Supplementary Information for

COVID-19 vaccination in Sindh Province, Pakistan: a modelling study of health-impact and cost-effectiveness

A. Model Details



+ stratification by age, +birth / death turnover of population foi governed by mixing matrices, age-specific susceptibility

Figure A: Model diagram.

We used a previously published compartmental model (1–3) tailored to the population of Sindh using population data from WorldPop (4) and assumed baseline population contact rates from previously estimated national patterns for Pakistan (5).

The model compartments are an extended SEIRS+V (Susceptible, Exposed, Infectious with multiple sub-compartments, Recovered and Vaccinated, both returning to Susceptible) system with births, deaths, and age structure. We represent the Infectious state with two paths: some individuals remain subclinical, but still transmit, while other individuals undergo a pre-symptomatic state then a symptomatic state. We assume that the subclinical path is half as infectious as the symptomatic path. For all compartments other than Recovered and Vaccinated, we use event-time distributions derived from global observations (Main text Table 1). For Recovered and Vaccinated, we consider multiple characteristic protection durations, given the uncertainty in these durations. We do not assume specific reasons for returning to Susceptible; these could represent e.g. antibody waning, emergence of new variants, or some mixture of mechanisms. For the Recovered compartment, we assume perfect protection; we address the Vaccinated compartment protection along with the vaccination programme details in the "Vaccine Programme" section.

We assume that age groups have different susceptibility to infection and, upon infection, different probabilities of following the subclinical versus symptomatic paths. These parameters are from an analysis using data from six countries (1). For disease severity outcomes, we assume the same age-specific hospitalisation, ICU, and death risk as used in previous work (2).

We assumed that contact patterns changed over the course of the epidemic (with corresponding changes in the time-varying effective reproduction number, R_i), and estimated these changes using Google Community Mobility indicators (6) for Sindh and school closures as reflected in the Oxford Coronavirus Government Response Tracker (7). We represent contact matrices with four components, corresponding to contacts associated with home, work, school, and miscellaneous "other" settings. We assumed home contacts scale linearly with the Google Mobility indicator for residential visits, work contacts scale linearly with the indicator for workplace visits, and school contacts are zero when schools are closed but unchanged otherwise.

For "other" contacts, we aggregate several Google Mobility indicators (g_{groc} , grocery and pharmacy; g_{ret} , retail and recreation; g_{tra} , transit; g_{par} , parks), and then scale linearly with the following weighted aggregation: $0.3(g_{groc} + g_{ret} + g_{tra}) + 0.1g_{par}$. For all indicators, $g_* = 1$ corresponds to the average measured during the first two weeks of February 2020. We assume that $g_* = 1$ corresponds to the contact matrices estimated for Pakistan in (5), $g_* = 0$ corresponds to no contacts, and linear scaling for other values. See Fig A for a model diagram and Fig B for population demography and contact patterns.



Figure B: Demographics in the modelled population. Demography of Singh province, Pakistan.

B. Model fitting to COVID-19 cases and deaths in Sindh

For introduction date, we assume that 10 SARS-CoV-2 infections are seeded in Sindh province on day t_0 , adopting a uniform prior probability for t_0 over the first 120 days of 2020; this is meant to approximately capture when sustained community transmission of

SARS-CoV-2 began rather than represent a precise schedule of infection importations, since continued importation will eventually become negligible relative to exponentially growing local transmission. For transmission, we adopted a vague prior for the basic reproduction number, following a normal distribution centered on R_0 = 2.4 with standard deviation 1.2.

The ascertainment proportion for both cases and deaths is parameterised using a starting value (i.e., the ascertainment proportion on 1 January 2020), an end value (the ascertainment proportion on 6 September 2020), and two additional parameters that determine the shape of the ascertainment rate between these two points. We model time-varying ascertainment rates for both cases and deaths as

$$asc(t; t_{max}, a_0, a_1, s_0, s_1) = a_0 + (a_1 - a_0)(lo(s_0 + (t/t_{max})(s_1 - s_0)) - lo(s_0))/(lo(s_1) - lo(s_0))$$

where

lo(x) = (exp x)/(1 + exp x).

Above, $asc(t; t_{max}, a_0, a_1, s_0, s_1)$ is a logistic-shaped curve parameterized to be a smooth S-shaped function of *t* from 0 to t_{max} , which goes from a_0 at t = 0 to a_1 at $t = t_{max}$, with an inflection point at $t = -s_0 t_{max}/(-s_0 + s_1)$ if $s_0 < 0$ and $s_1 > 0$. As prior distributions for the parameters governing time-varying case and death ascertainment rates, we assume $a \begin{array}{c} cases \\ 0 \end{array}$, $a \begin{array}{c} deaths \\ 0 \end{array}$, $a \begin{array}{c} deaths \\ 0 \end{array}$, $log(a \begin{array}{c} cases \\ 1 \end{array}), log(a \begin{array}{c} cases \\ 1 \end{array}), log(a \begin{array}{c} deaths \\ 1 \end{array}), log(a \begin{array}{c} cases \\ 0 \end{array}), log(a \begin{array}{c} cases \\ 1 \end{array}), s \begin{array}{c} cases \\ 1 \end{array}), s \begin{array}{c} cases \\ 1 \end{array}$, $s \begin{array}{c} deaths \\ 1 \end{array}$, $s \begin{array}{c} cases \\$

We assume that observed cases and deaths follow a normal distribution centered on model-predicted reported cases and deaths with standard deviations $\sigma_{cases} \sim halfnormal(0, 50)$ and $\sigma_{deaths} \sim halfnormal(0, 5)$. It is more conventional to model epidemiological incidence data using a Poisson or negative binomial distribution, but we found that a normal distribution resulted in a better fit, possibly because it was less sensitive to noisy data. Specifically, the likelihood of the model fit was

$$L = \prod_{j} \phi(c_{j}|\mu = C(t_{j}) \operatorname{asc}(t_{j}; t_{max}, a \overset{cases}{0}, a \overset{cases}{1}, s \overset{cases}{0}, s \overset{cases}{1}), \sigma = \sigma_{cases})$$

$$\times \prod_{k} \phi(d_{k}|\mu = D(t_{k}) \operatorname{asc}(t_{k}; t_{max}, a \overset{deaths}{0}, a \overset{deaths}{1}, s \overset{deaths}{0}, s \overset{deaths}{1}), \sigma = \sigma_{deaths}), \sigma = \sigma_{dea$$

where $\phi(x|\mu, \sigma)$ is the normal probability density function, c_j is the observed number of reported cases on day t_j , $C(t_j)$ is the model-predicted number of true case onsets on day

 t_j , d_k is the observed number of reported deaths on day t_k , and $D(t_k)$ is the model-predicted number of true COVID-19 deaths on day t_k .



C. Alternative Fitting Assumptions

Figure C: Alternative Infection-Induced Protection Durations.

These panels show the various durations assumed for infection-induced immunity. As can be seen across all assumptions, they can produce comparable fits to the data up to September 2020, but as they extend into 2021, the different assumptions diverge in both timing and magnitude.

D. Additional Health Outcomes



Vaccine Protection Expected Duration — 1 yr — 2.5 yrs — 5 yrs — Life-long

Figure D: Trends in ICU admissions and person-days.

Similar to Fig 3 in the main text, we also project hospital admissions and occupancy, for both intensive / critical care (ICU, this figure) and general hospital care (Ward, Supplement Fig 5). The trends for hospitalisation are very similar to those in cases and deaths.



Vaccine Protection Expected Duration — 1 yr — 2.5 yrs — 5 yrs — Life-long

Figure E: Trends in General Ward Admissions and person-days.

E. Number of vaccine doses available

In Phase 1 of its vaccine allocation, COVAX aims to make available vaccine doses according to participating countries' populations. An initial tranche of vaccine doses to cover 3% of the population of these countries is intended to be made available, expanding to 20% by the end of Phase 1 (8).

A projected timeline over which the doses will be available has been provided by WHO SAGE for mathematical modellers (9). We used this timeline (excluding direct country procurement) in order to project the number of doses available in Sindh. Given that Sindh has a population of 48 million, out of a global population of 7.8 billion but with only 70% in countries participating in COVAX (10), we assumed that 0.88% of COVAX doses will be allocated to Sindh.

Vaccines were not available in 2020, so we ignored the first row. In addition, we pushed the start of vaccination by 3 months compared to the WHO SAGE timeline due to delays to the start of COVAX allocations and likely time it will take for the vaccines to reach Sindh.

Given the doses available, we assume these are distributed every day of a quarter. For two-dose courses, the daily doses available are therefore the total doses available, times 85% (for 15% wastage), divided by 182. This comes out to 4110 per day, which we pessimistically round to 4000 per day.

24 2020 IS Territoved because doses were not available at that time.						
Timeline (WHO SAGE)	Timeline (us)	Doses available (total)	Doses available (Sindh)			
Q4 2020	Q2 2021	100 million	880,000			
Q1 2021	Q2 2021	100 million	880,000			
Q2 2021	Q3 2021	400 million	3,500,000			
Q3 2021	Q4 2021	600 million	5,270,000			
Q4 2021	Q1 2022	800 million	7,030,000			

Table A. Timeline for COVAX dose availability.

Q4 2020 is removed because doses were not available at that time.

F. Costs of COVID-19 vaccine introduction

Vaccine and Immunisation Supplies

We assumed a procurement price of the vaccine of \$3 per dose (10), with an additional 10% added for freight costs. We also account for the costs of an AD syringe and safety box. We assumed 15% wastage for vaccines, in line with published data from immunisation campaigns, and 10% wastage for immunisation supplies (11).

Cold chain

Cold chain costs were divided between national level and service level. National level costs were obtained from (11). Costs were calculated by estimating the additional cold chain equipment needed at national, regional and district levels, including walk-in cold rooms, ice-lined refrigerators, solar direct drive refrigerators and freezers for ice pack preparations.

Pakistan was scheduled to undergo a national- and provincial-level expansion of vaccine cold storage facilities in 2017-18. Existing cold storage space was estimated by adding the required 2017 expansion volume to the available volume reported by the latest Effective Vaccine Management report (12). Additional cold chain costs at the service level were estimated by assuming a packed volume per dose equivalent to that of a comparable vaccine (4.8cm³ for 1-dose vials, as for tetanus toxoid vaccines). We estimated the volume of the COVID-19 vaccine relative to other vaccines in the immunisation programme in order to allocate a COVID-19 vaccine-specific proportion of equipment and electricity costs. Facility-level cold storage equipment prices were obtained from the UNICEF Supply Divisions price lists (13). We obtained electricity consumption data for each type of equipment from product information sheets. We multiplied the total number of kilowatt hours required by the price per kilowatt hours in Pakistan (14).

Human resources

We assumed two types of healthcare workers would perform vaccinations: nurses and vaccinators. Monthly salaries for both types were sourced from federal pay scales and a cost per minute of work was calculated (2.83 PKR for nurses and 2.20 for vaccinators). We assumed that one health care worker would require 20 minutes to carry out a vaccination and all other relevant processes per person vaccinated. In addition, we assumed the health care worker would require 7 additional minutes devoted to transport per person vaccinated. Time use data were obtained from cost estimates of the tetanus toxoid vaccine, estimated for the Disease Control Priorities project in Pakistan (15,16).

Transport

We divided transport costs between those required to get vaccines to the facility (facility-based), and those required at the facility level in order to deliver vaccines in campaigns (campaign-based). We obtained facility-based costs from UNICEF (11); they reviewed available costing studies in low- and middle-income countries, finding a median value of \$0.04, which accounts for storage and transport (including per diems related to these activities).

We estimated campaign-based costs by calculating fuel and vehicle maintenance costs per campaign trip. We estimated the size of health facility catchment areas at 66 km² by dividing the total number of health facilities in the country by the total area of the country. We calculated the radius of the catchment area ($A=\pi r^2$) to be 4.59km and assumed a daily trip of 2x radius. We assumed that campaigns would take place during all 261 working days per year across all health facilities in Sindh Province, estimated at 1931 (17). We assumed the fuel costs to be \$0.65 per litre, and a fuel efficiency of 15 km per litre (18). We assumed a cost of vehicle maintenance per km of \$0.09 obtained from WHO-CHOICE (19).

Social mobilisation

We obtained the costs of social mobilisation per dose from budgeting data for a poliovirus detection and interruption campaign in Pakistan in 2019. Data were obtained from the Polio Global Eradication Initiative (20).

Health system mark-up

We applied a 31% mark-up to our delivery costs (i.e. all above mentioned costs excluding vaccine and immunisation supplies) in order to account for the following indirect but related activities: planning and coordination, training, pharmacovigilance, vaccination certificates, personal protective equipment, hand hygiene, waste management and technical assistance. This mark-up was derived by obtaining the costs of these activities relative to all delivery costs from UNICEF (11).

G. Costs of COVID-19 clinical management

The main parameters used in the estimates of health resources and costing of COVID-19 response and case management are summarised below. A set of COVID-19 diagnosis and treatment interventions was identified following WHO guidance shown in Table B. A corresponding list of unit costs was thus generated, to be brought together with the epidemiological model for estimating financial resource needs. More on the costs of COVID-19 clinical management can be found in Torres-Rueda et al. 2020 (21).

Activity	Activity costs
Case finding, contact tracing and management: Contact tracing	Per person contacted
Case finding, contact tracing and management: Quarantine of contacts	Per person quarantined
Screening and diagnosis	Per person screened and tested
Case Management: Home-based care	Per person requiring home-based care
Case Management: Hospital-based (severe case)	Per day of hospitalisation (severe case)
Case Management: Hospital-based (critical case)	Per day of hospitalisation (critical case)
Case Management: Death	Per COVID-related death

For each of the activities mentioned above, we used ingredients-based costing to identify a series of inputs (e.g. junior-level government worker day). For each input we estimated a number of units (e.g. three days of work) and a price. The costs of each input were identified using a range of sources, according to availability of recent primary cost data and appropriateness of cost estimates to the COVID pattern of care. Quantities and prices are presented in Table C.

Inputs	Number of Units per Input	Price per Input (USD)	
Case finding, contact tracing and manag	ement: Contact tracing		
Working day (junior level govt)	0.1	13.07	
Contact tracing household visit	0.33	3.02	
Contact tracing phone call	0.67	0.34	
Unit Cost:		2.54	
Case finding, contact tracing and manag	ement: Quarantine of c	ontacts	
Working day (health care workers)	0.1	10.43	
Working day (junior level govt)	0.1	13.07	
Unit Cost:	2.35		
Screening and diagnosis			
Ambulance trip	0.0001	9.51	
Isolation pod/ diagnostic visit	2	0.49	
Outpatient visit oral history	1	0.47	
Outpatient visit physical exam	1	0.47	
Outpatient visit specimen collection	1	1.09	
COVID19 test (PCR)	1	23.98	
Unit Cost:		26.98	

Case Management: Home-based care					
Home-based care bed-day	5	0.61			
Community-based care via GP	2	4.71			
Unit Cost:		12.45			
Case Management: Hospital-based (seve	re case)				
Inpatient ward bed-day (severe)	1	31.54			
Diagnostics					
Pulse oximetry	0.125	0.00			
Chest X-ray	0.125	2.79			
Full blood count	0.125	2.29			
Blood urea and electrolyte test	0.125	2.53			
C-reactive protein test	0.125	0.32			
HIV test	0.125	3.87			
COVID19 test (PCR)	0	23.98			
Malaria test	0.125	0.19			
Haemoglobin test	0.125	2.29			
Unit Cost:		33.32			
Case Management: Hospital-based (critic	cal case)				
Inpatient ward bed-day (critical)	0.33	32.29			
ITU bed-day	0.67	101.99			
Additional resourcing per COVID-related complication					
Acute respiratory distress syndrome (ARDS)	0.47	22.46			
Acute kidney injury days	0.04	10.60			
Acute cardiac injury days	0.06	46.25			
Liver dysfunction days	0.06	89.32			
Pneumothorax days	0.01	6.77			
Hospital-acquired pneumonia days	0.05	18.85			
Bacteraemia days	0.01	32.55			
Urinary tract infection days	0.01	9.03			
Septic shock days	0.05	0.67			
Diagnostics					
Pulse oximetry	10	0.00			
Chest X-ray	10	2.79			
Full blood count	10	2.29			
Blood urea and electrolyte test	10	2.53			
C-reactive protein test	10	0.32			

Venous blood gas test	10	4.23		
HIV test	0.1	3.87		
COVID19 test (PCR)	0	23.98		
Malaria test	0.1	0.19		
Haemoglobin test	0.1	2.29		
Unit Cost:	221.18			
Case Management: Death				
Body Bag	1	64.52		
Unit Cost:	64.52			

Clinical Management

The number of days per patient in general ward and in ICU was set at 8 and 10 respectively, and was set to match the assumptions in the epidemiological model (22,23). Following expert clinician advice we assumed that one-third of critical patient bed days would be treated in the general ward and two-thirds in the ICU.

The likelihood of additional COVID-related complications (per day) were estimated using evidence on the clinical course of COVID from patients in Wuhan, China, as were assumptions on the duration of symptoms (24,25). We assumed PCR tests would be used to determine COVID-19 status. The number of other diagnostic tests per hospitalisation was carried out in consultation with expert clinicians in essential critical care.

Estimation of non bed-day costs

An ingredients-based approach was used to calculate most of the service costs and prices for Pakistan. The data used was collected as part of the Disease Control Priorities 3-Universal Health Coverage (DCP3-UHC) project (15). Staff-related costs were constructed using federal-level pay scales. For most outputs, the number of minutes of staff required per activity were estimated via expert opinion obtained from clinicians working in the Health Planning, System Strengthening & Information Analysis Unit (HPSIU) in the Ministry of National Health Services Regulations and Coordination of Pakistan. For outputs where this was unavailable, health economists agreed a plausible assumed value.

Drug regimens were costed using resource use data obtained through expert opinion (HPSIU) and a number of price sources. An assessment of strengths and weaknesses of different price sources was conducted and hierarchy of sources was established. The primary source of price data was the Sindh Health Department Procurement Price list. If a price was unavailable, the Federal Wholesale Price List for Generic Medicines was used as a second option. As a last resort, private sector market prices were used.

Costs of supplies and equipment were similarly constructed. Resource use was determined through expert opinion (HPSIU) and price source hierarchy established. The primary source was the Medical Emergency Resilience Fund 2019-2020, and a secondary source was private sector market prices.

For additional diagnostic and radiology costs were estimated using available literature and market prices. We assessed strengths and weaknesses of different price sources. For example, we used the 'Costing and Pricing of Services in Private Hospitals of Lahore: Summary Report' as our primary source as it contained a methodological appendix that suggested that an ingredients-based approach consistent with ours was followed. If some prices were unavailable we used user fees from the Pakistan Institute of Medical Sciences, procurement prices from the Medical Emergency Resilience Fund procurement prices and user fees from the Aga Khan University Hospital. Space costs were estimated using data from budget documents from the Federal government (Islamabad Capital Territory Health Infrastructure PC-1).

Estimation of bed-day costs

We took an ingredients approach to estimating the costs of general ward and ICU ward bed days, as these were major cost drivers in our cost model. We estimated the plausible number of nursing hours per bed day in an LMIC setting through consultation with members of the research team who have expertise in critical care in LMICs. In ICU the assumption of nurse to patient ratio would be 1:1; in the general ward the ratio would be 1:6 during the day time and 1:20 in the night.

To understand the full range of inputs required we obtained the underlying costing data set provided by the authors of a recent primary costing of hospital-based care (26). The paper reports the results of a detailed activity-based costing in a hospital in Karachi, disaggregated by phase of care. We used the cost data for the ward stay phase, removing any supplies or equipment specific to the surgery, to estimate the average generic costs of a bed-day (27).

We estimated the additional costs of ICU beds compared to standard hospital beds using an ingredients-based approach to cost the equipment and supplies not present in standard hospital wards. We used the procurement price of equipment and assumed depreciation over ten (ventilators and suction pumps) or five years (all other equipment). Supply costs included central and arterial lines, ventilator tubing, and sedatives.

COVID-19-specific costs: Personal protective equipment and hygiene

We calculated the costs of personal protective equipment (PPE) per health worker per day (Table D) and allocated a cost per PPE per minute to clinical staff. We also calculated costs of hygiene per bed day (Table E). We estimated the costs of PPE and hygiene supplies using a list of necessary supplies from a COVID-related budget from the Ministry of Health of Pakistan, which included local prices sourced by the Aga Kahn University. This was complemented for other countries using the WHO's Essential Supplies Forecasting Tool (ESFT) (28). We divided supplies into single-use and disposable. We determined plausible quantities and useful life for supplies following clinical guidelines and expert opinion.

Supply	Price (USD)	Useful life (days)	Quantity per day	Total per member of staff per day (USD)	Assumptions
PPE for					
General Ward					
Single Use					
Surgical Gowns	0.20	1	1	0.20	
Nitrile Gloves	0.05	1	10	0.45	
Latex Gloves	0.04	1	10	0.39	
Disposable Head	0.03	1	4	0.10	
Shoe Covers	0.02	1	4	0.06	
Surgical Masks	0.08	1	10	0.77	
Reusable					
Goggles	11.61	90	1.5	0.19	Assuming half a day for washing
Gum Boots	19.35	90	1.5	0.32	Assuming half a day for washing
Total:				2.50	
PPE for ICU					
Single Use					
N-95 Masks	0.84	1	4	3.35	
Disposable apron	0.20	1	1	0.20	
Nitrile Gloves	0.05	1	10	0.45	
Latex Gloves	0.04	1	10	0.39	
Disposable Head	0.03	1	4	0.10	
Shoe Covers	0.02	1	4	0.06	
Surgical Masks	0.08	1	10	0.77	
Reusable					
Face Shields	27.81	5	1.5	8.34	Assuming half a day for washing
Goggles	11.61	90	1.5	0.19	Assuming half a day for washing
Gum Boots	19.35	90	1.5	0.32	Assuming half a day for washing
Total:				14.19	

 Table D. PPE costs per general ward bed day and per ICU bed day

Supply	Price (USD)	Useful life (days)	Quantity per day	Total per ICU bed per day	Assumptions
				(USD)	
Single Use					
Hand Sanitizers	47.97	1	0.05	2.40	100ml use per day, price assumed to refer to bottle of 2000ml
Biohazard Bags	0.23	1	1	0.23	
Disposable bed sheets	1.94	1	1	1.94	
Disposable Tissue Boxes	0.65	1	1	0.65	1 box per day, price assumed to refer to 1 box
Disposable Tissue rolls	0.35	1	1	0.35	1 roll per day, price assumed to refer to 1 roll
Disinfectants (1L Dettol)	3.23	1	0.25	0.81	250ml used per day, price refers to bottle of 1000ml
Liquid Soaps (250ml Dettol bottles)	1.74	1	0.2	0.35	50ml used per day, price refers to bottle of 250ml
Ethanol (1L bottles)	16.13	1	0.1	1.61	100ml used per day, price refers to bottle of 1000ml
Liquid Bleach	2.58	1	0.25	0.65	250ml used per day, price assumed to refer to bottle of 1000ml
Reusable					
Waste Bins	15.03	90	1	0.17	
Mackintosh bed sheets	9.68	90	1	0.11	
Mops	2.58	90	1	0.03	
Dusters	0.32	90	1	0.00	
Total:				9.28	

Table E. Hygiene costs per general ward and ICU bed-day.

COVID-19- specific costs: Oxygen supplementation

Oxygen supplementation therapy is the main form of treatment for COVID 19. There are different methods of oxygen delivery which utilise different types of supplies, equipment and require different average levels of oxygen flow. We calculated costs for 6 types of oxygen delivery techniques and assumed a distribution across severe and critical patients according to members of our research team with clinical expertise in critical care in LMICs (Table F).

Oxygen therapy costs per bed-day were calculated by estimating the number of cylinders consumed in 24 hours at different flow rates, assumed to be 10L per minute in the general ward and 30L per minute in the ICU. Cylinder duration (hours) was estimated by dividing

pressure by the number of litres per minute, assuming a standard cylinder size of 4.6kg, filled at 1,900 psi pressure (29). Cost per cylinder was obtained from the online catalogue of a multinational commercial manufacturer that is active in Pakistan (30).

	"Real-world" scenario		
	Severe case	Critical case Acute respiratory distress syndrome (5% of COVID cases)	
	Severe pneumonia (15% of COVID cases)		
	General ward	General ward only	ICU
Supplemental oxygen management type			
% ventilator	0%	0%	50%
% CPAP	0%	0%	25%
% high-flow nasal cannula	0%	0%	25%
% non-rebreather mask	25%	100%	0%
% nasal cannula	50%	0%	0%
% high-concentration mask	25%	0%	0%
Total % Patients in pathway	100%	33%	67%

Table F. Pathways of oxygen management

Household costs of illness

We estimated household costs of illness and care-seeking for COVID-19 using previously published data on the household-incurred costs associated with symptoms of tuberculosis (persistent cough and fever). We used a model previously used to pool household cost data from different settings to adjust costs for COVID-19 duration and age distribution (31). Direct costs to households included out-of-pocket payments for both medical and non-medical goods and services (32–34); these cost estimates were adjusted from South Africa to reflect Pakistan prices using GDP deflators and exchange rates from the World Bank (35). We estimated the likelihood of lost income due to sickness or caregiving by age using age-specific labour participation rates from the International Labour Organization (36). We also include a household cost of death, including funeral costs, and a loss of one year of income where the patient was an income earner (37).

H. Disability Adjusted Life Year Estimates

Scenario:	Base	case	Additional c	omorbidities
Age band	No discounting 3% discounting		No discounting	3% discounting
0-4	57.51	25.66	48.07	22.33
5-9	53.95	25.00	45.40	21.92
10-14	49.19	23.64	41.20	20.65

Table G. Disability Life Years per COVID-19 death

15-19	44.40	22.06	36.95	19.17
20-24	40.19	20.85	33.24	18.02
25-29	36.20	19.68	29.73	16.90
30-34	32.25	18.37	26.25	15.65
35-39	28.43	16.98	22.91	14.32
40-44	24.81	15.57	19.75	12.99
45-49	21.29	14.03	16.71	11.54
50-54	17.92	12.37	13.81	10.00
55-59	14.75	10.65	11.13	8.42
60-64	11.88	8.93	8.74	6.88
65-69	9.43	7.35	6.74	5.49
70-74	7.53	6.11	5.25	4.45
75+	4.88	4.19	3.45	3.06

I. Impact of time-horizon on the Incremental Cost-Effectiveness Ratio (ICER)

The impact of vaccination on SARS-CoV-2 transmission dynamics will result in changes in the number of infections (also cases, hospitalisations and deaths) that may vary over time, and depend upon particular assumptions about vaccine and immunity characteristics. As a result, the estimated ICER can vary, and even oscillate up and down, as the analysis time-horizon is increased. To check the convergence of the ICER over the 10-year time-horizon of our main analysis we performed a sensitivity analysis using different different assumptions about costs, vaccine price, DALYs, vaccine campaign duration, and duration of natural immunity. The results are shown in supplementary figures 6 and 7.



Vaccine price — \$3 — \$6 — \$10 Cost perspective — Health system ····· Societal

Figure F: Sensitivity of ICER to time-horizon under different assumptions about vaccine price, costs, campaign duration and duration of natural immunity.

Results shown are for vaccination using a 2-dose regimen with 70% efficacy and 2.5y vaccine immunity duration, an initial vaccination rate of 4000 courses per day, and initial targeting of adults aged over 60 years old.



Figure G: Sensitivity of ICER to time-horizon under different assumptions about co-morbidities, discounting of DALYs, campaign duration and duration of natural immunity.

Results shown are for vaccination using a 2-dose regimen with 70% efficacy and 2.5y vaccine immunity duration, an initial vaccination rate of 4000 courses per day, and initial targeting of adults aged over 60 years old.

J. Consolidated Health Economic Evaluation Reporting Standards (CHEERS) checklist

Section/item	ltem No	Recommendation	Reported by section, paragraph number
Title and abstract			·
Title	1	Identify the study as an economic evaluation or use more specific terms such as "cost-effectiveness analysis", and describe the interventions compared.	See Main Text Title.
Abstract	2	Provide a structured summary of objectives, perspective, setting, methods (including study design and inputs), results (including base case and uncertainty analyses), and conclusions.	The headings were adapted to fit the journal house style, but contain all the recommended items (see Main Text Abstract): Objectives: Mentioned in Background. Perspective, setting, study design, inputs: Mentioned in Methods. Base case and uncertainty: Mentioned in Results. Conclusions: Mentioned in Interpretation.
Introduction		1	
Background and objectives	3	Provide an explicit statement of the broader context for the study.	The policy context is described in the Introduction (see Main Text Introduction, paragraphs 1-4).
		Present the study question and its relevance for health policy or practice decisions.	Presented in the Main Text Introduction, paragraph 4.
Methods			
Target population and subgroups	4	Describe characteristics of the base case population and subgroups analysed, including why they were chosen.	The two target population scenarios (15+ and then 65+ followed by 15+) and their justification are stated in the last paragraph of the Main Text Methods subsection "Vaccine Programme", paragraph 6.
Setting and location	5	State relevant aspects of the system(s) in which the decision(s) need(s) to be made.	The setting and the decision makers are stated in the last paragraph of the Main Text Introduction, paragraph 4.
Study perspective	6	Describe the perspective of the study and relate this to the costs being evaluated.	The cost perspective is described in Main Text Methods subsection "Costs", paragraph 1.

Comparators	7	Describe the interventions or strategies being compared and state why they were chosen.	A vaccine campaign of 1 or more years, either focused on 65+ individuals initially or broadly targeted from the beginning. Various vaccine performance scenarios are considered. Main Text Methods subsection "Vaccine programme", all paragraphs, as well as S1 Text Section E, all paragraphs. These were chosen to reflect planned COVAX facility distribution and available vaccine product performance.
Time horizon	8	State the time horizon(s) over which costs and consequences are being evaluated and say why appropriate.	Ten years. The time horizon is described in Main Text Methods subsection "Vaccine Programme", paragraph 5.
Discount rate	9	Report the choice of discount rate(s) used for costs and outcomes and say why appropriate.	The discount rate is described and justified in the Main Text Methods subsection "Costs", paragraph 1.
Choice of health outcomes	10	Describe what outcomes were used as the measure(s) of benefit in the evaluation and their relevance for the type of analysis performed.	Cases, deaths, Hospitalisation admissions and person-days, and DALYs averted; see Main Text Methods subsection "Health and economic outcomes".
Measurement of effectiveness	11a	Single study-based estimates: Describe fully the design features of the single effectiveness study and why the single study was a sufficient source of clinical effectiveness data.	NA
	11b	Synthesis-based estimates: Describe fully the methods used for identification of included studies and synthesis of clinical effectiveness data.	Vaccine efficacy and duration assumptions are stated and justified in the Main Text Methods subsection "Vaccine programme", paragraphs 3-4.
Measurement and valuation of preference based outcomes	12	If applicable, describe the population and methods used to elicit preferences for outcomes.	NA

Estimating resources and costs	13a	Single study-based economic evaluation: Describe approaches used to estimate resource use associated with the alternative interventions. Describe primary or secondary research methods for valuing each resource item in terms of its unit cost. Describe any adjustments made to approximate to opportunity costs.	NA
	13b	Model-based economic evaluation: Describe approaches and data sources used to estimate resource use associated with model health states. Describe primary or secondary research methods for valuing each resource item in terms of its unit cost. Describe any adjustments made to approximate to opportunity costs.	Resource use estimates, sources and valuation methods are summarised in the Main Text Methods subsection "Costs" and detailed S1 Text Sections F-G.
Currency, price date, and conversion	14	Report the dates of the estimated resource quantities and unit costs. Describe methods for adjusting estimated unit costs to the year of reported costs if necessary. Describe methods for converting costs into a common currency base and the exchange rate.	See Main Text Methods subsection "Costs", paragraph 1.
Choice of model	15	Describe and give reasons for the specific type of decision-analytical model used. Providing a figure to show model structure is strongly recommended.	These are described in the Main Text Methods subsection "Epidemiological model". The model structure is shown in S1 Text, Fig A.
Assumptions	16	Describe all structural or other assumptions underpinning the decision-analytical model.	These are described in the Main Text Methods subsections "Epidemiological model" and "Model fitting and projections", with parameterisation described in Main Text Table 1.

Analytical methods	17	Describe all analytical methods supporting the evaluation. This could include methods for dealing with skewed, missing, or censored data; extrapolation methods; methods for pooling data; approaches to validate or make adjustments (such as half cycle corrections) to a model; and methods for handling population heterogeneity and uncertainty.	These are described in the Main Text Methods subsections "Epidemiological model" and "Model fitting and projections", with parameterisation described in Main Text Table 1.
Results			
Study parameters	18	Report the values, ranges, references, and, if used, probability distributions for all parameters. Report reasons or sources for distributions used to represent uncertainty where appropriate. Providing a table to show the input values is strongly recommended.	This is shown in Main Text Table 1. Distributions are given for all epidemiological parameters. Economic parameters are varied in scenario analyses rather than sampled from distributions.
Incremental costs and outcomes	19	For each intervention, report mean values for the main categories of estimated costs and outcomes of interest, as well as mean differences between the comparator groups. If applicable, report incremental cost-effectiveness ratios.	Incremental costs and cost-effectiveness ratios are given in Main Text Table 2.
Characterising uncertainty	20a	Single study-based economic evaluation: Describe the effects of sampling uncertainty for the estimated incremental cost and incremental effectiveness parameters, together with the impact of methodological assumptions (such as discount rate, study perspective).	NA

	20b	Model-based economic evaluation: Describe the effects on the results of uncertainty for all input parameters, and uncertainty related to the structure of the model and assumptions.	The result of varying epidemiological parameters is shown in the uncertainty ranges in Main Text Figures 1-3. Other parameters are varied in scenario sensitivity analyses; the range of uncertainty is reflected in the scenarios in Main Text Figures 4-5 and Table 2.	
Characterising heterogeneity	21	If applicable, report differences in costs, outcomes, or cost-effectiveness that can be explained by variations between subgroups of patients with different baseline characteristics or other observed variability in effects that are not reducible by more information.	Not applicable; the model did not examine particular subgroups.	
Discussion				
Study findings, limitations, generalisability, and current knowledge	22	Summarise key study findings and describe how they support the conclusions reached. Discuss limitations and the generalisability of the findings and how the findings fit with current knowledge.	Key findings are summarised in the Main Text Discussion, paragraphs 1-6, and limitations in paragraphs 7-9.	
Other				
Source of funding	23	Describe how the study was funded and the role of the funder in the identification, design, conduct, and reporting of the analysis. Describe other non-monetary sources of support.	The source of funding for study authors are listed at the end of the manuscript. The funders of this study had no role in the study design, data collection, data analysis, data interpretation, or writing of the manuscript.	
Conflicts of interest	24	Describe any potential for conflict of interest of study contributors in accordance with journal policy. In the absence of a journal policy, we recommend authors comply with International Committee of Medical Journal Editors recommendations.	A declaration of interests statement is provided at the end of the text.	

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