

# Secondary ASCVD Risk Prediction using Electronic Health Record Data

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## Background

- New, expensive drugs make predicting future secondary events of atherosclerotic cardiovascular disease (ASCVD) more important.
- The electronic health record (EHR) could make risk prediction more effective and practical.
- We evaluated whether the VA EHR can help predict ASCVD for secondary prevention and compared to a traditional risk score (the TIMI 2°Pr Model).

## Methods

- **Data sources:** VA CDW, Medicare, and National Death Index.
- **Outcome:** Fatal or nonfatal myocardial infarction or stroke over 5 years.
- **Population:** All VA ambulatory care patients aged 45-80 in 2009 who had a heart attack or stroke during the prior 5 years.
- **Analysis:**
  - Prediction used elastic net regression with 5-fold cross-validation.
  - Fit statistics were assessed with the testing dataset. Results of the VA Model were compared to the TIMI 2°Pr Model.

## Risk Factors

<b>Traditional Risk Factors</b>	Age, sex, diabetes diagnosis, hypertension diagnosis, hyperlipidemia diagnosis, statin use, BP medication use (0/1), smoking status
<b>Traditional risk factors, vital signs and labs</b>	Blood pressure, total cholesterol:HDL ratio, LDL, atrial fibrillation
<b>ASCVD history</b>	MI, stroke, PAD, CHF, CABG, PCI, peripheral arterial surgery
<b>Cardiovascular procedures</b>	Type of prior procedure (bypass, stent, endarterectomy); location (peripheral, aortic, coronary, carotid); number of cardiac or neurological vessels intervened upon; number of procedures
<b>Less common risk factors</b>	Atrial fibrillation, CKD and eGFR, heart rate
<b>Longitudinal variables</b>	For blood pressure, heart rate, eGFR, and weight we will include longitudinal measures from the prior 5 years (e.g., mean, minimum, maximum, standard deviation, slope)
<b>Other comorbidities</b>	ESRD, Serious Mental Illness, Substance Abuse
<b>Longitudinal changes</b>	Time since last cardiovascular event
<b>Medication use</b>	BP, cholesterol, anticoagulant, diabetes, antidepressant, antipsychotic, antianginal

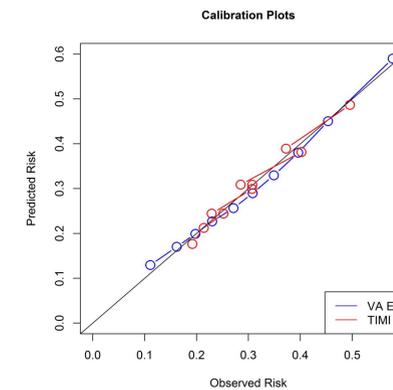
## Conclusions

- The electronic health record can be used to predict secondary ASCVD events.
- We were able to identify patients with secondary event rates that varied widely, with 20-80<sup>th</sup> percentile 5-year event rates (18%-45% in men and 10%-36% in women).
- This technique can be calculated entirely within the electronic health record and could be used to stratify medicines for secondary prevention.

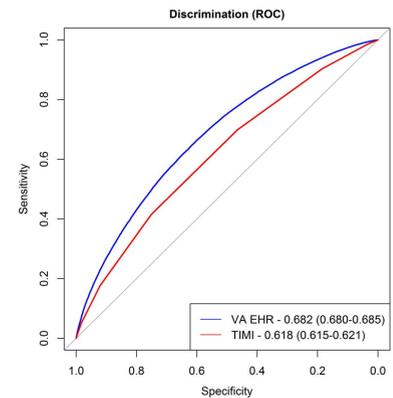
## Results

- **Population:** 742,787 participants (726,588 Men and 16,199 Women)
  - 65% Men, 49% Women had prior MI
  - 47% Men, 61% Women had prior Stroke
- 30% Patients had a CV event during 5-year follow-up (30% Men; 24% Women).
- The VA EHR Risk Model had better discrimination and was better calibrated than the TIMI Model.

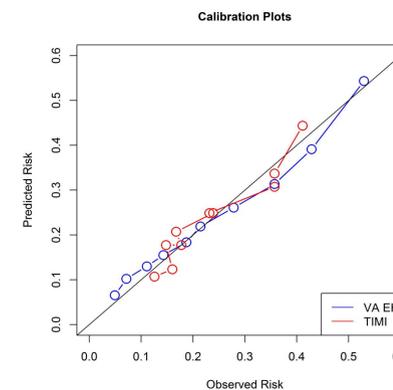
## Results: Men



- **Important risk factors:** History of CHF, Afib, CABG, PAD, diabetes, diabetes medications, coronary endarterectomy counts.
- Compared to TIMI, the VA EHR model was slightly better calibrated and had better discrimination.
- The VA EHR had similar discrimination for subgroups (hx MI 0.68; hx Stroke 0.66).



## Results: Women



- **Important risk factors:** History of MI, stroke, CHF, Afib, hypertension, number of prior carotid stents, other coronary procedures.
- Compared to TIMI, the VA EHR model was slightly better calibrated and had better discrimination.
- The VA EHR model had slightly worse discrimination for subgroups (hx MI 0.69; hx Stroke 0.70).

