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AMERICAN IMMUNIZATION  
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# Discovery Session: California IIS Data in Action— Insights into Flu Vaccine Effectiveness

February 24, 2025  
4 PM ET



# Today's Presenter

- **Josh Quint, PhD, MPH**, Epidemiology Supervisor, California Department of Public Health





# Interim Influenza Vaccine Effectiveness Against Laboratory-Confirmed Influenza, California, October 2024 – January 2025

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California Department of Public Health

American Immunization Registry Association Meeting

February 24, 2025

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***Disclaimer:*** The findings and conclusions in this presentation are those of the authors and do not necessarily represent the views or opinions of the California Department of Public Health or the California Health and Human Services Agency.

***Conflicts of interest:*** None





Morbidity and Mortality Weekly Report

## Interim Influenza Vaccine Effectiveness Against Laboratory-Confirmed Influenza — California, October 2023–January 2024

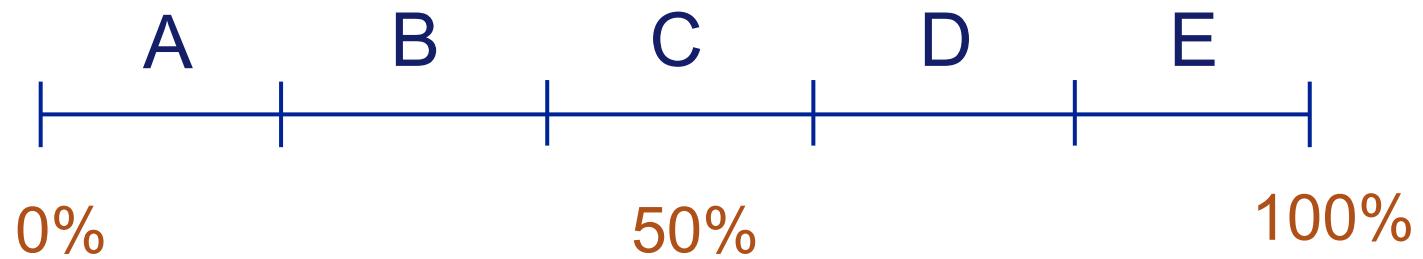
Sophie Zhu, PhD<sup>1,2</sup>; Joshua Quint, PhD<sup>2</sup>; Tomás M. León, PhD<sup>2</sup>; Monica Sun, MPH<sup>2</sup>; Nancy J. Li, MS<sup>2</sup>; Mark W. Tenforde, MD, PhD<sup>3</sup>; Seema Jain, MD<sup>2</sup>; Robert Schechter, MD<sup>2</sup>; Cora Hoover, MD<sup>2</sup>; Erin L. Murray, PhD<sup>2</sup>

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<https://pubmed.ncbi.nlm.nih.gov/38421946/>

# Quick Poll

- Over the past 10 years, what was the median estimated vaccine effectiveness for the seasonal influenza vaccine in the United States?
  - 0 - 19%
  - 20 - 39%
  - 40 - 59%
  - 60 - 79%
  - 80 - 99%



# Overview

- Background
- Methods
- Results
- Discussion



# Background

## Burden of Influenza in the United States

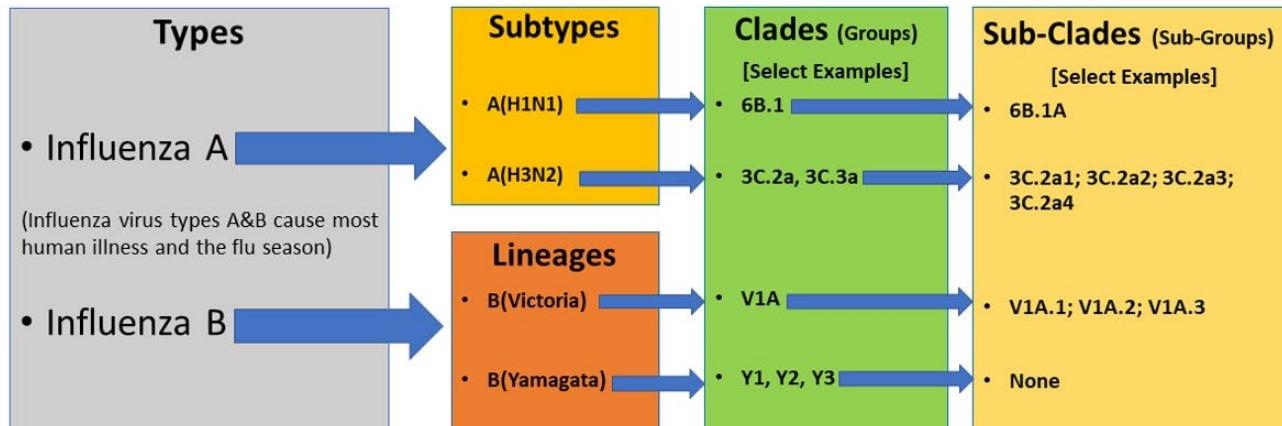
- Flu vaccine prevents millions of illnesses and flu-related doctor's visits each year.
- During [2019-2020](#), vaccination in the United States prevented an estimated:
  - 7 million influenza illnesses,
  - 3 million influenza-associated medical visits,
  - 100,000 influenza-associated hospitalizations, and
  - 7,000 influenza-associated deaths
- The Centers for Disease Control and Prevention (CDC) recommends that everyone age 6 months and older receive an annual influenza (flu) vaccine.
  - During seasons when flu vaccine viruses are similar to circulating flu viruses, flu vaccine has been shown to reduce the risk of having to go to the doctor with flu by 40% to 60%.

# Background

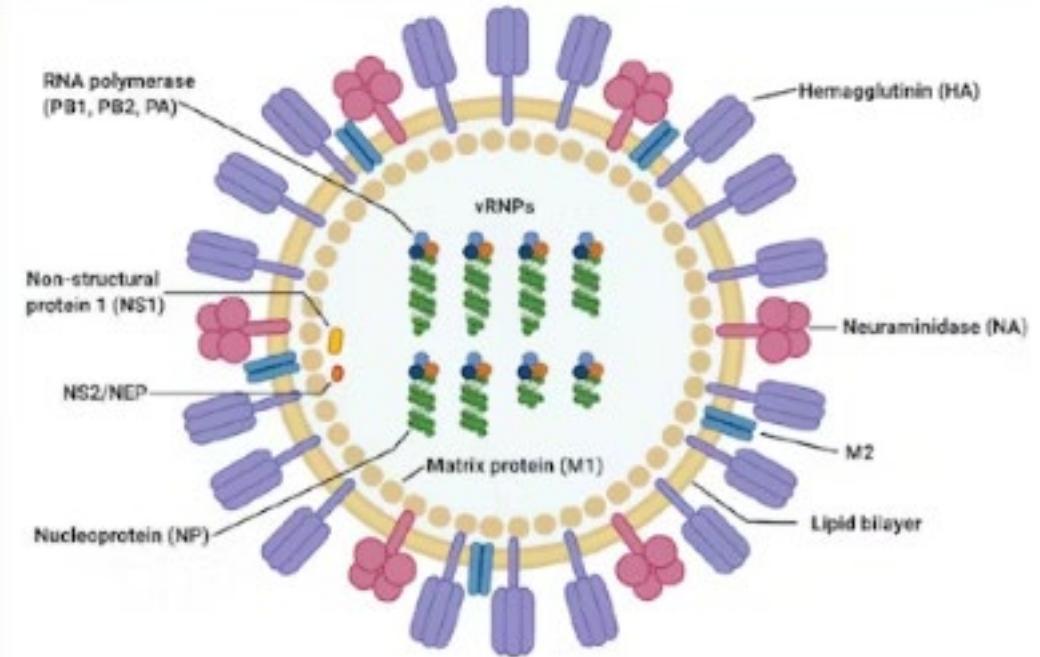
Why do we need a new vaccine every year?

- Influenza Types

## Human Seasonal Influenza Viruses



## Structure of Influenza Virus



<https://PMC3074182/>

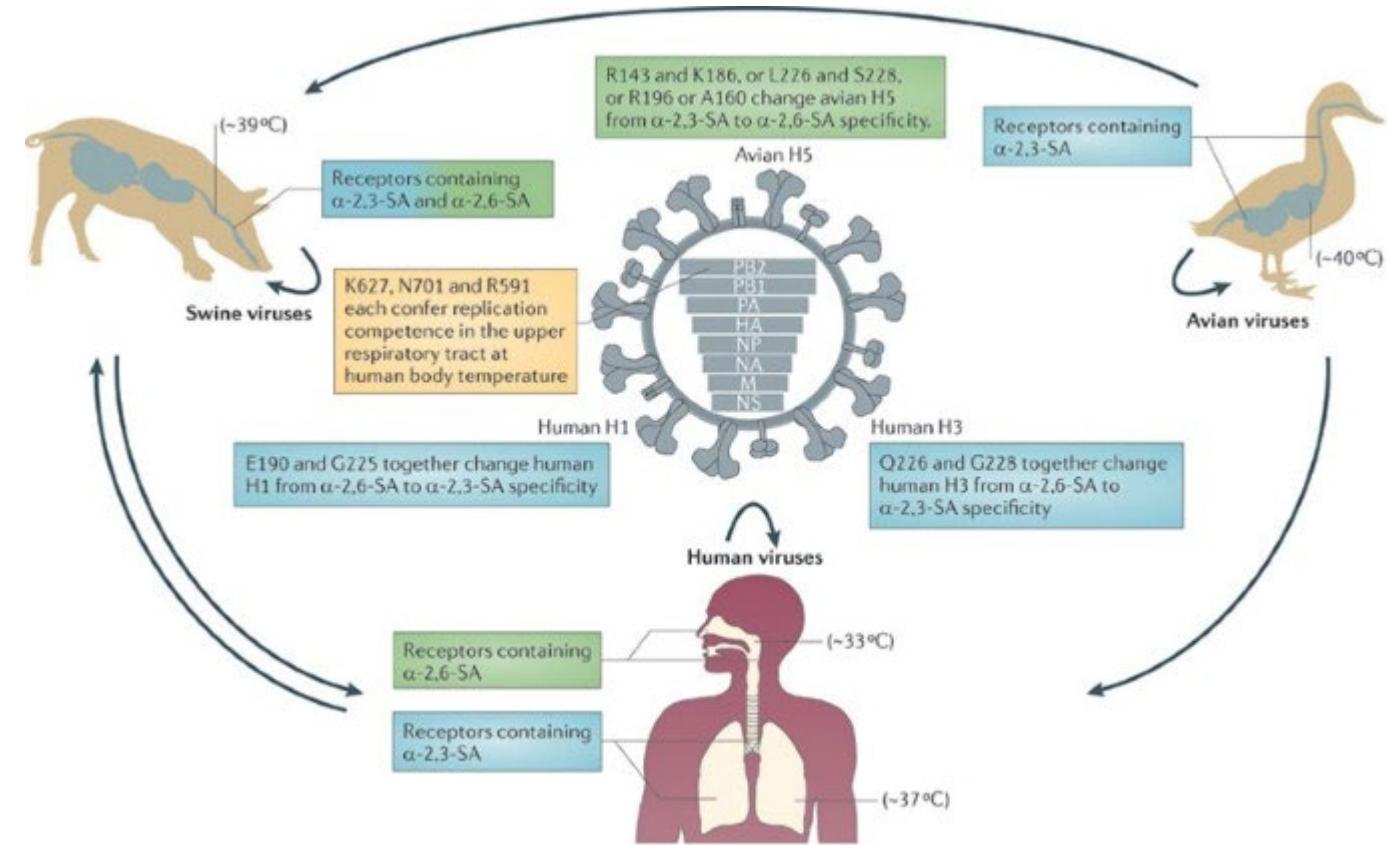
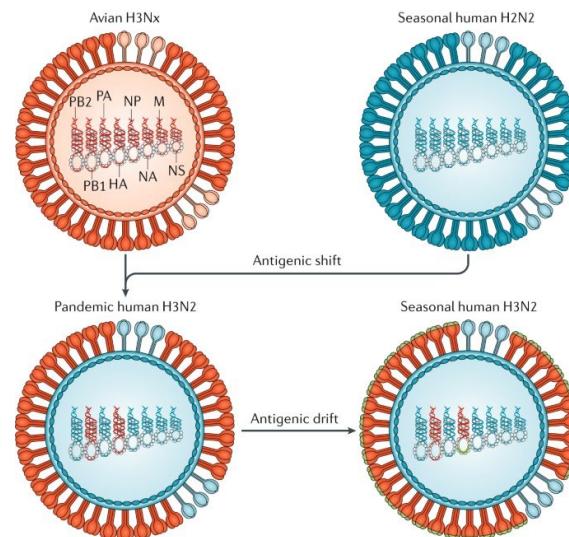
<https://www.health.harvard.edu/staying-healthy/why-do-we-need-new-flu-shots-every-year>

<https://www.cdc.gov/flu/about/viruses-types.html>

# Background

Why do we need a new influenza vaccine every year?

- Antigenic drift and shift

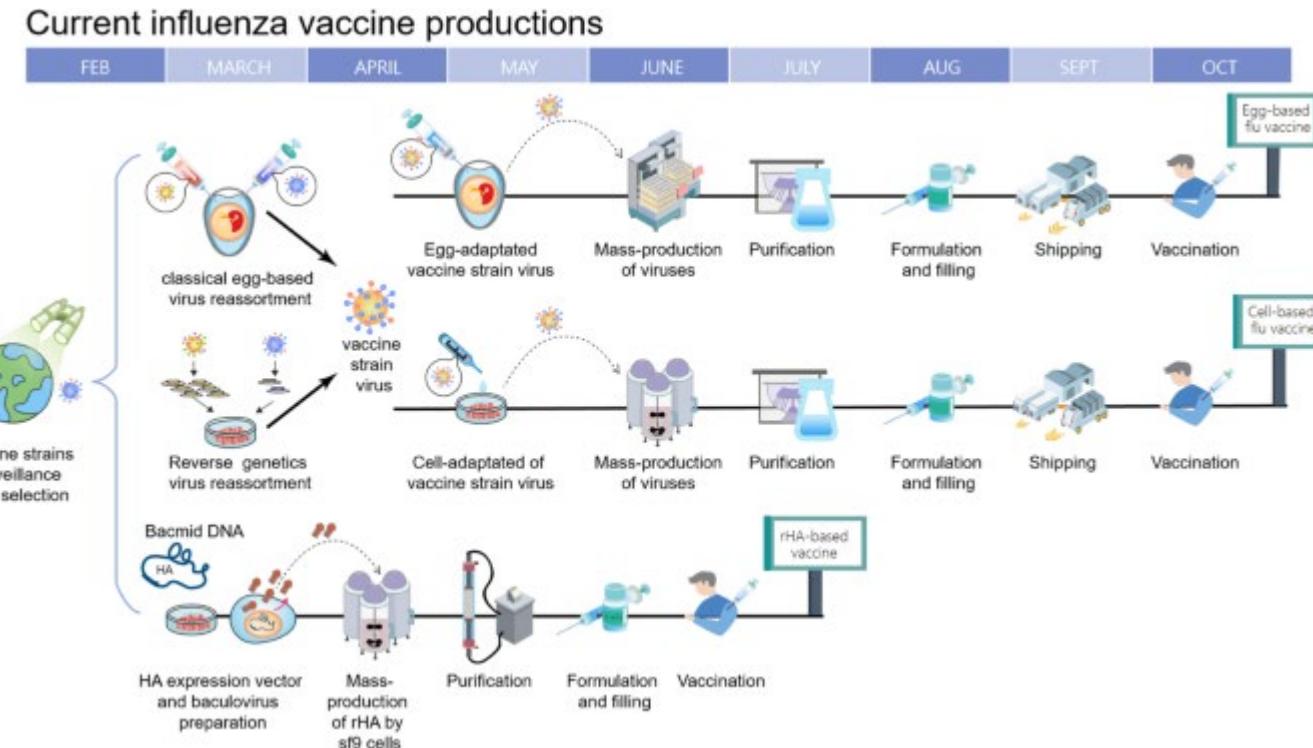


Nature Reviews | Microbiology

# Vaccine Formula

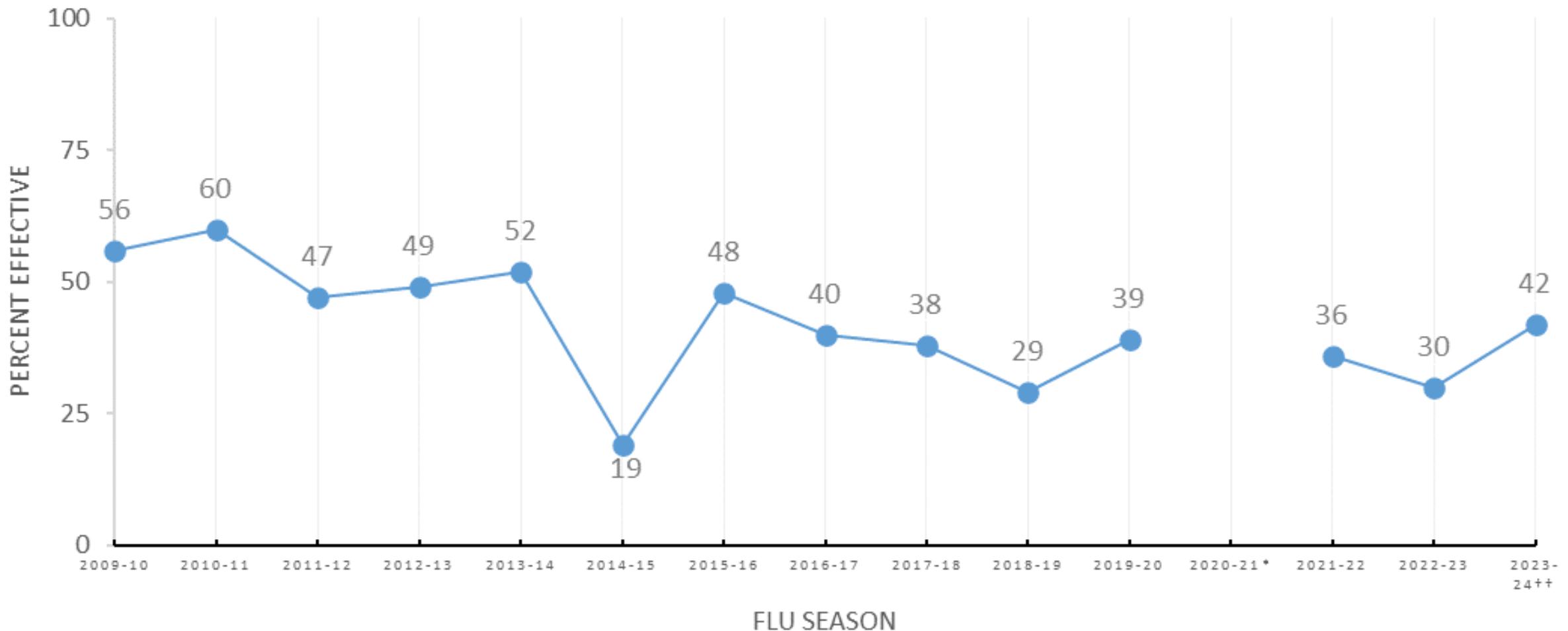
How is the seasonal vaccine formula selected?

- To obtain the best possible match between the vaccine and the circulating viruses, the FDA, WHO, [CDC](#) and other partners review data on the circulating flu strains from around the world
- In late February, the FDA convenes its vaccines [advisory committee](#) to review data and recommend which flu virus strains to include in the vaccines for the upcoming U.S. flu season
- Once the strains are selected, vaccine manufacturers begin the process to include the newly selected flu strains in their FDA-approved vaccines



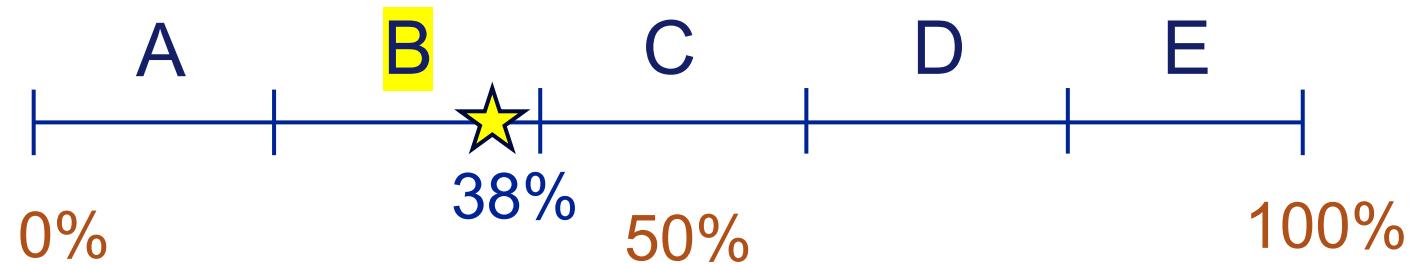
# SEASONAL FLU VACCINE EFFECTIVENESS

## UNITED STATES 2009-2024



# Quick Poll

- Over the past 10 years, what was the median estimated vaccine effectiveness for the seasonal influenza vaccine in the United States?
  - 0 - 19%
  - 20 - 39%**
  - 40 - 59%
  - 60 - 79%
  - 80 - 99%





# Background

Why calculate vaccine effectiveness?

- Having information about vaccine effectiveness is important to:
  1. Understand how well the previous vaccine composition selection performed
  2. Understand the relative importance of other (non-pharmaceutical) interventions

# Background

Why calculate vaccine effectiveness?

- CDC publishes interim estimates from their hospital network platforms in late February



## Interim Estimates of 2023–24 Seasonal Influenza Vaccine Effectiveness – United States

Weekly / February 29, 2024 / 73(8);168–174

[Print](#)

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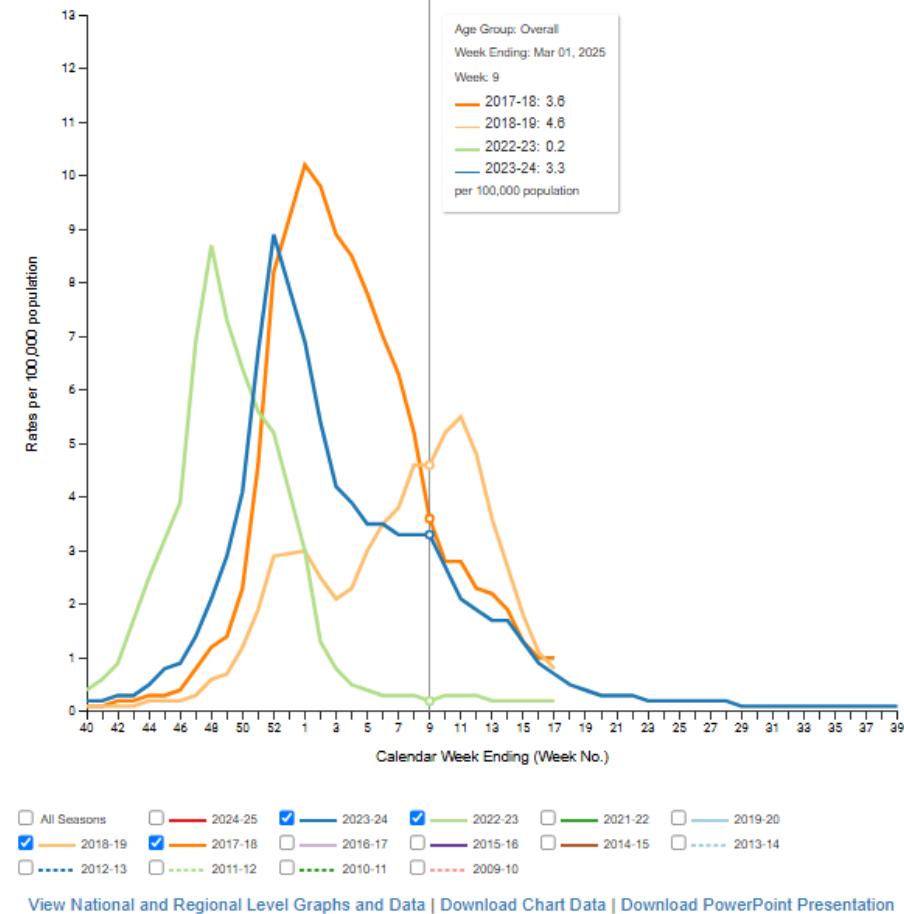
# Background

Why calculate vaccine effectiveness?

- CDC publishes interim estimates from their hospital network platforms in late February
- Flu activity for most seasons peaks before the end of February

Age Group: Overall   ?

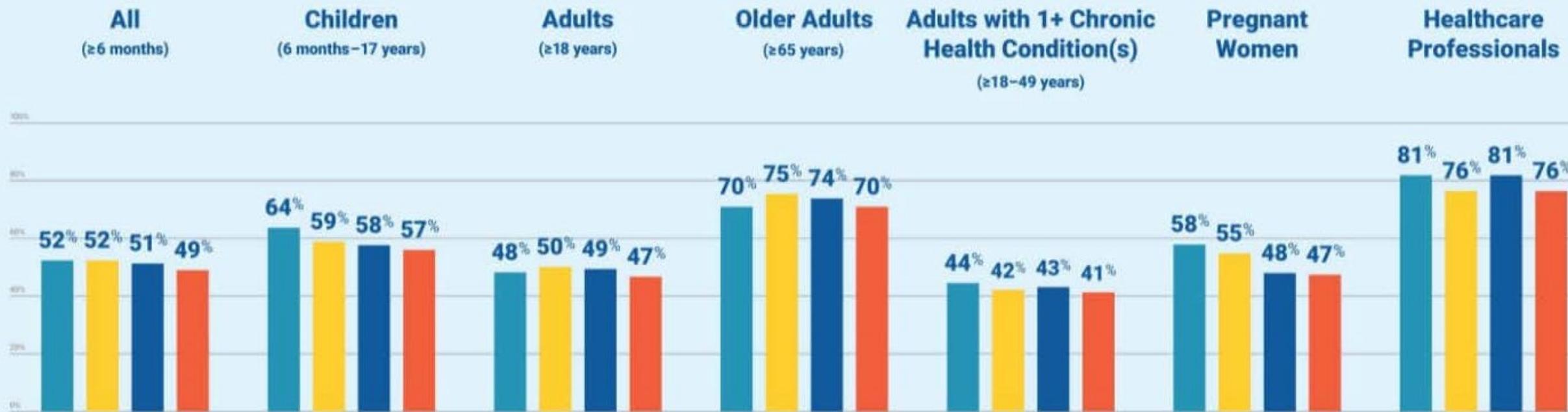
Laboratory-Confirmed Influenza Hospitalizations  
Preliminary cumulative rates as of Feb 15, 2025  
FluSurv-NET :: Entire Network :: Overall Age Group :: Weekly Rate



# Influenza Vaccination Coverage by Population



■ 2019–2020 season ■ 2020–2021 season ■ 2021–2022 season ■ 2022–2023 season



Receipt of ≥1 dose of influenza vaccine during the season

Source: Centers for Disease Control and Prevention (CDC)\*

\*Percentages have been rounded

**Annual vaccination is the best way to help protect against flu and potentially serious complications**  
Visit [www.nfid.org/flu](http://www.nfid.org/flu) to learn more about how you can help #FightFlu  
<https://www.nfid.org/resource/influenza-vaccination-coverage-by-population/>



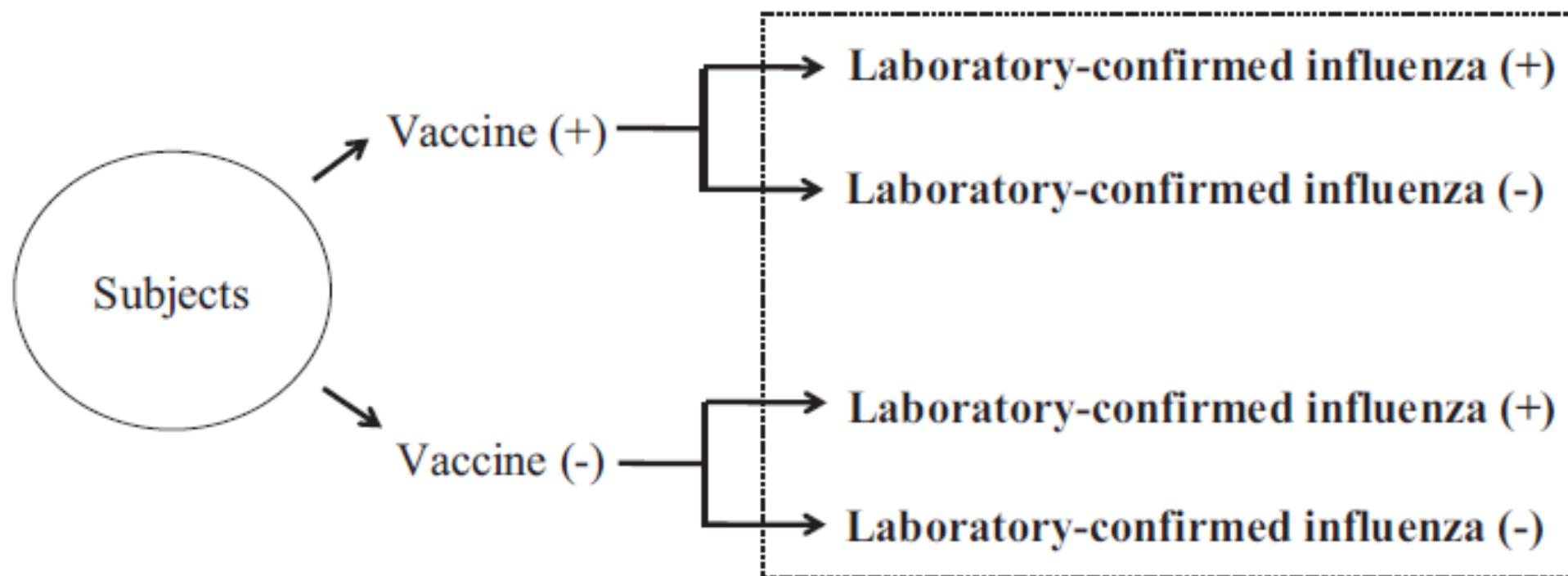
# Background

How could earlier vaccine effectiveness estimates be useful?

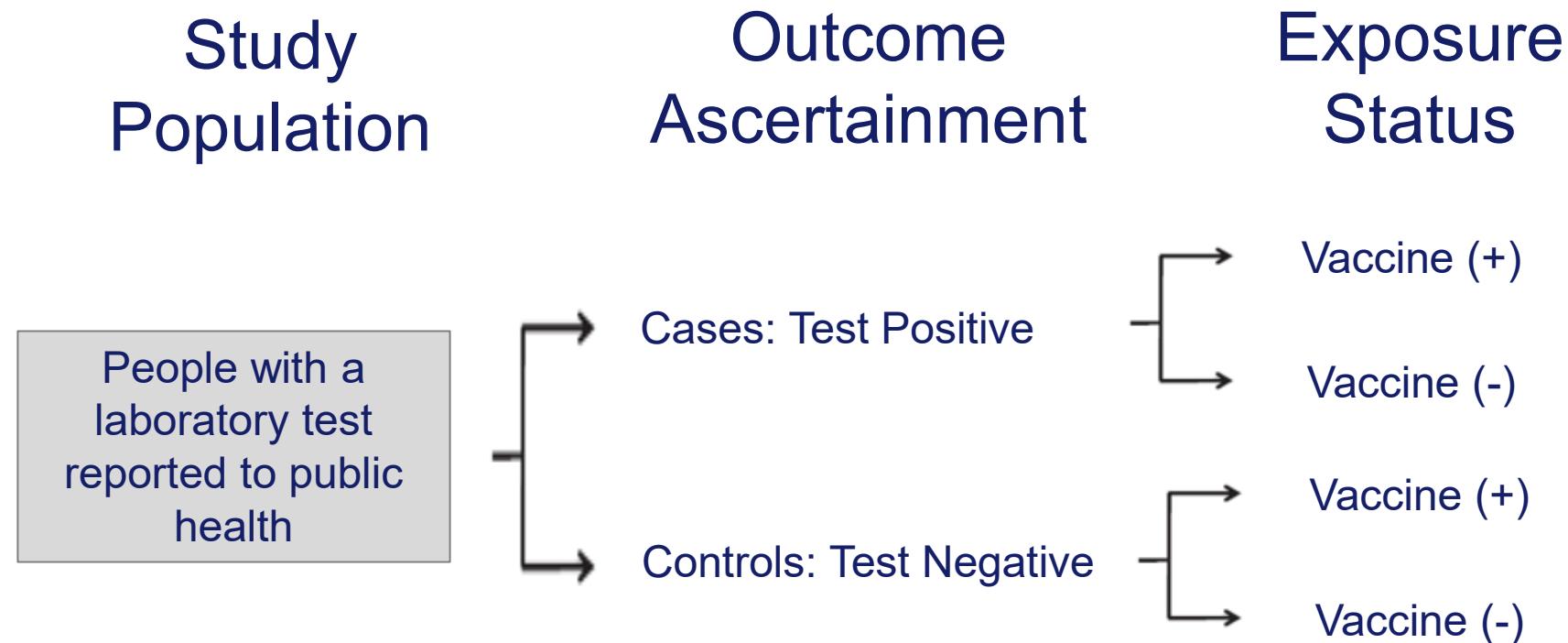
- Inform messaging regarding importance of vaccination
- Inform messaging about importance of non-pharmaceutical preventive measures (masks, distancing)
- Support resource planning for a potential high-severity, low effectiveness scenario (anti-viral availability, hospital capacity)

# Randomized Control Trial (RCT)

## Cohort Design (Observational)



# Case Control Design (Observational)

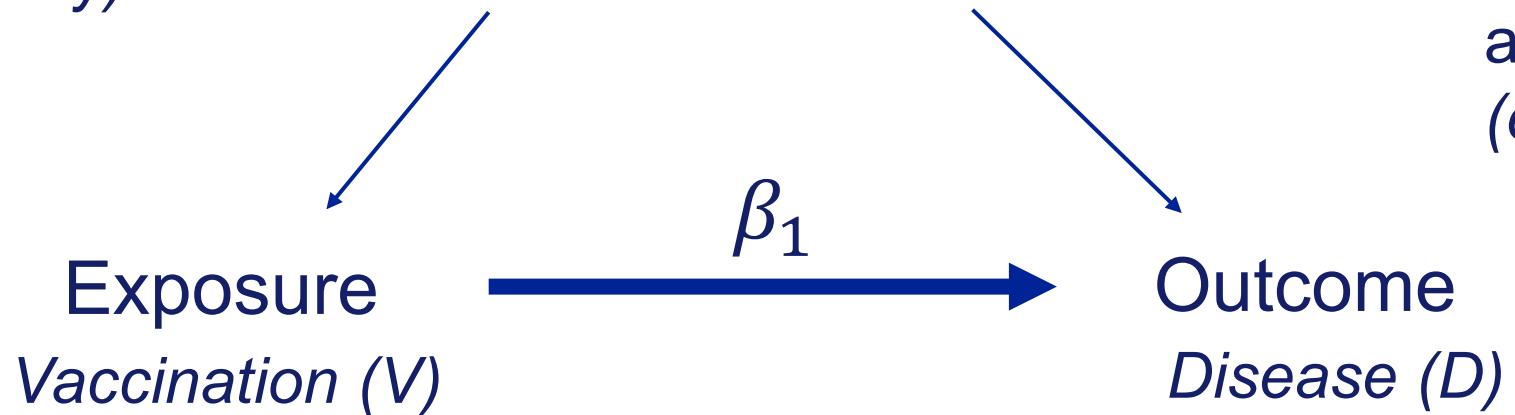


# Target Parameter

$\beta_1$  = **causal effect** of vaccine on disease (efficacy)

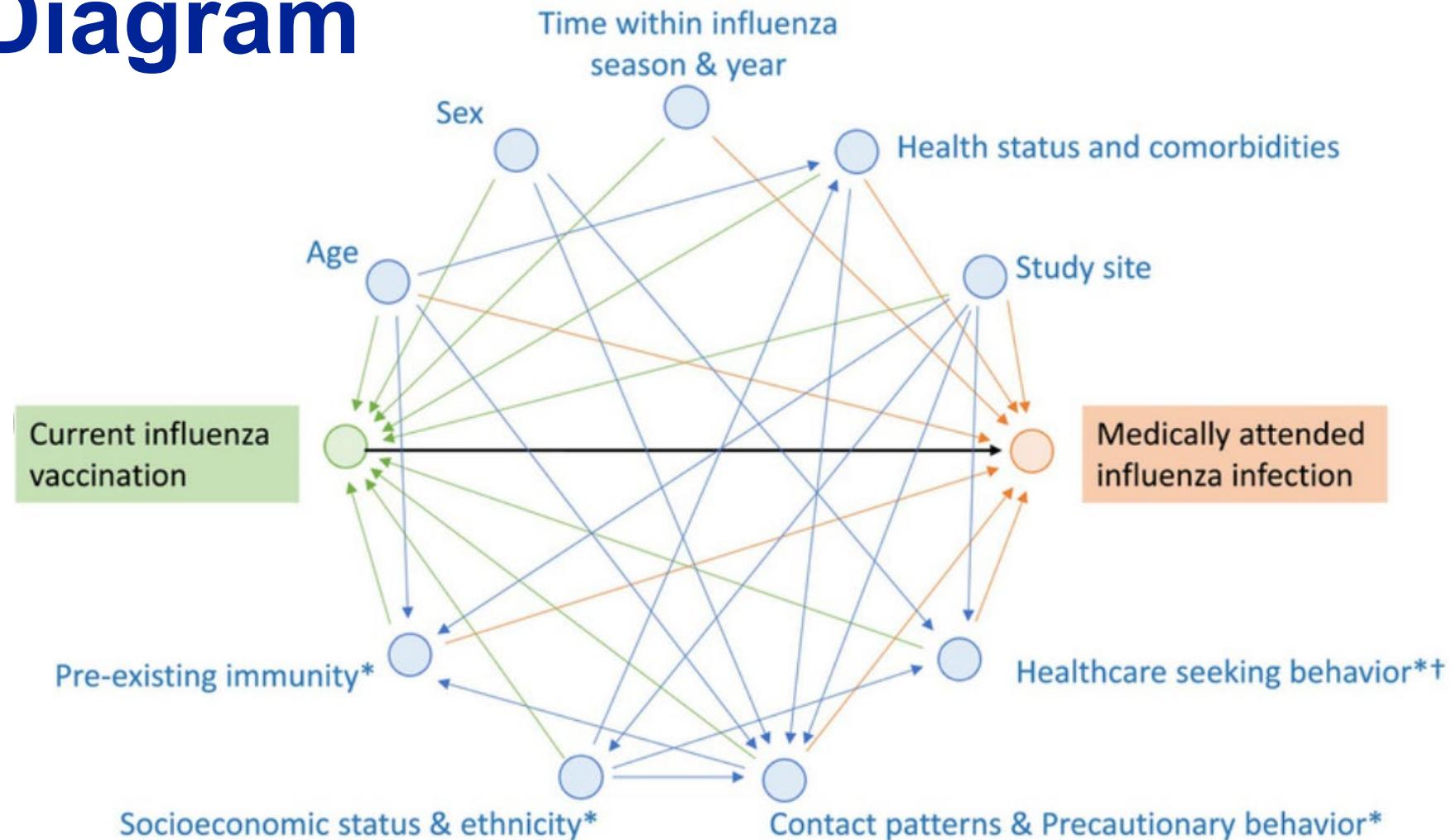
Covariates (Confounders)

$\beta'_1$  = **statistical association** between vaccine and disease (effectiveness)



$$\ln(\text{odds}(D = 1)) = \beta_0 + \beta_1 * V + \beta_n C_n$$

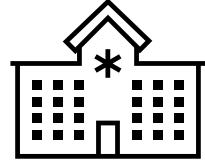
# Causal Diagram



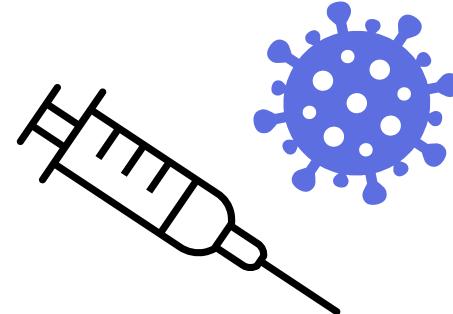
# Considerations



Population:  
Pediatric, Adult



Setting:  
Inpatient, Outpatient



Influenza VE

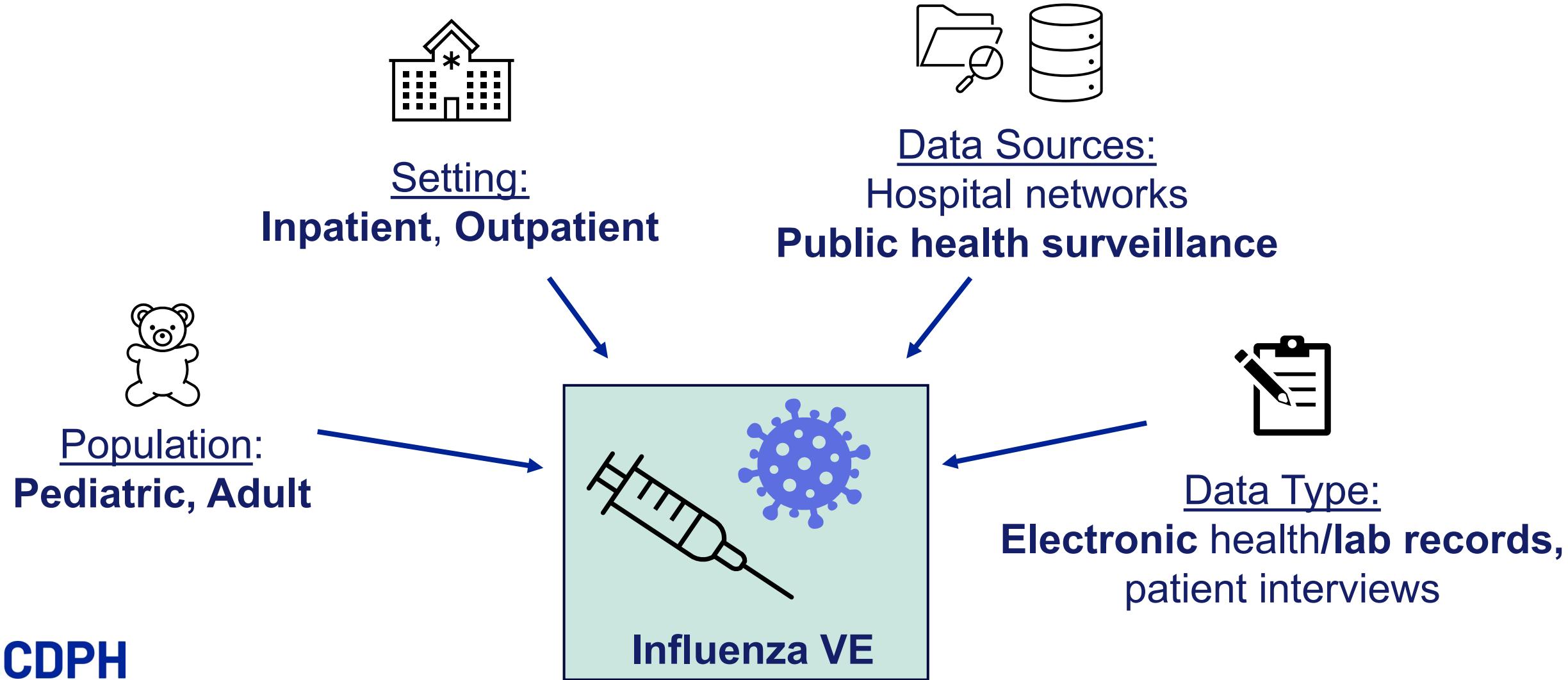


Data Sources:  
Hospital networks  
Public health surveillance



Data Type:  
Electronic health/lab  
records, patient interviews

# Considerations



# New California Data Reporting Requirements

- January 1, 2023
  - **All vaccination records** must be reported to the California Immunization Registry (CAIR)
  - Previously, only certain types of providers were required to report
- June 15, 2023:
  - **All influenza test results** must be reported to California Reportable Disease Information Exchange (CalREDIE)
  - Previously only positive results were reported



# New California Data Reporting Requirements



- All influenza test results must be reported (06/2023)



- All vaccination records must be reported (01/2023)

	Test Positive	Test Negative
Vaccinated		
Unvaccinated		

# New California Data Reporting Requirements



- All influenza test results must be reported (06/2023)



- All vaccination records must be reported (01/2023)

	Test Positive	Test Negative
Vaccinated		
Unvaccinated		

# Vaccine Effectiveness Formula

## Vaccine Effectiveness (VE)

$$VE = \frac{\text{unvaccinated rate} - \text{vaccinated rate}}{\text{unvaccinated rate}} \quad \text{or} \quad = 1 - \frac{1}{RR}$$

Simulated Cohort

	Positive	Negative	Total
Vaccinated	5	95	100
Unvaccinated	50	50	100
Total	55	145	200

# Vaccine Effectiveness Formula

## Vaccine efficacy (VE)

$$VE = 1 - \text{Relative Risk} = 1 - \frac{\text{Risk in vaccinated arm}}{\text{Risk in unvaccinated arm}}$$

Simulated Cohort

	Positive	Negative	Total	Rel Risk
Vaccinated	5	95	100	0.05
Unvaccinated	50	50	100	0.50
Total	55	145	200	

$$\begin{aligned} VE &= \left(1 - \frac{0.05}{0.50}\right) \times 100 \\ &= (1 - 0.10) \times 100 \\ &= \mathbf{90\%} \end{aligned}$$



# Covariates

- Age
- Race
- Ethnicity
- Week of Test
- County of Test



# Background

Can we generate sufficiently reliable early-season VE estimates using public health surveillance data?

- 2023-2024 Influenza VE study
  - First attempt
  - Pilot
  - Feasibility
  - Accuracy

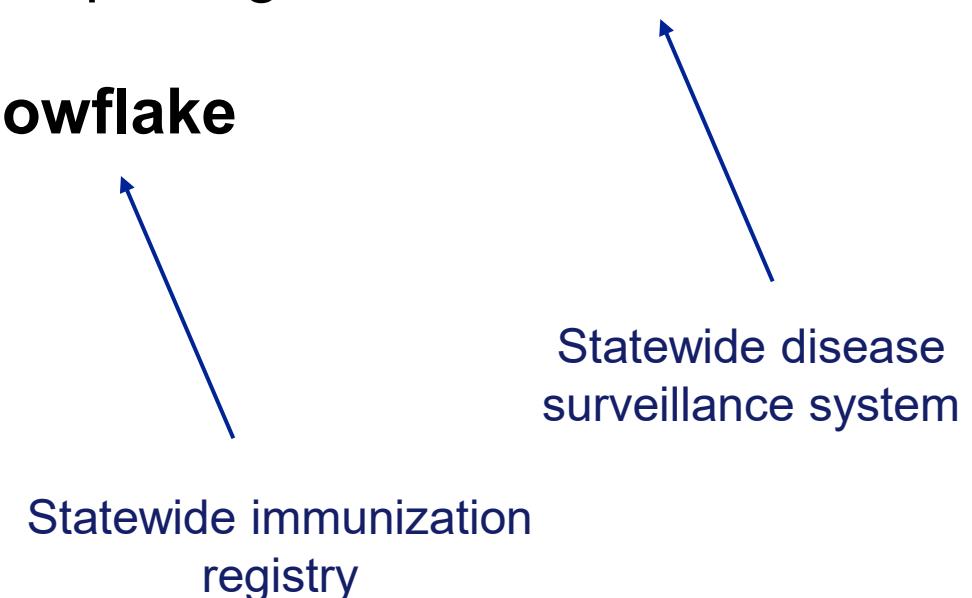
# Methods

# Case-control study (test negative design, unmatched)

- **Dates:** October 1, 2024—December 31, 2024
- **Eligibility/inclusion criteria:** California residents aged  $\geq 6$  months with a test result reported through the state electronic laboratory reporting (ELR) system
- **Exclusions:** duplicate test results for persons with multiple records, laboratories with greater than 50% weekly positive results
- **Outcome (test result):** molecular (NAAT) or culture test results for influenza (A/B)
- **Exposure (vaccination status):** documented dose of seasonal influenza vaccine in CAIR at least 14 days prior to test date
- **Analysis:**  $VE = (1 - \text{adjusted OR}) \times 100\%$ 
  - Mixed-effects logistic regression model
  - Adjusted for continuous age (natural cubic spline), categorical race and ethnicity; testing week and county as random effects

# Data Sources and Tools

- *Primary* > **Test Result** > Electronic Laboratory Reporting > **CalREDIE**
- *Secondary* > **Vaccination Status** > CAIR > **Snowflake**
- *Tertiary* > **Covariates** > (from test data)
- *Data cleaning*: **SAS, R**
- *Data modeling*: **R**
- *Data viz*: **Excel, Tableau**



# Matching

```
p_load("RecordLinkage")  
  
flu_pairs <-  
  flu2024 %>%  
  select(IncidentID, LastName, FirstName, DOB, DtLabCollect, County) %>%  
  RLBigDataLinkage(FLU_recipient %>%  
    select(product, LastName, FirstName, DOB, admin_date, County),  
    blockfld = "DOB",  
    strcmp = c("LastName", "FirstName", "County"),  
    exclude = c("IncidentID", "DtLabCollect"))
```

Deterministic  
("exact")

Probabilistic  
("fuzzy")

# Matching

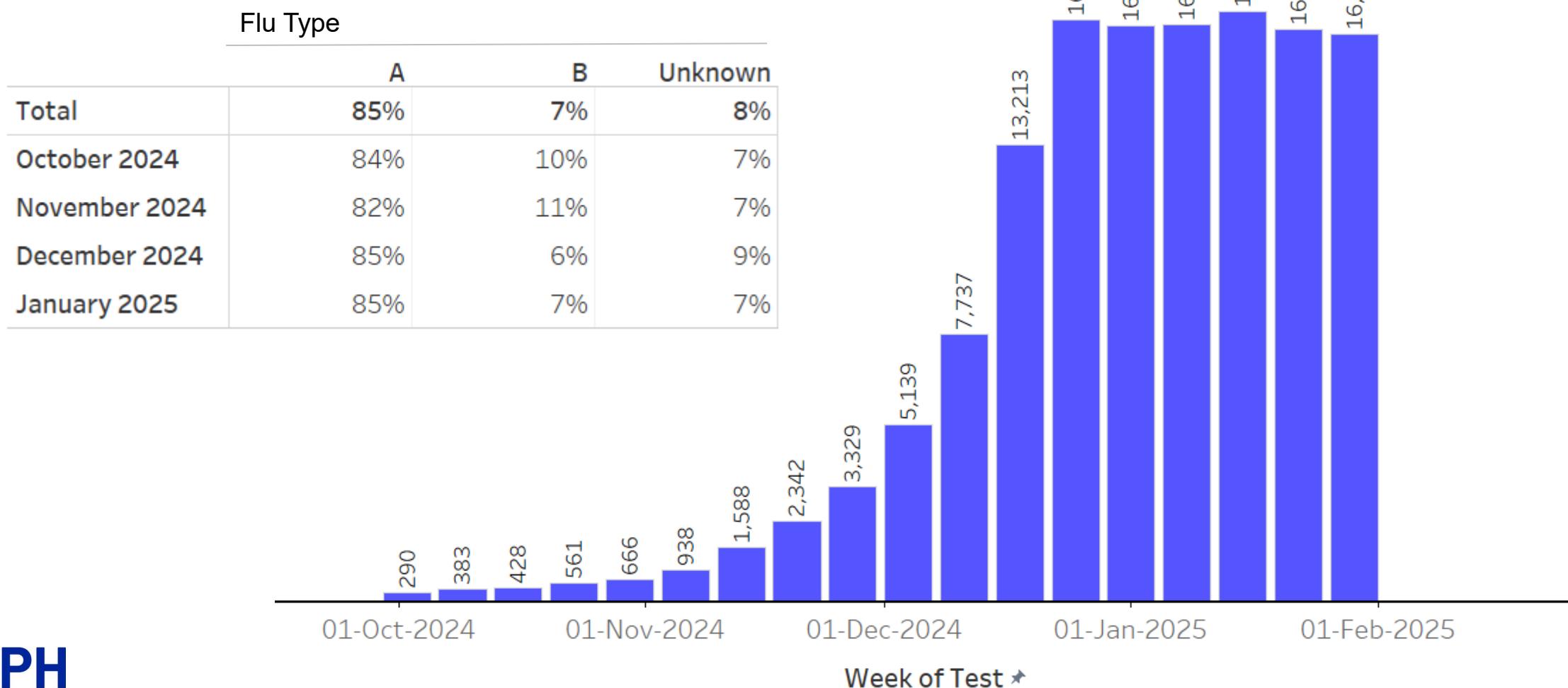
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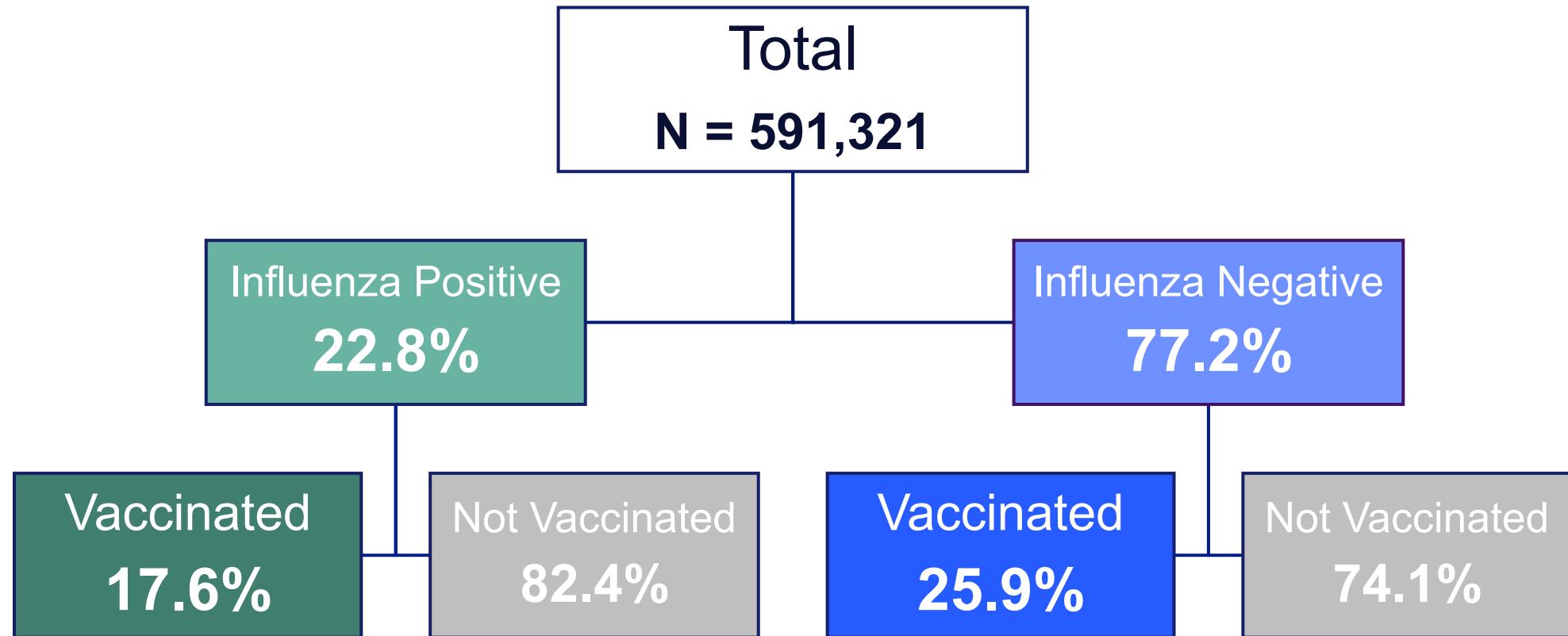
Probabilistic  
("fuzzy")

# Results

# Number of positive influenza detections by laboratories 2024–2025 season to date



# Study Population – Positivity and Vaccination



# Study Population - Demographics

	<b>Test Negative</b>	<b>Test Positive</b>
<b>Total No.</b>	456,437	134,884
<b>Age (yrs)</b> Median (IQR)	43 (20-67)	30 (11-55)
<b>Ethnicity - Hispanic or Latino</b>	24%	29%
<b>Race</b>		
White	46%	39%
Unknown	20%	22%
Other	19%	23%
Asian	8%	8%
Black	6%	6%
NHPI, AI/AN, or Multiple	<1%*	<1%*

NHPI = Native Hawaiian or Pacific Islander; AI/AN = American Indian or Alaska Native; \* <1% each

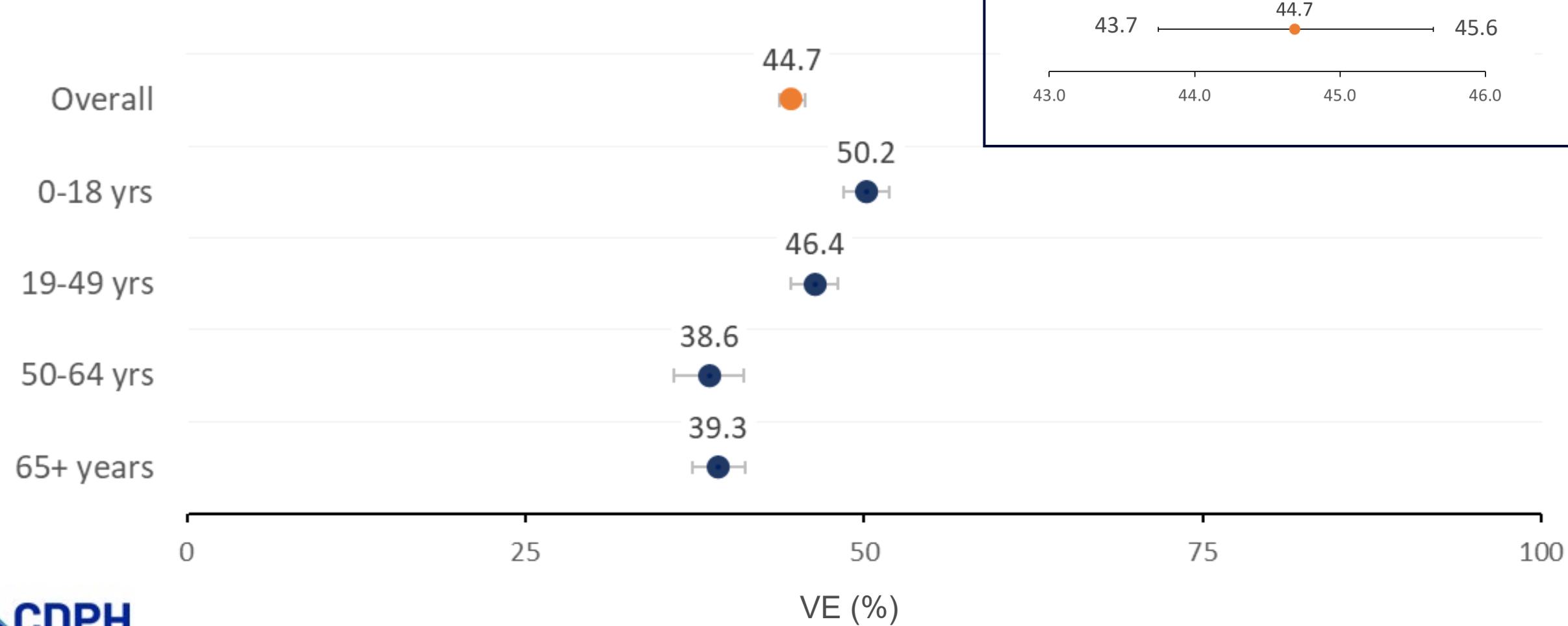


# Results Overview

- Vaccine Effectiveness (%) by **Age Group** (all types)
- Vaccine Effectiveness (%) by **Type** (A/B) and **Age Group**
- **Cumulative** Vaccine Effectiveness (%) by **Week**
- Vaccine Effectiveness (%) by **Month**
- Vaccine Effectiveness (%) by **Month** and **Type**

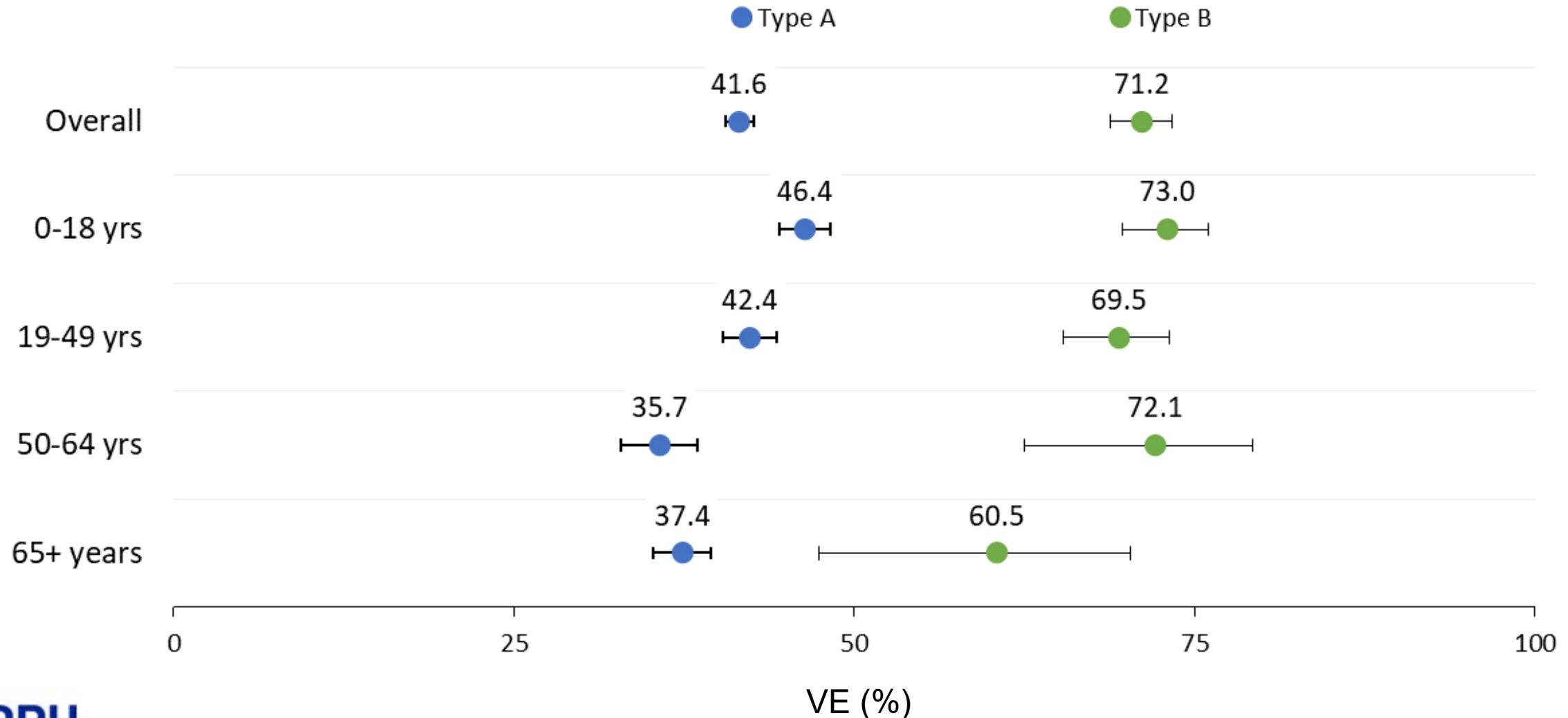
# Vaccine Effectiveness by Age Group

California October 2024 - January 2025



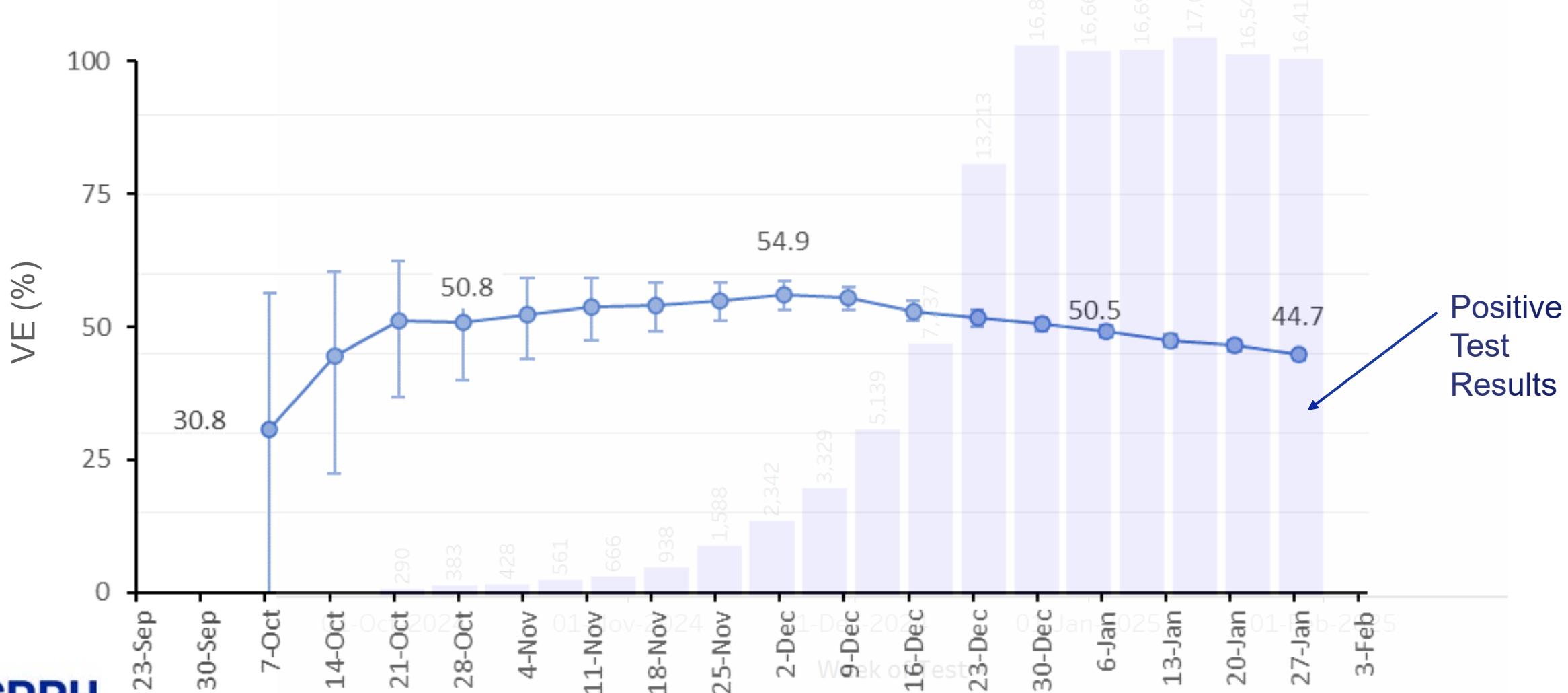
# Vaccine Effectiveness by Type and Age Group

California 2024-2025



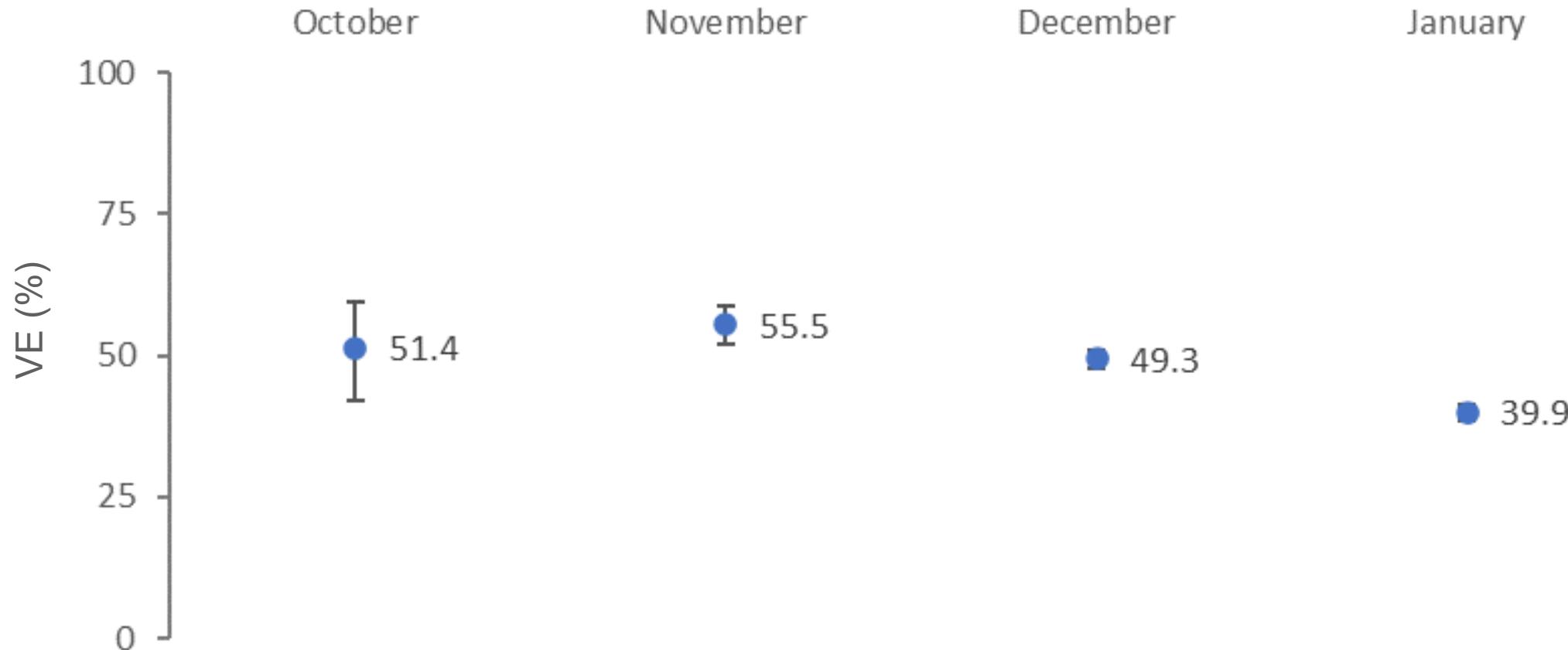
# Influenza VE Estimate (Cumulative)

California 2024-2025



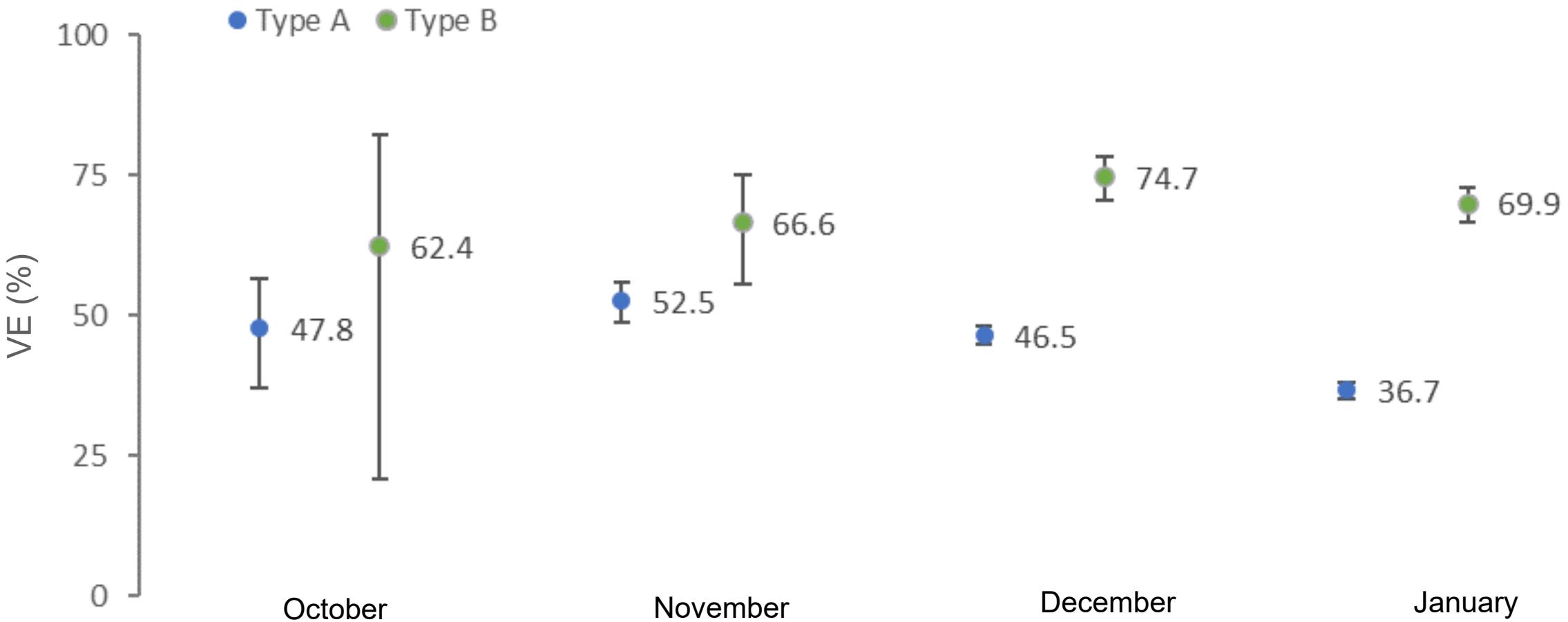
# Vaccine Effectiveness by Month

California 2024-2025



# Vaccine Effectiveness by Month and Type

California 2024-2025





# Limitations

1. **Likely incomplete documentation and reporting of mandatory vaccination and testing**
2. Inability to assess partial/full vaccination status for children aged <9 years
3. **Lack of symptom information, test setting, and outcome status (illness, hospitalization, or death)**
4. Subtype information not available for all positive influenza results
5. Unable to control for other potential confounders (health seeking behavior, pre-existing conditions)



# How did we do?

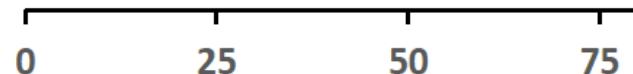


# 2023-2024 VE Platform Estimates

## Pediatric: 0-18 yrs

### CDC Vision VE Estimates

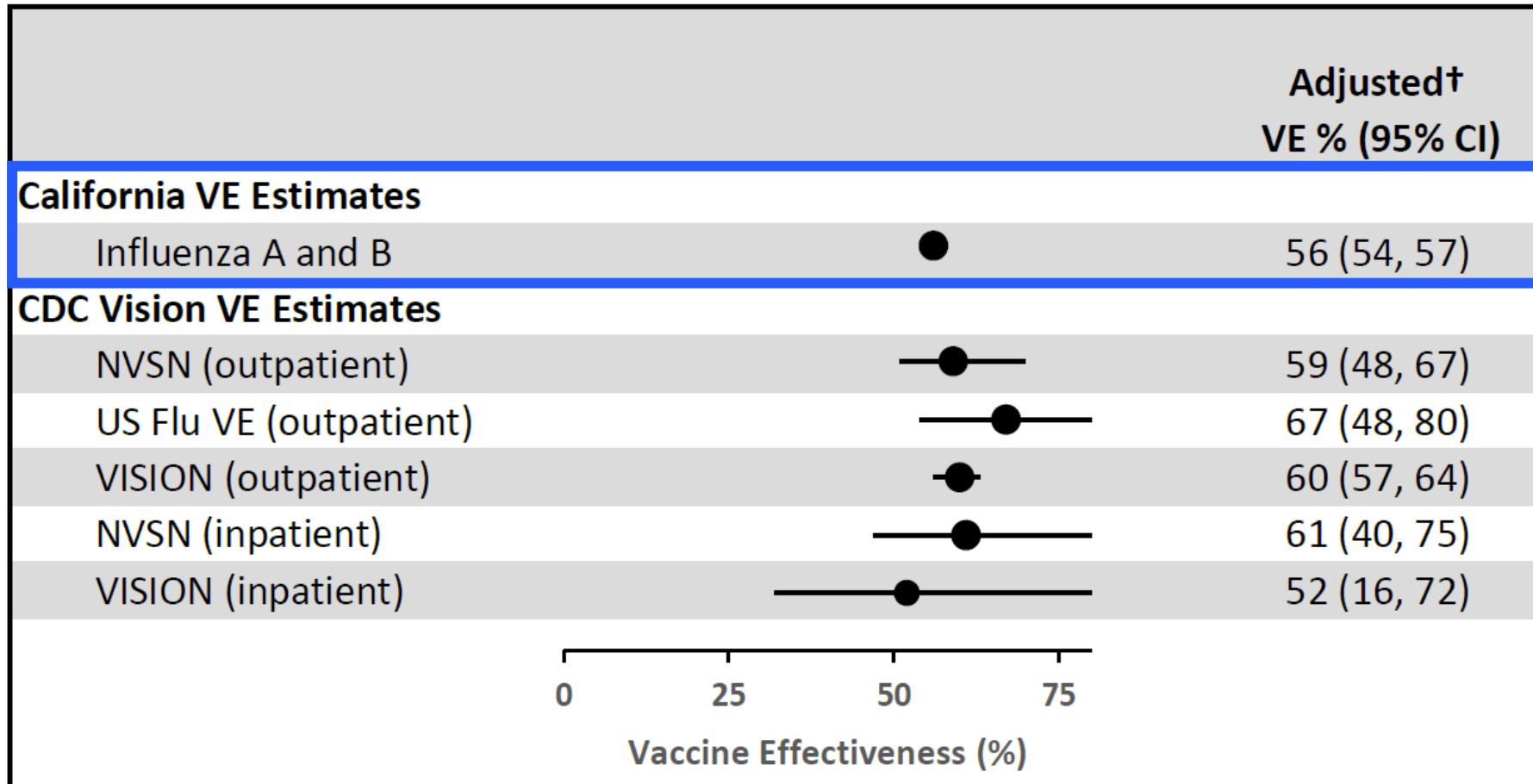
NVSN (outpatient)	59 (48, 67)
US Flu VE (outpatient)	67 (48, 80)
VISION (outpatient)	60 (57, 64)
NVSN (inpatient)	61 (40, 75)
VISION (inpatient)	52 (16, 72)



Vaccine Effectiveness (%)

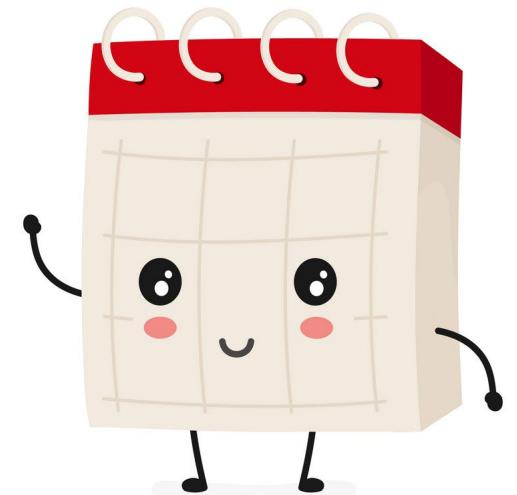
# CA estimates similar to CDC VE platforms

## Pediatric: 0-18 yrs

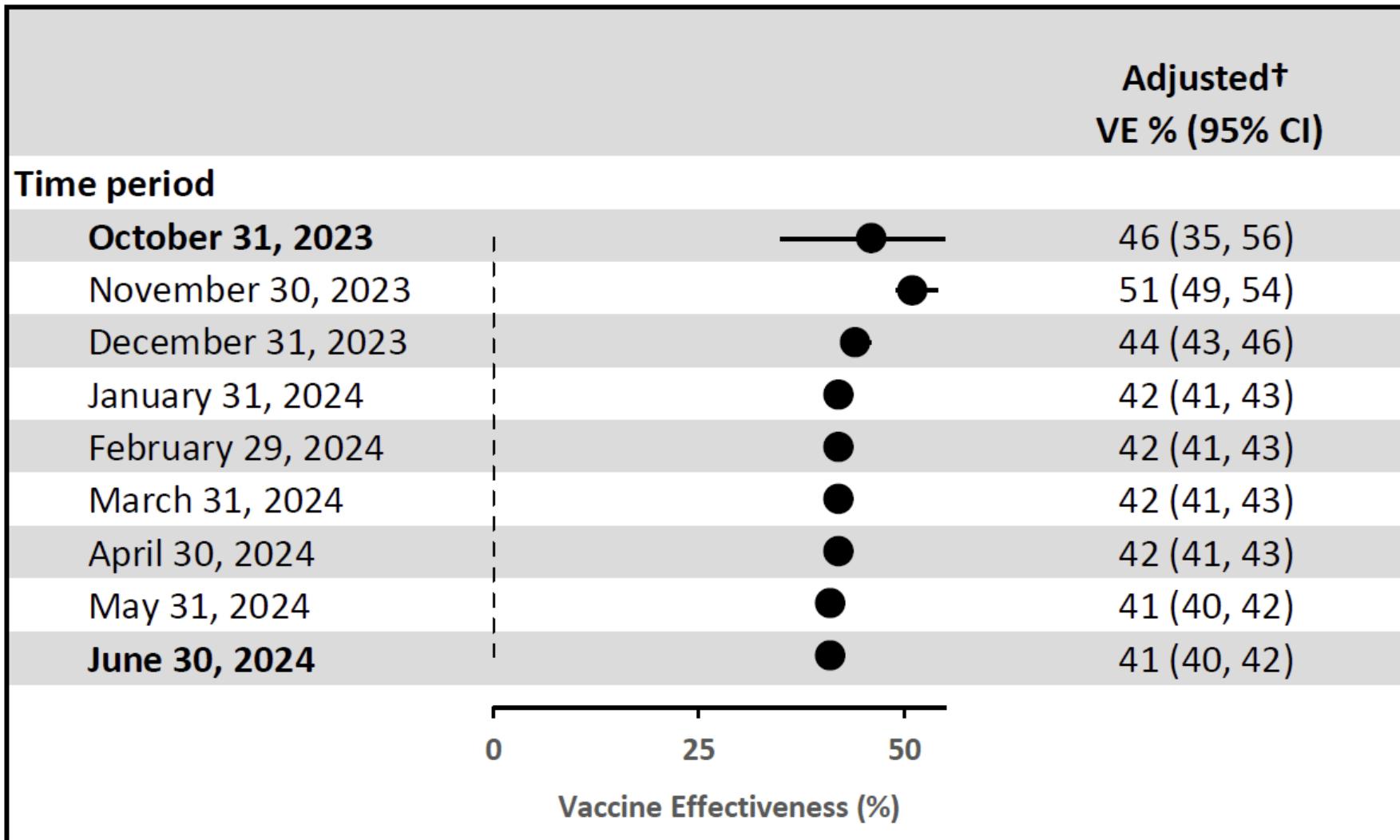




# What about timing?



# 2023-2024 VE estimates stabilized by early January





# Conclusion

1. Current seasonal influenza vaccines provide protection against laboratory-confirmed influenza for persons aged  $\geq 6$  months
  - Higher VE for influenza B & younger age groups (<18 years, 18-49 years)
2. Increased reporting of public health data can be leveraged to calculate more timely influenza effectiveness
3. Earlier estimates of vaccine effectiveness can support influenza preparedness and prevention efforts including vaccination messaging
  - Promote highly effective vaccine in early phase of the peak
  - Emphasize importance of non-pharmaceutical measures during seasons with low VE
  - Prepare for increased hospital capacity during seasons with low VE

# Recipe for Surveillance-Based VE

## Ingredients

- All influenza test results
- All vaccination records
- Covariate values for adjustment
- Data systems and software for management and processing
- Staff for analysis

## Steps

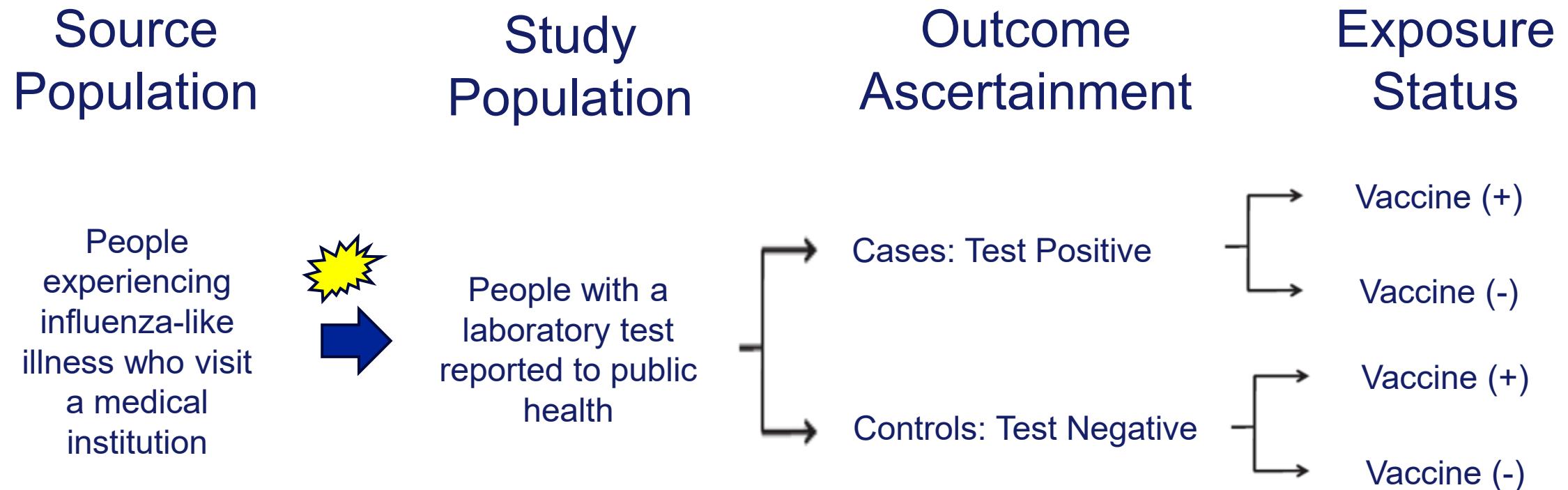
1. Clean testing data
2. Clean vaccination data
3. Match testing to vaccination records
4. Model selection
5. Tables and graphs

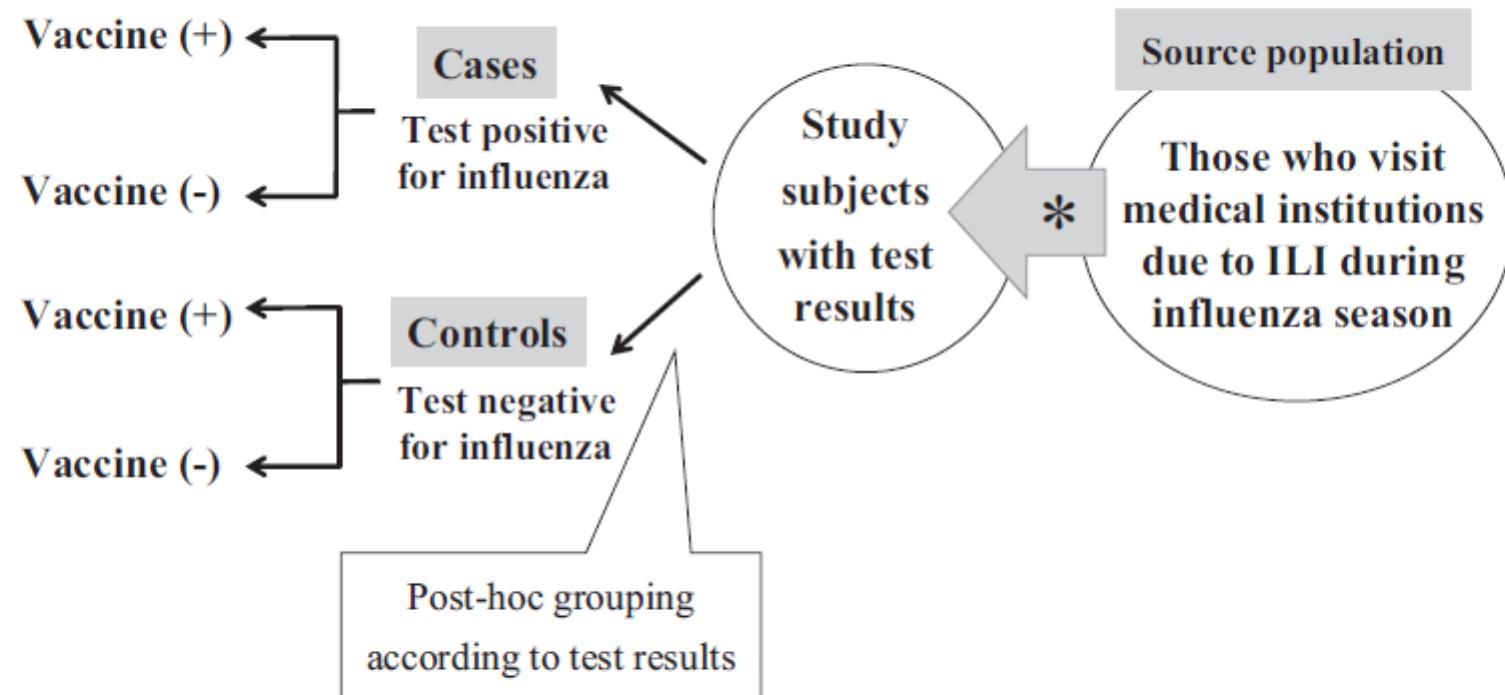


# What to watch for...

- **Selection bias**
  - Missing data from certain kinds of labs or vaccine providers
- **Confounding**
  - Missing data on important covariates
  - Model misspecification
- **Information bias**
  - Poor data quality (inaccurate values for exposure, outcome, or covariates)

# Generalizability/Selection Bias





**Fig. 3.** A test-negative design to evaluate influenza vaccine effectiveness against laboratory-confirmed influenza. ILI denotes influenza-like illness. Asterisk (\*) indicates a point where selection bias may occur. If the study subjects are limited to those who received the clinician-ordered test in the routine clinical setting, the application of the test would be related to (1) the likelihood of having influenza (outcome) or (2) influenza vaccination status (exposure), resulting in biased sampling (non-representativeness) of the study subjects from the source population.



# Conclusion

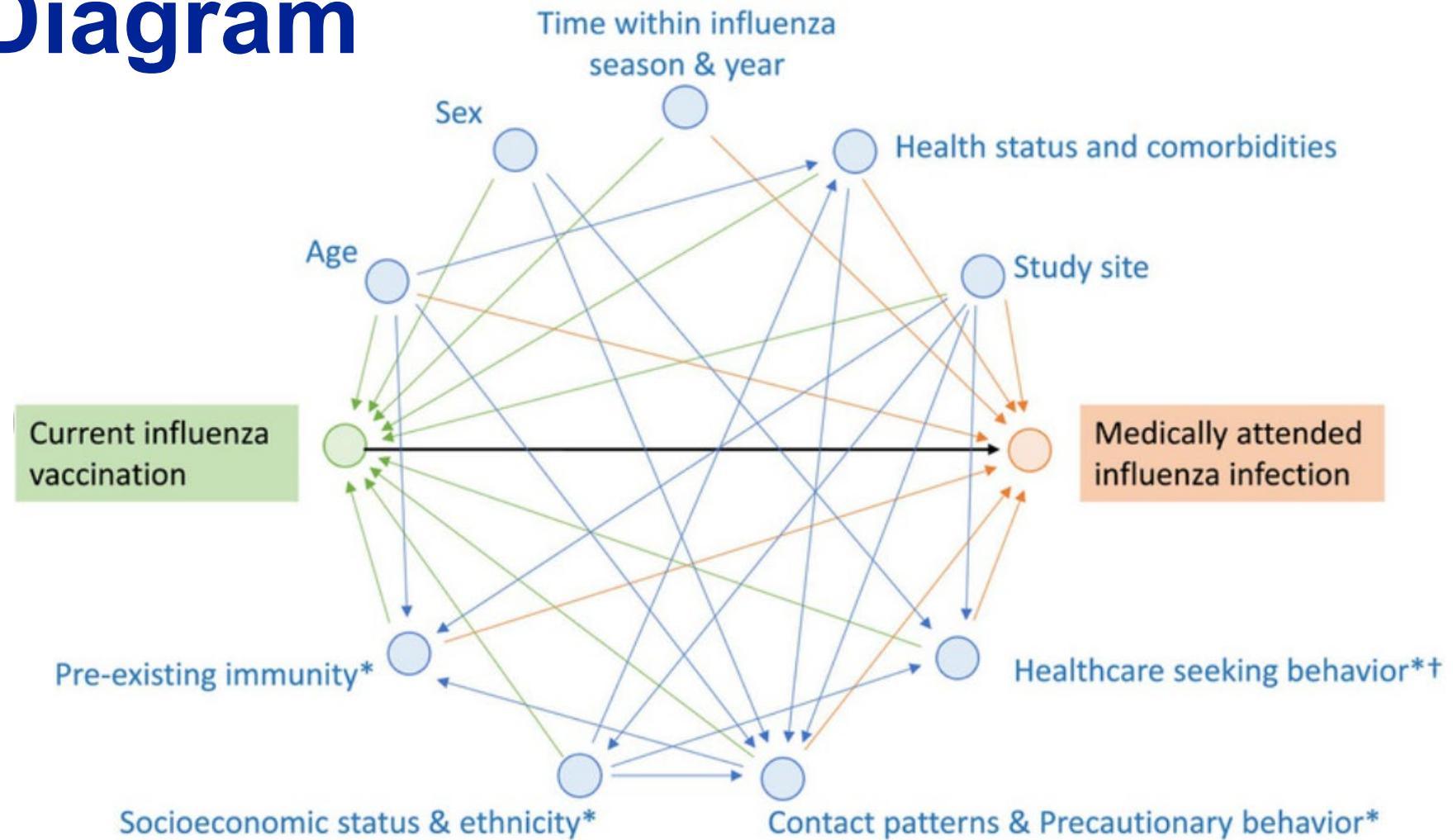
- 2023-2024
  - First attempt
  - Pilot
  - Feasibility
  - Accuracy
- 2024-2025
  - Did we get lucky last time?
  - Early indications that second season estimates are a close match to CDC



# Future Work

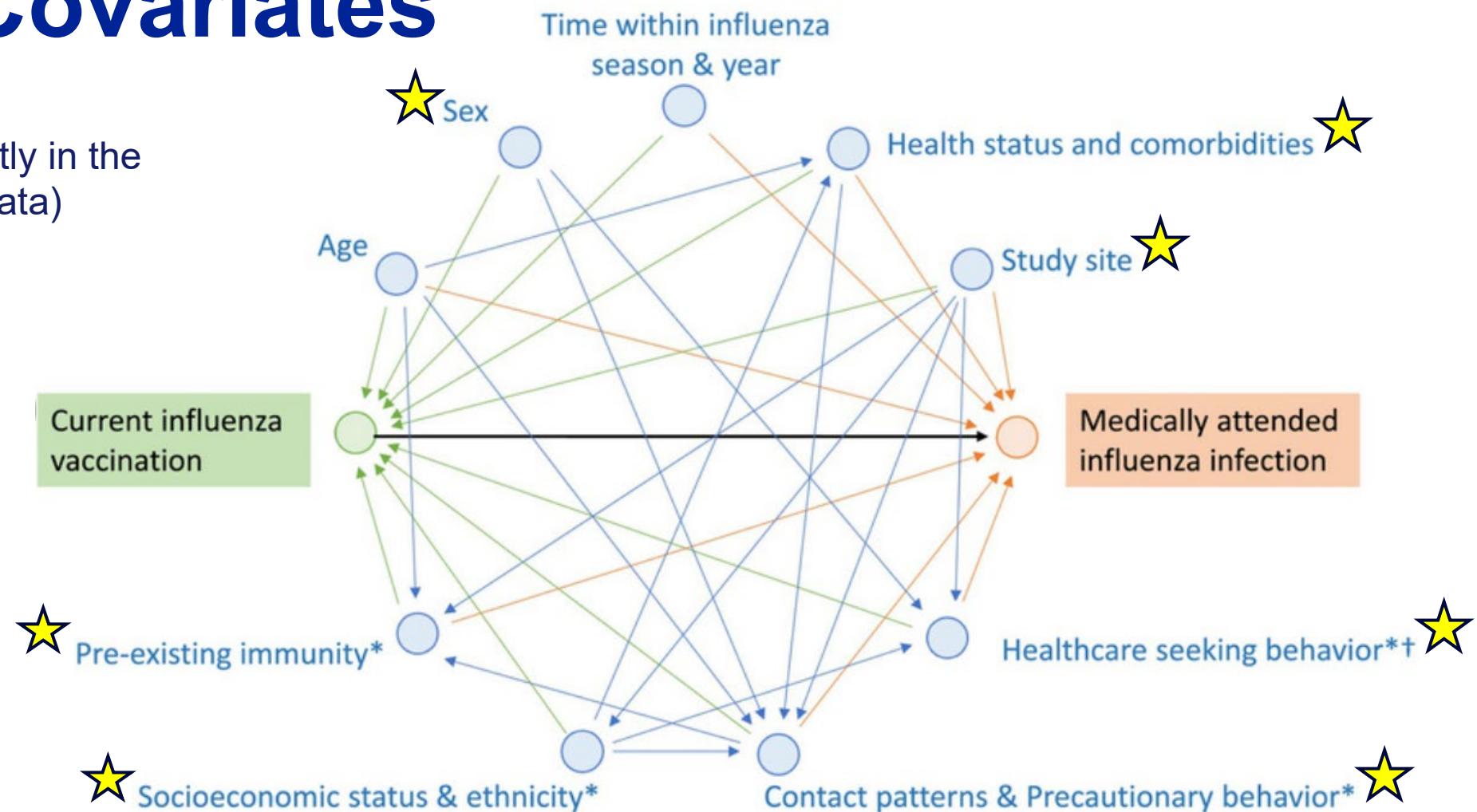
- Modernize and optimize data pipeline
- Address limitations
  - Sub-analyses (e.g., subtype, disease severity, clinical setting)
  - Improve completeness and quality of reporting
- Communicating benefits of a vaccine with 40% effectiveness
- Pool with (or compare to) with other jurisdictions?

# Causal Diagram



# Missing Covariates

★ = factors not currently in the model (missing data)



# References and Resources

Topic	Link
CDC MMWR	<a href="https://pubmed.ncbi.nlm.nih.gov/38421946/">https://pubmed.ncbi.nlm.nih.gov/38421946/</a>
Understanding VE	<a href="https://healthjournalism.org/blog/2020/10/know-the-nuances-of-vaccine-efficacy-when-covering-covid-19-vaccine-trials/">https://healthjournalism.org/blog/2020/10/know-the-nuances-of-vaccine-efficacy-when-covering-covid-19-vaccine-trials/</a>
CDC VE Guide	<a href="https://www.cdc.gov/flu-vaccines-work/php/effectivenessqa/">https://www.cdc.gov/flu-vaccines-work/php/effectivenessqa/</a>
WHO VE Guide	<a href="https://www.who.int/publications/i/item/9789241512121">https://www.who.int/publications/i/item/9789241512121</a>
Causal Diagram	<a href="https://pubmed.ncbi.nlm.nih.gov/36550627/">https://pubmed.ncbi.nlm.nih.gov/36550627/</a>
Test Negative Design	<a href="https://pubmed.ncbi.nlm.nih.gov/28818471/">https://pubmed.ncbi.nlm.nih.gov/28818471/</a> <a href="https://pubmed.ncbi.nlm.nih.gov/31609860/">https://pubmed.ncbi.nlm.nih.gov/31609860/</a> <a href="https://bmccinfectdis.biomedcentral.com/articles/10.1186/s12879-017-2838-2">https://bmccinfectdis.biomedcentral.com/articles/10.1186/s12879-017-2838-2</a>
R matching	<a href="https://cran.r-project.org/web/packages/RecordLinkage/index.html">https://cran.r-project.org/web/packages/RecordLinkage/index.html</a>

Thank you to our presenters,  
and thanks to all of you for  
joining us!

Please complete a brief evaluation survey.

The next Discovery Session  
will be on **March 24, 2025**