

Transforming vaccine development

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Abstract

The urgency to develop vaccines against Covid-19 is putting pressure on the long and expensive development timelines which are normally required for development of lifesaving vaccines. There is a unique opportunity to take advantage of new technologies, smart and flexible design of clinical trials, and evolving regulatory science to speed up vaccine development against Covid-19 and transform vaccine development altogether.

Introduction

Vaccines have had a tremendous positive effect on public health and well-being. Today, the desperate need for vaccines to protect people from the pandemic caused by the 2019 novel coronavirus (SARS-CoV-2, cause of COVID-19 disease), is a strong reminder for the value of vaccines, and of the importance of being able to develop and scale-up their use in a timely manner. Indeed, vaccines can not only save lives but also prevent the impact of infectious diseases on the global economy that in the case of Covid-19 has already killed more than 250,000 people, caused the unemployment of 25 million people in the USA alone and a loss of several trillion dollars to the global economy.

In addition to the immediate need for Covid-19, vaccines have the potential to address many other pathogens such as respiratory syncytial virus, cytomegalovirus, human immunodeficiency virus (HIV), and pandemic and seasonal influenza, as well as other viral emerging infections such as Ebola, Nipah, Zika, dengue, Lassa, and Middle East Respiratory Syndrome. Vaccines also offer the potential to address the mounting threat of antimicrobial resistance by targeting tuberculosis, *Salmonella spp*, *Shigella spp*, *Staphylococcus aureus*, *Neisseria gonorrhoeae*, carbapenem-resistant Enterobacteriaceae, and other resistant bacteria that have been prioritized by the World Health

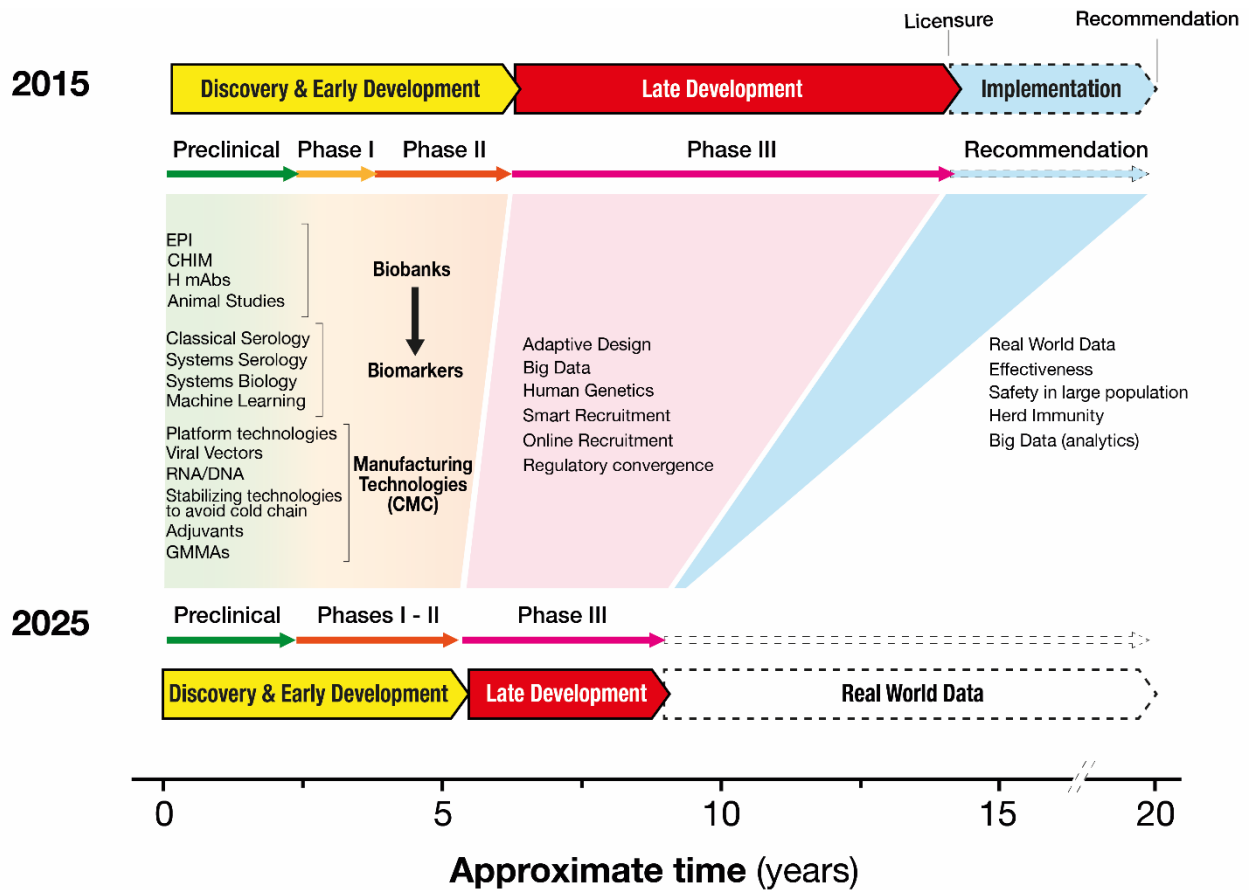
39 Organization (WHO); they can also target other bacteria, viruses, fungi, and parasites that are
40 frequently treated (whether appropriately or inappropriately) with antimicrobials, thereby promoting
41 resistance in colonizing pathogens. If all or many of these opportunities for vaccine development are
42 brought to fruition, the resulting impact on mortality, quality of life, and poverty could be
43 transformative (*1*).

44 Usually 15-20 years are required between the initial scientific discovery and vaccine licensure and
45 policy recommendation (Fig. 1). Indeed, the trend over the past 30 years, for national regulatory
46 agencies, policy-making bodies, and manufacturers has been to require a growing number of clinical
47 studies of increasing size and complexity before licensure and recommendation; more recently, yet
48 additional post-licensure studies have been required before broad recommendation of vaccine use. As
49 a result, promising vaccine candidates that have established clinical proof-of-concept and
50 demonstrated the potential for significant public health impact failed to reach people who needed
51 them in a timely manner, leaving many unnecessarily at risk for years. Even in the case of a Public
52 Health Emergency of International Concern (PHEIC), such as Ebola, it took 5 years, from 2014 to
53 2019, to get a licensed vaccine. The long timelines and the huge investments required discourage
54 vaccine manufacturers (and their actual and potential shareholders) from investing in innovation.

55 Today, the awareness that the Covid-19 pandemic will only be controlled when vaccines are made
56 broadly available for all people, is an incredible challenge to the classical vaccine development
57 timelines. Below we provide a list of possible opportunities that can be considered to fast track
58 development of vaccines for Covid-19, but also transform forever the way we develop vaccines.

59 **Discovery and early development.**

60 The first opportunity comes in the discovery and early development phases described in **Figure 1**.
61 Here a number of technological advances now make it possible to accelerate this dramatically. For
62 instance, the availability of the genomic sequence makes possible to generate synthetic genes and
63 nucleic acid vaccines (based on DNA or RNA) for laboratory testing in a week (*2*). In addition, the
64 availability of the atomic structure allows the structure-based design of optimized antigens within the
65 same timeframe (*3*). Optimized, synthetic genes can also be spliced into viral vectors (such as human
66 or chimpanzee Adenoviruses, Measles, Vesicular Stomatitis Virus, and others) to rapidly produce a
67 vaccine or used to engineer mammalian, insect or plant cells to produce recombinant proteins that
68 can be used alone or with adjuvants in a vaccine. All these acceleration opportunities that have been
69 used to fast track Covid-19 vaccines during the last few months and can also be used for other
70 vaccines. High-throughput analysis of genomes from bacteria, viruses, and parasites isolated
71 worldwide can provide early knowledge of the global epidemiology of diseases and the same time,
72 combined with structural biology, and human monoclonal antibodies, allow to identify protective
73 antigens and epitopes through a process known as “reverse vaccinology.”



74

75 **Figure 1.** Innovative scientific approaches to accelerate vaccine development, divided by discovery and early
 76 development (yellow), late development (red), and implementation (blue). Phase I, Phase II, and Phase III
 77 indicate Phase I clinical trials, Phase II clinical trials, and Phase III clinical trials, respectively. EPI =
 78 epidemiological studies; CHIM = controlled human infection model studies; H mAbs = human monoclonal
 79 antibodies; GMMAs = general modules for membrane antigens; CMC = chemistry and manufacturing controls.

80

81

82 The discovery and early development phase (containing preclinical, Phase I and Phase II in Figure 1)
 83 can also be used to address many of the questions that until today have been addressed later in
 84 development using large clinical studies. For instance, in the case of Covid-19 it is imperative to
 85 obtain biobanks of blood and possibly tissue samples collected from natural disease, from appropriate
 86 animal models and possibly from controlled human infection challenge models (CHIMs) to identify
 87 biomarkers that can support the regulatory decision-making processes. In the case of Covid-19 the
 88 most pressing need is to identify the virus neutralizing titer that confers protection. For Group B
 89 streptococcal infection, epidemiological studies analyzing the immune status of people who become
 90 ill compared with that of those who remained healthy in spite of being in the same environment
 91 revealed that high antibody levels in pregnant women correlated with protection from Group B
 92 *Streptococcus* disease in their newborns (4). CHIM studies, presently in discussion for Covid-19 (5),
 93 are being developed for an increasing number of diseases, and in the case of cholera, results from a
 94 CHIM provided pivotal data for vaccine licensure (6).

95 Biobanks of sera and cells from the types of studies mentioned above can also be used to perform
 96 traditional serology studies such as viral neutralization and bactericidal or opsonophagocytic activity

97 against bacteria. They can also be a source of materials for systems serology and systems biology,
98 which offer powerful new tools to generate hypotheses for the identification of new biomarkers.
99 Systems biology approaches, which use multi-omics data sets such as transcriptomics, metabolomics,
100 high dimensional flow cytometry to discover mechanisms and correlates of vaccine efficacy (7, 8),
101 including systems serology techniques to assess serological responses, have been used to find
102 correlates of protection and/or risks for the malaria RTS,S vaccine and for the HIV RV144 vaccine
103 candidate. Both correlates can be used as biomarkers to predict vaccine efficacy (19, 20). Systems
104 biology is also becoming increasingly important to predict safety and protection in vaccinated people
105 (9).

106 Finally, the recent innovation of high-throughput cloning of human B cells from convalescent or
107 vaccinated people provides an additional unprecedented means of both accelerating vaccine
108 development and developing therapeutic antibodies at the same time. For instance, the human
109 monoclonals recently recommended by the WHO for treatment of Ebola (10), which were developed
110 in less than five years, have also provided definitive evidence that antibodies alone can protect people
111 from disease and that the protective level of the antibodies can be used as a biomarker to license
112 future vaccines. Indeed, the clinical development of human monoclonals anticipates many of the
113 scientific questions such as correlates of protection that can inform clinical and regulatory questions
114 and endpoints that otherwise would need to be developed later for vaccine development (11). Human
115 monoclonal antibodies derived from memory B cells of Covid-19 convalescent people are being
116 developed (12), and are likely going to be among the first drugs to approach approval for Covid-19
117 therapy and prevention.

118 In addition, the overall vaccine development timeline can be accelerated by using vaccine
119 technologies that can be applied to manufacture different vaccines (platform technologies), so that
120 the technical, regulatory and manufacturing experience and capacity can be applied to new vaccines.
121 In the case of Covid-19, RNA and vector-based vaccines, already in clinical development for many
122 other targets, allowed developers to reach phase I clinical studies in record time of 65 days¹. In
123 addition, the long experience with safe and effective protein-based vaccines and adjuvants is likely
124 going to make it easier to develop vaccines based on the recombinant Covid-19 spike protein.
125 Another platform technology presently in development are General Modules for Membrane Antigens
126 (GMMAs) for bacterial vaccines (13).

127 **Late Development.**

128 The second opportunity comes in the design of clinical trials and late development (Fig. 1). The
129 classical pathway of doing Phase I clinical studies, followed by increasingly large Phase II and then
130 Phase III studies can be replaced by smart and flexible trials by implementing adaptive trial designs
131 where the information gained throughout a trial can be used to modify its design as the trial is being
132 executed. This approach, already successfully implemented for drug trials, requires that information
133 derived from biomarkers becomes available quickly during trial execution. Usually predictive
134 biomarkers are not routinely available in early vaccine development, however today we should be
135 able to identify them and make the information available in real time, by modifying the design of the
136 trials and using new technologies, especially systems serology and systems biology, supported by

¹ Source: <https://www.modernatx.com/modernas-work-potential-vaccine-against-covid-19> (accessed on May 6th, 2020)

137 evidence from relevant animal models when those exist. Trial enrollment should also be accelerated.
138 In the case of Covid-19 internet-based recruitment is easily providing a long list of volunteers eager
139 to get protection against this pandemic virus ¹. However, similar tools could be used for many other
140 vaccines thanks to the increased knowledge of human genetics and databases that identify people
141 susceptible to a given disease or at risk of side effects. For instance, the U.K. biobank has been used
142 to identify individuals who are susceptible to tuberculosis, while particular genotypes have been
143 shown to predict susceptibility to severe adverse reactions to measles, mumps, and rubella (MMR)
144 and yellow fever live-attenuated virus vaccines (14).

145 The ability to design trials differently and to collect more data from each individual could have a
146 profound influence on the late development stage by enabling smaller and shorter trials that provide
147 the necessary information for licensure and recommendation; a more comprehensive assessment of
148 safety and efficacy, which requires upwards of many tens of thousands of people because of the
149 expected rarity of certain adverse events, could then be quickly and accurately made after vaccine
150 implementation. Employment of large clinical databases and statistical techniques, such as
151 maximized sequential probability ratio testing (15), could further accelerate and enhance the process
152 of post-licensure safety and effectiveness assessment.

153 It is not yet clear what is the optimum approach to acquire sufficient evidence of efficacy to license
154 and recommend Covid-19 vaccines. The traditional approach to pre-licensure evaluation of efficacy
155 and safety is based upon the premise that very large phase III studies are the best way to generate
156 objective and robust information on vaccines' safety and efficacy. While double-blind placebo-
157 controlled clinical studies are the conventional gold standard and that they should be used in all
158 situations in which they are appropriate, in some instances, especially thanks to the new technologies,
159 alternative approaches can provide results that are at least as reliable, and faster. Below are some
160 examples where alternative approaches were used because double blind-placebo controlled trials were
161 not possible or required unacceptable time or investments. In the case for Ebola, ring vaccination was
162 used to acquire the evidence for vaccine licensure (16), and in the case of cholera CHIM studies were
163 used (6). In other circumstances correlates of protection have been used for vaccine licensure and
164 recommendation and the impact of vaccination has been collected later by real world evidence.
165 Examples that this approach can greatly accelerate the development process and provide a more
166 realistic safety assessment derive from the experiences of introducing meningococcus C (MenC) and
167 meningococcus B (MenB) vaccinations in the United Kingdom. In 1999, the MenC vaccine was
168 licensed based on safety and immunogenicity data from phase II clinical data and then used to
169 vaccinate the entire U.K. population aged two months to 18 years. Serum bactericidal assay, which
170 was broadly accepted as a regulatory biomarker for meningococcal polysaccharide vaccines but not
171 previously used for conjugate vaccines, was the basis for licensure. The real-world evidence showed
172 that the disease had virtually disappeared from the country just one year after introduction and that
173 the herd immunity induced by vaccination had reduced the circulation of this serogroup in the entire
174 country, thus protecting nonvaccinated cohorts (17). Unfortunately, this demonstration of the value
175 of herd immunity had an unintended consequence, as health economists and recommending bodies
176 have since requested demonstration of herd effects before issuing broad recommendations resulting
177 in long delays. Even more recently, the value of rapid vaccine implementation followed by real-

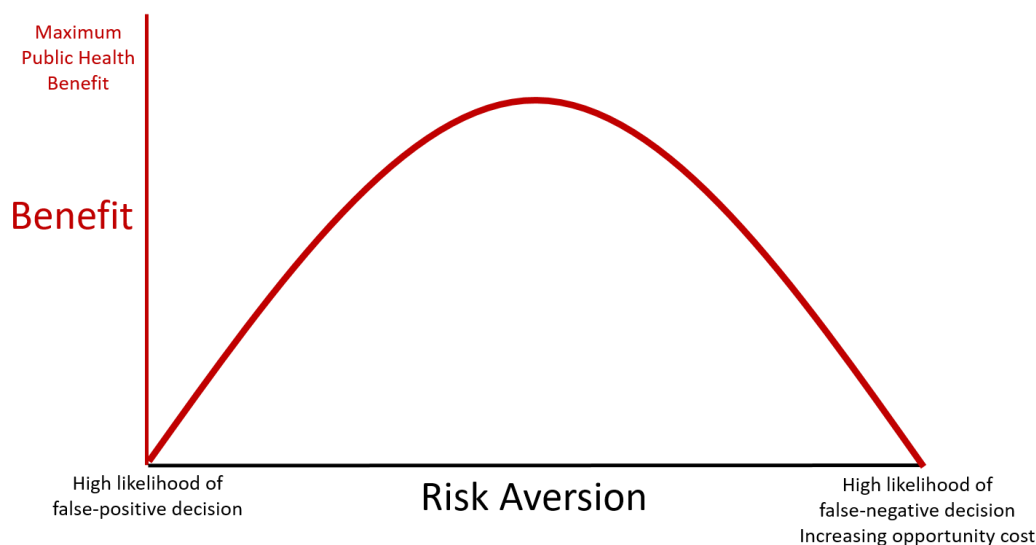
¹ Source: <https://covid19vaccintrial.co.uk/> (accessed on May 6th, 2020)

178 world evidence was again confirmed in the U.K. through the introduction and post-licensure testing
179 of the MenB vaccine (18). Following licensure, the vaccine was introduced in the national
180 immunization program in 2015. After three years and the administration of millions of doses, the
181 study reported a 75% reduction in disease in the vaccinated population and provided robust data about
182 the general safety of the vaccine.

183 **Health economics.**

184 The third opportunity resides in the health economics behind the regulatory approaches required for
185 licensure and recommendation of vaccines. These considerations clearly depend on the risk/benefit
186 balance. This balance is illustrated in **Figure 2**. As shown, while a moderate risk aversion results in
187 a great increase of public health benefit, an excessive risk aversion rapidly decreases the benefit. In
188 the case of Covid-19 the pressure is high to move fast. This justifies an appropriate but not excessive
189 risk aversion because the loss of lives and the economic impact of every additional day needed to
190 make the vaccine available are self-evident. However, during routine vaccine development many of
191 these factors are often overlooked and while it is easy to include in the analysis the costs of
192 implementing vaccine programs, it is also easy to forget the opportunity costs associated with the
193 large expenditure of time and resources necessitated by very large trials, and the cost in terms of lives
194 and productivity lost in the target population because of the length of time taken to develop and
195 introduce a new vaccine. The consequence is that a traditional vaccine development timeline requires
196 15-20 years and a cost of US\$1 billion, which clearly impact how many vaccines a pharmaceutical
197 company can develop, favor development of vaccines that target high-income populations, and make
198 the development and implementation of novel vaccines for public immunization programs in low-
199 and middle-income countries (LMICs) either unattractive or unsustainable (19). The need to speed
200 up vaccine development could be increased by including these data in a more comprehensive health
201 economic analysis. As an example, in **Table 1** we report the theoretical lives that would be saved for
202 a few vaccines in the ideal situation in which vaccines were introduced after licensure in all target
203 geographies and assuming immediate availability of vaccines for all target populations. We estimate,
204 for example, that every year the introduction of a malaria vaccine is delayed would result in up to
205 234,000 (95% CI = 65,934 – 328,042) lives lost in Sub-Saharan Africa alone (20, 21). A more
206 conservative estimate from a modeling study comprised of four models still indicated the impact of
207 RTS,S to be between 16,933-34,400 averted deaths per year (22) assuming partial coverage; which,
208 over the multi-year delay for this vaccine, is still a substantial number of lives. Similarly, the delay
209 in the use of a one-dose schedule for human papillomavirus (HPV) vaccination in high-risk areas in
210 Africa has resulted in an estimated 8,991 lives lost per year (23, 24), while the impact of the delay of
211 a two-dose vaccine in LMICs would be up to 151,687 lives lost per year. Furthermore, recent
212 advances in tuberculosis vaccine development suggest that almost 1 million deaths per year could be
213 saved by early introduction of a vaccine worldwide.

Public Health Benefit versus Risk Aversion



Adapted from: Eichler, H-G et. al. *Nature Reviews Drug Discovery* doi:10.1038/nrd4129

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215 **Figure 2.** Net public health benefits versus risk aversion in product development. The relationship between risk aversion
 216 by regulators on the x-axis, and the expected net public health benefits on the y-axis. The desire to minimize the likelihood
 217 of accepting products with unpredicted product-induced adverse effects drives the request for larger and larger safety
 218 datasets. By continuing to move to the right and beyond a ‘sweet spot’ of maximum efficiency, increased risk aversion
 219 or requests for more data are anticipated to result in diminishing net public health gains from product research and
 220 development. The unintended consequences are false-negative decision to deny licensure or restrict a product when actual
 221 use would result in more good than harm and increased opportunity costs (25).

222

223 **Regulatory environment.**

224 Regulatory agencies are generally and increasingly open to embracing innovation and accepting
 225 evidence from new technologies, provided that the innovation has been properly validated. In fact,
 226 some agencies are already moving toward implementation of several of the tools and techniques
 227 mentioned here in other areas of pharmaceutical development, especially with respect to cancer drugs
 228 (26, 27). Recent agency-sponsored workshops (for example, the U.S. FDA’s Identification and Use
 229 of Biomarkers to Advance Development of Preventive Vaccines: Public Workshop ¹) have provided
 230 insights and written guidelines on how to implement adaptive trial design, how to use biomarkers,
 231 and how to use real-world data for the development of certain therapies (28-30).

232 In the case of Covid-19 the major regulatory agencies are having a good dialog and overall a common
 233 and collaborative approach, however this is not the case in most circumstances. Establishing an
 234 agreement between regulatory agencies from around the world on the evidence necessary for vaccine
 235 licensure is of paramount importance to facilitate and accelerate development and introduction of
 236 new vaccines globally. This regulatory convergence would avoid unnecessary duplications of clinical
 237 trials and of regulatory information required for vaccine licensure in different countries.

¹ Source: <https://www.fda.gov/vaccines-blood-biologics/workshops-meetings-conferences-biologics/identification-and-use-biomarkers-advance-development-preventive-vaccines-public-workshop-09162019> (accessed on May 6th, 2020)

238 Development of master protocols, providing single “umbrella trial designs” that can be applied to
239 multiple vaccines, with pre-specified methods for planning or modifying the sample size, dropping
240 an arm, or other adaptive strategies; and endorsed by the different relevant national regulatory
241 authorities could be a first step in this direction (31).

242 Covid-19 could also provide the opportunity to explore new ways of collecting data from multiple
243 vaccine development programs. For instance, a public dataset with detailed information on the history
244 of regulatory review and approval status for every vaccine would offer significant social value by
245 facilitating research, shed light on cross-national differences in standards, procedures, and timelines;
246 and allow for the identification of bottlenecks—ultimately leading to improved vaccine access and
247 innovation.

248 The dataset could be maintained and hosted by an academic institution (in a similar fashion to the
249 Institute for Health Metrics and Evaluation at the University of Washington) or by a non-
250 governmental organization such as Gavi, the Vaccine Alliance. Ultimately, by facilitating research
251 that could accelerate regulatory processes and by providing vaccine manufacturers with more
252 certainty regarding prospective new markets, such a dataset could meaningfully contribute to greater
253 vaccination access and innovation.

254 While we are strongly convinced of the opportunities that are ahead of us, we also realize that the
255 approaches proposed in this article have several limitations. For instance, some of the technologies
256 described are not yet mature and have not yet proven their value. At the same time, since different
257 regulatory agencies may have different approaches, some of the suggestions we make may be already
258 accepted by some regulatory agencies while they may be useful suggestions for others. Also, we
259 acknowledge that the numbers reported in **Table 1**, which show the full potential benefit of
260 acceleration, were generated using very optimistic scenarios such as 100% coverage immediately
261 after licensure; to date, this has happened only in very exceptional circumstances such as the
262 implementation of the conjugate vaccines against meningococcus A and C in sub-Saharan Africa and
263 the U.K., respectively.

264 In conclusion, the need to develop safe and effective Covid-19 vaccines in the shortest time possible,
265 provides a unique opportunity to challenge the status quo and to introduce new tools such as smarter
266 designs for clinical trials and new regulatory and health economic sciences. The tools suggest here
267 and summarized in Figure 1 may be transformative and allow licensure of Covid-19 vaccines in 18
268 months from the beginning of vaccine development and reduce the time of normal vaccine
269 development and recommendation to ten years or less. At the same time, adopting some or all of these
270 recommendations would likely free up human and financial resources for R&D organizations to
271 develop more and better vaccines.

272

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276 **Conflict of interest**

277 S.B. reports personal fees from GSK.

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279 IVI, GSK, Pfizer, Merck, Sanofi - outside the submitted work.

280 R.R. and S.P. are full-time employees of the GSK group of companies. GSK is a company that has a
281 direct financial interest in producing and marketing vaccines.

282

283

284 **Table 1. Estimated morbidity and mortality costs of delayed vaccine introduction ^a**

285

Vaccine	Disease deaths/year	Vaccine efficacy	Potential maximum impact on lives lost per year of delay in vaccine introduction
Malaria: RTS,S in Sub-Saharan Africa	407,000 deaths/year	57.7% (95% CI: 16.2-80.6)	234,000 (95% CI: 65,934-328,042)
Human papillomavirus: One dose vaccine schedule in Sub-Saharan Africa given current supply constraints	81,687 deaths/year in a population of 372,000 women at risk with 119,284 new cases per year	95.89% (95% CI: 86-100) against vaccine strains	8,662 ¹ (95% CI: 7,768-9,032)
Human papillomavirus: Accelerated 2-dose vaccine introduction in LMICs	226,100 deaths/year in LMICs	95.89% (95% CI: 86-100) against vaccine strains	151,687 ² (95% CI: 136,112-158,270)
Tuberculosis: M72/AS01 _E globally	1,700,000 deaths/year	54.0% (95% CI: 2.9-78.2)	918,000 (95% CI: 49,300 -1,329,400)

286

287 ^a To highlight the maximum potential impact of vaccination, the estimates report the theoretical lives
 288 per year that would be saved in the ideal situation of achieving 100% vaccination coverage
 289 immediately after licensure in all target geographies.

290

291

¹ The UN estimates that the female population aged 10-14 in Sub-Saharan Africa is 67,248,900 (<https://population.un.org/wpp/>, accessed on May 6th, 2020). Given the mortality due to cervical cancer in Sub-Saharan Africa of 20/100,000 population and 70% coverage against cancer-causing strains and 95.5% vaccine efficacy against those strains, 8,991 is the number of additional deaths due to the extended use of a two-dose schedule given current capacity limits. HPV estimate based upon a global supply as of 2019 constrained to 30 million doses (WHO). Use of a one-dose schedule would double the population that could be vaccinated. Several studies indicate that effectiveness against long-term infection with HPV 16/18 is the same as a two-dose schedule (32). Currently, the program is capacity-limited to a one-year age group cohort with two doses rather than the five-year age group target population recommended by the WHO. Thus, by vaccinating with a one-dose schedule, vaccination could be expanded to two target cohorts. The mortality above represents the lives lost due to non-vaccination of this additional age group/year.

² Estimation of global mortality rate of HPV from <https://www.gavi.org/sites/default/files/board/minutes/2016/7-dec/presentations/12%20-%20Review%20of%20Gavi%20support%20for%20HPV%20vaccine%20presentation.pdf> (accessed on May 6th, 2020). Given that 85% of the deaths occur in LMICs and that the bivalent vaccine covers 70% of cancer-causing strains, the annual deaths averted would be 158,270 deaths/yr in LMICs. The study that modelled the data reported that the vaccine averted deaths over a ten-year period would be 2.4 million or 241,700/year (33).

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371