The COVID-19 pandemic has revealed weaknesses in global manufacturing and distribution of medications, exacerbating many pre-existing limitations and inequities in drug supply and creating new shortages. Supply chains have been disrupted as many were designed for “just-in-time” management of drug inventory to reduce the costs of storage and reduce the risk of drug expiration. The pandemic has also led to vastly increased demand for certain medications, including the highly publicized drug hydroxychloroquine, which proved to be ineffective in the treatment of COVID-19, and adjunctive medications required for the care of critically ill patients such as sedatives and analgesics. The problem of mismatched supply and demand can be exacerbated by people and institutions hoarding drugs in times of supply uncertainty.

The emergence of SARS-CoV-2 prompted testing of many newly developed or existing repurposed therapies as treatments for COVID-19. Expecting drug manufacturers to increase the supply of all candidate therapies or health care providers to stockpile inventory before drugs are proven effective would be unreasonable. Thus, when a new drug is shown to be effective, there will likely be at least a temporary shortage of supply unless it is already widely available. Medications are at greatest risk for prolonged shortage when their demand surges unexpectedly and manufacturing and distribution are not diversified.

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We show how a health system can estimate demand for a novel therapy and assess the supply. We then discuss how the harms of drug shortage may be mitigated through use of an ethical framework, using tocilizumab as a case study to illustrate the potential for acute drug shortage.

What are the uses of tocilizumab and what does it cost?

Tocilizumab is used to treat a variety of refractory rheumatologic conditions as well as cytokine release syndrome, a common and potentially life-threatening complication of chimeric antigen receptor T-cell therapy. Two large 2021 clinical trials reported that tocilizumab is an effective treatment for patients admitted to hospital with COVID-19. In the Randomized, Embedded, Multifactorial Adaptive Platform Trial for Community-Acquired Pneumonia (REMAP-CAP), treatment using tocilizumab in patients who were critically ill reduced 21-day mortality (number needed to treat [NNT] = 12). In the Randomised Evaluation of COVID-19 Therapy (RECOVERY) trial (results not yet peer reviewed), treatment in patients who required oxygen therapy and had C-reactive protein levels of 75 mg/L or more reduced 28-day mortality (NNT = 27). Expert bodies have recommended that tocilizumab be added to the standard of care for COVID-19.

In COVID-19 clinical trials, tocilizumab was delivered intravenously, using weight-based dosing and a total dose that ranged from 400 to 800 mg for most adults. Typically, tocilizumab treatment is with a single dose, but a second dose may be administered between 12 and 24 hours later if the patient is not improving. In the RECOVERY trial, 29% of patients received more than 1 dose. A single 600-mg dose is estimated to cost $1371 in Canada.

How might COVID-19 affect demand for tocilizumab?

To estimate eligibility for tocilizumab, we evaluated routinely collected data for adults over 18 years of age who were admitted to hospital with COVID-19 between Jan. 1 and June 30, 2020, at 6 hospitals in Toronto and Mississauga, Ontario, Canada (Box 1).
The RECOVERY trial included patients in hospital who required oxygen therapy and had a C-reactive protein level of 75 mg/L or more.10 The REMAP-CAP was more restrictive; it included patients who were critically ill and required cardiovascular organ support or high-flow oxygen therapy (defined as fraction of inspired oxygen > 0.40, noninvasive ventilation or invasive ventilation).1 We estimated eligibility for tocilizumab in our sample based on the number of patients who met the RECOVERY criteria or required ICU admission during the first 14 days of hospital admission, as per clinical guidance for use of the drug in Ontario.11

C-reactive protein levels in our sample were ordered at the discretion of treating physicians and not for all patients. We assumed that among patients requiring supplemental oxygen who did not have a C-reactive protein level measured, the proportion with a level 75 mg/L or more (an entry criterion for the RECOVERY trial) would be the same as in patients whose values were measured. To provide a lower and upper bound on the estimate for tocilizumab eligibility, we imputed all missing results for C-reactive protein as less than 75 mg/L and 75 mg/L or more, respectively.

We evaluated data for 820 hospital admissions (Table 1) and, based on RECOVERY inclusion criteria, estimated that 42.4% of hospital admissions for COVID-19 would be eligible for tocilizumab. After we imputed missing results for C-reactive protein levels, we determined a lower bound estimate of 262 (32.0%)...
and an upper bound estimate of 411 (50.1%). Eligibility varied across age groups. Based on the more restrictive REMAP-CAP inclusion criteria, we estimated that 32.7% of hospital admissions for COVID-19 would be eligible.

We also estimated eligibility for tocilizumab by extrapolating age-specific estimates in our study population to the reported age strata for hospital admissions for COVID-19 in the United States\textsuperscript{17} and Canada.\textsuperscript{18} According to these estimates, 42.9% of patients admitted to hospital with COVID-19 in Canada and 40.9% of those in the US would be eligible for tocilizumab (lower bound estimates 31.5% and 31.2%, and upper bound estimates 51.2% and 47.8%, respectively; Figure 1). This is comparable to an estimate that 49% of patients with COVID-19 who were admitted to hospital in the United Kingdom would have been eligible for tocilizumab.\textsuperscript{10}

If the third wave of the pandemic in Ontario is at least as severe as the second wave, about 7500 hospital admissions for COVID-19 might be expected. More than 3000 patients could be eligible for tocilizumab in Ontario alone. Variants of concern may result in even greater demand for the drug because the B.1.1.7 variant, which is the most prevalent in Ontario at present, is associated with a twofold greater risk of admission to the intensive care unit than the strain most prevalent earlier in the pandemic.\textsuperscript{19}

**What might be the absolute benefits of using tocilizumab to treat COVID-19?**

Based on the estimates in our sample, of every 1000 adults admitted to hospital for COVID-19, 429 would be eligible for tocilizumab; of these, 118 (27.5%) would be expected to die and 63 (14.8%) would receive invasive mechanical ventilation more than 12 hours after admission. In the RECOVERY trial, the relative risk reduction for mortality was 14% (95% confidence interval [CI] 4%–23%) and for invasive mechanical ventilation was 19% (95% CI 5%–32%).\textsuperscript{10} If we consider deaths and start of ventilation that occurred more than 12 hours after admission to be potentially preventable, because patients would be unlikely to receive tocilizumab early enough to prevent events before that, treatment with tocilizumab may prevent 17 (95% CI 5–27) deaths and 12 (95% CI 3–20) instances of invasive mechanical ventilation. The absolute benefits of tocilizumab could be greater than these estimates in patients with more severe disease associated with variants of concern.

| Age group, yr | Eligible, % |
|---------------|-------------|
| < 50          | 0%          |
| 50–59         | 20%         |
| 60–69         | 40%         |
| 70–79         | 60%         |
| > 79          | 80%         |

*Figure 1: Age-standardized eligibility for tocilizumab in Canada and the United States. Note: Age Std = overall estimate of age-standardized eligibility for tocilizumab among patients who were admitted to hospital with COVID-19. Age-stratified hospital admissions in Canada were reported by the Government of Canada, based on cases reported to the Public Health Agency of Canada to Feb. 18, 2021.\textsuperscript{18} Age-stratified hospital admissions in the United States were reported by the COVID-19-Associated Hospitalization Surveillance Network (COVID-NET)\textsuperscript{17} to Feb. 13, 2021, which represents about 10% of the US population. To provide a lower and upper bound on the tocilizumab eligibility estimate, we imputed all missing C-reactive protein level results as less than 75 and 75 mg/L or more, respectively.*
Does Canada have enough tocilizumab?

Tocilizumab is manufactured by Hoffman-La Roche, and supply is relatively scarce in Canada and around the world. The manufacturer reported sending 1400 doses to Canada in March and 1700 in April 2021 to treat COVID-19. Health Canada has declared a “Tier 3” shortage of tocilizumab, a designation reserved for shortages with the greatest potential impact on Canada’s health care system. An international survey conducted by the European Alliance of Associations for Rheumatology in the first 4 months of the COVID-19 pandemic found that tocilizumab shortages were noted by 134 out of 980 respondents (14%), even before publication of definitive trials.

We are unaware of any real-time data regarding availability and use of medications across hospitals. To understand tocilizumab use and access, the Ontario COVID-19 Science Advisory Table surveyed pharmacy directors, clinical pharmacists, critical care physicians and general internal medicine physicians in 20 academic and community hospitals throughout Ontario during the week of Mar. 9–15, 2021. This sample was purposefully chosen to represent a range of small and large institutions across the province. It revealed that access to tocilizumab is limited and unevenly distributed. Two hospitals reported using more restrictive eligibility criteria than provincial clinical practice recommendations. Almost 30% of centres reported needing access to additional tocilizumab. During the week of this survey, 15 patients did not receive treatment with tocilizumab because of concerns about inadequate supply or restrictive institutional policies.

How can health systems provide equitable access to drugs that are in relative shortage?

To provide an ethical framework for drug allocation during the pandemic, the Ontario COVID-19 Bioethics Table adapted the existing provincial framework for resource allocation during drug shortages. This approach is consistent with international frameworks, is based on 7 guiding ethical principles (beneficence, equity, reciprocity, solidarity, stewardship, trust and utility) and outlines 3 stages for resource allocation across the health system. Stage 1 involves serving as many people as possible by conserving and sharing supply, and increasing procurement and access. Stage 2 involves directing supply to those most likely to benefit based on existing evidence, which is the primary allocation principle. If Stage 1 and 2 efforts are insufficient to meet demand, Stage 3 involves using a fair procedure to choose between patients, which is the secondary allocation principle.

We have shown that tocilizumab is in short supply and demand for the drug may increase. There is a risk of suboptimal and inequitable distribution of this scarce resource if a dedicated systemwide procurement and allocation effort is not made. The 3 stages

| Stage 1: Maximize supply and sharing to maintain the standard of care |
|---|
| • Create and maintain a transparent inventory of tocilizumab supply. |
| • Monitor and transparently report use of tocilizumab in near real time. |
| • Centralize procurement and allocation of tocilizumab. |
| Supply sufficient? |
| Yes, maintain Stage 1 |
| No, continue to Stage 2 |

| Stage 2: Allocate treatments to maximize therapeutic benefits |
|---|
| • Ensure tocilizumab is used only for patient populations shown to benefit in clinical trials. We are unaware of any evidence to support triage of tocilizumab treatment to more specific subgroups. |
| • Modify protocols from randomized controlled trials to maximize supply. For example, allow only a single dose of tocilizumab. |
| • Consider treatment with sarilumab if tocilizumab is unavailable. |
| Supply sufficient? |
| Yes, maintain Stage 2 |
| No, continue to Stage 3 |

| Stage 3: Ensure fair access to drugs in short supply |
|---|
| • Implement a fair allocation procedure, such as a centralized allocation lottery. |
| • A weighted lottery could be considered, to give preference to factors that help mitigate inequities and disparities. |

Figure 2: A proposed 3-stage framework for managing tocilizumab shortage in Canada.
could be put into operation within health systems to manage tocilizumab supply (Figure 2). Stage 1 would include policies to create and maintain a reliable and transparent inventory of available supply of tocilizumab across the system, and monitor tocilizumab use on a near real-time dashboard. Procurement and allocation of tocilizumab would be centralized at the provincial level to maximize supply and sharing, and to avoid hoarding. Stage 2 would include ensuring treatment using tocilizumab is delivered consistently across all hospitals in accordance with evidence-based provincial recommendations, which generally would align with the inclusion criteria for the RECOVERY or REMAP-CAP trials. Beyond trial inclusion and exclusion criteria, we are unaware of any current evidence about whether certain subgroups of patients derive greater benefit from tocilizumab than others.

Sarilumab, another IL-6-receptor antagonist, was included in the REMAP-CAP trial, and may represent another treatment option for COVID-19. However, because sarilumab has been studied in fewer patients, its effect on mortality remains uncertain. Sarilumab supply is also limited. It is licensed and distributed in Canada as a subcutaneous injection, whereas trials studied intravenous delivery. It would be unlikely to completely address the unmet need for tocilizumab. Substituting therapy with sarilumab could be considered as a Stage 2 measure in the setting of a tocilizumab shortage.

If there is insufficient supply to meet all need and no other evidence-based ways to choose between recipients, Stage 3 may require other measures for fair distribution. For example, a centralized allocation lottery could be used. Lotteries may be preferred to nonrandom approaches, such as “first-come, first-served,” which may perpetuate inequities by disadvantaging people who seek care later because of existing systemic or structural barriers. Lotteries can also be weighted to align allocation decisions with different priorities (e.g., to reduce disparities). For example, Pennsylvania endorsed a policy that would use a weighted lottery for scarce hospital medications to prioritize essential workers and people from disadvantaged areas. The Ontario COVID-19 Science Advisory Table has also recommended that in Stage 3, “because of the absolute scarcity, it is defensible not to offer tocilizumab to COVID-19 patients who almost certainly will not benefit. This should be based on consensus among those involved in assessing eligibility for tocilizumab allocation.”

The potential for tocilizumab shortages has been recognized globally. The UK National Health Service (NHS) recommended that tocilizumab be considered for patients who meet criteria similar to those for the RECOVERY or REMAP-CAP trials. Provider organizations are required to register all patients receiving tocilizumab to treat COVID-19 and maintain records to show compliance with guidelines for clinical use.

Provider organizations have also been asked to regularly update regional procurement leads and chief pharmacists about tocilizumab supply. Patients may only receive a single dose of tocilizumab and if tocilizumab is not available, treatment with sarilumab is recommended. The NHS policies to monitor supply and use of tocilizumab and maximize therapeutic benefit align well with our proposed framework.

Conclusion

Drug shortages during a pandemic may result from sudden increases in demand or disruptions in supply chains. Health systems can rapidly respond to shortages of essential medications by estimating the clinical demand, assessing drug supply and potential inequities in access, and enacting policies grounded in an ethical framework for drug allocation.

The COVID-19 pandemic has created a critical shortage of tocilizumab in Canada. About 40% of adults admitted to hospital with COVID-19 could be eligible to receive tocilizumab, and estimated demand from Ontario alone could outstrip the entire national supply. Determining who is most likely to benefit from tocilizumab is an urgent research priority, which may be achieved through detailed subgroup analyses and meta-analysis of existing trial evidence. If jurisdictions are unable to obtain sufficient supplies of tocilizumab, policies are needed to support evidence-based and equitable distribution. The lessons from responding to this drug shortage can inform other unexpected disruptions in drug supply and future pandemic preparedness.

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