

Nudging Flu Vaccination in Patients at Moderately High Risk for Flu and Flu-related
Complications

Study Protocol with SAP

NCT05509283

10/25/2022

Study Protocol

Scientific Background

Almost everyone ages 6 months or older can benefit from the influenza vaccine, which can reduce illnesses, missed work, hospitalizations, and death by reducing the likelihood of contracting influenza. Flu shots are particularly important for patients at high risk of experiencing severe outcomes.

In the 2020–21 and 2021–22 flu seasons, the study team sent messages to Geisinger patients in the top 10% of risk for flu and complications according to an artificial intelligence algorithm. Messages that disclosed patients' risk status significantly increased flu vaccination rates. Additionally, messages that included risk information were most effective in patients at relatively lower risk (those in the top 4–10%) compared with those at the highest risk (top 3%).

Objectives

The present work will test the effectiveness of high-risk messages in patients who are in the top 11–20% of risk, at high risk but lower than previous studies. These communications will inform patients they are at high risk with either (a) no additional explanation, (b) an explanation that this determination comes from an analysis of their medical records, or (c) the additional explanation that an AI or ML algorithm made this determination.

Design

This study is a randomized controlled trial with 5 study arms. Patients were randomized to receive (or not receive) one of several messages about flu shots.

Methods

The sample includes 40,671 patients. Patients were randomized into the following study arms:

1. **Passive Control** - Patients in the passive control arm did not receive additional pro-vaccination interventions beyond the health system's normal efforts.
2. **Active Control** - Patients in the active control arm received messages reminding them to get a flu shot without advising them of their risk status.
3. **High Risk Only** - Patients in this treatment arm received messages telling them they were identified to be at high risk for flu complications, without specifying how or why the health system believes this to be the case.
4. **High Risk with Explanation Based on Medical Records** - Patients in this treatment arm received messages telling them they were identified to be at high risk for flu complications via review of their medical records.
5. **High Risk with Explanation Based on Algorithm** - Patients in this treatment arm received messages telling them they were identified to be at high risk for flu complications via analysis of their medical records by a computer algorithm.

Power Analysis

The sample size above allows 80% power to detect an increase in flu vaccination rates from 35% to 37.1% with two-tailed $\alpha = .05$ for any comparison between study arms.

Message Modalities

Patients randomized to arms 2-5 were sent messages in up to 3 modalities, depending on eligibility: 1. a letter, 2. a MyGeisinger (MyChart patient portal) message, and 3. a short message service (SMS) message.

Project Status

All intervention messages have been sent.

Letters for the Active Control and High Risk with Explanation Based on Algorithm study arms were sent on 9/13/22. Due to a miscommunication with the mail room, letters for the High Risk Only and High Risk Based on Medical Records arms were delayed by one day (send date of 9/14/22).

Patient portal messages were sent on 9/27/22 for all study arms.

Patients eligible for SMS were randomized to be sent a message on 10/12/22 or 10/13/22. Randomization was stratified by study arm.

Data collection is ongoing within the health system, and the study team has not yet obtained or analyzed any outcome data from the study.

Change in Primary Outcome Time Frame

Our originally preregistered primary outcome time frame was within 2 weeks of the final message send date. However, due to the mistimed letters mentioned in the Project Status section, we changed the primary outcome time frame to within 6 weeks of the patient's study start date, so all patients can be monitored for the same length of time.

The study start date corresponds to the letter send date for the patient's study arm:

- 9/13/22: Active Control and High Risk with Explanation Based on Algorithm
- 9/14/22: High Risk Only and High Risk Based on Medical Records

Because patients in the Passive Control study arm were not sent a letter, they will be randomized to a study start date of 9/13/22 or 9/14/22.

Analysis Exclusion Criteria

Patients vaccinated before to their study start date. We will remove patients from analysis who received a flu shot prior to their study start date (9/13/22 or 9/14/22, depending on their study arm), because they could not have been influenced by our nudge messages to get a flu shot.

Patients deceased prior to their study start date. Twice during the study, we received updated lists of patients who were deceased. Some had died prior to the study beginning but

medical records had not yet been updated to reflect the date of death. These patients will be removed from all analyses.

Statistical Analysis Plan

Planned Analyses

Primary Outcome: *Received a flu vaccination within 6 weeks of the patient's study start date [Time Frame: Within 6 weeks of the patient's study start date]*

Question 1: Does informing patients that they are at high risk for flu and flu-related complications increase the likelihood that they will get vaccinated?

Analysis 1a (Confirmatory): We will test the hypothesis that patients who were sent messages with information about their risk status (patients randomized to message arms 3, 4, or 5) will exhibit improved flu vaccination rates compared with patients in the Active Control arm who were sent messages without risk information (arm 2).

Analysis 1b (Confirmatory): We will test the hypothesis that patients who were sent messages with information about their risk status (those in arms 3, 4, or 5) will exhibit improved flu vaccination rates compared with patients assigned to the Passive Control arm (arm 1).

For analyses 1a and 1b, we will run OLS regressions. For both regressions, we will include a binary predictor variable coding separately for baseline (arm 2 for analysis 1a and arm 1 for analysis 1b), and message (all patients in arms 3–5).

Question 2: Do messages encouraging flu shots increase flu vaccination rates?

Analysis 2 (Confirmatory): We hypothesize that patients who were sent Active Control messages encouraging them to get a flu shot with no information about their risk status (arm 2) will be more likely to get a flu shot than those in the Passive Control arm (arm 1). To assess this hypothesis, we will employ OLS regression with a categorical predictor variable coding for arm.

Question 3: Among messages that mention patients' risk statuses, is it most effective to a) give patients no information about how their risk status was determined (arm 3), b) tell patients their high-risk designation was based on a review of their medical records (arm 4), or c) tell patients their high-risk designation was based on a computer algorithm review of their records (arm 5)?

Analysis 3 (Exploratory): We will evaluate this question using an OLS regression model, with a categorical predictor variable coding for arm (arm 3, arm 4, arm 5). We will run post-hoc tests using Tukey's HSD to test for significant pairwise differences between the arms.

Sensitivity Analyses and Robustness Checks

Recent work suggests that OLS regressions are appropriate in randomized experiments with binary outcome variables such as ours (Gomilla, 2021). However, as a robustness check, we will also run the regressions described above as logistic regressions instead of OLS regressions. We may run additional sensitivity analyses or robustness checks.

Other Pre-specified Outcomes

Other Pre-specified Outcomes listed below include flu outcomes (diagnosis, complications) and COVID-19 vaccination. If there are any differences in these outcomes as a function of study arm, the mechanism would almost certainly be increased flu vaccination. Therefore, we will only run analyses on Other Pre-specified Outcomes for analyses above where there is a significant difference in flu vaccination.

1. High confidence flu diagnosis

Patient received a flu diagnosis via a positive polymerase chain reaction (PCR)/antigen/molecular test (yes/no) during the 2022-23 flu season (from the patient's study start date through April 30, 2023).

[Time Frame: Up to 8 months]

2. "Likely flu" diagnosis

Received a "high confidence flu" diagnosis (with positive PCR/antigen/molecular test) and/or "likely flu" diagnosis (as assessed via International Classification of Disease [ICD] codes or Tamiflu administration or positive PCR/antigen/molecular test) (yes/no) during the 2022-23 flu season (from the patient's study start date through April 30, 2023).

Note that "likely flu" is a superset of the "high confidence flu" diagnoses.

[Time Frame: Up to 8 months]

3. Flu complications

Diagnosed with flu-related complications (yes/no) from the patient's study start date through July 31, 2023.

[Time Frame: Up to 11 months]

4. ER visits

Number of ER visits from the patient's study start date through July 31, 2023.

[Time Frame: Up to 11 months]

5. Hospitalizations

Number of hospitalizations from the patient's study start date through July 31, 2023.

[Time Frame: Up to 11 months]

6. COVID-19 vaccination rates

Received at least one COVID-19 vaccination (yes/no) during the 2022-23 flu season (from the patient's study start date through April 30, 2023).

[Time Frame: Up to 8 months]

Additional Exploratory Analyses

1. Age and gender

While older patients tend to be aware of their increased vulnerability, younger patients may be more surprised to learn of their high-risk status. Additionally, our previous work suggests that males and females are differently likely to get vaccinated as a function of age, with younger females *more* likely to get vaccinated than males, and older females *less* likely to get vaccinated than older males.

To test the relation between flu shots, age and gender, we will run an OLS regression including binned age (18–24, 35–44, 45–54, 65+), gender, and their interaction.

Finally, we will test for an interaction between age, gender, and study arm, as people of different ages and genders may be differentially receptive to different message versions.

2. Timing of shot

We will examine outcomes over time and run regression models to test whether intervention messages influenced the timing (time elapsed since the beginning of the intervention, September 13, 2022) of flu shots.

3. Risk level

We will explore heterogeneity in flu vaccination rates within the top 11–20% of risk, and test whether effects of study arm vary as a function of risk level.