Clinical prediction models assessing response to radiotherapy for rectal cancer: protocol for a systematic review

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Abstract

Background: Rectal cancer has a high prevalence. The standard of care for management of localised disease involves major surgery and/or chemoradiotherapy, but these modalities are sometimes associated with mortality and morbidity. The notion of 'watch and wait' has therefore emerged and offers an organ-sparing approach to patients after administering a less invasive initial treatment, such as X-ray brachytherapy (Papillon technique). It is thus important to evaluate how likely patients are to respond to such therapies, to develop patient-tailored treatment pathways. We propose a systematic review to identify published clinical prediction models of the response of rectal cancer to treatment that includes radiotherapy and here present our protocol.

Methods: Included studies will develop multivariable clinical prediction models which assess response to treatment and overall survival of adult patients who have been diagnosed with any stage of rectal cancer and have received radiotherapy treatment with curative intent. Cohort studies and randomised controlled trials will be included. The primary outcome will be the occurrence of salvage surgery at 1 year after treatment. Secondary outcomes include salvage surgery at any reported time point, the predictive accuracy of models, the quality of the developed models and the feasibility of using the model in clinical practice.

Ovid MEDLINE, PubMed, Cochrane Library, EMBASE and CINAHL will be searched from inception to 24 February 2022. Keywords and phrases related to rectal cancer, radiotherapy and prediction models will be used. Studies will be selected once the deduplication, title, abstract and full-text screening process have been completed by two independent reviewers. The PRISMA-P checklist will be followed. A third reviewer will resolve any disagreement. The data extraction form will be pilot-tested using a representative 5% sample of the studies reviewed. The CHARMS checklist will be implemented. Risk of bias in each study will be assessed using the PROBAST tool. A narrative synthesis will be performed and if sufficient data are identified, meta-analysis will be undertaken as described in Debray et al.

Discussion: This systematic review will identify factors that predict response to the treatment protocol. Any gaps for potential development of new clinical prediction models will be highlighted.

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Keywords: Prediction, Risk factors, Radiotherapy, Rectal cancer, Meta-analysis

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who do not have disseminated metastatic disease (cancer which has spread beyond the primary site) at the time of diagnosis recommend surgical treatment with or without chemo-radiotherapy (CRT) depending on the stage of the disease. An organ-sparing approach without surgery is also emerging as an effective option for some patients, based on effective CRT protocols and ‘watch-and-wait’ strategies with regular follow-up checks [2, 3]. Alongside this approach, active patient involvement in deciding their treatment options is also being promoted. As a result, patients who do not wish to have a permanent stoma (an artificial opening on the abdomen which connects the large bowel and allows waste, gas and faeces, to be diverted out of the body) are able to explore other possible treatment options for their disease [4].

One such option is contact X-ray brachytherapy, also known as contact radiotherapy (Papillon technique) which delivers a high dose of low energy X-rays straight onto the rectal tumour [5, 6]. It can be used in selected patients (often in addition to CRT) to treat rectal cancer and potentially avoid the need for surgery. According to the UK National Institute for Health and Care Excellence (NICE) guidelines, patients should not only be offered organ-sparing treatment options, but they also have the right to choose one of the approved treatments that best suits their needs [7]. In order to be able to make a choice, a patient needs to have the necessary background information and well-rounded knowledge of all the available options.

Clinical prediction models combine multiple pieces of patient information to make predictions about clinical outcomes in people who have an underlying condition. They can be used to inform patient counselling, guide treatment choice and stratify patients within clinical trials [8, 9]. Such a model, that is easy to understand and to use, may prove to be helpful to both clinicians and patients, especially now that new ‘watch-and-wait’ protocols for rectal cancer have emerged due to the extensive use of neo-adjuvant treatment (n-AT) [10]. A systematic review of risk prediction models in colorectal disease was undertaken in 2020 [11]. Although the review identified 24 risk prediction models and 51 risk factors that evaluate the colorectal tumour burden, none of these is widely used [11]. Additionally, no assessments of risk bias of the included models were undertaken. Consequently, an updated systematic review, targeting response to radiotherapy in people with rectal cancer, with an assessment of risk of bias, has the potential to minimise unnecessary operations and chemoradiotherapy side effects. Our review will highlight whether a suitable model already exists, whether an existing model can be updated in light of new evidence, or whether a new model should be developed.

We hope to create a new clinical prediction model, or update an existing one, for contact X-ray brachytherapy in rectal cancer and will therefore firstly systematically review existing clinical prediction models for the role of any type of radiotherapy in treating this disease. Our systematic review focuses on radiotherapy, with radical intent-treated rectal cancer patients. We will not include patients who have been treated for disease palliation.

Research aims
The aim of this systematic review is to identify and summarise existing clinical prediction models and clinical decision rules predicting response to radiotherapy treatment, in adults with rectal cancer. The response to treatment will be assessed by the need of salvage surgery either immediately after treatment or later. According to the literature, the most common timepoint for salvage surgery occurs within the first year of radiotherapy treatment [12]. This review will identify and summarise studies of any prospective or retrospective design which utilise multiple prognostic factors in combination to predict the individualised risk of response.

Methods
Overall, the PICO question is formulated [13]:

Population
The study population are adult patients diagnosed with any stage of rectal cancer who have received radiotherapy as a component of their treatment regimen.

Intervention
The study intervention is the radiotherapy for rectal cancer treatment administered with curative intent.

Comparator
A comparator is not applicable to a systematic review of clinical prediction models. The comparator regarding the population type is patients with rectal cancer who in their treatment protocol did not receive any form of radiotherapy.

Outcome(s)
The primary outcome is the assessment of overall survival of the patients and of the patient’s response to treatment (radiotherapy), i.e., the need for salvage surgery.

Selection criteria
Study design
The review will include studies which have developed and/or validated or compared prediction models to predict the response of rectal cancer to radiotherapy. Types of studies to be included are randomised controlled trials.
and cohort studies which are either prospective or retrospective and combine multiple prognostic factors to predict the outcome. Case–control studies will be excluded.

**Study population**

This review will include adults from all sexes who have a diagnosis of rectal cancer (any tumour node metastasis (TNM) stage) in whom treatment protocol radiotherapy regimens were administered with curative intent. Patients who received radiotherapy for palliation will be excluded, as well as any non-rectal cancer primary site diagnosis. Studies with mixed populations, including those outside of the remit, will be included provided that the appropriate data for our defined group of patients is extractable.

Eligible prediction models will include patients who may respond to treatment and were thus recruited to the study at the time of treatment.

**Setting**

Studies in any setting will be included.

**Potential prediction models**

Studies must report a clinical prediction model utilising multiple prognostic factors to predict the chance of response to treatment following diagnosis of rectal cancer.

**Study outcomes**

This systematic review will evaluate the predictive accuracy of clinical prediction models identified in the literature to evaluate patient response to radiotherapy treatment for rectal cancer at 1 year, our primary outcome. This will be determined by the need for salvage surgery after treatment. An additional outcome of this study will be the predictive accuracy of models assessing the overall survival of patients through patient follow-up assessment. Additional secondary outcomes will consider the response at different time points, quality of the developed models in terms of the use of appropriate statistical methodology, and the feasibility of using the model in clinical practice.

**Search strategy**

Bibliographic databases will be searched for studies to include in the review. Ovid Technologies, Inc., part of the Wolters Kluwer group (Ovid MEDLINE) will be searched, PubMed free search engine will be used. The Cochrane Library (Wiley) will also be searched to identify any potentially similar systematic reviews. The HDAS (Healthcare Databases Advanced Search) platform will also be used to access EMBASE (Excerpta Medica database by Elsevier) and CINAHL (Cumulative Index to Nursing and Allied Health Literature) by EBSCO.

Searches will be performed using keywords and phrases related to rectal cancer, radiotherapy and prognostic models [13–16]. The full-search strategy is shown in Additional file 1.

References cited in identified sources will be examined to supplement the database searches. Sources of all languages and time periods will be searched. To identify other studies which have not yet been published, abstracts for conferences relevant to our research will be searched. Relevant systematic reviews will also be searched for further studies to include.

**Study selection**

Firstly, the search results from the databases will be duplicated using reference manager Endnote X9, and then, the titles and abstracts will be searched, and if thought relevant, full texts will be identified and compared against the eligibility checklist. This will be performed by two independent reviewers (MK and DH) using predefined screening criteria and a full list of inclusion criteria. If any discrepancies cannot be resolved between the two reviewers, a third reviewer (LJB) will be sought for a solution [17, 18]. When required, additional information to ascertain eligibility will be requested from the study authors. If studies are not chosen for inclusion, the exclusion reason will be documented. A PRISMA-P (Preferred Reporting Items for Systematic Review and Meta-analysis Protocols) flow chart will be created and can be found in the Additional file 2 [19–21].

Non-English studies will be translated where necessary and possible to facilitate interpretation and data extraction.

**Data extraction**

Data will be extracted by two reviewers independently using an in-depth piloted data extraction form. Disagreements will be resolved through discussion or referral to a third reviewer. The data extraction form will be pilot tested using a representative 5% sample of the studies to be reviewed. Consensus between review authors will be gained before any modifications are made to the form. If major changes are needed after the first testing, the pilot testing will be repeated on a new set of 5% of the studies.

In terms of data extraction, study characteristics, study design characteristics, patient characteristics, candidate prognostic factors considered including the information on missing data, outcome measures, statistical methods employed and how prognostic factors included in the analysis were handled; and prediction model information including the method used in the final model will be extracted as will the prognostic factors used in the model.
The data extraction specifically related to clinical prediction models will include the final model (its specification, included factors, values of regression coefficients and standard errors), how it was developed and any internal or external validation performance statistics for discrimination (such as the c-statistics or area under the curve) or for calibration (such as the expected/observed events ratio), together with their associated measures of spread [22]. This will be informed by the Critical Appraisal and Data Extraction for Systematic Reviews of Prediction Modelling Studies (CHARMS) checklist which helps frame the review question, design the review and extract the relevant items from the reports of the primary prediction modelling studies [23].

If deemed necessary, the author will be contacted to clarify any issues or in an attempt to retrieve any missing information.

**Assessment of study quality**

In this systematic review of prediction models in rectal cancer treatment, the assessment of bias and applicability to the intended population and setting will be performed using PROBAST (Prediction model Risk Of Bias Assessment Tool) [24]. This tool is intended to evaluate studies developing, validating or updating (for example, extending) prediction models, both diagnostic and prognostic. The study design and sample size will also be included in the risk of the bias assessment. Moreover, the reviewers will consider how missing data and continuous variables were handled, the how the prognostic factors in the final model were chosen and whether there was any internal or external validation of the model [23].

**Evidence synthesis**

Any studies reporting the development of a prediction model will be summarised narratively, in particular what prognostic factors were included in the final model, how the included variables were coded, what the specification of the model was and how it produces an individual outcome probability or risk score, the reported predictive accuracy of the model and whether the model was validated internally and/or externally, and if so how.

If multiple studies are found that externally validate the same prediction model, then calibration statistics (such as expected/observed events) and discriminatory statistics (such as the c-statistic or area under the curve) will be synthesised using random-effects meta-analysis methodology of Debray and Snell to summarise the model’s average performance across different settings and its predicted performance in a future setting [25, 26]. If there are updated versions of the same prediction model identified in our review, then only statistics for the most recent model will be included in the meta-analysis.

If we identify multiple prediction models that have been adequately externally validated, we will compare their performance narratively, taking into account the different case mix, how this relates to our own setting, Clatterbridge Cancer Centre NHS Foundation Trust and also the quality of studies. The Clatterbridge Cancer Centre NHS Foundation Trust is a centre of excellence for contact X-ray brachytherapy treatment, namely Papillon technique, and receives referrals not only on a national but also on an international level. We have the largest cohort of adult patients treated for rectal cancer with this modality.

**Analysis of subgroups or subsets**

If there are sufficient relevant prediction models available, subgroup analyses will synthesise calibration and discrimination statistics for studies according to the setting of radiotherapy treatment implementation; i.e., neo-adjuvant or adjuvant conducted in different settings (countries) or different types of studies (prospective studies vs. randomised studies vs. randomised trails) or different model types (logistic vs. survival analysis) [27, 28].

**Discussion**

The results of this systematic review will identify the factors predicting response to the treatment protocol. It will also identify all the currently available statistical models for prognosis and will provide insight into their applicability. Moreover, any gaps for potential development of new clinical prediction models will be highlighted.

Our results have the potential to inform the clinical management of patients diagnosed with rectal cancer. In particular, the results of the review will identify clinical prediction models for the response to treatment after diagnosis. These will be informative for clinicians currently treating patients and help inform treatment choices. The review will also identify areas where the evidence for or against particular candidate prediction models is lacking, and this will lead to recommendations for initiating additional prediction model development and validation.

**Abbreviations**

| UK: United Kingdom | CRT: Chemoradiotherapy | NICE: National Institute for Health and Care Excellence | PICO: Population/practicants, intervention, comparator, outcome | C-index: Concordance index | ROC: Receiver operating characteristic curve | AUC: Area under the curve | TNM: Tumour, node, metastasis | MEDLINE: Medical Literature Analysis and Retrieval System Online | PubMed: Public MEDLINE | CHARMS: Critical appraisal and data extraction for systematic reviews of prediction modelling studies | PROBAST: Prediction model risk of bias assessment tool | PRISMA-P: Preferred reporting items for systematic review and meta-analysis protocols | CAST: Active monitoring of cancer as an alternative to surgery |
**Supplementary Information**

The online version contains supplementary material available at https://doi.org/10.1186/s41512-022-00132-y.

Additional file 1. Full search strategy tables.

Additional file 2. PRISMA-P 2015 Checklist.

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**Authors' contributions**

LJB had the idea for the manuscript. MK wrote the first draft of the manuscript with guidance from LJB and DMP. All authors contributed to the writing of this protocol. The authors have read and approved the final manuscript.

**Availability of data and materials**

Not applicable.

**Declarations**

**Ethics approval and consent to participate**

Not applicable.

**Consent for publication**

Not applicable.

**Competing interests**

The authors declare they have no competing interests.

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**References**

1. National Bowel Cancer Audit Annual Report 2020 An audit of the care received by people with bowel cancer in England and Wales. 2020. https://www.nboca.org.uk/content/uploads/2020/12/NBOCA-2020-Annual-Report.pdf.
2. Habr-Gama A, et al. Alternative treatment to surgery for rectal cancer. ALES. 2018;3:50–50.
3. Glynne-Jones R, et al. Rectal cancer: ESMO Clinical Practice Guidelines for diagnosis, treatment and follow-up. Ann Oncol. 2017;28:viii.22–40.
4. Myint A. Patient choice in the NHS: capturing “decision regret” BMJ. 2019;366:i3536–i3536.
5. Gérard JP, et al. Contact X-ray brachytherapy for rectal cancer: past, present, and future. Cancer Radiother. 2021;25:795–800 Elsevier Masson s.r.l.
6. Gérard JP, et al. A brief history of contact X-ray brachytherapy 50 kVp. Cancer Radiother. 2020;24(3):222–5.
7. Bromham N, et al. Colorectal cancer: summary of NICE guidance. The BMJ. 2020;368:m461.
8. Riley RD, van der Windt D, Croft P, Moons KG. Prognosis research in healthcare: concepts, methods, and impact. Oxford University Press; 2019.
9. Moons KG, Royston P, Vergouwe Y, Grobbee DE, Altman DG. Prognosis and prognostic research: what, why, and how? BMJ. 2009;338.
10. Beard BV, Rettig RL, Ryoo JJ, Parker RA, McLemore EC, Attilani V. Watch-and-Wait compared to operation for patients with complete response to neoadjuvant therapy for rectal cancer. J Am Coll Surg. 2020;231(6):681–92.
11. Xu W, et al. Risk factors and risk prediction models for colorectal cancer metastasis and recurrence: an umbrella review of systematic reviews and meta-analyses of observational studies. BMC Med. 2020;18(1):172–172.
12. Sun Myint A, et al. Treatment: the role of contact X-ray brachytherapy (Papillon) in the management of early rectal cancer. Colorectal Dis. 2019;21:45–52.
13. Eriksen MB, Frandsen TF. The impact of patient, intervention, comparison, outcome (Pico) as a search strategy tool on literature search quality: a systematic review. J Med Libr Assoc. 2018;106(4):420–31.
14. Salvador-Oliván JA, Marco-Cuenca G, Arquero-Avilés R. Development of an efficient search filter to retrieve systematic reviews from pubmed. J Med Libr Assoc. 2021;109(4):561–74.
15. Geersing GJ, et al. Search filters for finding prognostic and diagnostic prediction studies in medline to enhance systematic reviews. PLoS One. 2012;7(2):e25844.
16. McGowan J, et al. PRESS Peer Review of Electronic Search Strategies. 2015 Guideline Statement. J Clin Epidemiol. 2016;75:40–6.
17. Bonnert LJ, et al. Individualised prediction of psychosis in individuals meeting at-risk mental state (ARMS) criteria: protocol for a systematic review of clinical prediction models. Diagn Progn Res. 2019;3(1):21.
18. Watson V, Tudur Smith C, Bonnert L. Protocol for a systematic review of prognostic models for recurrent events in chronic conditions. Diagn Progn Res. 2020;4:1.
19. Page MJ, McKenzie JE, Bossuyt PM, Bouton I, Hoffmann TC, Mulrow CD, et al. The PRISMA 2020 statement: an updated guideline for reporting systematic reviews. Syst Rev. 2021;10(1):1–11.
20. Shamseer L, Moher D, Clarke M, Ghersi D, Liberati A, Petticrew M, et al. Preferred reporting items for systematic review and meta-analysis protocols (PRISMA-P) 2015: elaboration and explanation. BMJ. 2015;349.
21. PRISMA-P Statement – Moher Sys Rev Jan 2015.pdf.
22. Debray TP, et al. A guide to systematic review and meta-analysis of prediction model performance. BMJ. 2017;356:i6460.
23. Moons KGM, et al. Critical appraisal and data extraction for systematic reviews of prediction modelling studies: the CHARMS checklist. PLoS Med. 2014;11(10):e1001744.
24. Moons KGM, et al. Transparent reporting of a multivariable prediction model for individual prognosis or diagnosis (TRIPOD): explanation and elaboration. Ann Intern Med. 2015;162(1):W1–73.
25. Debray TP, Koffijberg H, Nieboer D, Vergouwe Y, Steyerberg EW, Moons KG. Meta-analysis and aggregation of multiple published prediction models. Stat Med. 2014;33(14):2341–62.
26. Snell KI, et al. Multivariate meta-analysis of individual participant data helped externally validate the performance and implementation of a prediction model. J Clin Epidemiol. 2016;69:40–50.
27. Snell KI, et al. Meta-analysis of prediction model performance across multiple studies: which scale helps ensure between-study normality for the C-statistic and calibration measures? Stat Methods Med Res. 2018;27(11):3505–22.
28. Debray TP, et al. A framework for meta-analysis of prediction model studies with binary and time-to-event outcomes. Stat Methods Med Res. 2019;28(9):2768–86.

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