

Predicting Vaccine Uptake Using Machine Learning

- Phase 3 Classification Project
- Predicting H1N1 and Seasonal Flu Vaccination
- Data-Driven Public Health Insights
- End-to-End Predictive Modeling

Business Problem

- The Challenge:
 - Identify groups less likely to get vaccinated
 - Improve outreach strategies
 - Allocate resources efficiently
- Objective:
 - Build a predictive model to estimate vaccination probability.

Why This Is a Classification Problem

- Target = Yes (1) or No (0)
- We predict categories, not numeric values
- Output is probability between 0 and 1
- Binary Classification Task

Data Overview

- ~26,700 respondents
 - 36 features per respondent
 - 2 target variables
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- Feature types:
 - Demographics
 - Health behavior
 - Risk perception
 - Geographic info

Modeling Approach

- 1. Data understanding
- 2. Cleaning & preprocessing
- 3. Train/validation split
- 4. Baseline model
- 5. Hyperparameter tuning
- 6. Ensemble comparison
- 7. Final model selection

Models Built

- 1. Logistic Regression (Baseline)
 - Interpretable
 - Fast
- 2. Tuned Logistic Regression
 - Optimized performance
- 3. Random Forest (Ensemble)
 - Captures nonlinear relationships

Evaluation Metrics

- Due to class imbalance we used:
- • ROC-AUC (ranking quality)
- • F1 Score (precision & recall balance)
- • Accuracy (secondary metric)

Key Results

- Tuned model improved baseline performance
 - Random Forest captured complex patterns
 - Vaccination behavior is predictable
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- Strong signal found in behavioral & demographic features.

Key Insights

- Strong predictors included:
- • Age group
- • Health worker status
- • Risk perception
- • Income & education
- • Geographic region

Business Recommendations

- 1. Target younger & lower-income groups
- 2. Increase risk-awareness campaigns
- 3. Tailor messaging by region
- 4. Use probability scores for outreach prioritization

Limitations

- Survey-based self-reported data
- No time-series information
- Not causal, only predictive
- Some missing data challenges

Next Steps

- 1. Deploy as decision-support tool
- 2. Integrate into outreach platforms
- 3. Track outcomes & retrain periodically
- 4. A/B test intervention strategies