

Using mutual information to identify predictors related to complications after colorectal and small bowel surgeries

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BACKGROUND

- Localized colorectal cancer (~80% of cases): resection sole curative treatment.
- Afterwards: patients at risk for complications (e.g., anastomotic leakage and ileus)
- >70% no complications -> could benefit from early discharge.

Aim: identification of risk factors of complications to determine risks and optimal timing of patient discharge.

METHODS

Population: 767 elective bowel surgeries at the Medical Spectrum Twente hospital (NL), Mar 2020 - Dec 2023.

Outcome Measures: any or serious complications (Clavien-Dindo classification >II).

- 34 perioperative variables (Table 1).
- Empirical logit plots: univariate associations interactions.
- Variable selection: filtering using mutual information (MI). To capture interaction effects, the analysis extended to include conditional MI (CMI).
- Datasets: 580 in-sample patients (up to December 2022) and 187 out-of-sample patients (2023) for validation.
- Comparison performance logistic regression, weighted logistic regression and random forests: AUC and Brier scores.

Table 1.

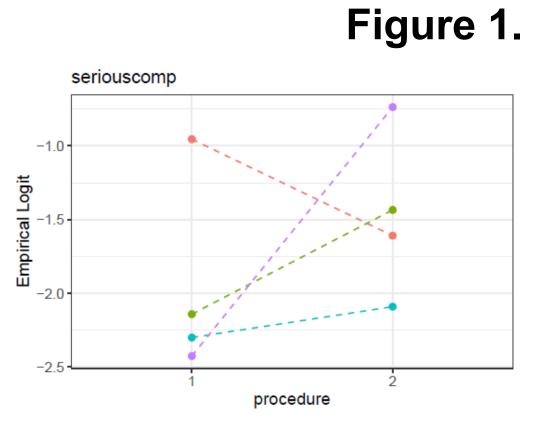
Αį	ge
Re	eported gender
Di	iabetes
Н	eart disease
Н	eart medication
Pι	ulmonary disease
Co	omorbidities
ВГ	MI
Sr	moking status
Αl	cohol use
Pr	revious surgeries
In	dication for surgery
AS	SA score
W	/HO score
Ra	adiotherapy
Pr	reop. nutritional status
Αı	nemia
St	coma councelling
Ca	arbohydrate intake
0	ral laxatives
Aı	nasthesia type
Sι	urgical procedure
Sι	ubprocedure
St	oma procedure
0	pen surgery
Co	onverted to open
0	ther conc. major procedures
M	luscle relaxants
В	owel anastomosis
Gi	iven crystalloids
Gi	iven colloids
Bl	ood loss

RESULTS

sample: 39% any, 11% serious complications.

Complication rates: In-sample: 34% any, 11% serious; out-of-

Empirical logit plots: patients with extreme BMI values undergoing rectal procedures -> complications serious compared to colonic procedures (Figure 1).



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More information:

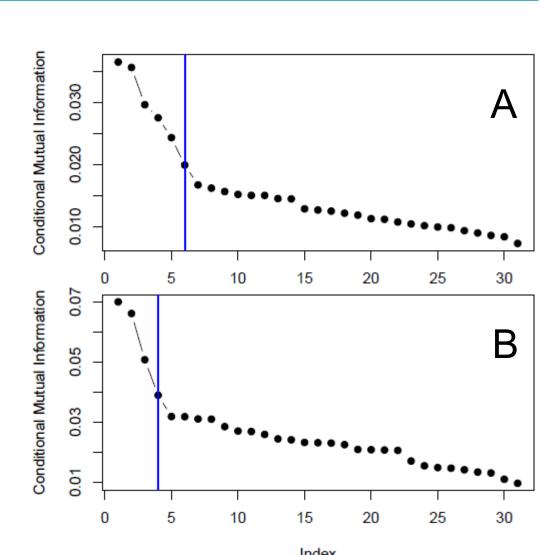
Associate Professor

Annemieke Witteveen, PhD

RESULTS continued

Figure 2. Conditional mutual information (CMI) analysis of remaining variables for A) any complications and B) serious complications.

The CMI values for each variable, conditioned on three previously selected variables, to identify additional influential variables are given on the y-axis in Figure 2. The elbow index, indicated by a vertical line, highlights the threshold we used to select significant variables for further analysis, including that index's variable.



MI + CMI: key predictors for complications: age, BMI, duration, multiple major procedures.

Table 2. Performance of the models. Best performances per variable set, measure and sample in bold.

	Outcome: ar	ny complicatio	n	Outcome: serious complication									
In-sample				Out-of-sample			In-sample			Out-of-sample			
Method	Variable set	AUC	Brier (no compl.)	Brier (serious compl.)	AUC	Brier (no compl.)	Brier (serious compl.)	AUC	Brier (no compl.)	Brier (serious compl.)	AUC	Brier (no compl.)	Brier (serious compl.)
Logistic regression	All	0.73	0.55	0.36	0.58	0.51	0.46	0.78	0.84	0.60	0.46	0.86	0.81
Weighted log. regression		0.73	0.37	0.21	0.58	0.34	0.30	0.80	0.46	0.18	0.54	0.52	0.47
Random Forest		0.79	0.20	0.17	0.63	0.24	0.24	0.77	0.19	0.22	0.72	0.19	0.24
Logistic regression	Filtering	0.68	0.52	0.39	0.58	0.51	0.47	0.74	0.82	0.68	0.57	0.84	0.79
Weighted log. regression		0.68	0.32	0.23	0.58	0.32	0.28	0.73	0.36	0.22	0.59	0.37	0.32
Random Forest		0.78	0.20	0.18	0.61	0.23	0.28	0.78	0.16	0.23	0.69	0.18	0.28

CONCLUSIONS

Key Takeaways: Factors related to the patient, such as age and BMI, along with intraoperative elements like blood loss, fluid management, and the type of procedure performed significantly influence the risk of complications in bowel surgeries.

Policy Implications: By monitoring these predictors, we can facilitate safe early discharge when people with low risks are identified.

Future Research: Development of prediction model for risks of complications on larger dataset, including timing of complication.

ACKNOWLEDGEMENTS

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