

# Resources for Influenza Research

- Infectious Disease Epidemiology
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  - Influenza Transmission
  - Influenza Forecasting
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## Topics and Keywords

- Influenza | Flu
- Pandemic (Antigenic Shift) vs. Epidemic (Antigenic Drift)
- Epidemiology of Influenza
- Modeling Influenza
  - Transmission
  - Forecasting
- Surveillance of Influenza
- Ecology of Influenza
- Evolution of Influenza
  - Phylodynamics
  - Phylogeography

## Infectious Disease Epidemiology

### *Textbooks*

- Gordis, L. (2013). Epidemiology. Elsevier: Saunders.
- Nelson, K. E., & Williams, C. (2013). Infectious disease epidemiology. Jones & Bartlett Publishers.
  - [x] Chapter 6 Infectious Disease Dynamics
  - [ ] Chapter 7 Geographic Information Systems
  - [x] Chapter 15 Epidemiology and Prevention of Influenza

## Modeling Infectious Diseases

### *Textbooks*

- Anderson, R. M., & May, R. M. (1991). Infectious Diseases of Humans: Dynamics and Control. Oxford: Oxford university press.
- Keeling, M. J., & Rohani, P. (2008). Modeling Infectious Diseases in Humans and Animals. Princeton University Press.
  - Book website: [www.modelinginfectiousdiseases.org](http://www.modelinginfectiousdiseases.org)

- Diekmann, O., Heesterbeek, H., & Britton, T. (2012). Mathematical tools for understanding infectious disease dynamics. Princeton University Press.
- Diekmann, O., & Heesterbeek, J. A. P. (2000). Mathematical epidemiology of infectious diseases: model building, analysis and interpretation. John Wiley & Sons.
- Sattenspiel, L. (2009). The Geographic Spread of Infectious Diseases: Models and Applications. Princeton University Press.
- [x] Vynnycky, E., & White, R. (2010). An Introduction to Infectious Disease Modelling. Oxford University Press.  
– Book website: [www.anintroductiontoinfectiousdiseasemodelling.com](http://www.anintroductiontoinfectiousdiseasemodelling.com)
- Fine, P. (1981). Influenza Models: Prospects for Development and Use. Proceedings of a Working Group on Epidemiological Models of Influenza and Their Practical Application.

#### *Review Papers*

- [x] Heesterbeek, H., Anderson, R. M., Andreasen, V., Bansal, S., De Angelis, D., Dye, C., ... & Viboud, C. (2015). Modeling Infectious Disease Dynamics in the Complex Landscape of Global Health. *Science*, 347(6227), aaa4339.
- A Special Issue of *Epidemics* on Challenges in Modelling Infectious Disease Dynamics.
- [x] Grassly, N. C., & Fraser, C. (2008). Mathematical Models of Infectious Disease Transmission. *Nature Reviews Microbiology*, 6(6), 477-487.
- Hethcote, H. W. (2000). The Mathematics of Infectious Diseases. *SIAM review*, 42(4), 599-653.

## **Ecology and Evolution of Influenza**

#### *Textbook*

- Webster, R. G., Monto, A. S., Braciale, T. J., & Lamb, R. A. (2014). Textbook of Influenza. John Wiley & Sons.

#### *Review Papers*

- Nelson, M. I., & Holmes, E. C. (2007). The Evolution of Epidemic Influenza. *Nature reviews genetics*, 8(3), 196-205.
- [x] Earn, D. J., Dushoff, J., & Levin, S. A. (2002). Ecology and Evolution of the Flu. *Trends in ecology & evolution*, 17(7), 334-340.
- [x] Potter, C. W. (2001). A History of Influenza. *Journal of applied microbiology*, 91(4), 572-579.
- [x] Cox, N. J., & Subbarao, K. (2000). Global Epidemiology of Influenza: Past and Present. *Annual review of medicine*, 51(1), 407-421.
- Webster, R. G., Bean, W. J., Gorman, O. T., Chambers, T. M., & Kawaoka, Y. (1992). Evolution and Ecology of Influenza A Viruses. *Microbiological reviews*, 56(1), 152-179.

## **Seasonality of Influenza**

#### *Key Paper*

- [x] Deyle, E. R., Maher, M. C., Hernandez, R. D., Basu, S., & Sugihara, G. (2016). Global environmental drivers of influenza. *Proceedings of the National Academy of Sciences*, 201607747.

#### *Review Papers*

- Rates, C. (2011). Global Influenza Seasonality: Reconciling Patterns Across Temperate and Tropical Regions. *Environmental health perspectives*, 119(4), 439.
- [x] Fuhrmann, C. (2010). The Effects of Weather and Climate on the Seasonality of Influenza: What We Know and What We Need to Know. *Geography Compass*, 4(7), 718-730.
- [x] Lipsitch, M., & Viboud, C. (2009). Influenza Seasonality: Lifting the Fog. *Proceedings of the National Academy of Sciences*, 106(10), 3645-3646.

- Lofgren, E., Fefferman, N. H., Naumov, Y. N., Gorski, J., & Naumova, E. N. (2007). Influenza Seasonality: Underlying Causes and Modeling Theories. *Journal of virology*, 81(11), 5429-5436.

## Dynamics of Influenza

### Influenza Transmission

#### *Classical Paper*

- [x] Rvachev, L. A., & Longini, I. M. (1985). A Mathematical Model for the Global Spread of Influenza. *Mathematical biosciences*, 75(1), 3-22.

### Influenza Forecasting

#### *Review Papers*

- Nsoesie, E. O., Brownstein, J. S., Ramakrishnan, N., & Marathe, M. V. (2014). A Systematic Review of Studies on Forecasting the Dynamics of Influenza Outbreaks. *Influenza and other respiratory viruses*, 8(3), 309-316.
- [x] Chretien, J. P., George, D., Shaman, J., Chitale, R. A., & McKenzie, F. E. (2014). Influenza Forecasting in Human Populations: a Scoping Review. *PloS one*, 9(4), e94130.

#### *Projects*

- FluSight 2016-17 from Epidemic Prediction Initiative
  - flusight: a static influenza forecasts visualizer created by the Reich Lab at UMass-Amherst. source code

## Digital Detection of Influenza

#### *Review Paper*

- Salathe, M., Bengtsson, L., Bodnar, T. J., Brewer, D. D., Brownstein, J. S., Buckee, C., ... & Vespignani, A. (2012). Digital Epidemiology. *PLoS computational biology*, 8(7), e1002616.

#### *Classical Paper*

- [x] Ginsberg, J., Mohebbi, M. H., Patel, R. S., Brammer, L., Smolinski, M. S., & Brilliant, L. (2009). Detecting Influenza Epidemics using Search Engine Query Data. *Nature*, 457(7232), 1012-1014.

#### *Projects*

- Google Flu Trends: using aggregated Google search data to estimate flu activity.
- HealthMap: flu & Ebola map | virus & contagious disease surveillance.

## Databases for Influenza Research

- WHO FluNet: a global tool for influenza virological surveillance.
- WHO FluID: a data collection tool to collect defined epidemiological indicators and data on seasonal and pandemic Influenza from national, regional and global systems on a weekly basis. It complements the existing virological data collection tool FluNet.
- Weekly U.S. Influenza Surveillance Report
  - FluView: national and regional level outpatient illness and viral surveillance.
  - FluView: influenza-like illness (ILI) activity level indicator determined by data reported to ILINet.
- Weekly influenza reports from Chinese National Influenza Center

- Estimated flu activity from Google Flu Trends. Google is no longer publishing estimates of disease activity (as of August 20, 2015), but it continue to provide signal data for research purposes. See details on the next chapter for Google Flu Trends.
  - Source: Ginsberg et al. (2009), Butler (2013), Lazer et al. (2014).
- HealthMap Flu Trends
  - Source: Freifeld et al. (2008).
- FluWeb Historical Influenza Database: free access to a number of rare and valuable sources of data concerning past influenza outbreaks.
- Project Tycho@: currently including data from all weekly notifiable disease (containing **influenza** and **pneumonia**) reports for the United States dating back to 1888.
  - Source: Van Panhuis et al. (2012).
- Influenza Research Database (IRD): global public database and analysis resource for the study of influenza viruses.
  - Source: Squires et al. (2012).
- NCBI Influenza Virus Resource
- Global Initiative on Sharing Avian Influenza Data (GISAID)
- EMPRES Global Animal Disease Information System (EMPRES-i)

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- Freifeld, C. C., Mandl, K. D., Reis, B. Y., & Brownstein, J. S. (2008). HealthMap: global infectious disease monitoring through automated classification and visualization of Internet media reports. *Journal of the American Medical Informatics Association*, 15(2), 150-157.
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- Van Panhuis, W. G., Grefenstette, J., Jung, S. Y., Chok, N. S., Cross, A., Eng, H., ... & Burke, D. S. (2013). Contagious diseases in the United States from 1888 to the present. *The New England journal of medicine*, 369(22), 2152.

## Software Packages for Influenza Research

### *R Packages*

- R0: Estimation of R0 and Real-Time Reproduction Number from Epidemics.
- EpiDynamics: Dynamic Models in Epidemiology. Currently, the R package **EpiDynamics** implements the computer programs written in other programming languages and available in the web page of the book Keeling, M. J., & Rohani, P. (2008). *Modeling Infectious Diseases in Humans and Animals*. Princeton University Press. Python Programs for this book also can be found here.
- EpiModel: Mathematical Modeling of Infectious Disease.
- epitools: EpiTools: R Package for Epidemiologic Data and Graphics.
- tsIR: An implementation of the time-series Susceptible-Infected-Recovered (TSIR) model (described by Finkenstadt and Grenfell (2000)) using a number of different fitting options for infectious disease time series data.
- The R-epi project: lists resources for infectious disease epidemiology using the R software. These resources include an overview of R packages, alongside dedicated documentation, cross-packages tutorials, and links to relevant forums of discussion. Now these are also listed in the projects of R Epidemics Consortium (RECON).

### *Python Packages*

- pypfilt: Bootstrap particle filter for epidemic forecasting.
- epifx: Epidemic forecasting with mechanistic infection models.

## Workshops and Conferences

- Multinational Influenza Seasonal Mortality Study (MISMS) Workshop
- Options for the Control of Influenza Conference
- International Conference on Emerging Infectious Diseases
- Epidemics: International Conference on Infectious Disease Dynamics
- Annual Ecology and Evolution of Infectious Disease Conference

## MOOCs

### *Massive Open Online Courses*

- Epidemics - the Dynamics of Infectious Diseases: a course provided by the Pennsylvania State University discusses about the dynamics of Malaria, HIV/AIDS, Influenza, Measles - how they emerge, how they spread around the globe, and how they can best be controlled.
- Epidemics: a course provided by the University of Hong Kong covers these four topics: origins of novel pathogens; analysis of the spread of infectious diseases; medical and public health countermeasures to prevent and control epidemics; panel discussions involving leading public health experts with deep frontline experiences to share their views on risk communication, crisis management, ethics and public trust in the context of infectious disease control.

## Glossary

### *Review Papers*

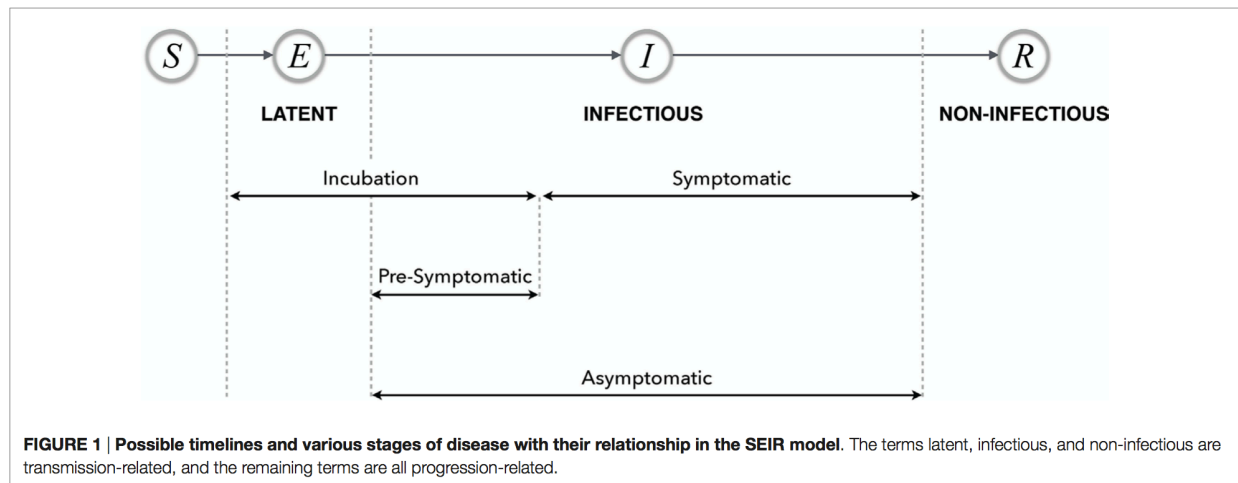
- Moghadas, S., & Laskowski, M. (2014). Review of terms used in modelling influenza infection. NCCID, 1-39.
- Moghadas, S., & Laskowski, M. (2014). A Logical Modelling Framework for Influenza Infection. NCCID, 1-24.
- [x] Milwid, R., Steriu, A., Arino, J., Heffernan, J., Hyder, A., Schanzer, D., ... & Moghadas, S. M. (2016). Toward Standardizing a Lexicon of Infectious Disease Modeling Terms. *Frontiers in Public Health*, 4.
- Moghadas, S., & Milwid, R. (2016). Glossary of Terms for Infectious Disease Modelling: A Proposal for Consistent Language. NCCID, 1-3.
- [x] Mishra, S., Fisman, D. N., & Boily, M. C. (2010). The ABC of terms used in mathematical models of infectious diseases. *Journal of epidemiology and community health*, jech-2009.

### *Terms*

- **Index case**
  - Definition: The first case in a family or other defined group to come to the attention of the investigator.
  - Source: Porta (2014)
  - Chinese: 指示病例
- **Primary case**
  - Definition: The individual who introduces the disease into the family or group under study. Not necessarily the first diagnosed case in a family or group.
  - Source: Porta (2014)

- Chinese: 原发病例
- **Secondary case**
  - Definition:
  - Source:
  - Chinese: 二代病例, 继发病例, 续发病例
- **Latent period**
  - Definition: The latent period refers to the period of time between exposure to a disease with successful transmission and the onset of **infectiousness**.
  - Source: Milwid et al. (2016).
  - Chinese: 潜伏期
- **Incubation period**
  - Definition: The incubation period is defined as the period of time between exposure to the disease (if transmission occurs) and the onset of **clinical symptoms**.
  - Source: Milwid et al. (2016).
  - Chinese: 潜育期
- **Infectious period**
  - Definition: The infectious period is defined as the time interval in which the infected individual is capable of transmitting the disease.
  - Source: Milwid et al. (2016).
  - Chinese: 传染期

The relationship of periods: latent, incubation, and infectious in the SEIR model is illustrated in Figure 1 of Milwid et al. (2016).



- **Generation time (interval)**
  - Definition: In modeling, the generation interval refers to the period of time between the onset of **the infectious period** in a primary case to the onset of **the infectious period** in a secondary case infected by the primary case.
  - Source: Milwid et al. (2016), Wallinga & Teunis (2004).
  - Chinese: 世代时间
- **Serial interval**
  - Definition: In epidemiology, the serial interval is defined as the period of time between the onset of **symptoms** in a primary case to the onset of **symptoms** in a secondary case infected by the primary case.
  - Source: Milwid et al. (2016), Fine (2003).
  - Chinese: 传代间期
- **Morbidity (rate)**
  - Definition: Morbidity is another term for illness.

- Source: <https://www.health.ny.gov/diseases/chronic/basicstat.htm>
- Chinese: 发病率
- **Mortality (rate)**
  - Definition: Mortality is another term for death.
  - Source: <https://www.health.ny.gov/diseases/chronic/basicstat.htm>
  - Chinese: 死亡率
- **Incidence**
  - Definition: Disease incidence is defined by both epidemiologists and modelers as the number of **new** cases in a population generated within a certain time period.
  - Source: Milwid et al. (2016).
  - Chinese: 发病率
- **Prevalence**
  - Definition: Disease prevalence is defined as the number of cases of a disease at a single time point in a population.
  - Source: Milwid et al. (2016).
  - Chinese: 患病率
- **Attack rate**
  - Definition: The attack rate describes the proportion of the population that becomes **infected** over a specified period of time.
  - Source: Milwid et al. (2016).
  - Chinese: 罹患率
- **Clinical attack rate**
  - Definition: The clinical attack rate measures the proportion for the population that develops disease **symptoms** as a result of an infection.
  - Source: Milwid et al. (2016).
  - Chinese: 临床罹患率
- **Secondary attack rate**
  - Definition: The secondary attack rate (SAR) is the probability that infection occurs among susceptible persons within a reasonable incubation period following known contact with an infectious person or another infectious source.
  - Source: Armitage & Colton (2005).
  - Chinese: 续发率
- **Basic reproduction/reproductive number/ratio**
  - Symbol:  $R_0$
  - Definition: the expected number of secondary cases produced by a typical primary case in an **entirely susceptible population**.
  - Source: Wallinga & Teunis (2004).
  - Chinese: 基本再生数
- **Effective reproduction/reproductive number/ratio**
  - Symbol:  $R_t$
  - Definition: A population will rarely be totally susceptible to an infection in the real world. The effective reproductive number estimates the average number of secondary cases per infectious case at time  $t$  in a population made up of both susceptible and non-susceptible hosts.
- Source: <http://www.healthknowledge.org.uk/public-health-textbook/research-methods/1a-epidemiology/epidemic-theory>
  - Chinese: 有效再生数
  - Remark: Wallinga & Teunis (2004) proposed a method that is generic and requires only case incidence data and the distribution of the serial interval to estimate effective reproduction number over the course of an epidemic. However, the approach has several drawbacks. First, estimates are **right censored**, because the estimate of  $R$  at time  $t$  requires incidence data from times later than  $t$ . Approaches to correct for this issue have been developed by Cauchemez et al. (2006). Furthermore, when the data aggregation time step is small (e.g., daily data), estimates of  $R$  can vary considerably over short time periods., producing substantial negative autocorrelation. For more details we refer the reader to Cori et al. (2013).

- **Case reproduction number**
  - Definition: The case reproduction number is a property of individuals infected at time  $t$ , and is the average number of people someone infected at time  $t$  can expect to infect. It is sometimes called the **cohort reproduction number** because it counts the average number of secondary transmissions caused by a cohort infected at time step  $t$ .
  - Source: Fraser (2007), Cori et al. (2013).
  - Chinese: 病例再生数
  - Remark: The case reproduction number is denoted  $R_c(t)$  in Fraser (2007) while  $R^c(t)$  in Cori et al. (2013). Essentially, It is the widely used effective reproduction number. The case reproduction number is the quantity estimated in the Wallinga and Teunis-type approaches.
- **Instantaneous reproduction number**
  - Definition: The instantaneous reproduction number is a property of epidemic at time  $t$ , and is the average number of people someone infected at time  $t$  could expect to infect should the condition remain unchanged.
  - Source: Fraser (2007), Cori et al. (2013).
  - Chinese: 瞬时再生数
  - Remark: In both Fraser (2007) and Cori et al. (2013), the instantaneous reproduction number is denoted  $R(t)$ , which is usually used as the notation for effective reproduction number. The instantaneous reproduction number is the only reproduction number easily estimated in real time. Moreover, effective control measures undertaken at time  $t$  are expected to result in a sudden decrease in the instantaneous reproduction number and a smoother decrease in the case reproduction number. Hence, assessing the efficiency of control measures is easier by using estimates of the instantaneous reproduction number.
- **Household reproduction number**
  - Definition: The household reproduction number is defined as the number of households infected by each infected household.
  - Source: Fraser (2007).
  - Chinese: 家庭再生数
- **Vaccine efficacy**
  - Definition: In epidemiological and clinical studies, vaccine efficacy refers to the percentage reduction in the attack rate of the vaccinated cohort compared to the unvaccinated cohort as observed in randomized controlled (field) trial.
  - Source: Milwid et al. (2016).
  - Chinese: 疫苗效能
- **Vaccine effectiveness**
  - Definition: Vaccine effectiveness refers to the ability of a vaccine to prevent infection or related outcomes in the population in real-world conditions.
  - Source: Milwid et al. (2016).
  - Chinese: 疫苗有效性
- **Herd immunity**
  - Definition: a form of indirect protection from infectious disease that occurs when a large percentage of a population has become immune to an infection, thereby providing a measure of protection for individuals who are not immune.
  - Source: [https://en.wikipedia.org/wiki/Herd\\_immunity](https://en.wikipedia.org/wiki/Herd_immunity)
  - Chinese: 群体免疫
- **Herd immunity threshold, Eradication fraction**
  - Symbol:  $S_h$
  - Definition: Under a compartmental framework with homogenous mixing, the minimum fraction of susceptibles that must be immune (or vaccinated at birth (assuming 100% vaccine efficacy)) to reduce  $R_t$  below 1 and eradicate infection; that is, by the removal of susceptible hosts.
  - Source: Mishra et al. (2010).
  - Chinese: 群体免疫阈值
- **Epidemic**
  - Definition: an increase in the frequency of occurrence of a disease in a population above its



- baseline or expected level in a given period.
- Source: <https://en.wikipedia.org/wiki/Epidemic>
- Chinese: 流行病
- **Epidemic curve**
  - Definition: the frequency of new cases over time based on the date of onset of disease.
  - Source: [http://sphweb.bumc.bu.edu/otlt/MPH-Modules/EP/EP713\\_DescriptiveEpi/EP713\\_DescriptiveEpi3.html](http://sphweb.bumc.bu.edu/otlt/MPH-Modules/EP/EP713_DescriptiveEpi/EP713_DescriptiveEpi3.html)
  - Chinese: 流行曲线
- **Emerging Infectious Disease (EID)**
  - Definition: an infectious disease whose incidence has increased in the past 20 years and could increase in the near future.
  - Source: [https://en.wikipedia.org/wiki/Emerging\\_infectious\\_disease](https://en.wikipedia.org/wiki/Emerging_infectious_disease)
  - Chinese: 新发传染病

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### Films and TV Series

- Flu from South Korea
- 亚洲英雄 from Hong Kong

### Contributing

Your contributions are always welcome!

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