# 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



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# **Summary**

Background Following the emergency use authorisation of the Pfizer-BioNTech mRNA COVID-19 vaccine BNT162b2 (international non-proprietary name tozinameran) in Israel, the Ministry of Health (MoH) launched a campaign to immunise the 6·5 million residents of Israel aged 16 years and older. We estimated the real-world effectiveness of two doses of BNT162b2 against a range of SARS-CoV-2 outcomes and to evaluate the nationwide public-health impact following the widespread introduction of the vaccine.

Methods We used national surveillance data from the first 4 months of the nationwide vaccination campaign to ascertain incident cases of laboratory-confirmed SARS-CoV-2 infections and outcomes, as well as vaccine uptake in residents of Israel aged 16 years and older. Vaccine effectiveness against SARS-CoV-2 outcomes (asymptomatic infection, symptomatic infection, and COVID-19-related hospitalisation, severe or critical hospitalisation, and death) was calculated on the basis of incidence rates in fully vaccinated individuals (defined as those for whom 7 days had passed since receiving the second dose of vaccine) compared with rates in unvaccinated individuals (who had not received any doses of the vaccine), with use of a negative binomial regression model adjusted for age group (16–24, 25–34, 35–44, 45–54, 55–64, 65–74, 75–84, and ≥85 years), sex, and calendar week. The proportion of spike gene target failures on PCR test among a nationwide convenience-sample of SARS-CoV-2-positive specimens was used to estimate the prevelance of the B.1.1.7 variant.

Findings During the analysis period (Jan 24 to April 3, 2021), there were 232 268 SARS-CoV-2 infections, 7694 COVID-19 hospitalisations, 4481 severe or critical COVID-19 hospitalisations, and 1113 COVID-19 deaths in people aged 16 years or older. By April 3, 2021, 4714932 (72·1%) of 6538 911 people aged 16 years and older were fully vaccinated with two doses of BNT162b2. Adjusted estimates of vaccine effectiveness at 7 days or longer after the second dose were 95·3% (95% CI 94·9–95·7; incidence rate 91·5 per 100 000 person-days in unvaccinated vs 3·1 per 100 000 person-days in fully vaccinated individuals) against SARS-CoV-2 infection, 91·5% (90·7–92·2; 40·9 vs 1·8 per 100 000 person-days) against asymptomatic SARS-CoV-2 infection, 97·0% (96·7–97·2; 32·5 vs 0·8 per 100 000 person-days) against symptomatic COVID-19, 97·2% (96·8–97·5; 4·6 vs 0·3 per 100 000 person-days) against COVID-19-related hospitalisation, 97·5% (97·1–97·8; 2·7 vs 0·2 per 100 000 person-days) against severe or critical COVID-19-related hospitalisation, and 96·7% (96·0–97·3; 0·6 vs 0·1 per 100 000 person-days) against COVID-19-related death. In all age groups, as vaccine coverage increased, the incidence of SARS-CoV-2 outcomes declined. 8006 of 8472 samples tested showed a spike gene target failure, giving an estimated prevalence of the B.1.1.7 variant of 94·5% among SARS-CoV-2 infections.

Interpretation Two doses of BNT162b2 are highly effective across all age groups (≥16 years, including older adults aged ≥85 years) in preventing symptomatic and asymptomatic SARS-CoV-2 infections and COVID-19-related hospitalisations, severe disease, and death, including those caused by the B.1.1.7 SARS-CoV-2 variant. There were marked and sustained declines in SARS-CoV-2 incidence corresponding to increasing vaccine coverage. These findings suggest that COVID-19 vaccination can help to control the pandemic.

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# Introduction

As of April 3, 2021, the SARS-CoV-2 pandemic has resulted in more than 131 million cases and more than

2.8 million deaths worldwide, including 821748 cases and 6236 deaths in Israel (population 9.1 million). Among the SARS-CoV-2 strains characterised globally

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#### Research in context

### Evidence before this study

The Pfizer-BioNTech mRNA COVID-19 vaccine BNT162b2, administered as two doses 21 days apart, was authorised for emergency use in Israel in December, 2020, after it was shown to have high efficacy against symptomatic laboratoryconfirmed COVID-19 in a randomised controlled trial of individuals aged 16 years and older. Since the initiation of vaccine rollout, we have been closely monitoring the scientific literature (including preprint servers) and press coverage to identify reports of BNT162b2 vaccine effectiveness. Although observational studies have estimated the effectiveness of BNT162b2, precise nationwide effectiveness estimates of two doses of BNT162b2 against SARS-CoV-2 outcomes are lacking. More data are particularly needed regarding the vaccine's effectiveness against severe disease and deaths, and effectiveness in older adults. Finally, no country has yet described the nationwide public health impact of a national COVID-19 vaccination campaign.

#### Added value of this study

This analysis of nationwide surveillance data, done in a period when SARS-CoV-2 variant B.1.1.7 was the dominant strain, provides precise real-world estimates of the high

effectiveness of two doses of BNT162b2 against a range of SARS-CoV-2 outcomes, including symptomatic and asymptomatic infection and hospitalisation or death due to COVID-19. The median follow-up time of 7 weeks after the second dose for vaccinated individuals was longer than that in previous reports. Marked and sustained declines in the incidence of SARS-CoV-2 infections were observed in all age groups as the percentage of individuals vaccinated with two BNT162b2 doses began to rise, thereby showing, at a national level, the beneficial public health impact of a nationwide vaccination campaign.

#### Implications of all the available evidence

Vaccination with two doses of BNT162b2 has high efficacy and effectiveness against a range of SARS-CoV-2 outcomes, including among older adults (aged ≥85 years), offering hope that COVID-19 vaccination will eventually control the pandemic. These findings are of international importance as vaccination programmes ramp up across the rest of the world, suggesting that other countries can similarly achieve marked and sustained declines in SARS-CoV-2 incidence if they can achieve high vaccine uptake.

in 2020, the D614G variant was dominant.<sup>3</sup> More recently, the SARS-CoV-2 variant B.1.1.7, first identified in the UK and associated with increased transmissibility, has emerged in several countries.<sup>3</sup> B.1.1.7 was first reported in Israel on Dec 23, 2020.<sup>4</sup>

In a randomised controlled trial (RCT), two doses of the Pfizer–BioNTech mRNA COVID-19 vaccine BNT162b2 (international non-proprietary name tozinameran) had 95% efficacy against symptomatic laboratory-confirmed COVID-19 at least 7 days after the second dose in people aged 16 years or older with no evidence of existing or previous SARS-CoV-2 infection.<sup>5</sup> After emergency use authorisation of BNT162b2 in Israel on Dec 6, 2020, the Ministry of Health (MoH) launched a nationwide vaccination campaign to administer two doses of BNT162b2 to the 6·5 million people aged 16 years and older (71% of the population). On April 3, 2021, 61% of the population of Israel had received at least one dose of a COVID-19 vaccine, a proportion higher than that of any other country in the world.<sup>6</sup>

Preliminary estimates of the effectiveness of one dose of BNT162b2 have been reported from Denmark, Israel, 8.9 the UK, 10.11 and the USA, 12 and estimates for two doses of BNT162b2 have been described for a subset of the Israeli population enrolled in a health maintenance organisation. 13 However, no estimates of the effectiveness of two doses of BNT162b2 against a range of SARS-CoV-2 outcomes, including among older adults, have been reported. Furthermore, population-level estimates of the impact of a COVID-19

vaccine on the incidence of SARS-CoV-2 infections have not been reported.

In this study, we provide nationwide estimates of the effectiveness of two doses of BNT162b2 against a range of SARS-CoV-2 outcomes and to evaluate the nationwide public-health impact following the widespread introduction of the vaccine.

## Methods

## Study design and population

In this observational study, we analysed nationwide surveillance data from Jan 24 to April 3, 2021, to assess the effectiveness of the BNT162b2 vaccine against various SARS-CoV-2 outcomes. The study population consisted of residents of Israel (ie, the census population) aged 16 years and older. The start of the study period corresponded to 14 days after the first individuals received their second BNT162b2 dose.

Health care in Israel is universal, with government-funded participation in one of four nationwide medical insurance programmes that operate as health maintenance organisations: <sup>14</sup> Clalit (in which 54% of the population are enrolled), Maccabi (26%), Meuhedet (12%), and Leumit (8%). <sup>15</sup> All Israeli residents are assigned a unique identification number that enables data linkage in the national medical records database.

The Israel MoH planned, organised, and continues to lead the nationwide vaccination campaign, which began on Dec 20, 2020, and was initially targeted at people aged 65 years and older, health-care workers, and residents of

long-term care facilities. Vaccine availability was subsequently expanded, approximately weekly, to younger age cohorts in 5-year intervals. Until Feb 28, 2021, because of an insufficient vaccine supply, individuals with a previous diagnosis of laboratory-confirmed SARS-CoV-2 infection were instructed to not seek vaccination, unless they were a resident of a long-term care facility. However, an unknown number of previously diagnosed people received vaccine. Immunisations were given at around 400 vaccination sites. At these sites, information about the administered vaccine was entered into the patient's electronic health record and reported to the national database.

Surveillance of COVID-19 and vaccine uptake are part of the national pandemic response and are collected under Public Health Ordinance number 40. Only aggregate data, with no personal identifiers, were used in this analysis.

The analysis plan for this study was internally reviewed by senior management in the MoH Public Health Services and found to be compliant with all regulatory requirements including the MoH guidelines for human subject research. As no regulatory issues were identified, it was decided that a full ethical review was not necessary. The study followed the Strengthening the Reporting of Observational studies in Epidemiology guidelines. <sup>16</sup>

## Testing for SARS-CoV-2, including variant B.1.1.7

SARS-CoV-2 testing is free-of-charge and widely available in Israel. Testing is required for people returning from travel abroad, in close contact with an infected person, or with suggestive symptoms such as fever or acute respiratory illness. When seeking testing, individuals provide their identification number and a specimen is collected via nasal or nasopharyngeal swab. Specimens are tested, using national testing standards, at one of 48 clinical diagnostic laboratories with use of real-time PCR tests. B.1.1.7 prevalence was estimated on the basis of swabs tested at Leumit with the TaqPath COVID-19 test (Thermo Fisher Scientific, Pleasanton, CA, USA), which identifies spike gene target failure (SGTF) associated with gene mutations that cause deletions of amino acids 69 and 70 in the spike protein. Because these mutations are found in B.1.1.7, SGTF is used to estimate the prevalence of this variant.17,18

# Public health surveillance

MoH conducts surveillance for laboratory-confirmed SARS-CoV-2 infections, with mandatory daily reporting of PCR results by all diagnostic laboratories. An epidemiological investigation, including an interview about COVID-19 symptoms, is done for each SARS-CoV-2 infection, usually within 2 days of diagnosis. MoH also conducts surveillance of COVID-19-associated hospitalisations. Daily updates are received from all hospitals and linked to the national database using patients' identification numbers. Hospitalisations are classified as severe (if a patient has a resting respiratory rate of

>30 breaths per minute, oxygen saturation on room air of <94%, or a ratio of PaO<sub>2</sub> to FiO<sub>2</sub> of <300) or critical (in the event of mechanical ventilation, shock, or cardiac, hepatic, or renal failure). In accordance with national guidelines, health-care providers attributed any hospitalisations and deaths among individuals with laboratory-confirmed SARS-CoV-2 infection to COVID-19.<sup>2,19</sup>

#### **Outcomes**

Vaccine effectiveness estimates were assessed against six SARS-CoV-2 outcomes, comprising asymptomatic infections and five other hierarchical laboratory-confirmed outcomes: all SARS-CoV-2 infections (symptomatic and asymptomatic), symptomatic COVID-19 cases, and COVID-19-related hospitalisations, severe or critical hospitalisations (including those who died), and deaths. Asymptomatic infection was defined as a person with laboratory-confirmed SARS-CoV-2 infection who reported no fever and no respiratory symptoms during the symptom interview portion of the epidemiological investigation, and who was not subsequently hospitalised for or did not die from COVID-19.

#### Statistical analysis

Individuals were defined as unvaccinated if they had not received any doses of BNT162b2, and as fully vaccinated if at least 7 days had passed since receiving the second dose of BNT162b2. Incidence rates were calculated for unvaccinated and fully vaccinated individuals aged 16 years and older for each SARS-CoV-2 outcome after excluding people with previous laboratory-confirmed SARS-CoV-2 infection. Data were stratified by age group (16-24, 25-34, 35-44, 45-54, 55-64, 65-74, 75-84, and ≥85 years, based on 2020 census data), sex, and calendar week. In the primary analysis, cases were categorised as vaccinated if the date of laboratory confirmation of infection occurred at least 7 days after the second dose of BNT162b2. Cases were excluded from the analysis if they had received only one dose, or had received two doses of BNT162b2 and fewer than 7 days had passed since the second dose. Person-days for the fully vaccinated group were ascertained each day by multiplying the proportion of people who were fully vaccinated with two doses of BNT162b2 by the census estimates for each age stratum. Person-days for the unvaccinated group were determined each day by subtracting the number of person-days contributed by those who were vaccinated from the total census population for each age stratum; this process was repeated, summed, and aggregated for each day of the study period. Individuals with previous SARS-CoV-2 infection were excluded from person-day estimates. Using STATA (version 15), a negative binomial regression model (nbreg command), which is better suited for over-dispersion of variance than the traditional Poisson regression method,20 was used to derive incidence rate ratios (IRRs) with 95% CIs for each outcome adjusted for age group, sex, and calendar week.

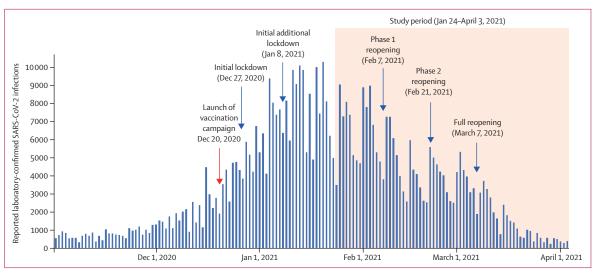


Figure 1: Daily laboratory-confirmed SARS-CoV-2 infections in Israel (Nov 1, 2020, to April 3, 2021)

	Population	Fully vaccinated*
Age-groups, years		
16-44	3646848	2290820(62.8%)
45-64	1764098	1408492 (79.8%)
≥65	1127965	1015620 (90.0%)
Sex†		
Female	3 3 3 7 6 9 3	2398547 (71.9%)
Male	3201218	2310788 (72-2%)
Sector		
Arab	1226788	669 542 (54-6%)
Ultra-Orthodox	534146	228 479 (42.8%)
General Jewish (non-ultra-Orthodox)	4777 977	3 816 911 (79.9%)
Calendar week in 2021		
Jan 17 to 23		248196
Jan 24 to 30		773 331
Jan 31 to Feb 6		767416
Feb 7 to 13		285 272
Feb 14 to 20		412 001
Feb 21 to 27		443 542
Feb 28 to March 6		408 882
March 7 to 13		391 983
March 14 to 20		415 510
March 21 to 27		382 569
March 28 to April 3		186230
Overall	6538911	4714932 (72.1%)

Data are n or n (%). \*Defined as people for whom at least 7 days had passed afte the second dose of BNT162b2 vaccine. †Sex was not recorded for 5597 fully vaccinated individuals.

Table 1: Numbers and proportions of people fully vaccinated with BNT162b2 in the Israel population aged 16 years and older (Jan 24 to April 3, 2021)

The exposure command was used to account for varying patient-days across strata.<sup>21</sup> Vaccine effectiveness estimates were calculated as (1–IRR)×100. In sensitivity

analyses, vaccine effectiveness estimates were also calculated with the same method for people who had received two BNT162b2 doses and for whom at least 14 days had passed after the second dose, as well as for those who had received one dose and for whom 14–21 days had passed after the first dose.

# Role of the funding source

The Israel MoH and Pfizer separately provided in-kind support to this study. No funding was exchanged between the Israel MoH and Pfizer. MoH and Pfizer were involved in the study design and writing of the report, and approved the decision to submit for publication.

## Results

The vaccination campaign was launched on Dec 20, 2020, around the time of a surge in SARS-CoV-2 infections in Israel that resulted in a nationwide lockdown on Dec 27, 2020 (figure 1). Additional lockdown restrictions were implemented on Jan 8, 2021. Daily SARS-CoV-2 infections increased in December, 2020, peaking at 10 213 on Jan 20, 2021. Phased reopening occurred on Feb 7 and Feb 21, 2021, and the lockdown was lifted on March 7, 2021.

From Jan 24 to April 3, 2021 (the study period), there were 232 268 SARS-CoV-2 infections. 213 919 (92·1%) of infected individuals were interviewed and 186 109 (87·1%) answered the questions about the presence or absence of symptoms. People aged 16 years or older accounted for 154 648 (66·6%) infections, among which 31548 (20·4%) were in the Arab sector, 24280 (15·7%) in the ultra-Orthodox sector, and 98 220 (63·9%) in the general Jewish (nonultra-Orthodox) sector. During the study period, 7694 COVID-19 hospitalisations, 4481 severe or critical COVID-19 hospitalisations, and 1113 COVID-19 deaths

	Unvaccinated		Fully vacc	inated*	Vaccine effectiveness	
	Cases	Incidence rate per 100 000 person- days†	Cases	Incidence rate per 100 000 person- days‡	Unadjusted	Adjusted§
SARS-CoV-2 infection	n¶					
Age 16-44 years	84611	95.1	1801	2.3	95·4% (94·0-96·5)	96.1% (95.7-96.5)
Age 45-64 years	19579	86-1	2264	3.4	93.6% (91.4-95.3)	94-9% (94-2-95-5)
Age ≥65 years	5686	67.7	2201	3.8	93.4% (91.3-95.0)	94.8% (93.9-95.5)
All ages	109 876	91.5	6266	3.1	94.2% (93.2-95.1)	95·3% (94·9-95·7)
Asymptomatic SARS-	CoV-2 infection					
Age 16-44 years	40 088	45.1	1174	1.5	92.8% (90.3-94.7)	93.6% (92.8-94.4)
Age 45-64 years	7414	32.6	1343	2.0	89-1% (84-7-92-3)	90.8% (89.6-91.9)
Age ≥65 years	1636	19.5	1115	1.9	85-9% (80-2-89-9)	88.5% (86.4-90.3)
All ages	49 138	40.9	3632	1.8	90.1% (88.0-91.8)	91.5% (90.7-92.2)
Symptomatic COVID-	19					
Age 16-44 years	28196	31.7	352	0.5	97.8% (97.0-98.3)	97.6% (97.3-97.8)
Age 45-64 years	7790	34-3	560	0.8	96.3% (95.0-97.3)	96.7% (96.3–97.0)
Age ≥65 years	3079	36.6	780	1.4	96.1% (94.8-97.1)	96.4% (95.9-97.0)
All ages	39 065	32.5	1692	0.8	96.6% (95.8-97.2)	97.0% (96.7-97.2)
COVID-19-related hos	spitalisation					
Age 16-44 years	2043	2.3	33	<0.1	98.1% (97.1-98.8)	98.1% (97.3-98.7)
Age 45-64 years	1687	7.4	112	0.2	97-6% (96-9-98-2)	97.6% (97.1-98.1)
Age ≥65 years	1826	21.7	451	0.8	96.6% (95.3-97.6)	96.8% (96.2-97.3)
All ages	5526	4.6	596	0.3	96.7% (95.5-97.6)	97-2% (96-8-97-5)
Severe or critical COV	ID-19-related ho	spitalisation				
Age 16-44 years	644	0.7	7	0.01	98-8% (97-3-99-5)	98-9% (97-6-99-5)
Age 45-64 years	1132	5.0	62	0.1	98.1% (97.2-98.6)	98.1% (97.5-98.5)
Age ≥65 years	1425	17.0	295	0.5	97.2% (95.9-98.1)	97.3% (96.8-97.8)
All ages	3201	2.7	364	0.2	97.2% (95.9-98.1)	97.5% (97.1-97.8)
COVID-19-related dea	ath					
Age 16-44 years	36	0.04	0	0.0	100	100
Age 45-64 years	125	0.5	14	<0.1	96-2% (92-6-98-0)	95.8% (92.6-97.6)
Age ≥65 years	554	6.6	124	0.2	96.8% (94.6-98.1)	96-9% (96-0-97-6)
All ages	715	0.6	138	0.1	96.6% (93.9-98.1)	96.7% (96.0-97.3)

Numbers and incidence rates of outcomes are shown for unvaccinated and fully vaccinated individuals. Vaccine effectiveness estimates are % (95% CI). \*Defined as people for whom at least 7 days had passed after the second dose of BNT162b2 vaccine. †Total person-days for all outcomes were 88 938 310 for age 16–44 years, 22 734 104 for age 45–64 years, 8 403 722 for age  $\geq$  65 years, and 120 076 136 for all ages.  $\pm$  10 tal person-days for all outcomes were 77 280 829 for age 16–44 years, 67 027 668 for age 45–64 years, 57 573 686 for age  $\geq$  65 years, and 201882183 for all ages.  $\pm$  5 Model is adjusted for age group (16–24, 25–34, 35–44, 45–54, 55–64, 65–74, 75–84, and  $\geq$ 85 years), sex, and calendar week.  $\pm$  11 Includes asymptomatic and symptomatic infections, as well as cases with positive SARS-CoV-2 tests for which the symptom interview portion of the epidemiological investigation was not completed.

Table 2: Estimated effectiveness of two doses of BNT162b2 (≥7 days after the second dose) against laboratory-confirmed SARS-CoV-2 outcomes by age group (Jan 24 to April 3, 2021)

occurred in people aged 16 years or older. 8472 (60%) of Leumit PCR tests used TaqPath during the study period, of which 8006 had an SGTF, giving an estimated prevalence of 94.5% for the B.1.1.7 variant.

As of April 3, 2021, BNT162b2 was the only COVID-19 vaccine available in Israel, and more than  $10 \cdot 0$  million doses were administered to more than  $5 \cdot 2$  million people. Overall, 4714932 ( $72 \cdot 1\%$ ) of 6538911 people aged 16 years or older and 1015620 ( $90 \cdot 0\%$ ) of 1127965 people aged 65 years or older were fully vaccinated with two doses (table 1). By sector, among those aged 16 years or older, 669542 ( $54 \cdot 6\%$ ) of 1226788 in the Arab population, 228479 ( $42 \cdot 8\%$ ) of 534146 in the ultra-Orthodox

population, and  $3816\,911$  ( $79\cdot9\%$ ) of  $4777\,977$  in the general Jewish population were fully vaccinated with two doses. Median follow-up for people who received two doses was 48 days (IQR 30-60).

Among 154648 SARS-CoV-2 infections in those aged 16 years and older, 109876 (71.0%) were unvaccinated and 6266 (4.1%) were fully vaccinated (with  $\geq$ 7 days after the second dose). Among 54677 people aged 16 years and older who had symptomatic COVID-19, 39065 (71.4%) were unvaccinated and 1692 (3.1%) received two doses (with  $\geq$ 7 days after the second dose). Among 7694 people aged 16 years and older who were hospitalised with COVID-19, 5526 (71.8%) were unvaccinated and

	Vaccine effectiveness*		
	Age	Age	Age
	≥65 years	≥75 years	≥85 years
SARS-CoV-2 infection†	94·8%	95·1%	94·1%
	(93·9-95·5)	(93·9–96·0)	(91·9–95·7)
Asymptomatic	88·5%	87·5%	83·2%
SARS-CoV-2 infection	(86·4-90·3)	(84·2-90·1)	(76·3-88·1)
Symptomatic COVID-19	96·4%	96·7%	96·6%
	(95·9–97·0)	(95·9–97·4)	(95·2–97·6)
COVID-19-related hospitalisation	96·8%	97·0%	96·9%
	(96·2-97·3)	(96·2–97·7)	(95·5 -97·9)
Severe or critical COVID-	97·3%	97·6%	97·4%
19-related hospitalisation	(96·8–97·8)	(96·8–98·1)	(95·9 –98·3)
COVID-19-related death	96·9%	97·1%	97·0%
	(96·0–97·6)	(96·0–97·9)	(94·9-98·3)

Estimates are % (95% CI). \*Model is adjusted for age group (16–24, 25–34, 35–44, 45–54, 55–64, 65–74, 75–84, and  $\ge$ 85 years), sex, and calendar week. †Includes asymptomatic and symptomatic infections, as well as cases with positive SARS-CoV-2 tests for which the symptom interview portion of the epidemiological investigation was not completed.

Table 3: Estimated effectiveness of two doses of BNT162b2 (≥7 days after the second dose) against laboratory-confirmed SARS-CoV-2 outcomes in the oldest age groups (Jan 24 to April 3, 2021)

596 (7·7%) received two doses with ≥7 days after the second dose. 4481 COVID-19-related severe or critical hospitalisations occurred in people aged 16 years and older, among which 3201 (71·4%) people were unvaccinated and 364 (8·1%) were fully vaccinated. Of the 1113 people aged 16 years and older who died from COVID-19, 715 (64·2%) were unvaccinated and 138 (12·4%) were fully vaccinated.

The incidence rate of SARS-CoV-2 infections among adults aged 16 years and older was 91.5 per 100 000 person-days in the unvaccinated group and 3.1 per 100000 person-days in the fully vaccinated group, with an estimated vaccine effectiveness (adjusted for age group, sex, and calendar week) against SARS-CoV-2 infection of 95.3% (95% CI 94.9-95.7%; table 2, appendix p 3). The adjusted estimates of vaccine effectiveness were 91.5% (90.7-92.2%) against asymptomatic SARS-CoV-2 infection, 97.0% (96.7-97.2%) against symptomatic COVID-19, 97.2% (95% CI 96.8-97.5%) against COVID-19 hospitalisation, 97.5% (97.1-97.8%) against severe or critical hospitalisation, and 96.7% (95% CI 96.0-97.3%) against death (table 2). Adjusted vaccine effectiveness estimates against all COVID-19 outcomes were higher than 96% among people aged 75 years and older and people aged 85 years and older (table 3). Vaccine effectiveness estimates adjusted for each day of the study period (rather than calendar week) yielded similar results (data not shown).

Adjusted vaccine effectiveness estimates against all SARS-CoV-2 outcomes were slightly higher at 14 days or longer after the second dose (table 4; appendix p 4) and somewhat lower at 14–21 days after the first dose

(appendix p 5) compared with those at 7 days or longer after the second dose. Vaccine effectiveness against deaths was estimated to be  $98\cdot1\%$  at 14 days or longer after the second dose and  $77\cdot0\cdot\%$  at 14–21 days after the first dose (in contrast to  $96\cdot7\%$  at 7 days or longer after the second dose).

Overall, as cumulative vaccination coverage increased, the 7-day daily moving average of incident cases of SARS-CoV-2 infection (per 100000 people) markedly declined across all age groups (figure 2). Notably, steeper and earlier declines were observed in older age groups, which had higher and earlier vaccine coverage. Specifically, although some declines in incident infections were evident around 2 weeks following the implementation of lockdown, sharper declines followed increased vaccine uptake. For example, steep reductions in incident cases of SARS-CoV-2 infections were observed for people aged 65 years and older starting in mid-January, 2021, but were not observed until 3-4 weeks later among people aged 16-24 years, when vaccine coverage for this age group began to increase. Similar marked declines in all age groups, corresponding to increasing vaccine coverage, were seen in the incidence of COVID-19 hospitalisations, severe or critical hospitalisations, and deaths (appendix pp 6-11). It is also noteworthy that the declines continued even after the two phases of reopening and the final lifting of the lockdown.

# Discussion

This nationwide observational study, with a median follow-up period of almost 7 weeks after receipt of the second vaccine dose, showed high effectiveness of two doses of BNT162b2, including among older adults, against SARS-CoV-2 infections and COVID-19 cases, hospitalisations, severe disease, and deaths. Corroborating the high effectiveness observed, marked declines in incident cases of SARS-CoV-2 infection were observed as vaccine coverage increased. Although populationlevel vaccine effectiveness data are ecological, and teasing apart the impact of a vaccination programme from the impact of non-pharmaceutical interventions (including a nationwide lockdown) is complex, it is noteworthy that declines in incident cases of SARS-CoV-2 for each age group corresponded with achieving high vaccine coverage in that age group rather than initiation of the nationwide lockdown. These findings suggest that the primary driver of reductions in the incidence of SARS-CoV-2 infections was high vaccine coverage, not implementation of the lockdown. Furthermore, even after reopenings occurred, SARS-CoV-2 incidence remained low, suggesting that high vaccine coverage might provide a sustainable path towards resuming normal activity. These data provide nationwide evidence of the beneficial public health impact of a COVID-19 vaccination campaign.

During the study period, 95% of 8472 tested specimens showed an SGTF, associated with SARS-CoV-2

See Online for appendix

	Unvaccinated		Fully vaccin	ated*	Vaccine effectiveness	
	Number of cases	Incidence rate per 100 000 person- days†	Number of cases	Incidence rate per 100 000 person- days‡	Unadjusted	Adjusted§
SARS-CoV-2 infection	on¶					
Age 16–44 years	84611	95-1	1066	1.7	97.2% (96.3–97.8)	97-1% (96-7-97-3)
Age 45-64 years	19579	86.1	1292	2.2	96.5% (95.6-97.2)	96.5% (96.3-96.7)
Age ≥65 years	5686	67-7	1284	2.5	96.1% (95.1-96.9)	95.9% (95.5-96.3)
All ages	109876	91.5	3642	2.1	96.6% (96.1-97.0)	96.5% (96.3-96.8)
Asymptomatic SAR	S-CoV-2 infection	n				
Age 16–44 years	40 088	45-1	666	1.1	95.8% (94.4-96.9)	95·2% (94·6–95·8)
Age 45-64 years	7414	32.6	729	1.3	94.3% (92.4-95.7)	94.0% (93.4-94.4)
Age ≥65 years	1636	19.5	633	1.2	91.7% (88.8-93.8)	91.5% (90.4-92.5)
All ages	49138	40-9	2028	1.2	94.4% (93.3-95.3)	93.8% (93.3-94.2)
Symptomatic COVI	D-19					
Age 16-44 years	28196	31.7	230	0.4	98.4% (97.7-98.8)	97.8% (97.5-98.1)
Age 45-64 years	7790	34.3	333	0.6	97-9% (97-2-98-4)	97.7% (97.4-97.9)
Age ≥65 years	3079	36.6	437	0.9	97-9% (97-3-98-4)	97.5% (97.2-97.8)
All ages	39 065	32.5	1000	0-6	98.0% (97.6-98.3)	97.7% (97.5-97.9)
COVID-19-related h	ospitalisation					
Age 16–44 years	2043	2.3	26	0.0	98.1% (97.0-98.8)	98·1% (97·1–98·7)
Age 45-64 years	1687	7-4	74	0.1	98.3% (97.6-98.7)	98-2% (97-7-98-6)
Age ≥65 years	1826	21.7	259	0.5	98.2% (97.6-98.7)	97-9% (97-6-98-1)
All ages	5556	4.6	359	0.2	98-2% (97-5-98-7)	98.0% (97.7-98.3)
Severe or critical CO	VID-19-related l	nospitalisation				
Age 16–44 years	644	0.7	5	0.01	98-9% (97-3-99-6)	99.0% (97.5-99.6)
Age 45-64 years	1132	5.0	41	0.1	98.6% (97.9-99.0)	98.5% (97.9-98.9)
Age ≥65 years	1425	17-0	160	0.3	98.7% (98.1-99.1)	98.3% (98.0-98.6)
All ages	3201	2.7	206	0.1	98-6% (98-0-99-0)	98.4% (98.1-98.6)
COVID-19-related d	leath					
Age 16–44 years	36	0.04	0	0	100	100
Age 45-64 years	125	0.5	10	<0.1	96-9% (93-5-98-5)	96.5% (93.2-98.2)
Age ≥65 years	554	6.6	61	0.1	98.7% (97.8-99.2)	98.2% (97.7-98.7)
All ages	715	0.6	71	<0.1	98.5% (97.4-99.2)	98.1% (97.6-98.5)

Numbers and incidence rates of outcomes are shown for unvaccinated and fully vaccinated individuals. Vaccine effectiveness estimates are % (95% CI). \*Defined as people for whom at least 14 days had passed after the second dose of BNT162b2 vaccine. †Total person-days for all outcomes were 88 938 310 for age 16-44 years, 22734 104 for age 45-64 years, 8 403722 for age  $\geq$ 65 years, and 120 076 136 for all ages. ‡Total person-days for all outcomes were 61397 072 for age 16-44 years, 57734 915 for age 45-64 years, 51302 672 for age  $\geq$ 65 years, and 170 434659 for all ages. \$Model is adjusted for age group (16-24, 25-34, 35-44, 45-54, 55-64, 65-74, 75-84, and  $\geq$ 85 years), sex, and calendar week. ¶Includes asymptomatic and symptomatic infections, as well as cases with positive SARS-CoV-2 tests for which the symptom interview portion of the epidemiological investigation was not completed.

Table 4: Estimated effectiveness of two doses of BNT162b2 (≥14 days after the second dose) against laboratory-confirmed SARS-CoV-2 outcomes by age group (Jan 24 to April 3, 2021)

variant B.1.1.7, thereby providing evidence that BNT162b2 is effective against B.1.1.7. These findings are consistent with laboratory studies that indicated that BNT162b2 was likely to be effective against B.1.1.7.<sup>22</sup> Notably, another clinically important variant, B.1.351, which was initially identified in South Africa, has recently been identified in Israel.<sup>23</sup> Vaccine effectiveness against B.1.351, however, could not be estimated in our study because of the small number of B.1.351 infections identified in Israel during the study period.

This study also suggests that two doses of BNT162b2 are effective against asymptomatic SARS-CoV-2 infections

(with vaccine effectiveness estimates of 92% at ≥7 days after the second dose and 94% at ≥14 after the second dose). Estimates of effectiveness against asymptomatic infections were slightly lower than those against COVID-19, which could suggest a higher threshold of protection for asymptomatic infection compared with symptomatic illness. We conservatively defined asymptomatic infections as SARS-CoV-2 infections in interviewees who reported no fever and no respiratory symptoms at the time of the interview. Additionally, it is possible that some SARS-CoV-2-infected individuals who reported being asymptomatic at the time of interview might have instead been presymptomatic (ie, developed

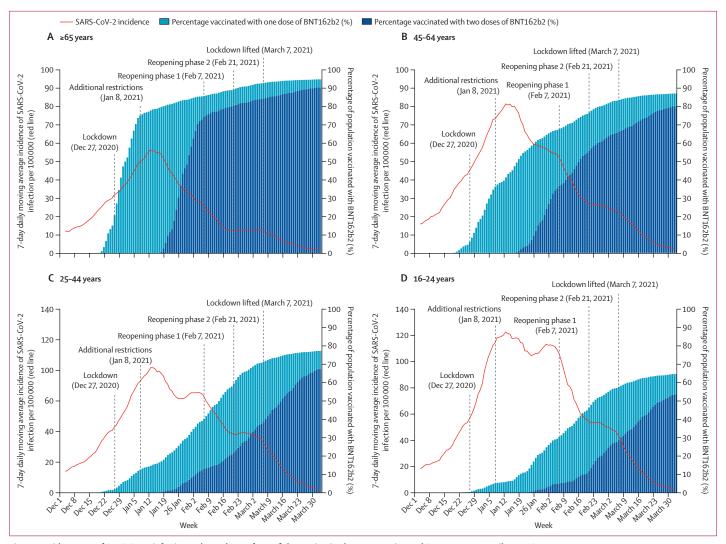


Figure 2: Incident cases of SARS-CoV-2 infection and prevalence of BNT162b2 vaccination by age group in Israel (Dec 1, 2020, to April 3, 2021)
Graphs show the 7-day daily moving average of laboratory-confirmed SARS-CoV-2 infections and the percentage of the population who had received one and two doses of the vaccine at each time point in people aged 65 years and older (A), 45–64 years (B), 25–44 years (C), and 16–24 years (D). Note that y-axis scales showing infection incidence differ between age groups.

symptoms later). Although we made efforts to avoid this type of misclassification by excluding the small number of people who were initially reported to be asymptomatic but were later hospitalised for or died from COVID-19, some presymptomatic individuals who later developed symptoms without being hospitalised or dying might still have been included. This type of misclassification, however, was probably uncommon and would be unlikely to substantially influence the vaccine effectiveness estimate against asymptomatic infection.

Notably, Israel's SARS-CoV-2 testing policy was different for unvaccinated and vaccinated individuals during the study period. At 7 days after the second dose, vaccinated individuals were exempt from the SARS-CoV-2 testing required of individuals who either had contact with a laboratory-confirmed case or returned from travel abroad. This testing policy might have

resulted in a differential bias that would cause overestimation of vaccine effectiveness against asymptomatic infection (ie, asymptomatic people who received two doses were less likely to be tested than unvaccinated asymptomatic people). However, 19% of the 4·4 million PCR tests conducted during the study period were done on exempted individuals (MoH, unpublished data). Additionally, symptomatic individuals might have been reluctant to report symptoms for fear of being blamed for infecting other individuals, in which case asymptomatic vaccine effectiveness would also be overestimated. Conversely, individuals who were hesitant to receive a COVID-19 vaccine might also have been reluctant to seek SARS-CoV-2 testing, which would lead to underestimation of vaccine effectiveness against asymptomatic infection. Further studies are needed to confirm the magnitude of BNT162b2 protection against

asymptomatic infection that we observed. Specifically, studies are needed to evaluate testing behaviour of vaccinated and unvaccinated people and to determine the extent to which prevention of asymptomatic infection leads to interruption of transmission.

Two-dose BNT162b2 vaccine effectiveness estimates from this observational study align with the 95% efficacy against symptomatic SARS-CoV-2 infections shown in the pivotal RCT.5 Our study adds important new data about the effectiveness of BNT162b2 derived from outside of the RCT setting. We found high vaccine effectiveness against a wider range of SARS-CoV-2 outcomes (including severe COVID-19 and deaths) than were evaluated in the RCT, as well as high effectiveness in older adults with a level of precision not available in the RCT. In addition, although pregnant women and immunocompromised individuals were excluded from the RCT, these groups were recommended to receive BNT162b2 in Israel and an unknown number would, therefore, have been vaccinated. Finally, unlike the clinical trial, our study provides evidence that achieving high population-level coverage with BNT162b2 can lead to marked declines in the incidence of SARS-CoV-2 infections and COVID-19 outcomes.

In the primary analysis of the Israel MoH surveillance data, we evaluated the effectiveness of two doses of BNT162b2, given Israel's adherence to the authorised two-dose 21-day vaccine schedule. In the sensitivity analysis, we showed moderate effectiveness of the vaccine against all SARS-CoV-2 outcomes at 14-21 days after the first dose. This finding is similar to those of studies from Israel<sup>8,9</sup> early in the vaccine campaign and in the UK.<sup>10,11</sup> Estimated effectiveness against all outcomes at 14-21 days after the first dose was lower than that of two doses at 7 days or longer or at 14 days or longer after the second dose, demonstrating the importance of fully vaccinating adults. Furthermore, despite indications of at least partial effectiveness after one dose of BNT162b2, relying on protection against COVID-19 from a single dose might not be prudent; BNT162b2 was developed and evaluated in the RCT as a two-dose schedule,5 and substantially lower levels of neutralising antibodies were observed after one dose compared with after two doses.24 Additionally, little is known about the duration of protection of one dose and how it compares with the durability after two doses. It is possible that one dose will provide a shorter duration of protection than two doses, particularly in an environment where new SARS-CoV-2 variants continue to emerge.

Our study has some limitations. In the absence of randomisation, there could have been unmeasured differences between vaccinated and unvaccinated persons (eg, different test-seeking behaviours or levels of adherence to non-pharmaceutical interventions) which might have confounded our vaccine effectiveness estimates.<sup>25</sup> Although we adjusted our estimates for age, sex, and calendar week, the effect of additional covariates

such as location, comorbidities, race or ethnicity, socioeconomic status, and likelihood of seeking SARS-CoV-2 testing should be evaluated in future studies. Preliminary findings from a study in Israel, for example, indicate that neighbourhood might be an important confounder.9 Misclassification of exposures and outcomes in our study are potentially more common than in the RCT, although misclassification was probably limited by Israel's readily available SARS-CoV-2 testing and comprehensive surveillance system. Misclassification of vaccine history in our study was also unlikely because of comprehensive recording of vaccine administration in Israel. With nearly 7 weeks of follow-up after the second dose, our study has the longest follow-up reported so far, although longer-term data on effectiveness are needed. Another limitation is that the time from symptom onset to hospitalisation and death might have prevented identification of all hospitalisations and deaths during the study period. Such unidentified hospitalisations and deaths are unlikely, however, to be differential between the vaccinated and unvaccinated groups. Finally, given differences between countries in how vaccines are rolled out and in how the pandemic evolves, caution should be used in extrapolating our findings to other populations. Further real-world effectiveness studies of BNT162b2, and other COVID-19 vaccines, in other populations and settings are needed.

Israel provides a unique opportunity to observe the nationwide impact on SARS-CoV-2 transmission of a rapidly increasing percentage of the population with vaccine-derived immunity. SARS-CoV-2 transmission is likely to continue until the proportion of the population with immunity exceeds a herd immunity threshold,26 which has been estimated to be at least 60%,27 although the emergence of more transmissible SARS-CoV-2 variants could result in higher herd immunity thresholds. Achieving the SARS-CoV-2 herd immunity threshold might not be reached, however, without vaccinating some individuals younger than 16 years. In addition, the duration of immunity to SARS-CoV-2, either from infection or immunisation, is not known, and progress towards herd immunity in Israel could be disrupted by the emergence of new SARS-CoV-2 variants if those variants are less susceptible to the current vaccine-induced immune response and if they were to become broadly disseminated. Further studies are needed to monitor the population level of immunity, identify disruption of viral transmission, and detect and evaluate the effects of emerging SARS-CoV-2 variants.

This study showed that two doses of BNT162b2 were highly effective, including in older adults, against laboratory-confirmed SARS-CoV-2 infections and COVID-19 hospitalisations, severe disease, and deaths in a nationwide observational study where variant B.1.1.7 was the dominant strain. Marked nationwide declines in the incidence of SARS-CoV-2 infections and COVID-19

outcomes corresponded with increasing vaccine coverage, and these declines were sustained even after societal reopening. Finally, the high effectiveness against all SARS-CoV-2 infections and apparent effectiveness against infections that were asymptomatic at the time of epidemiological investigation suggest that BNT162b2 might reduce SARS-CoV-2 transmission. Taken together, these findings suggest that high vaccine uptake can meaningfully stem the pandemic and offers hope for eventual control of the SARS-CoV-2 outbreak as vaccination programmes ramp up across the rest of the world.

#### Contributors

EJH and SA-P conceived the study, conducted the analysis, and edited the final manuscript. EJH, FJA, JMM, and DLS wrote the first draft of the protocol. EJH, JMM, FK, and KP cleaned and analysed the data. All authors contributed to study design, drafting the protocol, and revising the manuscript for important intellectual content, were responsible for the decision to submit for publication, and approved the final submitted version of the manuscript. All authors had full access to the deidentified and aggregated data in the study. EJH, JMM, and FK accessed and verified the data underlying the study and take responsibility for the data.

#### Declaration of interests

FJA, JMM, FK, GM, KP, JS, DLS, and LJ hold stock and stock options in Pfizer. All other authors declare no competing interests.

#### Data sharing

The individual-level data used in this study are sensitive and cannot be publicly shared. Requests for data should be made to the Ministry of Health of Israel. Aggregated surveillance data are freely available online at https://data.gov.il/dataset/covid-19.

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