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How many lives do COVID vaccines save? Evidence from Israel

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Background: Israel began a mass vaccination program with the rapid rollout of the Pfizer-BioNTech COVID-19 BNT162b2 vaccine for adults. At the same time, government stringency measures in terms of closing public life were decreased. Our objective was to estimate the total number of Covid-19 deaths avoided due to the massive vaccination campaign in the elderly Israeli population.

Methods: We examined the effect of vaccination on mortality when at least 90% of the population over age 70 were vaccinated for less than seven months. Projected deaths as expected from vaccine efficacy and actual mortality data were compared for the study population to account for potential confounding effects of government stringency. The average Oxford Stringency Index was calculated in the study period and the preceding period of the pandemic. Potential confounding effects of an age shift in the distribution of deaths were examined by analyzing the distributions before and after the study period.

Results: Confirmed deaths from COVID-19 in the population over 70 after mass vaccination were recorded as 370, versus 5,120 estimated without vaccinations.

Conclusions: Vaccines against COVID-19 saved more lives than expected by simply applying individual vaccine efficacy to the vaccinated population in Israel, despite a loosening of government stringency. Our findings support the worldwide efforts of governments to improve vaccination rates, especially in the elderly population.

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The study period for primary outcome

We examined deaths during the period when at least 90% of the most vulnerable population age group, the population over 70, was vaccinated. Deaths were tallied per age group until the Delta variant began to cause a new wave of infections. Thus, we computed deaths by summing them in the 104 days from March 15, 2021, until June 26 (inclusive).

Modeling the effect of vaccinations on mortality

The expected and confirmed deaths in the population by age group were derived from tabular data provided by the Israel Ministry of Health for 10 year cohorts. The effectiveness of vaccinations was estimated by published data on the Israeli population. Projected deaths with vaccination were derived by applying the reported deaths for vaccinated participants per person-days from the study to the vaccinated group's person-days from March 14, 2021, until June 26, 2021.

In order to account for slight changes in the percentage of each group vaccinated during this period, sums were made on a weekly basis. Projected deaths without any vaccination campaign were derived by applying the recorded deaths per unvaccinated person-days in the study over the number of person-days to all relevant populations. The confirmed deaths and projected deaths with and without vaccination in the population over 70 are reported.

Computational methods and availability

To evaluate the potential Covid-19 deaths saved, potential death counts by statistical regression to polynomial functions were created through curve fitting. The detailed datasets and curve-fitting algorithms were published in a designated Zenodo notebook. The assumptions and modeling process explicitly used for this research are detailed in the Github created for this purpose. All calculations were made in Python 3.8 and are available as coded in Jupyter notebooks on the laboratory Github.

Measurement of the government stringency policy

The Israeli contingency measures were quantified by The Oxford Covid-19 Government Response Tracker (OxCGRT). The OxCGRT collects systematic information on policy measures that governments have taken to cope with COVID-19. The different policy responses have been tracked since early 2020, cover more than 180 countries, and are coded into 23 indicators, such as school closures, travel restrictions, and since 2021, vaccination policy. A national lockdown is defined by an Oxford Stringency Index (OSI) that exceeds 80%.

Secondary outcomes

To minimize potential confounding effects, case and death distributions were compared in the study period with case and death distributions before the study period for the primary outcome. These effects may include age, sex, population sector, socioeconomic status, and additional clinical risk factors for death due to Covid-19 such as diabetes mellitus, chronic obstructive pulmonary disease, asthma, chronic kidney failure, hypertension, ischemic heart disease, chronic heart failure, obesity, lung cancer, stroke and smoking. As death rates in specific groups might be confounded by changing government policy, we derived and compared average government stringency as quantified by OSI for the study period for the primary outcome and the period before the study period for the primary outcome. We also calculated the days in total lockdown, defined by an OSI of 80, during and before the study period.

RESULTS

Primary outcomes

Recorded deaths from COVID-19 between March 14 and June 26, 2021, in the population over 70 years old were 370. There were 930 COVID-19 deaths in the total population (all ages) in this period. Given the vaccination rate, the estimated number of deaths in the Israeli population over 70 based on individual vaccine efficacy was 408. Without any vaccines, all other things being equal, including the lowered government stringency, the expected number of deaths in the period would have been 5,120.

Secondary outcomes

The confirmed number of cases in the population over 70 during the study period was 1,119. The death and case distributions were essentially unchanged in their trends before and during the study period. The two distributions for deaths by age before and after the vaccination campaign were 94.08% similar after normalization based on mean squared error. The two distributions for cases were 98.65% similar after normalization based on mean squared error. The skew and kurtosis of cases before and after the study period was very similar. Before and during the study period, the skewness of cases was positive, with more cases in the young. The kurtosis of cases was 7.03 before the study period and 8.38 afterward. The kurtosis of the distribution of deaths before the study period was 6.27, and during the study period was negative 0.28, but the trend towards more deaths increasing with age was maintained.

These distributions of deaths and cases are displayed below in Figure 1:

The OSI before and during the study period was different. Before the study period, Israel's OSI averaged 61, a maximum of 94, and 128 per 438 days over 80 (during national lockdowns). However, the OSI during the study period was much lower -- averaging 50 and a maximum of 60, and 0 days over 80 (no lockdowns).

DISCUSSION

Summary of results

After vaccines were introduced and had significant uptake, government stringency was lower than in previous periods. Once a level of 90% vaccination was reached in the older population, the distribution of cases and deaths was similar across age groups as before, but fewer than expected deaths were seen even as government stringency fell. These results raise the possibility of a pseudo-herd immunity type effect.

Limitations

Our study was limited in that it focused on the population of individuals over 70 years old. The number of deaths in this age group was 61% of total deaths before mass vaccination of the older population, ie, before the study period. During the study period, the percentage of deaths in this group was 40%.

The study period after vaccinations was limited due to uncertainties related to the Delta variant and the temporal period of vaccine efficacy in individuals. Therefore, we limited the study period to the end of June before the Delta variant created new patterns of rising cases. Thus, the precise results relate to conditions in which the Alpha variant was predominant, and the vaccine efficacy was presumed to be high. Many questions about the effects of vaccination on the Delta variant remain unanswered with real-world data as it is presented in clear how much of the rise in deaths may be due to vaccines wearing off.
Calculating the precise number of saved lives by any vaccine is challenging. The counterfactual number of deaths if the public had never been vaccinated depends upon many variables that change because of the patient’s vaccine uptake. For example, we might assume that due to the high uptake of the COVID-19 vaccine in Israel, the government became less strict in terms of closures, but how strict exactly it might have been in the counterfactual world is a mystery and only one of many variables affecting transmissions and deaths. After a steep rise in deaths, we expect the government to become very strict and perhaps employ novel measures and increase surveillance to lower the deaths, so the estimate of deaths without any vaccinations may be overestimated.

Another reason deaths without vaccinations may be overestimated is statistical confounding related to the population’s characteristics that do not vaccinate despite freely available vaccinations and universal health coverage. This small percentage of the population may be generally non-compliant or specifically somehow different in compliance with measures against COVID-19 transmission, and therefore have a different death rate.

Despite the imprecision of our results regarding predicted deaths without vaccination, they were lower than predicted deaths from the results of simple curve-fitting to model the situation with no vaccines and no increasing government stringency, which implies they are within the range of plausibility.15

Our estimates may help examine whether vaccine efficacy on a population level after a mass vaccination campaign can be predicted from individual-level vaccine efficacy. Our lack of long-term experience with COVID-19 vaccines makes it unclear how much immunity against future variants they will provide over time. Initial evidence suggests a waning of vaccine efficacy over time.16 However, we cannot predict how many lives will be saved over many years as new, very varied variants may emerge.

Fig 1. Cases and deaths, before and during the study period.
**Strengths**

Our research demonstrates that there are empirically additional lives saved over that expected by vaccine efficacy with a strategy of targeting the adult population even when confounders of government stringency and case distribution in age groups are accounted for. We have demonstrated that the real-world effects of a vaccination campaign are not necessarily simply the sum of expected efficacy multiplied over a population, but instead, there is some synergistic effect similar to herd immunity.

**CONCLUSIONS**

Vaccination in Israel proved to be a better-than-expected tool against the COVID-19 virus’ early variants. There appear to be additional beneficial effects in terms of lives saved of a vaccination campaign in the elderly over what would be expected by applying expected efficacy. Our findings support the worldwide efforts of governments to improve vaccination rates, especially in the elderly population.

**References**

1. Rosen B, Waitzberg R. Israeli A. Israel’s rapid rollout of vaccinations for COVID-19. *Isr J Health Policy Res*. 2021;10:6.
2. Smith PG. Concepts of herd protection and immunity. *Procedia in Vaccinology*. 2010;2:34–39.
3. Haas JE, Angulo FJ, McLaughlin JM, et al. Impact and effectiveness of mRNA BNT162b2 vaccine against SARS-CoV-2 infections and COVID-19 cases, hospitalisations, and deaths following a nationwide vaccination campaign in Israel: an observational study using national surveillance data. *The Lancet*. 2021;397:1819–1829.
4. Abecassis A. Five priorities for universal COVID-19 vaccination. *The Lancet*. 2021;398:2285–2286.
5. Giubilini A, Savulescu JD, Wilkinson D. COVID-19 vaccine: vaccinate the young to protect the old? *J Law Biosci*. 2020;7:lsaa050.
6. Mattraj L, Eaton J, Leung T, Brown ER. Vaccine optimization for COVID-19: who to vaccinate first? *Sci Adv*. 2021;7:1–11.
7. Rossman H, Meir T, Sommer J, et al. Hospital load and increased COVID-19 related mortality in Israel. *Hospital. Vols. Nat Commun*. 2021;12:1904.
8. Ages of the vaccinated (in Hebrew). Israel Ministry of Health csv file downloaded on 7/9/2021. Available at: https://data.gov.il/dataset/covid-19. Accessed January 14, 2022.
9. Moore CM. Israeli COVID-19 mortality predictions, without government action, by regressions and curve-fitting binder notebook: maxcorlabs/Corona_Cost_Effectiveness v0.1.0 (v0.1.0). s.l.: Zenodo, 2021, Vol.
10. Moore C, Arbel R. How many lives did COVID-19 vaccines save before July 2021 in Israel? s.l.: Maxcor labs on Github. Available at: https://github.com/maxcorlabs/Corona_Cost_Effectiveness/blob/master/vaccinations_life_savings_in_israel.ipynb. Accessed January 14, 2022.
11. Hale T, Angrist N, Goldszmidt R, et al. A global panel database of pandemic policies (Oxford COVID-19 Government Response Tracker). *Nat Hum Behav*. 2021;5:529–538.
12. Blavatnik School of Government. Coronavirus Government Response Tracker. 2020. Available at: https://www.bsg.ox.ac.uk/research/research-projects/coronavirus-government-response-tracker. Accessed November 28, 2020.
13. Arbel R, Hammerman A, Sergienko R, et al. BNT162b2 vaccine booster and mortality due to Covid-19. *N Engl J Med*. 2021;385:2413–2420.
14. Kwok KO, Lai F, Wei W, et al. Herd immunity - estimating the level required to halt the COVID-19 epidemics in affected countries. *J Infect*. 2020;80:e32–e33.
15. Moore CM. Curve-fitting COVID predictions: notebook for COVID-19 death derived numbers and equations: curve fitting version. s.l.: MedRxiv. Available at: https://hub.gioc2.mybinder.org/user/10.5281/zenodo.5571165-dcr76yc3/lab/tree/curve_fitting.ipynb. Accessed January 14, 2022.
16. Mizrahi B, Lotan R, Kalkstein N, et al. Correlation of SARS-CoV-2 Breakthrough Infections to Time-from-vaccine. s.l.: MedRxiv.