The evolution of seasonal influenza viruses

Velislava N. Petrova¹ and Colin A. Russell^{2,3}

Abstract | Despite decades of surveillance and pharmaceutical and non-pharmaceutical interventions, seasonal influenza viruses continue to cause epidemics around the world each year. The key process underlying these recurrent epidemics is the evolution of the viruses to escape the immunity that is induced by prior infection or vaccination. Although we are beginning to understand the processes that underlie the evolutionary dynamics of seasonal influenza viruses, the timing and nature of emergence of new virus strains remain mostly unpredictable. In this Review, we discuss recent advances in understanding the molecular determinants of influenza virus immune escape, sources of evolutionary selection pressure, population dynamics of influenza viruses and prospects for better influenza virus control.

Epidemics

Infectious disease outbreaks involving a large number of people in a defined geographic location over a defined period of time.

Fomites

Surfaces or objects that can be contaminated by pathogens.

Pandemics

Global infectious disease epidemics.

¹Wellcome Trust Sanger Institute, Wellcome Genome Campus, Hinxton, Cambridge, CB10 1SA, UK. ²Department of Veterinary Medicine, University of Cambridge, Madingley Road, Cambridge, CB3 OES, UK. ³Present address: Laboratory of Applied Evolutionary Biology, Department of Medical Microbiologu. Academic Medical Center, University of Amsterdam, Meibergdreef 9, Amsterdam, 1105 AZ, The Netherlands Correspondence to C.A.R.

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c.a.russell@amc.uva.nl

Seasonal influenza viruses infect 5-15% of the human population each year, resulting in $\sim 500,000$ deaths worldwide¹. The annual recurrence of seasonal epidemics is attributed to the continued evolution of seasonal influenza viruses, which enables them to escape the immunity that is induced by prior infections or vaccination, and to the ability of those viruses to be transmitted efficiently from human-to-human via respiratory droplets, direct contact and fomites. Influenza virus vaccines are effective in preventing the spread of seasonal influenza virus epidemics, but they must be updated regularly to keep pace with the evolution of the circulating viruses.

Influenza viruses belong to the Orthomyxoviridae family of viruses that have negative-sense, singlestranded, segmented RNA genomes. The vast majority of the seasonal influenza virus burden is associated with two types of influenza viruses: A and B (type C viruses also circulate in humans but cause less severe disease²). Influenza A viruses in humans originate from birds and swine³. Their introduction and subsequent adaptation to humans has caused global pandemics (for example, the 1918 'Spanish flu' and 2009 'Swine flu' pandemics) followed by their continued circulation in human populations as seasonal influenza viruses. Influenza A viruses are further classified into subtypes based on the combination of haemagglutinin (HA) and neuraminidase (NA) glycoproteins on their surfaces (FIG. 1a). There are currently 18 HA subtypes and 11 NA subtypes⁴, most of which circulate in wild birds, but only three combinations are known to have circulated widely in humans: A/H1N1, A/H2N2 and A/H3N2. Of these, A/H1N1 and A/H3N2 subtype viruses currently cause seasonal influenza virus epidemics. The influenza B viruses (BOX 1) have no known animal reservoir

and have circulated in humans since at least 1940 (REF. 5) (when the first influenza B virus was isolated), though they have probably circulated in humans for much longer. The influenza B viruses fall into two major lineages (B/Victoria and B/Yamagata) that diverged from each other in the 1970s^{6,7}.

The influenza A and B virus genomes comprise eight gene segments, including polymerase basic 1 (PB1), polymerase basic 2 (PB2) and polymerase acidic (PA), which encode the viral RNA-dependent RNA polymerase (RdRP) and other proteins that have been proposed to induce cell death (for example, PB1-F2 (REF. 8)) and to modulate viral pathogenicity (for example, PA-X9); nucleoprotein (NP), which encodes the viral nucleoprotein; matrix (M), which encodes the virus matrix protein (M1) and a virus surface protein (M2) that acts as an ion channel; nonstructural (NS), which encodes both the nonstructural 1 (NS1) protein that is involved in immune evasion and the nuclear export protein (NEP; also known as NS2), which mediates the nuclear export of viral ribonucleoprotein complexes; and HA and NA, which encode the viral primary surface glycoproteins (FIG. 1a). HA is responsible for cell attachment and entry through the binding of sialic acid on the surface of sialylated cells and for subsequent membrane fusion. NA enables the release of new virions from infected cells by cleaving the bonds between HA and sialic acid and by facilitating virus movement through mucus¹⁰. Owing to the misincorporation of nucleotides by the viral RdRP during genome replication and the segmented nature of their genomes, influenza viruses evolve through the gradual accumulation of mutations and genome reassortment11, which are also known as antigenic drift and antigenic shift, respectively.

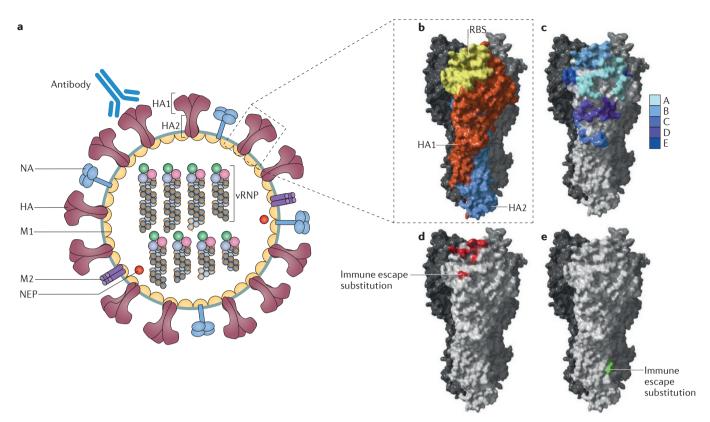


Figure 1 | **The influenza A and B virion. a** | The influenza A and influenza B virus genomes are composed of eight viral ribonucleoprotein (vRNP) complexes, encoding at least ten proteins and multiple polypeptides. The surface of the virus is dominated by the haemagglutinin (HA) and neuraminidase (NA) glycoproteins. HA is required for cell attachment and entry and is the primary target of the anti-influenza antibody response; NA is responsible for cell egress and mucus penetration. HA is the primary target of anti-influenza antibodies, particularly the globular head of the HA1 domain. The virus surface protein (M2) acts as an ion channel and the nuclear export protein (NEP) mediates the nuclear export of vRNP complexes. **b** | HA is a trimeric protein with each monomer being composed of two domains: HA1 (orange) and HA2 (blue). HA1 makes up the majority of the globular head and contains the receptor binding site (RBS) (yellow) for cell attachment. HA2 makes up the majority of the protein stalk domain. **c** | The five classical antigenic sites of H3 HA (denoted A–E) identified by monoclonal antibody selection and protein crystal structure considerations are shown, all of which have been observed to evolve in nature^{34–36}. **d** | Immune escape substitutions (red) responsible for the majority of antigenic change in the influenza A virus with H3 HA and NA subtype 2 glycoproteins (A/H3N2) from 1968 to present are shown^{37–39}. **e** | Substitutions shown to facilitate the escape of the H3 subtype of HA from broadly neutralizing anti-HA antibodies within the protein stalk domain (amino acids 387 and 391) are highlighted in green⁴⁸. M1, matrix protein 1.

Genome reassortment

A form of genomic rearrangement where two or more influenza viruses infect the same cell and exchange genomic segments, resulting in a genetically novel virus.

Antigenic clusters

A set of influenza virus variants with similar antigenic profiles.

Haemagglutination inhibition (HAI) assays Experimental assays used to antigenically characterize viruses based on the ability of host serum to inhibit the virus-induced agglutination of red blood cells.

Within each virus subtype, the gradual accumulation of nucleotide mutations and amino acid substitutions in the HA and NA surface glycoproteins periodically results in the emergence of new antigenic variants (often referred to as strains, particularly in the context of vaccine design), a phenomenon called antigenic drift¹²⁻¹⁴. These punctuated antigenic changes, particularly in HA, result in escape from the immunity that was induced by prior infection or vaccination, thus allowing the virus to reinfect individuals who were once immune to the virus and necessitating reformulation of the seasonal influenza virus vaccine¹⁵⁻¹⁷. The punctuated nature of antigenic evolution makes graphical depictions of antigenic variation of the viral glycoprotein structures appear clustered and gives rise to the concept of antigenic clusters¹².

One important consideration regarding the clustered appearance of antigenic evolution is that most antigenic variation is measured by haemagglutination inhibition (HAI) assays. These assays are unlikely to identify all forms

of antigenic change, as they rely on antibodies that block sialic acid binding. Other mechanisms of antibody-mediated response (such as antibody-mediated or complement-dependent cellular cytotoxicity and antibody-dependent cellular phagocytosis) could have important roles during infection^{18–22}, and the reliance on HAI assays might therefore occlude some forms of antigenic variation from being identified that could give antigenic evolution a less punctuated appearance. Indeed, even using HAI assays, there are occasional examples of modest, gradual antigenic changes that occur outside of periods marked by more substantial antigenic cluster changes, where a newly emerging antigenic variant replaces existing antigenic variants.

New antigenic variants of A/H3N2 viruses appear every 3–5 years, whereas new antigenic variants of A/H1N1 and influenza B viruses appear less frequently (2–5 years for A/H3N2 viruses compared with 3–8 years for A/H1N1 and influenza B viruses)^{12,23–25}. Given that

Within-host selection

Evolutionary selection that occurs at the level of an individual host, generally pertaining to virus fitness or virus interaction with the host immune response.

Immunodominant

A property of an antigen, causing it to be the primary focus of the immune response.

Plaque assays

Experimental assays that measure virus growth rates.

Microneutralization assays

Experimental assays that measure the ability of host serum to neutralize specific antigenic strains.

seasonal influenza viruses cause epidemics worldwide, infecting hundreds of millions of people each year¹, and that each human is likely to be infected multiple times over their lifetime^{26,27}, it is surprising that new antigenic variants appear so infrequently. In this Review, we explore why influenza viruses evolve so slowly, a concept that challenges the preconception that influenza viruses evolve rapidly. We discuss recent advances in our understanding of the processes that determine the rate of antigenic drift, including the molecular basis of antigenic evolution, within-host selection, between-host transmission and population-level epidemics. Throughout this Review, we focus on how different evolutionary and ecological mechanisms impede the generation of the genetic diversity that underlies virus evolution28, thus making the number of opportunities for evolutionary selection to act on new variants rare. We then discuss the prospects for improved control of influenza virus through vaccination and the potential to predict patterns of viral evolution.

Molecular basis of antigenic drift

The HA protein is the primary target of the human adaptive immune response to the influenza virus and the key component of influenza virus vaccines. HA is a

Box 1 | Influenza B viruses

The majority of influenza virus research has focused on influenza A viruses, owing to the diversity of species that they infect, their ability to cause global pandemics in humans, their burden to reared livestock populations and their substantial contribution to the public health burden of seasonal influenza viruses. Influenza B viruses have circulated in humans since at least 1940 (REF. 5), contributed substantially to the human disease burden and constitute one-third and one-half of the viruses in the trivalent and quadrivalent seasonal influenza virus vaccines, respectively. However, they have been studied to a lesser extent than influenza A viruses because they cause fewer and smaller epidemics, evolve less rapidly than influenza A viruses and are thought to primarily infect children.

A number of key questions remain concerning the evolutionary and epidemiological dynamics of influenza B viruses. Importantly, why do influenza B viruses evolve more slowly than influenza A viruses? Multiple hypotheses have been proposed for why influenza B viruses evolve at a slower rate, including a less error-prone viral RNA-dependent RNA polymerase (RdRP) than influenza A viruses⁶⁹, a lower immunogenicity than influenza A viruses¹⁶⁰ and a relatively lower receptor binding avidity for sialic acid compared with influenza A viruses^{24,61}. Similarly, population-level processes could have an important role, with smaller and less frequent epidemics allowing fewer opportunities for the virus to evolve and with children likely exerting less evolutionary selection pressure on the virus owing to a lower exposure history compared with adults.

A practical challenge for influenza B virus vaccine strain selection is anticipating which of the two influenza B viruses (B/Victoria or B/Yamagata) will dominate in the forthcoming influenza virus season. The majority of influenza vaccines used worldwide are a trivalent formulation consisting of one representative A/H1N1 virus, one A/H3N2 virus and one B/Victoria or B/Yamagata virus. From 2000 to 2010, the influenza B virus lineage of the vaccine virus matched the dominant circulating strain in only 50% of seasons¹⁶¹, with substantial consequences for vaccine efficiency¹⁶². Quadrivalent vaccines that include both influenza A viruses and influenza B viruses have recently been introduced to circumvent this problem, but they are currently less widely used than the trivalent formulation. Another issue for the influenza B virus components of the trivalent and quadrivalent vaccines is the reliance on eggs for growing vaccine viruses. Since at least 2004, growing influenza B viruses in eggs can result in the loss of a glycosylation site in HA that alters virus antigenicity and thus affects the efficacy of the vaccine¹⁶³. This problem still exists today, as evidenced by the poor reactivity of ferret antisera raised against egg-grown viruses when tested against cell-grown viruses^{38,39}.

homotrimeric protein, with each monomer containing a globular head (HA1) and a stalk (HA2) domain (FIG. 1b). The majority of the antibody-mediated responses to HA are directed against the globular head^{29,30}, but antibodies that are directed against the stalk occasionally develop in older individuals^{31–33}.

Identifying the precise molecular determinants of antigenic drift has been a research priority for decades. Seminal work in the 1980s used monoclonal antibodies and HA protein structures to identify five broadly defined antigenic sites, each composed of multiple amino acid residues on the globular head^{34–36} (FIG. 1c). These studies suggested that at least one amino acid substitution in each of these sites was required to give rise to a new antigenic variant. At the time, a separate study hypothesised that one of these sites could be immunodominant³⁵, but only recently has a more precise definition of the molecular determinants of antigenic drift emerged.

A recent study showed that just seven amino acids around the HA receptor binding site (positions 145, 155, 156, 158, 159, 189 and 193 in H3) were the primary determinants of antigenic change in A/H3N2 viruses from 1968 to 2003, as measured by HAI assays, plaque assays and microneutralization assays37 (FIG. 1d). Single amino acid changes in one of these seven positions in HA can be sufficient to generate new antigenic variants, but in strains from some genetic backgrounds, two or three mutations are required to generate new antigenic variants. Antigenic variants of A/H3N2 viruses that have been identified since 2003 have been similarly associated with changes at these seven positions^{38,39}. The importance of a small numbers of amino acid positions immediately adjacent to the receptor binding site in shaping antigenic evolution has also been shown for avian A/H5N1 viruses⁴⁰, swine A/H3N2 viruses^{41,42} and equine A/H3N8 viruses⁴³. However, substitutions that are distant from the receptor binding domain of HA, including substitutions that are not characterized in the most widely used antigenic assays, may have important roles in immune escape¹⁸. A recent study that used deep mutational scanning to identify substitutions in HA leading to immune escape found similar evidence for escape being determined by single amino acid substitutions⁴⁴. Interestingly, deep mutational scanning also showed that the extent of escape from immune recognition by specific antibodies was dependent on the specific amino acid residue at each amino acid position.

Antibodies that target the stalk of the HA protein are much less prevalent than those that target the globular head and are more commonly isolated from older individuals^{31–33}. Stalk epitopes are more inaccessible to antibodies than those on the globular head, which reduces their exposure to the immune system; thus, multiple infections are required for the generation of stalk antibodies^{33,45,46}. These antibodies are of substantial interest, as the stalk region of HA tends to be conserved among subtypes, and antibodies that target the stalk could therefore potentially offer inter-subtype protection⁴⁷. Antigenic escape from antibodies that target the stalk has not been widely reported, but this could be caused by a lack of selection pressure on the HA stalk due to the inaccessibility of the stalk region to antibodies and thus the rarity of antibodies

to this region. However, in *in vitro* experiments, escape from stalk antibodies can be achieved through single amino acid substitutions (particularly through the Q387K substitution in A/H3N2 viruses)⁴⁸ (FIG. 1e).

Antibodies are also raised against influenza virus NA during infection and have been shown to reduce viral replication and disease severity in mice49 and in humans⁵⁰. However, NA antigenic variability has been studied to a lesser extent than that of HA owing to the immunodominance of HA, the greater neutralizing potential of anti-HA antibodies and the challenges that are associated with phenotypic assays of NA antigenicity. Similar to that of HA, the antigenic evolution of NA is clustered13,14, but the timing of emergence of new NA antigenic variants is asynchronous with antigenic drift in HA14. Influenza virus vaccines that are currently licensed include immunogenic quantities of NA, but the contribution of NA to vaccine efficacy is not known⁵¹, and the immunogenicity of the NA within vaccines could be compromised by the low thermostability of NA during vaccine production⁵².

Constraints on viral evolution

Given that only a small number of amino acid substitutions are required to generate new influenza virus antigenic variants, it is surprising that new variants are observed only every few years. Over the past decade, a number of hypotheses that concern host–virus interactions have been proposed to explain the frequency of emergence of new antigenic variants^{53–60}.

The identification of the seven amino acid positions that are responsible for antigenic change in A/H3N2 viruses and their close proximity to the receptor binding site³⁷ gives rise to a hypothesis about a key constraint on immune escape. Escape from antibodies that target the receptor binding site may require a delicate balancing act: mutations in these positions must cause antigenic change without disrupting receptor binding function. Thus, at any one time, only a minor subset of possible amino acid changes in each position can retain receptor binding function while causing antigenic change. This hypothesis could explain an interesting evolutionary event in the history of seasonal A/H1N1 viruses where between 2006 and 2007, viruses in three antigenically similar but geographically segregated HA genetic lineages each acquired the same amino acid substitution to become the same new antigenic variant24. This substitution, K140E, is immediately adjacent to the receptor binding site and structurally equivalent to the sites that were identified for A/H3N2 viruses (FIG. 1c).

Receptor binding avidity for sialic acid could also have an important role⁶¹ in limiting the rate of antigenic evolution, particularly if the extent of the antigenic similarity between old and new variants is associated with the extent of receptor binding disruption caused by the acquisition of antigenicity-altering substitutions around the receptor binding site. As sialic acid binding is essential for viral entry, HA subtypes with lower binding avidity for sialic acid could be less able to tolerate amino acid substitutions near the receptor binding site than viruses with higher receptor binding avidity for sialic acid.

This balance of receptor binding and immune escape might effectively limit antigenic drift, thus explaining the relative uniformity of antigenic differences between successively circulating antigenic clusters¹².

The genetic strain in which an amino acid substitution appears is likely to be a major determinant of the tolerance of that substitution. Experimental work on NP⁶² and NA63 has shown that even closely related viruses can vary in their ability to tolerate particular amino acid substitutions. A theoretical study that used dynamical models of influenza epidemiology and evolution⁵³ showed that the rate of antigenic change could be constrained by the need to acquire multiple genetic mutations in order to acquire those substitutions that alter the antigenicity of the protein with little or no impact on the fitness of the virus. A more recent theoretical modelling study proposed that mutations that had a deleterious effect on viral fitness could limit antigenic change by requiring that substitutions that alter the antigenicity of HA confer a benefit to the fitness of the virus that offsets the cost of the accumulation of deleterious mutations⁵⁴.

Even in the absence of these constraints, the opportunities for immune selection to affect an escape variant are likely to be rare, perhaps because antigenic drift variants need to reach a sufficient density for selection to operate. A hypothetical assessment of the factors shaping within-host virus evolution suggests that the acute nature of influenza virus infections combined with the probabilities of mutant virus emergence and the restriction of the innate immune response (see section on 'Selection pressures') should make the emergence of antigenic variants driven by within-host selection a rare event⁶⁴⁻⁶⁶ (though more probable in prolonged infections of immunocompromised individuals⁶⁷). For example, the mutation rate of the influenza A virus RdRP is in the range of $\sim 2.0 \times 10^{-6}$ to $\sim 2.0 \times 10^{-4}$ mutations per site per round of genome replication⁶⁸⁻⁷¹; thus, the probability of generating a specific antigenic drift variant through a single nucleotide mutation is $\sim 2/10^5$ (the inverse of the mean of the two rates listed above) per round of replication. In an infected cell that produces ~104 virions⁷², even if the variant arises in the first round of replication, it will be vastly outnumbered by all the other progeny that are generated in that cell. After exiting the cell, virus progeny must survive the mucociliary clearance system before antibody selection can operate. This immune barrier is likely to substantially reduce the population of newly generated variants, with only a minority of virus progeny successfully infecting other cells (FIG. 2).

Selection pressures

Evolutionary selection pressure on influenza virus antigenicity primarily stems from immunity that is induced by prior infections or vaccinations. The extinction of old antigenic variants upon the emergence of new ones is evidence that immune selection on influenza virus occurs¹²; however, the mechanisms of within-host selection that account for this observation are not well understood. Indeed, a recent study⁶⁵ showed that vaccination and prior infections had minimal effects on the emergence of new antigenic variants in the 166 individuals studied.

Deep mutational scanning

An experimental protocol for assessing the mutability and effect of amino acid substitutions at specific positions or across entire proteins.

Epitopes

The parts of an antigen that are recognized by the host adaptive immune response.

Antigenicity

The quality determining the appearance of an antigen to the immune system.

Avidity

The strength of binding between an antigen and a receptor based on multiple chemical bonds.

Dynamical models

A mathematical abstraction of the time-dependent behaviour of an object or system.

Mucociliary clearance

The removal of pathogens by the movement of mucus in the upper respiratory tract by ciliated cells.

Infectious dose The number of pathogen particles that initiate an

Understanding how within-host immune selection could influence virus evolution requires careful consideration of the temporal and spatial features of influenza virus infection and of the respective roles of innate and adaptive immunity in naive and previously exposed individuals.

Innate immune selection. In individuals who have not been previously exposed to influenza virus antigens (naive individuals), infection is largely controlled by the innate immune response. Upon initial exposure to

the virus, the mucosal barrier creates a layer of mucus rich in sialic acid, which acts as a decoy by binding to the viral HA protein and thus traps a substantial portion of viruses, effectively reducing the infectious dose^{10,73}. After the virus has infected host cells, Toll-like receptor signalling and interferon-mediated responses are triggered, resulting in the rapid establishment of an antiviral state that limits the permissivity of nearby cells to virus replication^{74,75}. The efficiency of innate immune selection is dependent on infectious dose⁷⁶, virus immunogenicity

epidemics

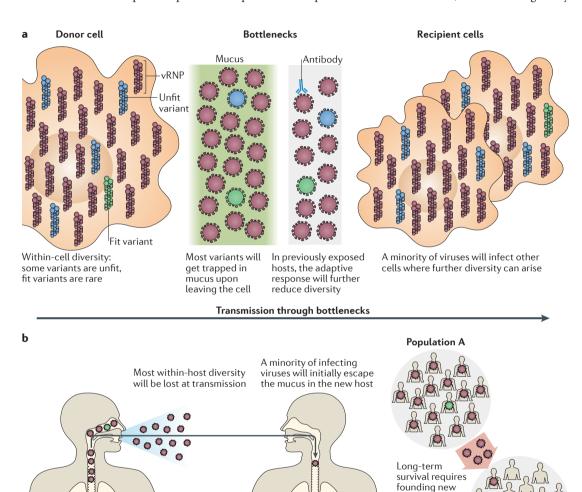


Figure 2 | **Bottlenecks in influenza virus diversity. a** | An illustration depicting within-cell and within-host factors that reduce virus diversity, including the frequency of *de novo* mutant generation, innate and adaptive immune capture and subsequent infection of available host cells. Mutants are likely to be produced in each infected cell owing to the error-prone nature of the virus polymerase complex. Though most variants inside a donor cell are likely to be unfit, some will be fit. After exiting an infected cell, a substantial portion of free virus will be trapped in mucus. In previously infected individuals, free virus populations will be further reduced by the adaptive immune response. These virus population bottlenecks reduce both virus numbers and the newly generated mutant diversity that can propagate in recipient cells. **b** | The factors for between-host and population-level spread of influenza viruses include donor host excretion, recipient host infection and epidemic seeding. Most virus diversity generated within an infected host will be lost during transmission to a new host, as only a small number of virus particles are likely to establish the infection in the new host. This same process occurs at the population level, as long-term virus survival requires that the viruses from an epidemic manage to start epidemics in new locations. Much like the between-host transmission bottleneck, the between-epidemic bottleneck is likely to similarly reduce virus diversity. vRNP, viral ribonucleoprotein.

Recipient

Population B

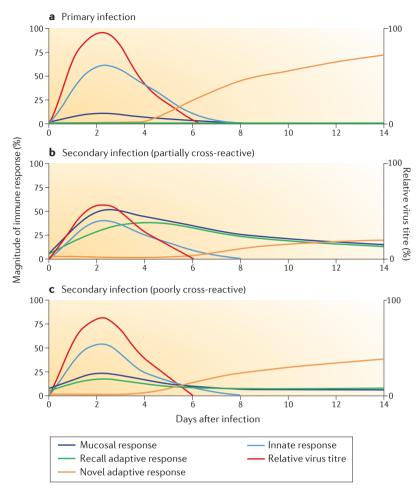


Figure 3 | Models of host immune selection during primary and secondary infections with influenza virus. The left y axis of each panel represents the relative contribution of each type of host immune response (innate response, mucosal response, recall adaptive response and novel adaptive response) to the magnitude of immune response against influenza virus. The red line corresponds to the right y axes, which represent the relative influenza virus titre. These panels were generated from basic immunological principles of primary and secondary infections assuming an average duration of influenza virus infection. However, dynamics could differ substantially in immunocompromised individuals 165,166. a | Primary influenza virus infection in an individual who is immunologically naive to influenza virus is shown. Induction of interferon response correlates with influenza virus replication 167,168 and dominates the early immune response 169. This time course of generation of novel B cell response is consistent with dynamics of antigen-specific germinal centre reaction, which takes place approximately six days after antigen exposure¹⁷⁰. A low degree of mucosal immune response can be present as a result of antigen-independent induction of natural immunoglobulin M antibodies¹⁷¹. **b** | In the case of secondary infection with a variant with partial cross reactivity to previous antigenic variants, immune selection is based on cross-reactive serological and memory B cell responses¹⁵⁵, which have competitive advantages relative to naive B cell responses¹⁷². As in part a, the generation of specific adaptive immunity occurs after the peak of virus replication. However, the generation of antibodies to drifted strains is limited by the activity of cross-reactive antibodies, which bind to the HA head and reduce the amount of influenza antigen available to trigger a specific response 94,95. c | In the case of secondary infection with a new antigenic variant with low cross reactivity to previous influenza viruses, neutralization of the virus by prior immunity is minimal, and the virus replicates to titres similar to those in primary infection (as in part a). This allows for sufficient antigen exposure to generate novel B cell responses specific to the new variant, but these typically occur 5–6 days after infection 169. Thus, increasing antigenic distance between strains favours the generation of novel immune responses¹⁴⁷.

that leads to a pro-inflammatory state^{77,78} and host genetic factors that affect the strength of innate immune reactivity^{79–81}. Overall, the innate immune response constrains virus evolution by decreasing the availability of cells that are permissive to virus replication and by reducing the virus diversity on which selection can operate²⁸, independent of the antigenic phenotype.

Adaptive immune selection. The recurrent nature of influenza virus epidemics and repeated vaccination results in a complex mosaic of immune selection pressures from antibodies and immune memory cells. For an individual, the strength of the immune selection depends on the history of virus or vaccine antigen exposure⁸², the similarity of the antigen from the infecting virus to antigens from previous exposures²⁷ and the extent of immune waning, which can lead to reduced selection pressures despite previous exposures⁸³.

In naive individuals, viruses that escape the innate response are able to replicate, leading to a peak in virus titre 24-72 hours after infection, depending on the infectious dose⁸⁴ (FIG. 3a). However, the time that is required for the de novo generation of virus-specific antibodies is 7-10 days after infection85, leading to minimal within-host antigenic selection on the virus during primary infection. In addition to the low selection pressure on the virus during primary infection, the acute nature of influenza virus infections leads to transient exposure of virus antigens to the adaptive immune system, which requires the prolonged presence of an antigen to develop highly specific adaptive immunity86. Thus, naive individuals would likely require more than one infection or vaccination to generate highly specific antibodies that are able to confer protection⁸⁷. This potential need for more than one exposure to generate immune selection pressure means that, despite the high prevalence, infections in young children could have a limited role in virus evolution.

After primary infection, subsequent exposures to previously encountered antigenic variants induce mucosal immune responses to previously encountered virus epitopes. Such mucosal responses are largely mediated by immunoglobulin A (IgA) antibodies in the upper respiratory tract, which are able to cross the epithelial barrier from the blood to the upper respiratory tract lumen in order to bind to and neutralize influenza viruses, thus preventing the infection of host cells88 (a process referred to as 'immune exclusion' (REF. 89)). As long as highly specific antibodies to the infecting virus were generated after a previous exposure, an infection can be rapidly contained with limited additional immune activation, which explains the reduction in serological responses after each subsequent infection with homologous influenza virus strains²⁶. However, this response is likely to strongly select for any new antigenic variants that are present in an infecting inoculum and to be a key source of selection pressure for virus evolution at the human population level.

Secondary infections with partially cross-reactive antigenic variants typically lead to incomplete early antibody neutralization and infection^{90,91}. As most influenza

virus infections result in the recall of some immune memory²⁷, individuals typically have the highest cumulative antibody titres against viruses that were encountered earlier in life^{27,92-94}. This immunological backboosting gives rise to so-called antigenic seniority of antigenic variants that were encountered in the first decade of life95 and is consistent with the hypothesis of 'original antigenic sin' (REF. 96), where the recall of previously generated immunological memory compromises the generation of a highly specific antibody response to the new antigenic variant (reviewed in REF. 19). During infections in which the immune response is dominated by a recall of immune memory (FIG. 3b), there is the possibility of immune selection pressure for new antigenic variants arising de novo, but this will be limited by the acute nature of typical infections, the predominance of existing antibodies with sub-neutralizing activities and the potentially reduced virus population size on which selection can exert its effects.

Infection with an antigenic variant that has a substantially reduced cross reactivity to previously encountered antigenic variants is primarily subject to restriction and clearance by the innate immune response independent of its antigenic profile, as it only weakly elicits a memory recall response and is unlikely to be neutralized by existing antibodies. Similar to naive individuals, selection that is mediated by virus-specific antibodies is likely to occur only upon secondary exposure owing to the asynchrony in the generation of novel adaptive immune response and peak virus titre (FIG. 3c).

Measuring immune selection. Anti-influenza virus antibody levels and cross reactivity with new viruses are routinely used to assess potential protection against new influenza virus infections97. When combined with characterizations of virus genomic diversity, serological assays can provide insight into immune-driven virus evolution^{40,98}. However, because the majority of influenza infections are restricted to the upper respiratory tract, in order for antibodies to apply selection on newly infecting variants, they need to be present in the lumen of the upper respiratory tract at the point of infection. Not all antibodies from the serum have access to this site of infection owing to differences in their capabilities to cross epithelial barriers, an ability that is mostly limited to secreted IgA antibodies (and IgG antibodies in the lungs at a much lower rate). This means that high immune activation and elevation of serum antibody levels do not directly reflect the antibody-mediated selection applied to influenza viruses at the site of infection, as only a small subset of these antibodies will have access to this site. Recent studies have shown that serum antibody titres can be a weak correlate of immune reactivity upon infection^{51,99,100} (reviewed in REF. 101), suggesting that serum antibody levels overestimate the strength of immune selection pressure. An improved understanding of the development and the maintenance of tissue-resident immune memory cells that are specific for influenza virus is required to assess the involvement of mucosal immunity in recall responses and its potential role in driving virus evolution.

Antigenic distance

A measure of antigenic similarity derived from quantitative representations of haemagglutination inhibition assay data.

Immune waning

The process by which antibody titres or general immune reactivity declines with time in the absence of stimulation.

Immunological backboosting

The recall of previously acquired immune memory upon infection or vaccination with a partially cross-reactive antigen.

Antigenic seniority

The phenomenon of having higher antibody titres to influenza virus variants encountered earlier in life than to more recent viruses.

Bottlenecks

Contractions in population diversity associated with reductions in population size.

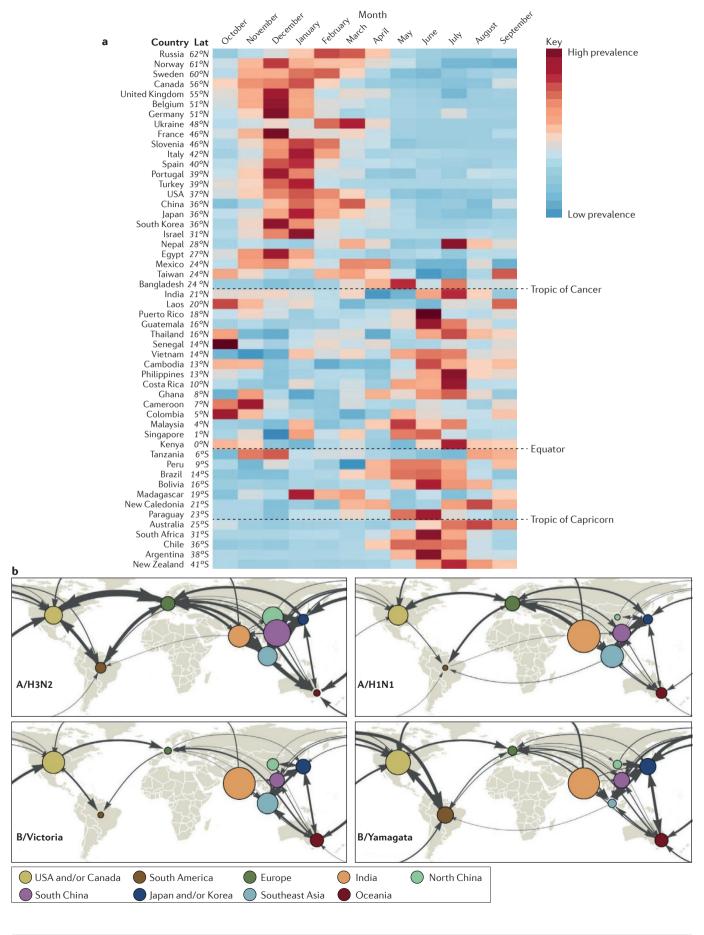
Between-host and epidemic dynamics

New antigenic variants are likely to be lost upon transmission to subsequent hosts unless they are able to replicate to high levels within an individual who is infected. The virus population bottlenecks that occur during virus egress from the donor host, ingress into the recipient host and penetration of innate immune barriers are each likely to be substantial, resulting in major losses of newly generated viral diversity ^{64,102–105} (FIG. 2b). The extent of these bottlenecks varies with route of transmission, with respiratory droplet transmission imposing a stronger bottleneck than contact transmission ^{102,103}.

Similar to within-host and between-individual transmission processes, larger-scale epidemic dynamics also impose strong bottlenecks on influenza virus evolution. The seasonal nature and short duration of influenza virus epidemics combined with the large viral diversity in an ongoing epidemic mean that newly emerged variants, even when they are more fit than the dominant variants, have little time to compete with existing variants, to replicate to high levels and to seed subsequent epidemics.

The timing of seasonal influenza virus epidemics varies globally, with the majority of influenza virus infections in temperate regions occurring in the winter months and during the rainy season in tropical regions (though epidemic timing is variable in some tropical countries)^{106–108} (FIG. 4a). Experimental work in animal models has shown that respiratory droplet transmission of seasonal influenza viruses occurs most efficiently in lower temperature and lower relative humidity environments compared with higher temperature or higher humidity environments109. This could explain the seasonality of influenza virus epidemics in the temperate regions of the Northern and Southern Hemispheres. However, in many parts of the tropics, influenza virus epidemics coincide with local rainy seasons, during which temperatures and relative humidity are both high. This implies that in the tropics, influenza virus transmission that occurs via direct contact or fomites could have a more important role than respiratory droplet transmission. If true, the larger population bottlenecks that are associated with contact transmission could facilitate more rapid evolution in tropical environments than the possibly respiratory droplet dominated transmission in temperate environments. The onset of epidemics has also been linked to fluctuations in absolute humidity110,111.

Winter epidemics in temperate regions and rainy season epidemics in the tropics could also be linked to changes in human behaviour, for example, by increases in time spent indoors. Host mixing in confined spaces can have an important role in viral transmission, as evidenced by summertime outbreaks of influenza virus in elderly care homes and prisons¹¹²⁻¹¹⁴ and by the effect of school closures on limiting viral transmission¹¹⁵. Additionally, seasonal fluctuations in human immunity, particularly during the winter months in which pro-inflammatory responses are upregulated¹¹⁶, could also have a role in the seasonality of influenza epidemics.



Global dynamics

Owing to the acute nature of influenza virus epidemics, the long-term circulation of influenza viruses in the human population is driven by the global movement of viruses. The extent to which viruses move internationally versus persisting locally between different epidemics has been of interest since at least the 1800s117,118. Various hypotheses have been proposed to explain the global movement of viruses, including back and forth migration between the temperate regions of the Northern and Southern Hemispheres due to differences in the timing of winter, continual seeding of epidemics in temperate regions from the tropics and seeding of viruses from China. The hypothesis based on the seeding of viruses from China originates from the perceived historical importance of China as a source of pandemic viruses¹¹⁹ and the sheer magnitude of the human population in China.

Phylogenetic analyses of virus genome data sets from New York, United States, and South Island, New Zealand, and Australia representing the Northern and Southern Hemispheres, respectively, provided evidence against the local persistence of A/H3N2 viruses between epidemics¹²⁰. Subsequent studies on the global dynamics of A/H3N2 viruses provided further evidence of local extinction of viruses between epidemics and identified East and Southeast (E-SE) Asia as the global source of A/H3N2 viruses^{24,121-126}. The advent of influenza virus surveillance data from India (BOX 2) led to the discovery that the global source region for A/H3N2 viruses also includes India in addition to E-SE Asia24 and confirmed previous hypotheses¹²¹. In E-SE Asia and India, A/H3N2 viruses become locally extinct between epidemics, but variation in local climates enables viruses to continuously circulate by passing from epidemic to epidemic in the region.

Recently, the global circulation pattern of seasonal influenza was shown to vary with the rate of antigenic evolution of different virus types and subtypes²⁴. Unlike A/H3N2 viruses that spread globally from E–SE Asia

▼ Figure 4 | Global dynamics of seasonal influenza viruses. a | The mean influenza virus epidemic activity by month based on virologically confirmed samples of influenza A virus with haemagglutinin (HA) subtype 3 and neuraminidase (NA) subtype 2 glycoproteins (A/H3N2), A/H1N1, B/Victoria, and B/Yamagata viruses from 2000 to 2015 (REF. 164) is shown. The 2009 A/H1N1 pandemic caused outbreaks with atypical seasonality around the world. To avoid biasing the estimates of seasonality, A/H1N1 viruses collected in 2009 were excluded. For countries for which data was not available for all years from 2000 to 2015, data for years available was used. The number of virologically confirmed cases reported in FluNet¹⁶⁴ were calculated for each month for each country and converted into mean case frequencies per month by dividing each monthly total by the total number of cases recorded for that country. Colours represent the relative level of influenza virus activity for that country during that month: dark red represents high influenza prevalence; dark blue indicates low prevalence. b | Estimates of virus migration rate between regions based on phylogenetic inferences of influenza HA genetic sequence data are depicted by arrows. Line thickness indicates the mean number of virus migration events per year. Arrowheads indicate the strength of directionality of virus migration. The circle area for each region indicates that region's contribution to the global ancestry of viruses. Circles are coloured to differentiate regions of the world but do not otherwise affect the interpretation of the figure. Africa could not be included in these inferences owing to the substantially lower levels of surveillance in Africa relative to the rest of the world. Lat, latitude. Part b adapted with permission from REF. 24, Macmillan Publishers Limited.

and India each year, A/H1N1 and influenza B viruses sporadically persist locally between epidemics in multiple regions of the world, giving rise to multiple co-circulating genetic lineages. These co-circulating lineages occasionally resulted in divergent antigenic variants, suggesting a need for region-specific influenza B virus vaccine components²¹.

The differences in the global dynamics of seasonal influenza viruses are likely a result of differences in the rates of virus evolution, potentially leading to the observed variations in age distributions of infection²⁴; that is, viruses that evolve rapidly to escape immunity can infect people of all ages more often than viruses that evolve at a slower rate, which primarily infect children and only sporadically infect adults. For example, antigenic regions of the HA glycoprotein of A/H3N2 viruses evolve at a faster rate than A/H1N1 virus and influenza B virus antigenic regions¹²⁷, and these differences in rates of evolution lead to larger and more frequent A/H3N2 virus epidemics (which could, in turn, drive evolution¹²⁸), resulting in people of a wide variety of ages becoming infected. A/H1N1 and influenza B viruses tend to cause smaller and less frequent epidemics and to infect younger individuals. Combined with the more frequent global travel of adults than young children, these differences in the distribution of age of infection provide a mechanism for A/H3N2, A/H1N1 and influenza B viruses to follow similar patterns of movement around the world but at the same time provide a mechanism for A/H3N2 viruses to spread more rapidly than A/H1N1 and influenza B viruses (FIG. 4b).

Options for the control of influenza

Vaccines are the primary tool for preventing and controlling seasonal influenza virus infections. The effect of vaccination on virus evolution is likely to be small compared with the effect of influenza virus infection, as <10% of the world population is routinely vaccinated against influenza virus¹²⁹. However, the impact of virus evolution on vaccine efficacy is substantial^{130,131}. Accordingly, the formulation of influenza virus vaccines is re-assessed twice annually (in February in the Northern Hemisphere and in September in the Southern Hemisphere) to try to ensure that the viruses in the vaccine match circulating viruses that are most likely to cause future epidemics^{38,39,132}. These decisions are made approximately nine months before the vaccines are intended to confer protection in order to accommodate the time that is necessary for producing, distributing and administering the vaccine. The long vaccine production process is largely caused by the use of chicken egg-based vaccine production technologies, and this duration creates a window of opportunity for new virus variants to emerge, often resulting in decreased vaccine efficacy¹³³. Eggbased vaccine production also has the potential to cause unintended antigenic change to the vaccine virus when the human-adapted virus is evolved to replicate efficiently in eggs¹³⁴. New vaccine production methods could reduce these inefficiencies (TABLE 1), potentially leading to more efficient vaccine production processes and more effective vaccines. Influenza virus vaccines can now be

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Adjuvant

A pharmacological agent that affects the breadth and/or strength of the immune response.

Antisera

The antibody-containing portions of the blood, which are specific for a given pathogen.

produced using cell-based culture manufacturing and recombinant technologies without culturing the virus in chicken eggs (reviewed in REFS 135,136), thus allowing the use of viruses that are genetically closer to wild-type viruses in vaccines and reducing the risk of viral evolution during laboratory passage¹³⁶⁻¹³⁸. Recombinant technologies have the added benefit of substantially reducing production times compared with egg-based and cellbased technologies, as production can begin once a virus genome has been sequenced rather than starting with a live virus¹³⁶. If the majority of influenza virus vaccines were produced using recombinant technologies, the vaccine strain selection decisions could be made closer to the time of intended vaccine use, thus reducing the window of opportunity for the emergence of new antigenic variants in the human population.

A complementary approach to improve influenza virus vaccine production is to attempt to predict future patterns of influenza virus evolution. The ability to predict how influenza viruses will evolve would substantially improve options for vaccine development and efficacy. To date, the accurate prediction of future antigenic change to influenza viruses has been hindered by a limited understanding of how changes in viral genotype affect viral phenotype and of the interplay of factors governing the rate of antigenic evolution.

Recent efforts have made progress in predicting influenza virus genetic evolution by analysing genetic sequence data and phylogenetic branching patterns to predict the success of genetic lineages^{139,140} and may

become useful for predicting which virus lineages are likely to survive or to become extinct. Attempts to integrate antigenic data into these predictions have resulted in improvements in prediction accuracy¹⁴¹. These methods, combined with tools that track the real-time evolution of influenza viruses, like NextFlu¹⁴², are helping to integrate different types of surveillance data, particularly antigenic data, and have the potential to help determine the vaccine strains that are included in influenza virus vaccines.

There is also a need to improve how vaccines are used to maintain immunity. The annual re-vaccination designed to maintain protection against influenza viruses can have a negative effect on vaccine efficacy, owing to the repeated recall of previously generated immune memory with a limited stimulation of novel immune responses 143-146. This decline in vaccine efficacy associated with vaccination history is thought to be the result of a decline in boosts of antibody titres with each repeated exposure to similar viruses and antigenic differences between the vaccine virus and circulating viruses147,148. There are four broad strategies for combatting this problem: generating broadly neutralizing responses to conserved epitopes to reduce the need for revaccination (that is, creating a universal vaccine)^{47,149}; better stimulating mucosal immunity to improve the breadth of cross-protection^{150,151}; vaccinating with viruses that are sufficiently antigenically dissimilar to previously circulating viruses to leverage backboosting for protection against circulating strains^{27,152}; and improving the adjuvant composition of vaccines to enhance the generation of novel immune responses^{153,154}.

In addition, influenza virus vaccine efficacy could likely be improved by better vaccine strain selection strategies¹³². Vaccine strain selection is largely based on the antigenic characterization of circulating viruses by use of antisera in binding assays that are produced during primary influenza virus infections in ferrets. These assays can overlook the complexity of the immunity that results from multiple infections and vaccinations¹⁸ and might not accurately reflect protection in individuals who have been exposed multiple times, particularly in elderly people. Emerging technologies for immune phenotyping and next-generation sequencing of antibody repertoires to improve our understanding of protection could facilitate a more strategic selection of vaccine strains to elicit better protection in individuals who have been previously exposed to influenza viruses through infections and repeated vaccinations¹⁵⁵⁻¹⁵⁷.

Box 2 | Surveillance of seasonal influenza viruses

The evolution of seasonal influenza viruses is monitored by the World Health Organization (WHO) Global Influenza Surveillance and Response System (GISRS), which includes the National Influenza Centres, the WHO Collaborating Centres for Reference and Research on Influenza and the Essential Regulatory Laboratories. Collectively, the GISRS oversees influenza virus surveillance in >110 countries around the world and tested >2 million clinical samples in 2015¹⁶⁴.

Seasonal influenza virus surveillance is crucial for evaluating and designing seasonal influenza vaccines and is also important for monitoring the emergence of resistance to antiviral drugs, detecting and responding to potential pandemic threats and generating valuable data for influenza virus research. The long-term, intensive nature of influenza virus surveillance has generated a wealth of data that have facilitated our understanding of the large-scale population dynamics of seasonal influenza viruses, including studies that showed that virus evolution is continuous but changes in antigenicity are clustered¹² and that the global circulation patterns of seasonal influenza viruses vary with rates of virus evolution²⁴.

Despite the fact that seasonal influenza viruses are among the most monitored pathogens in the world, there is still scope for improving their surveillance. Historically, seasonal influenza virus surveillance was lacking in major parts of the world including South America, India and Africa. However, in the past 10–15 years, surveillance activities have increased substantially in many parts of South America and India. Increased surveillance in India revealed an important role for the country in seasonal influenza virus evolution and in seeding epidemics around the world, comparable in importance to China²⁴. Despite important progress in developing surveillance infrastructure in Africa, many countries there remain under-surveyed or lack influenza virus surveillance programmes altogether. This can be clearly seen in FIG. 4a and FIG. 4b, where most of Africa has not been included owing to insufficient data to reliably assess patterns of seasonality and the role of African countries in global virus circulation. Importantly, there is still substantial scope for improving surveillance worldwide to detect rare events such as the emergence of new antigenic variants and the cross-species transmission of viruses from animals to humans.

Conclusions

In this Review, we have discussed how processes that operate at the level of the virus, host and human population act in concert to determine the rate of influenza virus evolution and, in turn, shape the global dynamics of seasonal influenza viruses. Despite the high number of influenza virus infections each year, the opportunities for evolutionary selection pressures to act on are likely to be rare. The factors that limit these opportunities are inherent to the biology of the virus (owing to the limited number of mutations that can be accommodated by the virus without substantially decreasing fitness), immunological

Table 1 | Advantages and disadvantages of strategies for influenza virus vaccine production

Vaccine	Advantages	Disadvantages	Refs
Licensed			
Egg-grown vaccines	Well established; relatively inexpensive compared to other vaccine production methods	Prone to mutations and changes in antigenicity during egg adaptation; long production time; dependent on egg supply, which might be limited in the case of pandemics	173,174
Mammalian cell-grown vaccines	Faster start-up and scale-up than egg-based vaccines, as cells can be frozen in advance; production in sterile environment without the use of antibiotics; no risk of egg-adaptation mutations	Require live virus to begin production	175–177
Recombinant vaccines	Rapid production and scale-up; production can be initiated from virus genetic sequence without live virus; no risk of mutations from laboratory passage	Reduced immunogenicity requires the use of adjuvants or high haemagglutinin (HA) concentrations; potential differences in glycosylation between mammalian and insect cells	178,179
Live- attenuated vaccines	Administration via natural route of infection; broader immunity with better activation of mucosal immunity	Low risk of virus reversion to wild type; observed decrease in efficacy after repeated vaccination; temperature-sensitive; produced in eggs with all associated disadvantages	180,181
Emerging technologies			
Viralvectors	Rapid production and scale-up; easy to introduce multiple antigens on a single vector; vector-induced innate immunity removes the need for adjuvants	Efficacy can be affected by pre-existing immunity to the vector	182,183
Insect cell-grown virus-like particles (VLPs)	Rapid production and scale-up; do not require live virus during production process; no risk of mutation from laboratory passage; not reliant on egg supply; allow for simultaneous introduction of multiple antigens; stimulate innate and adaptive immunity	Previous exposure can interfere with immunogenicity; low efficacy of production of VLPs of large antigens (for example, the envelope protein of human immunodeficiency virus and influenza virus HA); require prior knowledge of epitope immunogenicity; differences in glycosylation between mammalian and insect cells	184
Broadly acting vaccines ('universal vaccines')	Rapid production and scale-up; based on recombinant technologies without the need for live virus; provide cross-protection across influenza strains; do not require annual re-vaccination	Require further assessment of short-term and long-term efficacy; unknown whether viruses would evolve to escape broad neutralization once vaccine is in widespread use	90,185, 186

(owing to the way complex exposure histories limit the generation of novel immunity) and epidemiological (owing to the acute nature of infections and epidemics).

Studies of these evolutionary processes will benefit from the increasing resolution of next-generation sequencing tools, which can be used to identify mutations during within-host and between-host processes, particularly with regard to the *de novo* generation of new mutants and the selective advantages that mutants confer to escape stochastic extinction. Similarly, there is a growing need for better computational and mathematical modelling frameworks for integrating different data sources about processes occurring within and between hosts. Moreover, standardizing practices across different laboratories and the sharing of primary virological data beyond genetic sequence data, particularly antigenic data, is crucial for heightening our understanding of the evolution of seasonal influenza viruses.

Immune repertoire sequencing for profiling immune responses during infection and vaccination could lead to the identification of markers of the host immune response that are shared among individuals and thus

provide opportunities for the systematic characterization of within-host and population-level selective pressures that affect virus evolution¹⁵⁸. These common immune markers could be used for predicting the efficacy of vaccines during the design stage¹⁵⁹. However, the use of such large-scale sequencing approaches in influenza virus vaccine design requires an understanding of how changes in viral genotype affect specific immune phenotypes, which is currently lacking.

Improving our understanding of influenza virus evolution and our ability to predict patterns of viral evolution will lead to better influenza virus control. However, as influenza virus is a global pathogen, new measures for controlling influenza virus will need to be implemented worldwide. Currently, global seasonal influenza virus vaccine production is ~500 million doses per year ¹²⁹ for a human population of >7 billion people. Reducing the global burden of influenza virus will require substantial increases in vaccine production and increases in access to influenza virus vaccines, antiviral drugs and non-pharmaceutical interventions. This is particularly important for areas where the public health infrastructure is poor.

Immune repertoire sequencing

Targeted genetic sequencing of the B cell or T cell receptor genes.

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Author contributions

V.N.P. and C.A.R. contributed to researching data for article. V.N.P. and C.A.R. substantially contributed to the discussion of content. V.N.P. and C.A.R. wrote the article. V.N.P. and C.A.R. reviewed and edited the manuscript before submission.

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