Development of a Predictive Risk Model to Identify Patients Unlikely to Complete a Colonoscopy Following an Abnormal Fecal Test in Community Clinics

INTRODUCTION

The Strategies and Opportunities to STOP Colon Cancer in Priority Populations (STOP CRC) project increased CRC screening among patients in Federally Qualified Health Centers (FQHCs) through a direct mailed fecal testing program (FIT).¹ However, a follow-up colonoscopy is recommended for patients with an abnormal fecal test, and rates of completion of the follow-up colonoscopy remain low, especially among patients in the community clinic setting.²⁻⁴ We aimed to develop a prediction model using patient-level data available in the EHR to identify patients who are more and less likely to undergo colonoscopy following an abnormal FIT test.

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This research project is approved by the Kaiser Permanente Northwest IRB (KPNW IRB, Protocol #4364), and is registered at ClinicalTrials.gov (NCT01742065).

METHODS

We developed a risk prediction model using data from patients with abnormal fecal tests at STOP CRC clinics.

PARTICIPANTS

- and California.
- Patients were 50-75 years of age.
- 4, 2014 through February 28, 2016 (n=1723).

MEASURES

- a colonoscopy within 6 months of receiving their abnormal FIT test result.
- Predictor characteristics were those that predicted in the EHR in these community clinic settings.

ANALYSES

- R code from Harrell that assigns one point to the smallest increment. The scale of points is arbitrary.
- likely to receive a follow-up colonoscopy (lowest two the highest predicted risk of non-adherence (bottom 55% chance of obtaining a follow-up colonoscopy.

Retrospective cohort of STOP CRC patients in Oregon

Patients returned an abnormal FIT result from February

The outcome measure was whether a patient received

completion of CRC screening or colonoscopy in previous studies, but were limited to those that would be available

 We used Cox proportional hazards models. We fit a full model and used a step-down process to simplify the model by removing characteristics so that the final model retained at least 90% of the variation explained of the full model.

• We assigned points to each level of each variable using

• The model accurately predicts the patients who are least quintiles, 17.8% and 25.4% respectively). Patients with quintile) had and estimated 18% chance of obtaining a colonoscopy; whereas patients with the lowest predicted risk of non-adherence (top quintile) had a greater than



C-statistic (95% CI)	0.6598				
R2 (95% CI)	13.08 (9.36-17.13)				
D (95% CI)	0.794 (0.658-0.931)				
Bootstrap-corrected c-statistic	0.6328				
Slope Shrinkage	0.0997				

A D-statistic of zero means that the model failed to separate higher and lower risk patients. The R² statistic measures the amount of variation explained in the model.

FIGURE 1. Patient Population from STOP CRC

*Patients excluded from clinics too small to contribute and with missing data *Patients excluded from clinics too small to contribute and with missing data.

TABLE 1. Significant characteristics at baseline for all patients and patients with a colonoscopy; hazard ratios and risk score points for the final prediction model

	POINTS	HAZARD RATIO	(95% CI)	VARIABLE	PATIENTS N (%OF A	WITH COLONOSCOPY	ALL PATI N (% OF	ENTS ALL)	POINTS	HAZARD RATIO	(95% CI)
		0.97	(0.96 - 0.99)	Long term anticoagulant use						0.52	(0.28 - 0.98
	50			No	546 (35.3%)			1545 (96.8%)	55	· · ·	
	38			Yes	10 (19.6%)	51 (3.2%)			0	· ·	
	25			Flu shot within	1 year of in	dex date				1 59	(1 28 - 1 98
	13			No	452 (33.0%)			1368 (85.7%) 0	1.07	(1.20 - 1.70
	0			Yes		228 (14.3%)			40		
		1.49	(1.15 - 1.93)	Count of no-sh	ow encount	ters in year prior to inc	ex date			0 00	(0.79 0.00
	0			0	394 (34 9%)			1128 (70 7%)	22	0.00	(0.70 - 0.99
30 (83.3%)	34			1	- 99 (39.1%)	253(15.9%)		1120 (70.770)	11		
				2+	63 (29.3%)	215 (13.5%)			0	· ·	
	4	ref		Lleelth Center						1.04	(1 00 1 1 2
	14	1.13	(0.89 - 1.45)		103(31/1%)		615 (38 5%)			1.00	(1.00 - 1.12)
	4	1.01	(0.76 - 1.34)	НС 2	- 6/ (/8 1%)	133 (8 3%)	013 (30.370)		100	3.22	(1.14 - 2.4)
	0	0.96	(0.67 - 1.38)		- - - - - - - - - - - - - - - - - - -	104 (6 5%)			Q1	2.50	(2.07 - 4.70)
		4.07			44 (42.370) 	207 (10.00/)			01	2.37	(1.03 - 4.12)
		1.06	(1.00 - 1.12)	HC 5	139 (48.4%)	287 (18.0%)			97	3.09	(2.08 - 4.60
	0			HC 6	66 (28.5%)	232 (14.5%)			28	1.38	(0.89 - 2.13
	5			HC 7	19 (27.1%)	70 (4.4%)			32	1.46	(0.82 - 2.59
	10			HC 8	31 (20.0%)	155 (9.7%)			0	ref	
	14			Not significant chara	cteristics includ	de aender BMI language eth	nicity tobacco use % of	census tract with college de	aree nerce	nt of census	tract household
	4.0			below FPL, census tr	act median hou	usehold income, census tract	unemplovment, census t	ract population density, cen	sus tract low	i access, ER v	visits per 1,00

urban/rural, Charlson comorbidity, asthma/COPD, diabetes, severe mental illness, mood disorder, substance/alcohol abuse, blood in stool, hemorrhoid/anal fissure, prior CRC screening, number of outpatient encounters.

ABBREVIATIONS: CI, Confidence Interval; GINI, Gini Coefficient on Income Inequality

MODEL POPULATION



FIGURE 2. Histogram of Predicted Probability



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DISCUSSION

- The C-statistic shows adequate separation of patients across risk levels for non-adherence to follow-up colonoscopy, yet the R² indicates the discrimination and calibration could be suboptimal because of the calibration (Table 2).
- Focusing efforts for improving screening on the lowest quintiles could provide value to the population most in need of follow-up support. When putting the model into practice, targeting the lowest probability groups could result in the greatest improvements.
- Both patient and system-level barriers were used in the final model, indicating the importance of recognizing multiple levels of barriers to adherence to colonoscopy following an abnormal FIT.
- This is the first model to predict likelihood of follow-up after an abnormal fecal test. Further research is needed to test interventions for patients who have a low and moderate probability of completing follow-up colonoscopy.

Knowing who may be at risk for failing to follow-up on an abnormal FIT test could help providers and clinics identify patients in need of early interventions (including patient navigation) aimed at completing a colonoscopy. Precision delivery of interventions to those most likely to benefit optimizes patient outcomes and organization resources.

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