

Timing of Respiratory Epidemics Driving Seasonal Influenza-like Illness in the United States

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The seasonality of influenza-like illness (ILI) epidemics in the United States is well-established, with peak ILI activity generally occurring between December and February every year. However, the timing of the specific respiratory infections which contribute to the overall trajectory of each ILI season is not well understood. While traditional wisdom suggests that ILI seasons are initiated by epidemics of influenza A and followed by epidemics of influenza B, we use state-level surveillance data from the Centers for Disease Control and Prevention to show that epidemics of respiratory syncytial virus (RSV) reach their peak intensity before epidemics of influenza in over half of the last 8 ILI seasons. Improving our understanding of the temporal order of distinct respiratory infections will lead to improvements in preparedness for future outbreaks and increased understanding of the complex dynamics driving seasonal ILI.

disease surveillance | RSV | influenza-like illness | forecasting | pandemic preparedness

Influenza-like illness (ILI) affected between 9 and 41 million individuals in the United States (US) between 2010 and 2023 (1), with approximately 8% of the US population having symptomatic ILI every year (2). While many ILI cases in the US are associated with mild respiratory symptoms and afflicted patients recover quickly, the immense volume of ILI cases can put unnecessary stress on both health infrastructure and medical providers. Given this information, it is surprising that misconceptions about the sequencing of the respiratory disease epidemics contributing to the overall seasonal volume of ILI cases continue to persist among researchers and health providers. While it is understood that the overall ILI season is a combination of multiple epidemics caused by different respiratory pathogens, it is commonly believed that these epidemics are mainly caused by different genetic variants of influenza. However, this belief likely stems from systemic and historical leaning by public health surveillance systems towards influenza surveillance. Although a majority of ILI cases are attributable to influenza, many ILI cases are caused by non-influenza respiratory pathogens such as respiratory syncytial virus (RSV), rhinoviruses, parainfluenza virus (PIV), human pneumovirus (HMPV), and coronaviruses including those causing coronavirus disease 2019 (COVID-19) (3). Given this wide variety of potential sources of ILI, the temporal ordering of influenza epidemics and epidemics of non-influenza diseases is unclear, especially in the US.

Anticipating the timing of respiratory epidemics, especially the beginning of ILI seasons and the epidemics driving the start of each season, has important implications for public health. One goal of continuous ILI surveillance and forecasting is to provide healthcare workers and healthcare facilities with timelines for resource allocation and allow for preparation for incoming waves of patients afflicted with respiratory symptoms. In addition to bolstering health infrastructure, proper anticipation of impending epidemics is vital for the timely distribution of prophylactics and vaccinations. For example, RSV prophylaxis for infants (a high-risk group for serious RSV infection) using the monoclonal antibody nirsevimab must be administered before the onset of an infant's first RSV season; infants born during the RSV season should receive nirsevimab within a week of birth (4). Prediction of the start of the RSV season would allow healthcare facilities to increase stock of the prophylactic well before a surge in RSV cases occurs.

To better understand how ILI seasons begin, we use time series analysis methods to determine the timing of respiratory outbreaks in the United States and highlight how many epidemics of RSV at the state level corresponded with the start of the ILI season in those states. We show that in such state-ILI seasons, the peak volume of RSV hospitalizations occurs before the peak volume of influenza hospitalizations. We also demonstrate that the presence of COVID-19 during the 2019–2020, 2021–2022, and 2022–2023 ILI seasons substantially affected the seasonality and duration

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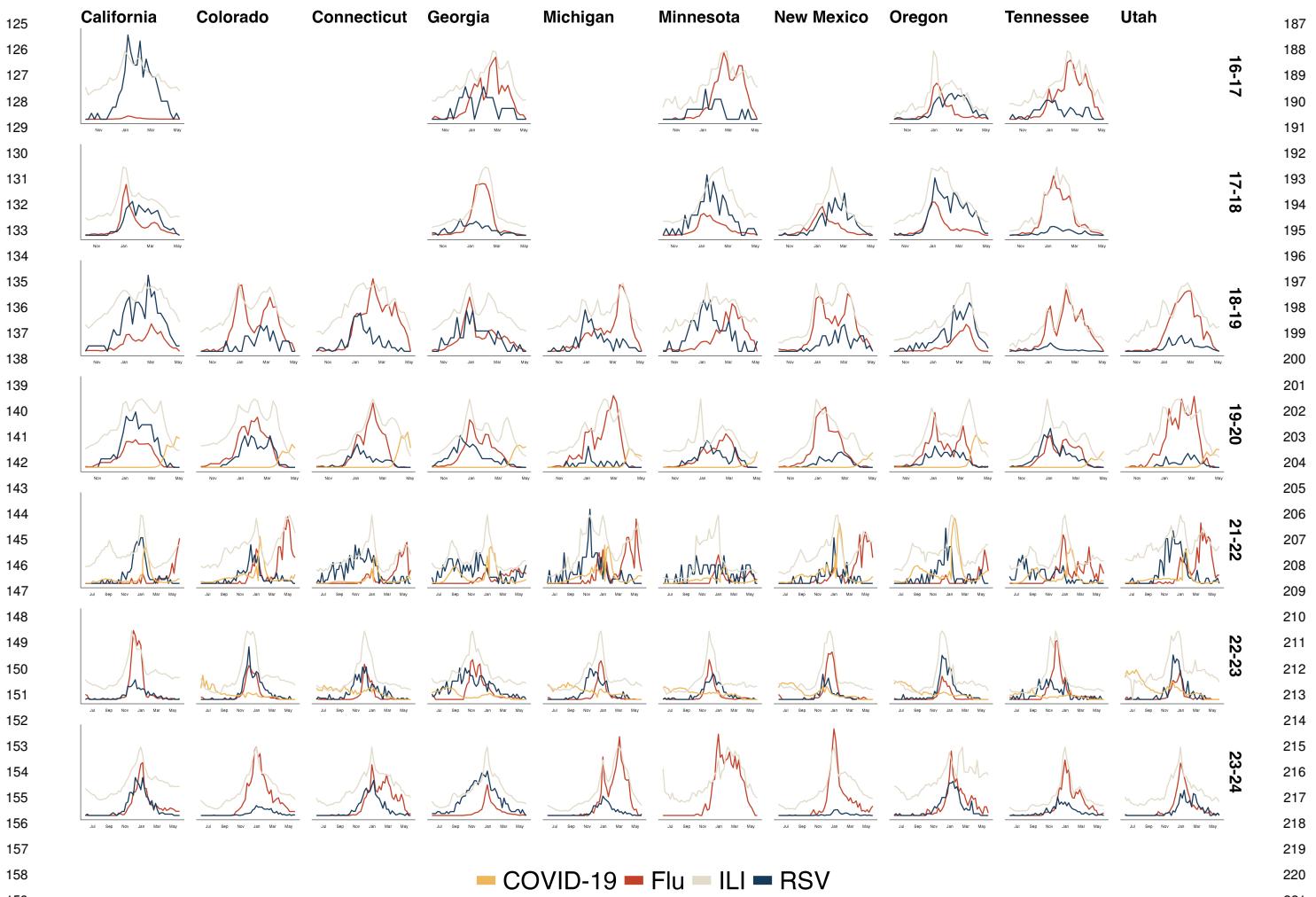


Fig. 1. Variation in the peak timings of RSV, Influenza, and COVID-19 between the 2016-2017 ILI season and the 2023-2024 ILI season. Curves are generated using a stacked regression scheme using the LASSO estimator as the underlying model, such that the maximum value of each curve for an individual plot indicates the peak volume of hospitalizations or outpatient visits for each disease. Date ranges in the first 4 years are shorter than those in the latter 3 years due to changes in data reporting structures. Abbreviations - COVID-19: coronavirus disease 2019, flu: influenza, ILI: influenza-like illness, RSV: respiratory syncytial virus

of epidemics of both RSV and influenza. These analyses reinforce our argument that RSV epidemics "kick off" ILI seasons and show that the RSV outbreaks are followed by outbreaks of other respiratory epidemics such as influenza A, influenza B or COVID-19.

Results

In 32 out of 52 (61.5%) state-seasons, seasonal RSV volume reached peak intensity before the seasonal influenza (**Figure 1**). Peak ILI activity generally occurred between November and February each season, corresponding with epidemics of RSV, influenza, or synchronous increases in the volume of both infections. There were two main exceptions to this pattern. First, the 2019-2020 ILI season was significantly impacted by the onset of the COVID-19 pandemic in March 2020, resulting in a dramatic uptick in COVID-19 volume and a corresponding steep decline in both reported RSV and reported influenza volume to near-zero values. This flattening extends throughout the 2020-2021 ILI season, with all analyzed states reporting little to no hospitalizations attributable to either RSV or influenza. In the 2021-2022

influenza season, we observed a deviation from the usual seasonal ILI pattern; in this season, we observed increases in ILI activity in both summer 2021 (July - September) and spring 2022 (March - May). The summer 2021 increase in ILI activity was fueled by overlapping RSV and COVID-19 outbreaks, while the spring 2022 ILI outbreak was driven by increases in influenza infections.

We also observed variable strength of respiratory epidemics in each state. In California, RSV hospitalizations offered the strongest signal in 6 out of 9 seasons, while in states such as Colorado, Connecticut, Georgia, Michigan, Tennessee, and Utah, influenza hospitalizations had the strongest signal in a majority of seasons. Similarly, there was variation in the timing of peaks within each infection type; influenza volume generally peaked in late December or early January, while RSV demonstrated a wider range of peak times, ranging from October (Minnesota in 2021-2022 and Connecticut in 2021-2022) to March (New Mexico in 2018-2019).

In light of the dramatic deviation from normal seasonal patterns caused by the COVID-19 pandemic, we evaluated if the temporal relationship between RSV and influenza peaks

249 differed before and after the pandemic. We divided the ILI
250 seasons into a pre-pandemic period (2016-2017, 2017-2018,
251 and 2018-2019 seasons) and post-pandemic period (2022-2023,
252 2023-2024 seasons) and again calculated the number of state-
253 seasons in which RSV peaked before influenza. We found
254 that during the pre-pandemic period, 11 out of 22 (50%) of
255 state-seasons had RSV peak before influenza, while in the
256 post-pandemic period, only 6 out of 20 (30%) of state-seasons
257 had RSV peak before influenza.

258 Discussion

259 Our finding that RSV epidemics initiated a majority of ILI
260 seasons in the United States has significant implications for
261 public health authorities, medical providers, and healthcare
262 facilities. Identifying increases in RSV hospitalizations as a
263 signal for the start of the yearly ILI season and understanding
264 the possible early start (i.e., before December or January)
265 of seasonal RSV epidemics should improve the preparedness
266 of healthcare workers and facilities before patient volume
267 exceeds the capacity of health infrastructure. Our findings
268 concur with those of past studies evaluating the timing
269 of RSV and influenza epidemics in Argentina (5) and on
270 the global scale (6) which identified that RSV epidemics in
271 temperate regions occurred before influenza epidemics. These
272 results promote future research into the accurate timing
273 and anticipation of respiratory epidemics, especially the
274 development of new predictive tools which can take advantage
275 of the immense number of data streams available through
276 modern technologies.

277 It is notable that the clearest temporal ordering for the
278 different respiratory outbreaks occurred during the 2022-
279 2023 ILI season, as one would expect that the co-circulation
280 of an additional respiratory disease (COVID-19) would
281 negatively impact surveillance of others like RSV or influenza.
282 However, we expect that increased testing for respiratory
283 infections and heightened scrutiny of respiratory disease-
284 related hospitalization in fact led to improved surveillance
285 during that ILI season.

286 There are several limitations to this study. Our analysis
287 was limited to only the 10 states that supplied data to both
288 CDC respiratory illness surveillance systems: CDC ILINet
289 and CDC RESP-NET. These states have historical data for
290 both ILI volume and RSV or influenza infection volume
291 in time periods both pre- and post-COVID-19 pandemic,
292 allowing us to make comparisons and determine if post-
293 COVID-19 seasonal outbreak patterns returned to pre-
294 pandemic levels. The availability of RSV, influenza, and
295 COVID-19 data for all 50 states is available through the
296 CDC's National Syndromic Surveillance Program (7), but this
297 initiative was only started after the COVID-19 pandemic and
298 therefore has only data collected starting in the 2022-2023 ILI
299 season. We also acknowledge that our regression algorithm
300 do not account for the presence of other epidemics such as those
301 caused by HMPV or PIV; however, these diseases are more
302 mild among adults and are unlikely to burden healthcare
303 systems as RSV or influenza do.

304 Materials and Methods

305 **Data sources.** Our analyses utilize publicly available data collected
306 by two major CDC surveillance systems: the US Outpatient

311 Influenza-like Illness Surveillance Network (ILINet) and the
312 Respiratory Virus Hospitalization Surveillance Network (RESP-
313 NET) (8). ILINet is a collaboration between national, state, and
314 local health departments and healthcare facilities that records
315 the volume of hospital visits for any influenza-like illness and
316 submits those records to the CDC for centralized data storage.
317 RESP-NET is a combination of three surveillance systems which
318 cover the three main respiratory infections covered in this report:
319 FluSurv-NET (monitoring influenza), COVID-NET (monitoring
320 COVID-19) and RSV-NET (monitoring RSV). Since we were
321 primarily interested in the temporal ordering comparing RSV
322 and influenza, we restrict our analyses to only the states reporting
323 to RSV-NET (9), which monitors laboratory-confirmed, RSV-
324 associated hospitalizations among children and adults. RSV-NET
325 began tracking RSV hospitalizations among adults in the 2016-2017
326 season and comprises 161 counties and county equivalents in 13
327 states participating in the Respiratory Virus Surveillance Network.
328 RSV-NET covers more than 30 million people and includes an
329 estimated 9% of the US population. We restrict our analysis to
330 only hospitalizations among adults to ensure that the maximum
331 amount of available data was incorporated.

332 We measure the overall intensity of each ILI season using data
333 from ILINet. ILINet data is presented as the percentage of all
334 outpatient visits for influenza-like illness as reported by sentinel
335 sites. We also measure the case volume of influenza, COVID-19,
336 and RSV using the RESP-NET dataset (7). Data from RESP-NET
337 is reported as the percent of all emergency department visits by
338 age group associated with each infection type. For example, a
339 value of 6.5% for influenza for adults aged 18 and over indicates
340 that 6.5% of all emergency department visits for adults aged 18
341 and over were associated with influenza infections.

342 Our final analysis incorporated 62 state-ILI seasons, with data
343 aggregated at the weekly level. In the 2016-2017 ILI season, only
344 5 states (California, Georgia, Minnesota, Oregon, and Tennessee)
345 supplied both flu and RSV hospitalization data. In the 2017-
346 2018 season, those 5 states were joined by New Mexico. For the
347 following 5 ILI seasons (2018-2019, 2019-2020, 2021-2022, 2022-
348 2023, and 2023-2024), we had hospitalization and ILI data for
349 10 states (the previously noted 6 states in addition to Colorado,
350 Connecticut, Michigan, and Utah). We exclude the 2020-2021
351 ILI season from analysis because almost all records included no
352 volume of either influenza or RSV-associated hospitalizations but
353 an immensely high volume of COVID-19 associated hospitalizations.
354 We additionally exclude 3 RSVNET member states from analysis
355 (New York, Maryland, and North Carolina). New York data
356 was excluded because only 2 counties supplied data. We exclude
357 Maryland and North Carolina because these states did not report
358 influenza data.

359 **Data analysis.** We used a stacked regression (10) scheme to evaluate
360 how the intensity of individual respiratory outbreaks contributed
361 to the overall trajectory of each ILI season across the analyzed
362 states. We first filtered the data to generate individual datasets
363 for each state-ILI season, where each ILI season begins in May of
364 one year and ends in June of the following year. Next, we used a
365 rescaling algorithm to take the signal characterized by each time
366 series and constrain it to the range [0, 1], where 1 represents the
367 maximum signal strength and 0 represents the minimum signal
368 strength. The algorithm takes the value of each signal at each
369 time point and divides it by the maximum signal value for each
370 ILI season.

371 We next run a LASSO regression, using 10-fold cross validation
372 to identify the best lambda value. The regression formula for each
373 state-season is:

$$374 \text{ILI} = \beta_{\text{flut}} + \beta_{\text{RSVt}} + \beta_{\text{COVIDt}} + \epsilon \quad [1]$$

375 where ILI is the rescaled ILI volume for the timepoint t and ϵ is
376 a generic error term. For these regressions, we use the *penalized* R
377 package (11) to remove the intercept and constrain predicted values
378 for each individual predictor to be positive. We then take the beta
379 coefficients from the LASSO model and multiplied them by the
380 values of the rescaled ILI/hospitalization curves to obtain the time
381 series shown in Figure 1. Finally, we used those signal curves to

373	identify the ILI seasons where peak RSV intensity occurred before	435
374	peak influenza intensity; that is, when:	436
375	$t_{\text{peak RSV}} < t_{\text{peak flu or COVID}}$	437
376		438
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378	1. C for Disease Control, Prevention, Influenza - about estimated flu burden (2025).	440
379	2. JI Tokars, SJ Olsen, C Reed, Seasonal incidence of symptomatic influenza in the united	441
380	states. <i>Clin. Infect. Dis.</i> 66 , 1511–1518 (2018).	442
381	3. JA Spencer, et al., Distinguishing viruses responsible for influenza-like illness. <i>J. Theor. Biol.</i>	443
382	545 , 111145 (2022).	444
383	4. AA of Pediatrics, Nirsevimab administration (2024).	445
384	5. E Baumeister, et al., Timing of respiratory syncytial virus and influenza epidemic activity in	446
385	five regions of argentina, 2007–2016. <i>Influ. Other Respir Viruses</i> 13 , 10–17 (2019)	447
386	1750–2659 Baumeister, Elsa Duque, Jazmín Orcid: 0000-0003-3484-276x Varela, Teresa	448
387	Palekar, Rakhee Couto, Paula Savy, Vilma Giovachini, Carlos Haynes, Amber K Rha,	449
388	Brian Arriola, Carmen S Gerber, Susan I Azziz-Baumgartner, Eduardo Comparative Study	450
389	Journal Article England 2018/07/28 Influenza Other Respir Viruses. 2019 Jan;13(1):10-17.	451
390	doi: 10.1111/irv.12596. Epub 2018 Nov 20.	452
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