ratio due to increased rates of infections resulting in higher numbers of new daily COVID-19 cases. During the 30-day period where Delta emerged in Ottawa, full immunization in the total population (2 doses +) increased from 54.2 % on Jul. 16th, 2021, to 66.9 % on Aug. 14th, 2021), which likely limited the spread of the Delta variant within the community during this time, as attested by the observed viral load in wastewater and reported clinical cases (Fig. 1a).

A summary of proportional observed changes in the preceding 15-day period and following 15-day period in reported clinical cases of COVID-19, measured viral signal in wastewater, and WC ratio at the tested locations is shown in the Supplementary Material (Table S4). Individually, proportional changes in reported clinical cases and measured SARS-CoV-2 viral signal in wastewater varied, however in three of the five tested locations (Ottawa, Toronto and Waterloo), the WC ratio decreased by an average of 27.0 % during the emergence of the B.1.617.2 VOC as the dominant source of new infections. Meanwhile, in the four other tested locations with data during the emergence of the B.1.617.2 VOC (Peel, Kitchener, Edmonton and Calgary), the WC ratio instead increased by an average of 53.8 %. A visual comparison of the WC ratio changes during the onset of the B.1.617.2 VOC is shown below in Fig. 6. Contrary to trends observed during the B.1.1.7 VOC, the overwhelming trend in the WC ratio was not a decrease. It is believed that this increase in WC ratio in some of the locations (Peel, Kitchener, Edmonton and Calgary) may have been indicative of a disconnect between reported clinical cases in the communities and observed viral signal, caused partly by community immunization (hypothesized to lead to lower viral loads in feces) and local clinical testing capacity being reached or exceeded, leading to elevated WC ratio values caused by artificially low reported clinical cases. It is likely that in immunized communities without VOCs capable of immune escape, the change in the observed WC ratio will be lessened. Under such circumstances, the WC ratio is less indicative of the onset of new VOCs entering the community. Mann-Whitney U tests were performed on each data set during the Delta VOC onset to investigate the shifts in WC ratios in the studied locations. The results of the tests, along with accompanying interpretation, are shown below in Table 4.

3.5. Event #4: WC ratio as an indicator of the onset of the B.1.1.529 (Omicron) variant of concern

Later in the pandemic, further mutations on the S protein RBD locations resulted in a very genotypically different VOC, denoted B.1.1.529 (Omicron). The combination of several mutations observed previously in the C.37 (Lambda) variant and several new mutations on the S protein RBD resulted in a significantly more infectious yet symptomatically milder VOC (Halfmann et al., 2022; Shuai et al., 2022), which spread rapidly around the world and replacing Delta as the main VOC in the majority of the location where it established. One of the important characteristics of Omicron is its ability to potentially evade neutralization in sera, even in vaccine-immunized individuals (He et al., 2021; Zhang et al., 2021).

Using Ottawa as an initial test case, when comparing the average of the preceding 15-day period and the average of the next 15-day period after the period of onset of the B.1.1.529 VOC (December 20th, 2021), the number of clinical tests performed on the general population increased by 29.6 % and the local public health reported a corresponding increase of 497.3 % in the detection new clinical cases of COVID-19 (Fig. 7a). During the same period, normalized WWS reported an important increase of 243.5 % in measured viral signal (average of N1-N2 viral copies/copies PMMoV). At the same time, the WC ratio decreased by 41.9 % (Fig. 7c). It is believed that significant decreases in the WC ratio are an indicator of the onset of new VOCs with immune escape abilities. An analysis of the age demographic of new cases and changes in community immunization (Fig. S4) showed no statistically significant difference during the studied 30-day period. Daily vaccination rates during the studied 30-day period increased slightly over time due to residents obtaining third-dose booster vaccinations, but due to the time required for immuno-competence development, it is understood that vaccination was not likely to be a major factor influencing changes of the WC ratio. To determine the statistical significance of the change in WC ratio in Ottawa during the Omicron VOC onset, a non-parametric Mann-Whitney U test was performed, and the corresponding p-value was calculated. The WC ratio before the Omicron VOC onset had a mean of $1.7 \times 10^{-6}$ (IQR = $1.2 \times 10^{-6} - 1.8 \times 10^{-6}$), while the mean after the Omicron VOC onset was of $1.0 \times 10^{-6}$ (IQR = $7.2 \times 10^{-7} - 1.3 \times 10^{-6}$). As hypothesized, the onset of a more infectious VOC (Omicron) corresponded with a decrease in WC ratio (p-value <0.035).

Fig. 6. Comparison of the WC ratio and B.1.617.2 allelic proportionality during the onset of the B.1.617.2 (Delta) VOC in 6 additional locations in Canada (Toronto, Kitchener, Peel, Waterloo, Edmonton, and Calgary).
Table 4
Mean WC ratio and interquartile ranges (1st and 3rd quartiles) before and after the Delta VOC onset along with the results of Mann-Whitney U tests performed on the WC ratio data sets to evaluate the significance of shifts before and after the Delta VOC onset. The resulting p-value, and textual interpretation are also shown to establish if the WC ratio shift was statistically significant.

| Location  | Mean WC ratio (before)/(after) | IQR (1st / 3rd quartiles) | Mann-Whitney U test p-value | Interpretation |
|-----------|-----------------------------|-----------------------------|----------------------------|----------------|
| Ottawa    | $4.6 \times 10^{-5} / 3.8 \times 10^{-5}$ | $2.5 \times 10^{-5} - 6.4 \times 10^{-5} / 1.5 \times 10^{-5} - 4.3 \times 10^{-5}$ | 0.079 | As hypothesized, decreases in the WC ratio occurred during the Delta onset, and the Mann Whitney U test could establish statistical significance ($p < 0.1$). |
| Toronto   | $6.0 \times 10^{-6} / 3.5 \times 10^{-6}$ | $3.0 \times 10^{-6} - 6.4 \times 10^{-6} / 2.1 \times 10^{-6} - 3.5 \times 10^{-6}$ | 0.132 | As hypothesized, decreases in the WC ratio occurred during the Delta onset, however the Mann Whitney U test could not establish statistical significance ($p > 0.1$). |
| Kitchener | $1.2 \times 10^{-7} / 9.9 \times 10^{-6}$ | $8.1 \times 10^{-8} - 1.8 \times 10^{-7} / 7.3 \times 10^{-9} - 1.1 \times 10^{-8}$ | 0.409 | As hypothesized, decreases in the WC ratio occurred during the Delta onset, however the Mann Whitney U test could not establish statistical significance ($p > 0.1$). Lower frequency of testing could have had an impact on the test results. |
| Peel      | 0.26 / 0.28                   | 0.16-0.32 / 0.24 – 0.45     | 0.257 | Contrary to the emitted hypothesis, increases in the WC ratio occurred during the Delta onset, however the Mann Whitney U test could not establish statistical significance ($p < 0.1$). Lower frequency of testing could have had an impact on the test results. |
| Waterloo  | $2.7 \times 10^{-5} / 3.8 \times 10^{-5}$ | $6.1 \times 10^{-6} - 2.7 \times 10^{-5} / 2.2 \times 10^{-7} - 6.1 \times 10^{-5}$ | 0.065 | Contrary to the emitted hypothesis, increases in the WC ratio occurred during the Delta onset, and the Mann Whitney U test established statistical significance ($p < 0.1$). Lower frequency of testing could have had an impact on the test results. |
| Edmonton  | $5.4 \times 10^{2} / 6.0 \times 10^{2}$ | $4.1 \times 10^{2} - 8.4 \times 10^{2} / 2.6 \times 10^{2} - 9.0 \times 10^{2}$ | 0.201 | Contrary to hypothesized, increases in the WC ratio occurred during the Delta onset, however the Mann Whitney U test could not establish statistical significance ($p > 0.1$). Lower frequency of testing or lack of normalization for flow/dilution effects could have had an impact on the test results. |
| Calgary   | $4.7 \times 10^{2} / 1.5 \times 10^{3}$ | $3.5 \times 10^{2} - 5.8 \times 10^{2} / 7.5 \times 10^{2} - 1.1 \times 10^{3}$ | 0.624 | Contrary to hypothesized, increases in the WC ratio occurred during the Delta onset, however the Mann Whitney U test could not establish statistical significance ($p > 0.1$). Lower frequency of testing or lack of normalization for flow/dilution effects could have had an impact on the test results. |

Fig. 7. Comparison of a. the number of daily SARS-CoV-2 RT-PCR nucleic acid clinical tests performed and corresponding daily new COVID-19 positive cases in Ottawa, Canada, b. the daily viral signal measured through a SARS-CoV-2 wastewater surveillance program servicing approx. 91 % of the City of Ottawa’s population (pop.: 1.1 M) and c. the corresponding wastewater/clinical cases ratio (WC) during the same period, overlaid with the corresponding progression of the allelic expression of the B.1.1.529 (Omicron) VOC in wastewater.
The data sets demonstrate that the magnitude of change in the WC ratio correlates with the overall disease burden in the community (Fig. 8). The largest changes in WC ratios are observed during the Alpha variant and Omicron variant within the city of Ottawa, which are the two epidemiological events responsible for the highest disease burden within the city. In particular, the magnitude of the WC ratio during the Alpha and Omicron variants were similar and distinct from the period corresponding to the spread of the Delta variant in Ottawa. A distinction between the magnitudes of the WC ratio during the Alpha variant compared to the Delta variant also exists in the cities of Toronto, Kitchener, Peel and Waterloo. The in-depth analysis of the WC ratio during several major epidemiological events (as described in the above sections) revealed several major trends and findings: First, performed alone, both traditional clinical testing and WWS sometimes provide limited information for public health units that are monitoring a major pandemic disease like COVID-19. Clinical testing appears to sometimes suffer from underreporting due to the limited reach of the clinical tests, coupled with the limits in the ability and the desire of individuals to be tested, especially if they do not feel unhealthy. Furthermore, a strong relationship exists between the number of clinical tests performed and the number of detected new cases in the community, particularly during periods of disease resurgence, where a high degree of community transmission occurs, potentially biasing interpretations of results. It is hypothesized that this weakness in traditional clinical testing is due to the difficulty in performing enough tests throughout the community to constitute testing rates that approximate a random distribution. In contrast, WWS effectively tests all individuals connected to the sewersheds regardless of whether they are symptomatic or believe they have been exposed to the virus. Monitoring the WC ratio while performing RT-qPCR-based WWS can appear to provide accurate notice of the time of arrival of new variants of concern in a community during a pandemic as quickly as traditional clinical testing and does not require infected individuals to seek clinical testing or enter the healthcare system. Throughout the study, it appears that a shift in the magnitude of change of the WC ratio and the relationship between reported clinical cases and observed WWS signal occurred for three reasons: (i) immunization may significantly reduce the number of individuals seeking COVID-19 testing due to a reduction of apparent symptoms caused by vaccination; (ii) as the pandemic progresses, disinterest may develop in disease dynamics and the arrival/onset and waning of more infectious variants or mutations of a pathogen or disease. When using traditional clinical case data and WWS, additional monitoring of the WC ratio may provide a greater understanding of the surveillance metrics during events of high epidemiological importance. The specific conclusions of this study are as follows: During periods of resurgence or increases in disease spread in a community, monitoring of reported clinical cases may provide a limited understanding of the true disease prevalence rates when community daily clinical testing is restricted or insufficient. The WC ratio will strongly increase when the disease burden increases in a community where an insufficient number of clinical tests are being performed to adequately approximate the disease burden in the community. Furthermore, if a community is not well immunized (<2.5 % of individuals have received two doses of a COVID-19 vaccine), based on observed trends in this study, the onset of new, more infectious VOCS may lead to a decrease in the WC ratio. Meanwhile, if a community is well immunized (>60.0 % of residents have received two doses of a COVID-19 vaccine), the onset of new, more infectious VOCS caused modest decreases in the WC ratio. Moreover, the onset of the Omicron VOC resulted in significant decreases in the WC ratio, as was observed during Alpha VOC dominance in early 2021, and this, irrespective of the immunization status of the community, is likely due to the immune escape capability of the Omicron VOC. It was observed that as a result, decreases in the WC can often be associated with the onset of a change in disease dynamics and the arrival of more infectious novel variants in the community and could be used as a tool to identify the emergence of new

4. Conclusions

This study strongly suggests that regular, daily monitoring of the WC ratio can reveal and detect the onset of changes in disease transmission patterns, and the arrival/onset and waning of more infectious variants or mutations of a pathogen or disease. When using traditional clinical case data and WWS, additional monitoring of the WC ratio may provide a greater understanding of the surveillance metrics during events of high epidemiological importance. The specific conclusions of this study are as follows: During periods of resurgence or increases in disease spread in a community, monitoring of reported clinical cases may provide a limited understanding of the true disease prevalence rates when community daily clinical testing is restricted or insufficient. The WC ratio will strongly increase when the disease burden increases in a community where an insufficient number of clinical tests are being performed to adequately approximate the disease burden in the community. Furthermore, if a community is not well immunized (<2.5 % of individuals have received two doses of a COVID-19 vaccine), based on observed trends in this study, the onset of new, more infectious VOCS may lead to a decrease in the WC ratio. Meanwhile, if a community is well immunized (>60.0 % of residents have received two doses of a COVID-19 vaccine), the onset of new, more infectious VOCS caused modest decreases in the WC ratio. Moreover, the onset of the Omicron VOC resulted in significant decreases in the WC ratio, as was observed during Alpha VOC dominance in early 2021, and this, irrespective of the immunization status of the community, is likely due to the immune escape capability of the Omicron VOC. It was observed that as a result, decreases in the WC can often be associated with the onset of a change in disease dynamics and the arrival of more infectious novel variants in the community and could be used as a tool to identify the emergence of new

Fig. 8. Comparison of WC ratio amplitude during the 30-day periods of onset of the B.1.1.7 (Alpha), B.1.617.2 (Delta) and B.1.1.529 (Omicron) VOCS in Ottawa, Toronto, Kitchener, Peel and Waterloo.
variants in the future. Finally, it was determined that changes in the magnitude and inflection points in the WC ratio at a longitudinally surveyed location may be indicative of changes in disease burden and the ability of the pathogen to spread. These findings indicate that monitoring the WC ratio during the SARS-CoV-2 pandemic and other, future pandemics, will yield additional insight into the disease burden in a community and should be performed where possible.

**CRediT authorship contribution statement**

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Syeda Tasneem Towhid: experimental work, writing, review & editing.

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**Declaration of competing interest**

The authors declare that no known competing financial interests or personal relationships influenced the work reported in this manuscript.

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**Appendix A. Supplementary material**

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