# Predictors of variation in colorectal cancer care and outcomes in New South Wales: a population-based health data linkage study

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olorectal cancer is the second

most commonly diagnosed

cancer in Australia, excluding

non-melanoma skin cancers. There is

high-quality evidence that specific

treatment approaches improve

patient outcomes; however, previous

Australian and international studies

have found that clinical care processes

and outcomes are highly variable for

people with colorectal cancer.<sup>2-6</sup> For

example, a statewide patterns-of-care

study completed in New South Wales

in 2000 described large variation

among hospitals in both evidence-

resource-intensive clinician surveys or

medical record audits have been used

to conduct patterns-of-care studies.

Because clinical cancer registries have

been collecting in-depth clinical

information in public facilities in

NSW since 2006, there is now poten-

tial to conduct these studies using

routinely collected data, at least in the

cantly better or worse performance

than other hospitals can be difficult,

owing to differences in patient

casemix and caseload. Without

adjusting for factors that independ-

ently predict poorer outcomes, such

as older age, comorbidities, later stage

of disease, and emergency resection,6

hospital performance will not be

accurately ascertained. Greater vari-

ability in outcome rates is also more

likely to arise by chance for providers

with small caseloads. Funnel plots,

which plot the estimated outcome

rate against a measure of its precision,

have been suggested for use in identi-

fying outlier hospitals<sup>8</sup> and are

increasingly being used in health

services research.6 Multilevel regres-

sion models, which take into account

the clustering of patients within hos-

pitals, have also been used to quantify

hospital variation in outcomes. 9,10 By

including patient and hospital factors

in these models, adjusted perform-

Identifying hospitals with signifi-

To date in NSW, time- and

based care and outcomes.7

**Objective:** To identify predictors of variation in colorectal cancer care and outcomes in New South Wales.

**Design, setting and patients:** Multilevel logistic regression analysis using a linked population-based dataset based on the records of patients with cancer of the colon, rectosigmoid junction or rectum who were registered in 2007 and 2008 by the NSW Central Cancer Registry and treated in 105 hospitals in NSW.

Main outcome measures: Six outcome measures (30-day mortality, 28-day emergency readmission, prolonged length of stay, 30-day wound infection, 90-day venous thromboembolism, 1-year mortality) and five care process measures (discussion at multidisciplinary team [MDT] meeting, documented cancer stage, recorded pathological stage, treatment within 31 days of decision to treat, treatment within 62 days of referral).

**Results:** We analysed data for 6890 people. There was wide variation between hospitals in care process measures, even after adjusting for patient and hospital factors. Older adults were less likely to be discussed at an MDT meeting and receive treatment within suggested time frames (all P < 0.001 for colon cancer). Increasing patient age, greater extent of disease, higher Charlson comorbidity score and resection after emergency admission consistently showed strong evidence of an association with poor outcomes. Much of the variation between hospitals in outcome measures was accounted for by patient characteristics.

**Conclusions:** Patient characteristics should be included in risk-adjustment models for comparing outcomes between hospitals and for quantifying hospital variation. Further exploration of the reasons why certain hospitals and patients appear to be at risk of poorer care is needed.

ance estimates can be produced and patient-level and hospital-level determinants of care and outcomes can be identified.

The aim of this study was to quantify the extent of variation between hospitals in care processes and outcomes for colorectal cancer in NSW using a linked population-based dataset, and to identify patient- and hospital-level factors accounting for hospital variation.

#### Methods

# Linked dataset

A linked population-based de-identified dataset was created from the records of people with a cancer of the colon, rectosigmoid junction or rectum registered by the NSW Central Cancer Registry (CCR) in 2007 and 2008. The CCR receives mandatory cancer notifications and includes tumour details and demographic items. CCR data were linked by the Centre for Health Record Linkage to the NSW Admitted Patient Data Col-

lection, a population-based collection including information on all episodes of hospital care from all NSW public and private facilities, and the NSW Registry of Births, Deaths and Marriages, which records date of death. Only records of the first registered colorectal cancer were used, and synchronous colorectal cancers were excluded. The study was approved by the NSW Population and Health Services Research Ethics Committee.

The study dataset included people who had an admission for an identified surgical resection procedure<sup>11</sup> in one of 105 hospitals in NSW. Additionally, data were linked to six Area Health Service Clinical Cancer Registries (ClinCRs). The ClinCR contains items about cancer diagnosis, staging, and specialist referrals and consultations that provide additional depth to the data collected in the CCR and other datasets. ClinCR data are based on a minimum dataset collected voluntarily for notifiable cancers in public hospitals in six of the eight former Area Health Services in NSW since 2006, and have been shown to include

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# 1 Characteristics of 6890 people having surgery for colorectal cancer in New South Wales

No. of people (%)
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Sex	
Male	3741 (54.30%)
Female	3149 (45.70%)
Age at diagnosis (years)	
0-59	1542 (22.38%)
60–69	1912 (27.75%)
70–79	2075 (30.12%)
≥80	1361 (19.75%)
Socioeconomic disadvantage (SEIFA score	e)*
1 Least disadvantaged	1393 (20.22%)
2	1186 (17.21%)
3	1452 (21.07%)
4	1568 (22.76%)
5 Most disadvantaged	1286 (18.66%)
Remoteness (ARIA index)	
Highly accessible	4707 (68.32%)
Accessible	1636 (23.74%)
Moderately accessible/remote/very	547 (7.94%)
remote	
Private health insurance*	
Yes	3310 (48.04%)
No	3475 (50.44%)
Resection after emergency admission	
Yes	666 (9.67%)
No	6224 (90.33%)
Degree of spread of cancer*	
Localised	2611 (37.90%)
Regional spread	3243 (47.07%)
Distant metastasis	860 (12.48%)
Charlson comorbidity score	
0	6130 (88.97%)
1	322 (4.67%)
2	326 (4.73%)
3+	112 (1.63%)
Site of cancer	
Colon	4612 (66.94%)
Rectosigmoid junction	575 (8.35%)
Rectum	1703 (24.72%)
Hospital type	
Public	4237 (61.49%)
Private	2653 (38.51%)
Hospital location	
Metropolitan	4738 (68.77%)
Rural/regional	2152 (31.23%)
SEIEA - Socia Economic Indoves for Areas 15 AD	IA - Associality/

SEIFA = Socio-Economic Indexes for Areas.  $^{15}$  ARIA = Accessibility/Remoteness Index of Australia.  $^{17}$  \* Some data missing.

85% of people who underwent colorectal cancer surgery in a public hospital in 2008. <sup>11</sup>

# Calculating outcome and care process measures

We analysed six outcome and five care process measures in this study. Measures were chosen based on current

clinical practice guidelines and literature review (with input from a study advisory group comprising clinicians, data managers and clinical coders), as well as an assessment of the feasibility of calculating them from available data.<sup>11</sup> Measures were calculated for colon and rectal cancers separately. Rectosigmoid junction cancers were grouped with colon cancers as they have more similar rates of survival and recurrence.<sup>12</sup> Outcome measures were calculated for the whole cohort; however, care process measures required data from the ClinCR, which are collected only in public hospitals (43 hospitals; 61.5% of patients). The available data for each measure and further information about their definition and calculation are reported elsewhere. 13

Outcome rates by hospital were calculated using multilevel logistic regression models. Rates were adjusted for age, sex, Charlson comorbidity score, 14 extent of disease, emergency admission, socioeconomic status (Socio-Economic Indexes for Areas score), 15 and private health insurance status. Each hospital's expected number of outcomes was obtained by summing their patients' predicted probabilities of experiencing the outcome, given their covariate values. The observed number (O) of people who experienced the outcome was divided by the expected number (E) to create a ratio (O/E) that was multiplied by the overall NSW outcome rate to obtain the riskadjusted rate for each hospital. 16 Hospital rates for care process measures were unadjusted, as each measure should apply to all people defined in the denominator of the measure.

# Determining hospital variation and factors that explain variation

Funnel plots and multilevel regression models were used to quantify hospital variation. In the funnel plots, the outcome and care process rates for each hospital were plotted against hospital caseload. For each measure, 95% and 99.8% "control limits" were calculated based on the mean NSW rate.<sup>8</sup> Hospitals outside of these limits were considered outliers.

Multilevel regression models take into account the clustering of patients within hospitals and allow the partitioning of variance between levels. The following two-level logistic regression models were fitted for each measure:

- a null model (hospital random effects but no explanatory variables);
- a model with fixed patient effects (as reported in Box 1) and hospital random effects; and
- a model with fixed patient and hospital effects (ie, caseload, private or public hospital, metropolitan or rural location) and hospital random effects.

Models were fitted using a Markov chain Monte Carlo approach in MLwiN (Centre for Multilevel Modeling). Intraclass correlation coefficients were calculated to compare the proportion of total variability attributable to hospitals after accounting for known patient and hospital factors.

Adjusted odds ratios (AORs) for patient and hospital factors were obtained from a maximum likelihood estimation approach based on adaptive quadrature in Stata (StataCorp). ORs for hospital factors are also presented as 80% interval ORs (IOR-80%), as hospital-level AORs can be problematic to interpret in multilevel models. An IOR-80% containing the value one indicates that the hospital characteristic does not add meaningfully to explaining hospital variation in the outcome.

## Results

Box 1 presents the characteristics of the 6890 people included in the dataset. Hospital caseload varied widely, with hospitals treating between one and 129 patients with a new colon cancer and one and 41 patients with a new rectal cancer on average per year. Hospital caseload was divided into quintiles for the analysis.

#### Hospital variation

Box 2 shows the number of outlying hospitals identified from funnel plots. Example funnel plots are shown in Box 3. More hospitals performed outside of control limits for care process measures than for outcome measures. The outcome measure with the most outlying hospitals was 90-day venous thromboembolism for both colon cancer (5% above 95% limits) and rectal cancer (8% above 95% limits). Recorded pathological stage (documented tumour—node—metastasis stage based on histological examina—

5 (13%)

0

9 (23%)

4 (10%)

5 (13%)

2 Hospital variation in outcome and care process measures for hospitals treating 6890 people with colorectal cancer in NSW									
	Model 1: Null two-level model (ICC)		Model 2: Patient factors only (ICC)		Model 3: Patient + hospital factors (ICC)		No. (%) of outlying hospitals in funnel plots		
	Colon	Rectal	Colon	Rectal	Colon	Rectal	Colon	Rectal	
Outcome measures							n = 98	n = 91	
30-day all-cause mortality	0.12	0.10	0.02	0.14	0.04	0.11	1 (1%)	5 (6%)	
28-day emergency readmission	0.03	0.02	0.008	0.01	0.01	0.02	3 (3%)	2 (2%)	
Prolonged length of stay for relevant diagnosis-related group	0.04	0.04	0.02	0.008	0.02	0.006	1 (1%)	1 (1%)	
Venous thromboembolism within 90 days of surgery	0.01	0.04	0.02	0.03	0.02	0.08	5 (5%)	7 (8%)	
Wound infection within 30 days of surgery	0.03	0.06	0.02	0.01	0.01	0.01	2 (2%)	0	
1-year all-cause mortality	0.03	0.009	0.006	0.01	0.005	0.005	2 (2%)	0	
Care process measures							n = 42	n = 39	

0.41

0.59

0.91

0.30

0.21

0.36

0.67

0.89

0.52

0.52

0.42

0.67

0.93

0.43

0.29

0.28

0.71

0.87

0.51

0.49

0.42

0.76

0.91

0.45

0.26

10 (24%)

4 (10%)

17 (41%)

11 (26%)

11 (26%)

0.34

0.67

0.86

0.44

0.43

ICC = intraclass correlation coefficient (the estimated proportion of total variability attributable to hospitals).

tion) was the care process measure with the greatest proportion of outlying hospitals (colon cancer, 41%; rectal cancer, 23%) (Box 2).

Discussed at multidisciplinary team meeting

Treatment within 31 days of decision to treat

Treatment within 62 days of initial referral

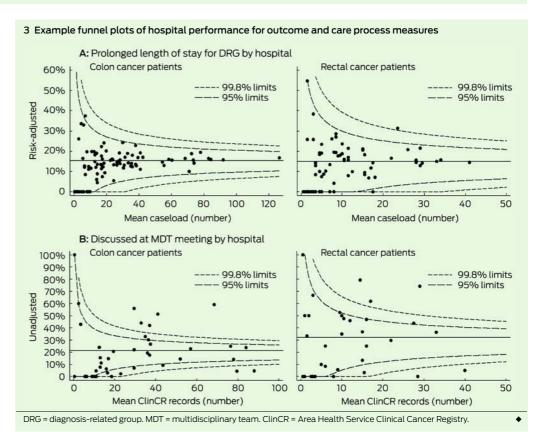
Cancer stage documented

Pathological stage recorded

Hospital variance was much greater for care process measures than for outcome measures in the multilevel models, both before and after adjusting for patient and hospital factors (Box 2; and Appendix 1, online at mja.com.au). Known patient factors accounted for most of the hospital variation in outcome measures. For care process measures, known patient and hospital factors generally did not help to explain much of the hospital variation. Recorded pathological stage showed the greatest hospital variation; estimates of total variability attributable to hospitals, after accounting for known patient and hospital factors, were 87% in the colon cancer model and 91% in the rectal cancer model.

# Patient and hospital factors that explain variation

Box 4 and Box 5 summarise patient and hospital-level predictors of outcome and care process measures. Complete results are available in Appendix 2 (online at mja.com.au). Greater extent of disease, comorbidity, resection after emergency admission and increasing patient age consistently showed strong evidence of an effect on outcomes. Having no current partner increased the odds of prolonged length of stay for colon (AOR, 1.8; 95% CI, 1.5–2.2) and rectal cancer patients (AOR, 1.7; 95% CI, 1.2–2.4).



There was less evidence of an effect of hospital-level factors on outcomes. Wound infection within 30 days was more likely in a rural or regional hospital compared with a metropolitan hospital (colon cancer: AOR, 1.9; 95% CI, 1.3–2.7; rectal cancer: AOR, 2.4; 95% CI, 1.4–4.0).

Care process measures had fewer consistent predictors than outcome measures. Younger people were more likely to be discussed at a multidisciplinary team (MDT) meeting and receive treatment within suggested time frames from the initial referral and the decision to treat. Greater extent of disease increased the odds of appropriate care for nearly all care process measures. Interestingly, males with rectal cancer were more likely than females to be treated within 62 days of initial referral (AOR, 1.9; 95% CI, 1.4–2.8).

Care process measures could only be compared between public hospi-

#### 4 Summary of significant predictors in multilevel models for outcome measures

		day tality	28-day emergency readmission		Prolonged length of stay		90-day VTE		30-day wound infection		1-year mortality	
Patient factors												
Charlson score (higher)	C*	R <sup>†</sup>			C*	R*	C <sup>†</sup>				C*	R*
Cancer spread (greater)	C <sup>†</sup>		C*		C*		C*				C*	R*
Age at diagnosis (older)	C*				C*	R*					C*	R*
Emergency admission	C*				C*	R*					C*	
Marital status (no partner)					C*	R*						
Sex (male)	C <sup>†</sup>								C <sup>†</sup>			
Private health insurance					C <sup>†</sup>							
Remoteness (more remote)												
Socioeconomic status												
Hospital factors												
Hospital type (public)				R <sup>†</sup>								
Hospital location (rural)									C*	R*		
Mean caseload (mid)												

C = colon cancer model. R = rectal cancer model. VTE = venous thromboembolism. \*P < 0.001.  $\dagger P < 0.01$ .

#### 5 Summary of significant predictors in multilevel models for care process measures

	Discussed at MDT meeting		Documented cancer stage		Pathological stage recorded		Treatment within 31 days of decision		Treatment within 62 days of referral	
Patient factors										
Cancer spread (regional)	C*		C*	R <sup>†</sup>	C*		C*	R*	C*	R*
Age at diagnosis (younger)	C*						C*	R*	C*	R <sup>†</sup>
Sex (male)								R*		R*
Charlson score (lower)							C <sup>†</sup>			
Remoteness (more remote)	C <sup>†</sup>									
Emergency admission									C*	
Marital status (partnered)										
Private health insurance										
Socioeconomic status										
Hospital factors										
Mean caseload (mid)	C <sup>†</sup>									
Hospital location (metro/rural)	C*									

C = colon cancer model. R = rectal cancer model. MDT = multidisciplinary team. \*P < 0.001. †P < 0.01.

tals, as these measures are based on data from the ClinCR. A patient with colon cancer treated at a metropolitan hospital or a medium caseload hospital was more likely to be discussed at an MDT meeting. However, the IOR-80% for these factors contains one, meaning that known hospital factors accounted for only a small component of the unexplained hospital variation in care processes.

### Discussion

A linked population-based dataset was used in this study to examine predictors of variation for a number of outcome and care process measures. Both funnel plots and the results of multilevel models showed that vari-

ation in hospital performance was much greater for care process measures (eg, discussion at an MDT meeting) than outcome measures (eg, 30-day mortality). There was a consistent effect of several patient-level and hospital-level factors on care and outcomes after colorectal cancer surgery.

Increasing age, for example, increased the odds of a patient not being discussed at an MDT meeting and not receiving treatment within suggested time frames. In a patterns-of-care study conducted in NSW in 2000, older people were also reported to be less likely to receive guideline-recommended care.<sup>2</sup> Differences in the provision of care likely compound older patients' already poorer post-operative outcomes, resulting in

reduced longer-term survival. For both colon and rectal cancer patients, wound infection was more likely in a rural hospital. The reason for this is unclear, but could reflect differing practices for wound infection documentation in medical records, or could possibly arise from real differences in access to wound care after hospital discharge. Investigating and addressing causes of these differences could improve the care and outcomes of people with colorectal cancer.

This study has confirmed that patient characteristics must be included in risk-adjustment models to enable valid comparisons of outcomes and to accurately quantify hospital variation. Greater extent of disease, comorbidity, resection after emergency admission and increasing patient age showed evidence of a strong association with most outcome measures in this study. These predictors have been consistently reported across other population-based studies of colorectal cancer outcomes.<sup>6,20-22</sup> However, socioeconomic status was not a predictor of any outcome in this study. A more personalised measure of socioeconomic status, such as income or education, or a measure of physical or health status could also explain outcomes.<sup>22,23</sup> Nevertheless, there was little variation between hospitals for most outcome measures after accounting for patient factors.

Identifying causes of variation is more difficult for care process measures, as patient and hospital characteristics largely did not help to explain hospital variation. Physician-related factors such as training and volume have been identified as predictors of better patient outcomes after surgery for colorectal cancer,<sup>24</sup> and could account for some of the hospital variation in care. Unfortunately, data about individual clinicians were not available for our study. Care process measures also rely on the accuracy and completeness of data in the ClinCR, which may differ by hospital.<sup>11</sup> Hospital variation in recording of pathological stage, for example, could have resulted from a lack of local resources for interpretation of complex pathology reports. Recent integration of the ClinCR into the NSW Central Cancer Registry<sup>25</sup> will facilitate increased completeness and reduce the potential for measurement

error. However, further validation is required to determine whether a treatment or care process was not received or simply not recorded.

Variation between hospitals for one of the most commonly studied outcomes in surgical oncology, 30-day mortality, has been noted internationally for colorectal cancer surgery.<sup>6,22</sup> While the range of hospital rates may be large, the amount of variation attributable to hospitals in statistical modelling is often small.<sup>22</sup> Incorporating measures such as IOR-80%26 or using funnel plots to identify outlying hospitals while accounting for the precision of performance estimates may assist the interpretation of the practical importance of observed differences between hospitals.

A linked, routinely collected population-based dataset was able to be used in this study to explore hospital variation in colorectal cancer surgery for a range of outcome and care process measures for the first time in NSW. Despite its limitations, data linkage appears to be a cost-effective way to monitor the ongoing performance of hospitals in NSW and identify hospitals and patient groups most at risk of suboptimal care and outcomes. The reasons why certain patients and hospitals are at risk need to be further explored. The wide variation between hospitals in care processes indicates that there is considerable scope for improvement; however, identifying variation is ultimately only useful if it stimulates quality improvement.<sup>27</sup>

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