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Immunogenicity and persistence of trivalent measles, mumps, and rubella vaccines: a systematic review and meta-analysis

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Summary

Background Despite the universal use of the two-dose trivalent measles-mumps-rubella (MMR) vaccine in the past two decades, outbreaks of these diseases still occur in countries with high vaccine uptake, giving rise to concerns about primary and secondary failure of MMR vaccine components. We aimed to provide seroconversion and waning rate estimates for the measles, mumps, and rubella components of MMR vaccines.

Methods In this systematic review and meta-analysis we searched PubMed (including MEDLINE), Web of Science, and Embase for randomised controlled trials, cohort studies, or longitudinal studies reporting the immunogenicity and persistence of MMR vaccines, published in English from database inception to Dec 31, 2019. Studies were included if they investigated vaccine-induced immunity in healthy individuals who received a trivalent MMR vaccine, including different dosages and timepoints of vaccine administration. Studies featuring coadministration of MMR with other vaccines, maternal immunity to the MMR vaccine, or non-trivalent formulations of the vaccine were excluded. Pooled seroconversion and waning rates were estimated by random-effects meta-analyses. This study is registered with PROSPERO, CRD42019116705.

Findings We identified 3615 unique studies, 62 (1.7%) of which were eligible for analysis. Estimated overall seroconversion rates were 96.0% (95% CI 94.5–97.4; P=91.1% for measles, 93.3% (91.1–95.2; P=94.9%) for mumps when excluding the Rubini strain, 91.1% (87.4–94.1; P=96.6%) for mumps when including the Rubini strain, and 98.3% (97.3–99.2; P=93.0%) for rubella. Estimated overall annual waning rates were 0.009 (95% CI 0.005–0.016; P=85.2%) for measles, 0.024 (0.016–0.039; P=94.7%) for mumps, and 0.012 (0.010–0.014; P=93.3%) for rubella.

Interpretation Our meta-analysis provides estimates of primary and secondary vaccine failure, which are essential to improve the accuracy of mathematical and statistical modelling to understand and predict the occurrence of future measles, mumps, and rubella outbreaks in countries with high vaccine uptake.

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Introduction

Vaccines offer direct protection against infection and, by decreasing the pool of susceptible hosts in a population, provide indirect protection of unvaccinated individuals through herd immunity. Despite high vaccine uptake, vaccine-preventable disease outbreaks still occur in unvaccinated clusters within highly vaccinated populations. A relatively small proportion of the cases might be due to primary vaccine failure—the individual lack of seroconversion or adaptive immune response after vaccination; or secondary vaccine failure—the gradual loss of immunity over time after vaccination (ie, waning immunity). Vaccine efficacy and effectiveness, influenced by primary and secondary vaccine failure, are essential inputs for immunisation policy.

Globally, most countries immunise against measles using one of the many available measles-mumps-rubella (MMR) vaccines. Numerous measles outbreaks have been reported during the past two decades in various parts of the world, including Europe. In the Americas, measles elimination was declared in 2016, but recent outbreaks have raised concerns about the sustainability of elimination. Since the 1990s, regional elimination targets have been reset for various reasons, but the past decade has seen a general increase in vaccine hesitancy among the general public, particularly towards MMR vaccination. In 1997, the WHO Regional Office for Europe proposed a European-wide phased measles elimination, distinguishing groups of countries depending on their progress towards elimination. This strategy was based on achieving and maintaining immunity to measles at levels that mathematical modelling estimated to be necessary for European-wide elimination of the disease by 2007. It assumed high vaccination coverage, particularly for the first dose, leading to potentially cost-saving elimination strategies. Dwindling population-level immunity globally, especially in children aged 5–9 years, needs to be raised together with improved immunity in older age groups.
The current WHO 2020 measles and rubella elimination target is now generally considered to be unattainable and must be revised, as vaccine-induced immunity levels decline below the target values in various age groups. Numerous mumps outbreaks have also been reported, but no large-scale rubella outbreaks have been documented in countries with high MMR vaccination coverage and a catch-up vaccination programme. Declining immunity in parts of the world is thought to have three main causes: declining vaccination uptake or staying below target uptake level in subpopulations; waning vaccine-induced protection, reinforced by the decline in natural boosting of immunity by exposure; and historically low vaccine coverage in individuals older than 20 years of age. Vaccine hesitancy flares up when incidence of the disease declines through so-called prevalence-elastic vaccine demand, with scarcity of the disease influencing the perception of the trade-off between vaccine-preventable disease and risks of adverse events caused by the vaccination.

The level (immunogenicity) and duration (persistence) of MMR vaccine-induced immunity through IgG antibodies is documented in many studies, but overall estimates of MMR seroconversion and vaccine failure are scarce in the literature. Therefore, we systematically reviewed primary and secondary vaccine failure estimates for MMR vaccines; nevertheless overall estimates of seroconversion and vaccine failure are not readily available in the literature.

In this systematic review, we identified 3615 unique studies across 24 countries to quantify primary and secondary vaccine failure for the three components in combined MMR vaccines. Our meta-analysis results provide accurate and up-to-date information on seroconversion and waning immunity after MMR vaccination.

Our paper considers the combined scientific evidence to estimate both the level of MMR vaccine-induced humoral immunity, and how this wanes over time, after a single dose or two doses of MMR vaccine at a given age. This estimation will directly improve the parameterisation of mathematical models, and therefore also their accuracy, as well as the relevance and certainty of policies based on those models. This work contributes to identifying how vaccination schedules could be adapted and what level of vaccination coverage should be reached, to prevent the resurgence of measles, mumps, and rubella worldwide.
Articles

failure”, “persistence”, “waning”, or “secondary vaccine failure” (appendix pp 5–9). Two researchers (JS and SA) independently screened the search results by title, abstract, keywords, and full text if necessary (if there was any doubt after reviewing the title and abstract). Publications considered eligible were retained for review of the full text obtained through online downloads, interlibrary loans, or email communication with the corresponding author. Eligibility was confirmed after reading the full text. In addition, all references in the Cochrane review concerning MMR vaccination were that met the inclusion criteria were reviewed. Additional articles were identified for analysis by screening reference lists of articles already selected for review. All full texts considered eligible by both reviewers were included in the final review. In five cases of disagreement, a third reviewer (NH) was consulted to make a final decision regarding article eligibility.

Data analysis
Duplicate publications were identified using Endnote X8 before two reviewers (JS and SA) extracted data including study and patient characteristics, vaccine information (no restriction based on vaccines or strains, administration route, or detection method used), seroconversion rates, and persistence of immunity. Quality of the eligible studies was evaluated according to the Cochrane risk-of-bias tool by both reviewers independently. In two cases a third reviewer (NH) was consulted to make a final decision regarding the quality of the data. Publication bias was investigated by constructing a funnel plot and formally tested using the test by Peters and colleagues for seroconversion studies, and Egger’s test for persistence studies.

For each eligible immunogenicity study, we estimated seroconversion rates as the proportion of individuals who were seropositive for anti-measles, anti-mumps, and anti-rubella IgG after MMR vaccination in the total number of vaccinated participants, together with 95% Clopper-Pearson exact confidence limits. Seroconversion after the second MMR dose was measured in the seronegative individuals.

For waning vaccine-induced immunity, we derived the exponential waning rates using three different methods according to the data from each study. First, if only the study duration together with the number of seropositive individuals at the end of the study was given, and starting from a documented 100% seroconverted population, we calculated an empirical estimate of the waning rate. Second, if persistence was reported over time in different individuals, we used a generalised linear model for a binary outcome to estimate an exponential waning rate. Third, repeated measurements over time in the same individuals were analysed using a generalised estimating equations approach. The annual exponential waning rate represents the decay in seropositivity. For example, 10 years after vaccination, the expected loss of seropositivity equals 8.6% \((=1-e^{-0.009 \times 10})\), with 0.009 taken as the annual waning rate (appendix p 11).

Study-specific rates were combined per component, taking information from vaccine strains and both MMR vaccine doses together, to obtain overall seroconversion and waning rate estimates using a meta-analysis random-effects model with the DerSimonian-Laird estimator for the between-study variability. The Freeman-Tukey double arcsine variance-stabilising transformation, which allows calculation of an overall proportion from a set of proportions, was used for the seroconversion rates; waning rates were log-transformed before pooling, after which, pooled estimates were back-transformed. Inverse-variance weighting was used and CIs for the combined effects were constructed using the Knapp and Hartung method, which provides an adjustment to the SEs to account for uncertainty in \(\tau^2\), the (total) amount of heterogeneity or variability among the different studies.

We investigated heterogeneity in the estimated overall seroconversion and waning rates using the \(I^2\) statistic. As a secondary analysis, we subdivided studies by vaccine strain for measles and mumps to estimate strain-specific seroconversion rates, but not for rubella as there is only one dominant rubella strain. A subdivision based on the method of detection (ELISA or other test) was done to determine any influence on the estimated MMR seroconversion rates. As there are suspected differences in amounts of heterogeneity within the different measles and mumps strains, and the method of detection, we fitted a single mixed-effects meta-regression model with strain as fixed effect for measles and mumps and used a two-sided omnibus test (appendix pp 12–13).

All statistical analyses were done at a 5% significance level, using the statistical software packages metafor (for primary vaccine failures) and meta (for secondary vaccine failures) in R version 3.4.3. This study is registered with PROSPERO, CRD42019116705.

Role of the funding source
The funder of the study had no role in study design, data collection, data analysis, data interpretation, or writing of the report. The corresponding author had full access to all the data in the study and had final responsibility for the decision to submit for publication.

Results
Of 6029 records identified, 3615 were screened after removing duplicate records, and 147 were selected for full-text review (figure I). Four studies concerning MMRV vaccination with an MMR vaccine group as the control group, and six articles identified via reference checking were added. In total, 62 studies were identified (table), 50 for MMR immunogenicity and 12 for MMR persistence; 23 studies (37%) were done in Europe, 17 (27%) in Asia, 13 (21%) in North America, five (8%) in central America or South America, and one (2%) in Australia. Three studies (5%) were done in more than one country.
Most of the included articles were clinical trials, observational studies, or longitudinal follow-up studies (table). ELISA was the most frequently used method to detect IgG antibodies against measles, mumps, and rubella (appendix pp 30–35). Immunogenicity and persistence was evaluated for both the first and second MMR vaccination doses in healthy individuals aged from 8 months to 44 years (appendix pp 27–29). Characteristics of the included publications concerning MMR vaccine persistence are presented in the appendix (pp 36–40). Different forms of the MMR vaccine were used in the eligible studies (table), and MMR-II (Merck) was the most frequently used (30 [34%] of 87 vaccination groups).

Overall estimated seroconversion rates were 96·0% (95% CI 94·5–97·4) for measles (figure 2), 91·1% (87·4–94·1) for mumps (figure 3), and 98·3% (97·3–99·2) for rubella (appendix p 41). Excluding the Rubini strain, the overall estimated seroconversion rate for mumps was 93·3% (91·1–95·2; P=94·9%). There was no significant difference in seroconversion rates after the first and the second MMR doses (p=0·77 for measles, p=0·50 for mumps, and p=0·11 for rubella), and the rates are considered independent of age at vaccination (appendix p 17). We found no regional differences in the overall seroconversion rates (appendix p 21).
Figure 2: Forest plot of the seroconversion rates for measles.

The overall seroconversion rate estimate was obtained from a meta-analysis random-effects model with the DerSimonian-Laird estimator. I²=91.1% (95% CI 88.6–94.8%). 95% CIs for the individual studies were Clopper-Pearson exact confidence limits. References for included studies are given in the appendix (pp 46–54). n=number of seropositive patients. N=total number of individuals tested.
Estimated mumps seroconversion rate (%)
Figure 4: Forest plot of the waning rate for measles
The waning rate estimates for dose one, dose two, and both doses combined for measles was obtained from a meta-analysis random-effects model, with the DerSimonian-Laird estimator. I²=85%. 95% CI (4.4–91.4) for both doses combined. References for included studies are given in the appendix (pp 46–54).

Certain measles, mumps, and rubella strains are less immunogenic than others, especially the mumps component. Therefore, we did a meta-analysis subgrouping the studies on the basis of measles and mumps strains, but not rubella, as most studies used the RA 27/3 rubella strain (appendix pp 18, 20). Differences between measles strains were not significant (p=0.60), but a significant difference was found between mumps strains (p=0.001). After excluding the Rubini strain, this difference did not persist (p=0.66). Additionally, when subdivided on the basis of serological test (ELISA or other tests), seroconversion rates were generally higher when ELISA was used. However, this difference between tests was only significant for measles (p=0.043), with no significant differences found for mumps (p=0.14) or rubella (p=0.74).

Combining all MMR vaccine types, annual exponential waning rates after the first dose were 0.008 (95% CI 0.002–0.024) for measles, 0.039 (0.028–0.056) for mumps, and 0.014 (0.012–0.017) for rubella, and after the second dose were 0.009 (0.003–0.021) for measles, 0.016 (0.008–0.031) for mumps, and 0.010 (0.009–0.012) for rubella. Overall annual exponential waning rates for doses 1 and 2 combined are estimated to be 0.009 (0.005–0.016; I²=85.2%) for measles, 0.024 (0.016–0.039; I²=94.7%) for mumps, and 0.012 (0.010–0.014; I²=93.3%) for rubella (figure 4, appendix pp 43–44). The seroconversion and waning rates with different estimators for the between-study variance are displayed in the appendix (p 19).

A simple hypothetical projection based on the overall meta-analysis results, to display how the proportion seroconverted in a group of 100 vaccinated individuals would evolve over a time span of 50 years, is shown in the appendix (p 45). This projection assumes that every MMR vaccine recipient received a single dose of MMR vaccine and that they are not exposed to wild-type viruses at any time after vaccination. After 35 years, for instance, the proportion of individuals who became seronegative was about 30% (95% CI 14.2–46.1) for measles, 65% (36.8–80.1) for mumps, and 35% (31.3–43.3) for rubella.

The results of the risk-of-bias assessment, summarising the proportions of outcomes categorised as high, low, and unclear risk of bias, from all included articles together, are shown in the appendix (p 22). Because not all questions were applicable for all studies, a not applicable category was added. The main source of risk of bias was lack of blinding of all outcomes, which in some studies was not possible or not applicable. Studies that involved a comparison between two or more vaccines considered binding of outcomes, whereas some studies only investigated one MMR vaccine and thus blinding was not performed. Only three (5%) of the 62 studies had a high risk of measurement bias. In some cases there was insufficient information to determine the risk of allocation concealment or how missing data were handled. In addition, separate funnel plots were constructed for measles, mumps, and rubella for seroconversion and waning studies (appendix pp 25–26). No publication bias was found for seroconversion of the measles (p=0.58), mumps (p=0.27), and rubella (p=0.86) components when stratifying by strain. There was no publication bias present in the persistence studies concerning the mumps (p=0.19) and rubella (p=0.056) components, but evidence of publication bias was found for the measles component (p=0.013), even when excluding studies with large sample sizes (p=0.033).

Discussion
Eliminating measles, mumps, and rubella infections requires achieving and maintaining high age-stratified threshold levels of population immunity, while accommodating vaccine failure. Using systematic review and meta-analyses we estimated overall seroconversion and waning rates for measles, mumps, and rubella components of combined MMR vaccines. Several authors have reviewed the immunogenicity and persistence of MMR vaccines, but there are no specific estimates of primary and secondary MMR vaccine failure rates for the three individual components available in the literature, and such information is very much fragmented. It is essential to account for vaccine failure in mathematical and statistical models to adjust available coverage estimates with respect to vaccine uptake, and consequently determine existing population susceptibility to those infections.

We have documented studies on primary and secondary vaccine failure for the three MMR components and synthesised available information through meta-analytic approaches. Assessing whether infection is due to primary vaccine failure is easier than attributing it to secondary vaccine failure as the latter requires information about the presence of an immune response
following primary vaccination, which is often lacking.\textsuperscript{49} Our findings provide more accurate, up-to-date information on seroconversion and waning immunity, to improve modelling projections, which are used to formulate public health policy. These insights will expand our understanding of the immunological within-host dynamics after MMR vaccination for predictions of measles, mumps, or rubella outbreaks within highly vaccinated populations, to improve control and prevention of these diseases. Our systematic review provides evidence for the decline of IgG antibody levels for measles, mumps, and rubella over time and our meta-analysis provides overall yearly waning rate estimates for the three components of the MMR vaccine.

We found considerable heterogeneity in published seroconversion rates for MMR components, which persisted in subgroup analyses for different measles and mumps vaccine strains. Substantial heterogeneity also exists in the retrieved waning rates for all three components, even when discriminating between waning rates after administration of the first or second MMR dose. Because of the low number of publications within each dosing category and per strain, one should interpret the results with caution. We did not do a subgroup analysis to study differences in waning rates across strains as most vaccines included the same measles and mumps vaccine strains. Heterogeneity is presumably induced by many factors, including diverging clinical and methodological aspects. Moreover, the evaluation of seropositivity was not identical in all the eligible studies in terms of timing of vaccination or evaluation, test used, or threshold values applied to discriminate between seropositive and seronegative individuals. Each potential source of variability could be evaluated individually, but not collectively. Given the presence and extent of variability between studies identified in our meta-analysis and of publication bias concerning the persistence of the measles component, our findings should be interpreted with caution.

In general, MMR vaccines have proven to be highly effective in diminishing the overall incidence and prevalence of measles, mumps, and rubella infection. The results of this meta-analysis for measles, mumps, and rubella, taking all strain types together, are in line with the general consensus that vaccine-induced mumps immunity is less persistent over time than that of measles and rubella. More specifically, IgG antibodies seem to decline slowly, with most individuals remaining seropositive for many years, and vaccine-induced immunity seems to be long term, at least for measles and rubella. Primary vaccine failure levels are crucial to determine vaccine coverage levels required to achieve virus elimination through herd immunity. Secondary vaccine failure levels have a less clear role but are also important, mainly to maintain elimination. Both primary and secondary vaccine failures are pathogen-specific. The absence of measles herd immunity is mostly due to missing vaccination goals, as the high infectivity of measles requires very high and homogeneous immunity levels. In the USA, most individuals with measles had incomplete or unknown MMR vaccination status.\textsuperscript{56} Outbreaks of measles in highly vaccinated populations mainly occur in groups of susceptible individuals—ie, adult cohorts who were not infected and not vaccinated as young children, children who are too young to be vaccinated or whose parents refuse vaccination, or those who did not respond to vaccination (primary vaccine failure).\textsuperscript{42–44} Waning of vaccine-induced immunity for measles has been identified in the literature and shown through our meta-analysis, but there is no evidence that waning has a major role in the observed measles resurgence in many countries worldwide.\textsuperscript{47} Nevertheless, cases of (modified) measles have been reported as secondary vaccine failures in vaccinated individuals that were exposed to measles during outbreaks. However, the capacity of these individuals to transmit the disease might be diminished, and they might not have a role in sustaining transmission.\textsuperscript{40,46}

Over the past two decades, there has been a simultaneous escalation in the number of mumps cases in different vaccinated populations,\textsuperscript{15,16,39} raising concerns over the immunogenicity of the mumps strains in current vaccines, and whether these vaccines are sufficiently effective to prevent outbreaks. We found significant differences in seroconversion rate across the mumps strains, but not when the Rubini strain was excluded, which fits with the findings of Dayan and colleagues,\textsuperscript{6} that the highest proportion of cases in outbreaks of mumps were among those individuals immunised using the Rubini strain. Our analysis supports the WHO recommendation not to use vaccines containing Rubini strains. Moreover, several studies found a higher attack-rate with increasing time since vaccination,\textsuperscript{12,14} indicating that waning most likely has a role in the current mumps outbreaks. In a systematic review of prospective and retrospective cohort studies estimating the effectiveness of the Jeryl Lynn mumps strain, exponential waning rates were derived by minimising the sum of squared errors between the proportion initially protected and the estimates of the ratio of vaccine effectiveness, resulting in an average waning rate of 0.036 (95% CI 0.020–0.059) for mumps.\textsuperscript{36} We derived the exponential waning rates directly from each study and estimated a similar overall waning rate of 0.024 (0.016–0.039).

Rubella is probably better controlled than mumps or measles because of its relatively low transmissibility, together with a high seroconversion rate. Neither primary nor secondary vaccine failure seem to be an issue with rubella given the scarcity of outbreaks, with the exception of a recent outbreak in Poland due to its historically low vaccination coverage.\textsuperscript{9} The annual waning rate for rubella we obtained from our
meta-analysis is considerably higher than a model-based estimate obtained from an Australian serological survey. As we did in a previous study, overall rubella waning rates can also be estimated on the basis of country-specific serological data, selecting individuals vaccinated twice with the MMR vaccine. In the current study the overall waning rate for rubella was retrieved by a meta-analysis fixed-effects model rather than a mixed-effects model because of the small number of eligible studies we found.

The second dose is given to decrease the proportion of people with no response after the first MMR dose, and we found no significant difference in seroconversion rates for all components after first and second MMR doses.

High-quality cross-sectional serological surveys require high levels of quality control and assurance of serological assays. Despite updated WHO guidelines, important barriers to high-quality serological surveys remain, such as the difficulty in standardising different laboratory assays (especially in the past) and the determination of appropriate cutoffs for seropositivity, especially in the absence of a correlate of humoral protection. We generally observed higher seroconversion rates when an ELISA was used, although this finding was only significant for the measles component. Different studies using the same assay used different cutoffs, leading to underestimation or overestimation of seroconversion rates. Despite these drawbacks, seroprevalence studies are important as they provide a direct measure of a population’s immunological profile, especially as the prevalence of disease burden declines after the introduction of a vaccine. Accumulating years of widespread vaccination causes a shift in the relative contribution of natural and vaccine-derived immunity, creating generations who have not been exposed to wild-type measles, mumps, and rubella viruses, so waning immune-memory is unlikely to be boosted by natural wild-type infection.

We did not consider coadministration of the MMR vaccine with other vaccines, such as varicella. Nevertheless, previous studies have shown that coadministration of varicella and MMR vaccines, either as a combination, or as concomitant injections, did not significantly affect the immunogenicity of the MMR components. We also note that seropositivity for anti-measles, anti-mumps, and anti-rubella IgG was used as a proxy for both natural infection or vaccine-induced protection, and seronegativity as a proxy for susceptibility to these infections. Some people without detectable antibodies might have a degree of protection via cellular immunity, but this proportion remains unknown, so could not be taken into account in our model. Therefore, it is important to note that our results are based on humoral immunity only. There are few studies concerning persistence of MMR-induced immunity within dosing, so our results should not be overinterpreted.

In conclusion, this systematic review and meta-analysis provides rigorous evidence that primary and secondary vaccine failures exist for different MMR vaccines and their components. These estimates are crucial for mathematical predictions regarding measles, mumps, and rubella outbreaks, and are sensitive to historical, current, and future MMR vaccine-uptake data as well as vaccine effectiveness over time. As increasingly long periods of time have passed since the average person received MMR vaccination, an important element to improve the accuracy of predictive models is how vaccine-induced immunity wanes over time for each MMR component.

Contributors

NIH, PB, SA, and JS designed the study and NIH conceived the project. JS and SA reviewed the literature, extracted the data, performed the data analysis, data interpretation, and writing of the first draft of the manuscript. JS made the table, panel, and figures. JS, SA, HT, PVD, PB, and NH contributed to, reviewed, and approved the final version of the manuscript.

Declaration of interests

HT reports grants from Pfizer, outside the submitted work. PVD reports grants from GlaxoSmithKline, Pfizer, Sanofi, Merck, Takeda, Baxter, CanSino, Thernis, Johnson & Johnson, Abbott, the Bill & Melinda Gates Foundation, the Flemish Government, and the EU, outside the submitted work. NH reports grants from GlaxoSmithKline, Pfizer, Merck, and Johnson & Johnson, outside the submitted work. PB reports grants from Innovative Medicines Initiative of the European Commission, and attended meetings of an advisory board on economic evaluations of vaccines convened by Pfizer in 2019, outside the submitted work. All other authors declare no competing interests.

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