

Article

The Prostate Clinical Outlook (PCO) Classifier Application for Predicting Biochemical Recurrences in Patients Treated by Stereotactic Body Radiation Therapy (SBRT)

MDPI

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Abstract: (1) Background: Prostate cancer risk classifiers have been used for predicting surgical and radiation therapy outcomes; however, a classifier for predicting biochemical recurrence (BCR) in patients undergoing stereotactic body radiation therapy (SBRT) is not available. We attempted to develop a model that creates a risk classifier to predict BCR in patients considering SBRT. (2) Methods: We studied the outcomes of 809 patients treated with SBRT between August 2007 and November 2016. We used Cox regression analysis with time to BCR as the outcome to develop a model that calculates a prostate clinical outlook (PCO) score based on age at diagnosis, clinical-radiological staging, and a modified risk level. We then created the PCO classifier application, which uses the model we created to categorize patients into risk groups based on multiple factors. We assessed the concordance index (c-index) to determine the accuracy of the PCO classifier application and compared the results to the D'Amico and Kattan nomogram classifications. (3) Results: The calculated PCO scores ranged from 0 to 156 points. The PCO classifier application categorized patients into three risk-groups, with 5-year BCR-free survival rates of 98.3% for low risk (n = 137), 95.4% for intermediate risk (n = 570), and 86.4% for high risk (n = 102). We demonstrated the improved prognostic power of the PCO classifier application, with a c-index of 0.75 (training set) and 0.67 (validation set); the c-index of the Kattan nomogram was 0.62 and 0.63, respectively, and that of the D'Amico classifier was 0.64 and 0.64, respectively. (4) Conclusions: The PCO classifier application is a predictive tool for employing readily available clinical parameters to stratify prostate cancer patients and to predict the probability of BCR after SBRT.

Keywords: biochemical recurrence; CyberKnife; nomogram; prostate cancer; risk classification; stereotactic body radiation therapy; predictive analytics

1. Introduction

As the most common solid malignancy diagnosed in men, prostate cancer was the second most common cause of cancer death in 2016 [1,2]. However, advances in radiation oncology have led

to the development of effective therapies for clinically localized prostate cancer. Stereotactic body radiation therapy (SBRT) is delivered in large fractions of highly conformal radiation therapy. It is designed to deliver a very precise type of external radiation treatment and to provide optimized results while minimizing side effects. SBRT is a safe and effective treatment for clinically localized prostate cancer. Compared with surgery, it is an outpatient procedure that does not require general anesthesia or hospitalization, and it can be completed within four to five sessions. There are diverse benefits: no pain; minimal invasiveness; little or no recovery time; only five treatments instead of 40, the latter being typical of other forms of radiation therapy; few or reduced side effects; and speed, convenience, and effectiveness [3]. Such treatments are believed to be radiobiologically more effective in treating prostate cancers than the conventional low-dose fractions commonly used for prostate cancer radiotherapy [4,5]. In addition, SBRT treatment of localized prostate cancer has been reported as safe, and it offers excellent local control, as determined by freedom from biochemical recurrence (BCR) in patients presenting with low- and intermediate-risk cancers [6–8].

Risk assessments tools have been developed for predicting surgical and radiation therapy outcomes following standard prostate cancer treatment (i.e., D'Amico [9], Kattan nomogram [10], the University of California, San Francisco Cancer of the Prostate Risk Assessment (CAPRA) score [11], and the Candiolo classifier [12]). Although these risk assessments have been developed for predicting outcomes, these assessments have not been applied for use in patients treated with SBRT.

SBRT has been proven effective for the treatment of low- and intermediate-risk prostate cancer patients, who are the dominant recipients of SBRT treatment. However, there is yet to be a classifier that can be applied to predict BCR of patients treated with SBRT.

Therefore, we developed a prostate clinical outlook (PCO) classifier application that provides information on predicted BCR, specifically for patients electing to undergo prostate cancer treatment with SBRT. We have also proposed a prostate clinical outlook visualization system (PCOVS) based on the PCO classifier application [13].

2. Materials and Methods

Using Cox regression analysis, with time to BCR as the outcome for prostate cancer patients who underwent SBRT, a model was developed that calculates a PCO score based on (1) age at diagnosis, (2) clinical-radiological staging, and (3) the modified risk level based on a combination of pretreatment prostate specific antigen (PSA) and the Gleason score.

We studied the outcomes of 809 prostate cancer patients at MedStar-Georgetown University Hospital's Department of Radiation Medicine between August 2007 and November 2016. They were treated with SBRT after being diagnosed with prostate cancer and undergoing follow-up management. The patients were seen for follow-up examinations and blood sample collection at 3-month intervals for 2 years and then 6-month intervals for the remaining 3-year follow-up period.

We focused on BCR at 5 years after SBRT. The patients were enrolled in an IRB (Institutional review board)-approved study (#12-1175). The analysis was performed on de-identified, HIPAA-compliant data.

The PCO score was calculated using a nomogram. The three predictors we used for the PCO classifier application were as follows: (1) age at diagnosis, (2) clinical-radiological staging, and (3) modified risk level, which is the combination of pretreatment PSA and the Gleason score. These were selected and modified based on one physician's comments and fed into the application.

We used age, clinical-radiological staging, and modified risk level as independent variables in the regression analysis. For input into our PCO classifier application, patients were grouped into four age categories: 59 and under, 60–69, 70–79, and over 80 years. After an initial data review of tumor staging, only three patients presented with T3 tumors; a number were considered inadequate for separate analysis. Therefore, based on standard t-stage classification [14], the patients were assigned into the following groups: T1 (T1a, T1b, T1c), T2a, T2b, and T2c + T3. Recent studies have categorized a Gleason 7 tumor as two types: 7a (primary 3 + secondary 4) and 7b (4 + 3) [4,15]. Thus, the PCO classifier application divided the Gleason score into four grades (Table 1). Pretreatment PSA scores

were divided into three categories: $\leq 10.0 \text{ ng/mL}$, $>10.0 \text{ and } \leq 20.0 \text{ ng/mL}$, and >20.0 ng/mL (Table 1). We used a modified risk level based on a combination of the Gleason score and pretreatment PSA (Table 1) [16] and determined five classifications for the modified risk level.

Using a total score range based on BCR-free survival rate at 4 years, the patients were classified into one of three groups: 99%, 90%, and 80%. We determined three risk-groups based on patient distribution and the range of the total score (Appendices). Finally, the three risk-groups were validated by physician comments. The BCR-free survival rate at 4 years was used to calculate PCO scores. Because prostate cancer treated with SBRT has the lowest recurrence rate, there were not enough BCR rates to calculate the risk score using the BCR-free survival rate at 5 years.

To determine the accuracy of the PCO classifier application, we computed the concordance index (c-index). The 95% CI of the c-index was calculated by K-folder cross-validation. K-folder cross-validation is an effective validation procedure for classification [17,18]; we used 5-folder cross-validation in this study. To obtain balanced statistical power, we divided the data into two sets: training and test data [18]. We matched seven training datasets (n = 570) to four test datasets (n = 239). In addition, the PCO classifier application and classifications according to the D'Amico and Kattan nomogram risk groups were compared.

Survival data analyses were used to find the disease-free survival rates. We used the Kaplan–Meier estimator and Cox multivariable regression analysis to determine the risk factors significantly associated with BCR.

In this study, we used the American Society of Therapeutic Radiology and Oncology (ASTRO) definitions for BCR [19]. ASTRO defines BCR as the midpoint between the PSA nadir and the first of three consecutive rises in PSA level [20]. According to the Phoenix definition, BCR is an increase of at least 2 ng/mL from the nadir PSA [21]. It has been reported that using the Phoenix definition resulted in substantially lower estimates of BCR at 5 years and substantially higher estimates of BCR at 10 years, compared with the ASTRO definition [22]. Using the ASTRO definition resulted in better outcomes for up to 7 years after radiotherapy [23]. We focused on BCR at 5 years. Therefore, for our analyses, BCR was defined according to the ASTRO definition [22] and physician comments: the midpoint between PSA nadir and the first of three consecutive rises in PSA of at least 0.5 ng/mL.

The data were analyzed using R packages (R language; R V3.3.1; 21 June 2016) [24] and SPSS, version 18.0.

3. Results

3.1. Patients

The 809 patients' ages at diagnosis ranged from 44 to 100 years (Table 1), with 43.8% in the 70–79-year-old age range and 38.7% of the patients in the 60–69-year-old age range. The mean patient age was 70 years. The patients presenting with T1 tumors (T1b and T1c) comprised 66.4% of the study population. The patients with T2a comprised 16.7% of the study population. Based on the Gleason score, 37.3% of the patients had a low-risk disease, and 36.1% of the patients had a favorable intermediate (7 = 3 + 4) risk. A total of 18% of the patients had an unfavorable intermediate (7 = 4 + 3) risk. A pretreatment PSA below 10.0 ng/mL was observed in 73.9% of the patients. A total of 21% of the patients had pretreatment PSA values between 10.0 and 20.0 ng/mL. The patients with a favorable intermediate Gleason score comprised 34.7% in the modified risk level calculation. The median follow-up was 574 days, the mean was 758 days, and the maximum was 2227 days. There were 18 (2.2%) patients diagnosed with BCR.

	Category	N	Percent
	Under 59	60	7.4
A as at diagnosis	60–69	313	38.7
(Mean Pange)	70–79	354	43.8
(Weall, Kalige)	Over 80	82	10.1
	70.04 (44–100)		
	T1 (T1b, T1c)	537	66.4
T-stage	T2a	135	16.7
1 Stage	T2b	97	12.0
	T2c + T3	40	4.9
	Low $(3 + 3 \text{ or less})$	302	37.3
Classes	Favorable intermediate $(7 = 3 + 4)$	292	36.1
Gleason score	Unfavorable intermediate $(7 = 4 + 3)$	146	18.0
	High $(4 + 4 \text{ or greater})$	69	8.5
	$\leq 10.0 \text{ ng/mL}$	598	73.9
Pretreatment PSA	>10.0 and \leq 20.0 ng/mL	170	21.0
	>20.0 ng/mL	41	5.1
	Gleason score \leq 6 and PSA \leq 10 ng/mL	222	27.4
	Gleason score \leq 6 and PSA > 10 and PSA \leq 20	67	8.3
Modified risk level	Gleason score = $7(3 + 4)$	281	34.7
	Gleason score = $7(4 + 3)$	142	17.6
	Gleason Score ≥ 8 or PSA > 20	97	12.0
DCD	No BCR	791	97.8
BCR	BCR	18	2.2
	Median	574 days	
Follow-up periods	Mean 758 d		58 days
	Maximum	22	27 days
	Total	809	100

Table 1. Demographics of 809 patients. BCR: biochemical recurrence; PSA: prostate specific antigen.

3.2. Factors Associated with BCR after SBRT

Before developing the PCO classifier application, we tested various factors associated with BCR in patients who had received SBRT for prostate cancer (Table 2). Age at diagnosis was a significant factor (for p < 0.01) associated with BCR based on multivariate analysis (p = 0.006). The modified risk level had no significant associations with BCR based on multivariate analysis (p = 0.052).

Variables	HR	95.0% CI	р
Age at diagnosis	2.62	1.326-5.166	0.006 **
T-stage	1.03	0.643-1.641	0.910
Modified risk level	1.47	0.997-2.154	0.052

Table 2. Cox multivariable regression analysis on BCR.

3.3. The PCO Classifier Application

We calculated the PCO classifier score based on the nomogram depicted in Figure 1 and the data shown in Table 3. The total PCO classifier score was calculated as the sum of the values for each variable. The total scores ranged from 0 to 156.



Figure 1. PCO nomogram. Age (years): 1 = under 59, 2 = 60–69, 3 = 70–79, and 4 = over 80; T-stage: 1 = T1 (T1b, T1c), 2 = T2a, 3 = T2b, and 4 = T2c-T3; Modified risk level: 1 = Gleason score \leq 6 and PSA \leq 10 ng/mL, 2 = Gleason score \leq 6 and PSA > 10 and PSA \leq 20, 3 = Gleason = 7 (3 + 4), 4 = Gleason = 7 (4 + 3), and 5 = Gleason score \geq 8 or PSA > 20; Nomogram points: Low risk = 0–34, Intermediate risk = 35–115, High risk = 116–156, and Total scores = 0~156. Prob. = probability.

	X7	C
	Variables	Score
	Under 59	0
A an at dia amoria	60–69	33
Age at diagnosis	70–79	67
	Over 80	100
Tataas	T1 (T1b, T1c)	0
	T2a	1
1-stage	T2b	2
	T2c-T3	3
	Gleason score \leq 6 and PSA \leq 10 ng/mL	0
	Gleason score \leq 6 and PSA > 10 and PSA \leq 20	13
Modified risk level	Gleason score = 7 (3 + 4)	26
	Gleason score = $7(4 + 3)$	40
	Gleason score ≥ 8 or PSA > 20	53
	PSA: pretreatment PSA.	

Table 3. Prostate Clinical Outlook (PCO) classifier application score.

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The patients were classified using a total score range that was based on the BCR-free survival rate at 4 years: 99%, 90%, and 80%. The total scores ranged from 0 to 156. The PCO classifier application categorized prostate cancer patients into three risk-groups based on the BCR-free survival rate at 4 years: 137 patients were low risk (16.9%); 570 patients were intermediate risk (70.5%); and 102 patients were high risk (12.6%). We defined scores of 0–34 as a low-risk group, scores of 35–115 as an intermediate-risk group, and scores of 116–156 as a high-risk group.

The classifier calibration was assessed by grouping patients by their PCO classifier score (Figure 2). The calibration of the PCO classifier application illustrates how its predictions compare with the actual outcomes for the 809 patients. The performance of the PCO classifier application was within 10% of the actual outcomes and more accurate at 90% predicted probability. The *x*-axis is the predicted value

calculated using the PCO classifier application, and the *y*-axis is the actual freedom from BCR for the present patients [10,25]. The vertical bars represent 95% CI based on bootstrap analysis.



Figure 2. Calibration of the PCO classifier application.

Finally, we validated the PCO classifier application in two steps. First, we used the c-index for accuracy, which indicates the discrimination ability of prediction models [26]. The accuracy of the PCO classifier application was also assessed with Harrell's concordance. Next, we compared the PCO classifier and two other classifiers: Kattan nomogram and D'Amico (Figure 3). The c-index of the PCO classifier was 0.75 (training set) and 0.67 (validation set). The c-index of the Kattan nomogram classifier was 0.62 and 0.63, respectively, and the c-index of the D'Amico classification was 0.64 and 0.64, respectively (Table 4).



Figure 3. Cont.







Tab	ole 4	. Risk	assessments	comparison.
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No.	Risk Assessments	Predictor Variables	Treatments	Outcome	Samples	Performance (c-Index)
1	PCO Classifier Application	Age, Clinical stage, A modified risk level (Gleason score + pretreatment PSA)	Stereotactic body radiation therapy	Biochemical recurrence	809	0.75 ^a , 0.67 ^b
2	D'Amico	PSA, Gleason scores, Clinical stage	Radical Prostatectomy, External Beam Radiation Therapy, Interstitial Radiation Therapy	PSA failure	1872	0.62 ^a , 0.63 ^b
3	Kattan-nomogram	PSA, Gleason scores, Clinical stage	Radical prostatectomy	PSA recurrence	996	0.64 ^a , 0.64 ^b

^a: training set, ^b: validation set.

According to the PCO classifier application, the 5-year BCR-free survival rates for these groups were: low-risk group—98.3%; intermediate-risk group—95.4%; and high-risk group—86.4%. For the entire cohort, the BCR-free survival rate at 5 years was 95.0%.

4. Discussion

We developed a PCO classifier application to inform patients electing to undergo prostate cancer treatment with SBRT of potential outcomes. We can draw several conclusions based on our findings.

The PCO classifier application outperforms the D'Amico and Kattan nomogram definitions for the evaluated endpoint of BCR at 5 years post-treatment. We compared recurrence risk analysis and observed c-indexes of 0.75 (training set) and 0.67 (validation set) for the PCO classifier application, 0.62 (training set) and 0.63 (validation set) for Kattan nomogram, and 0.64 (training set) and 0.64 (validation set) for D'Amico. The c-index ranges from 0.5 (equivalent to equal change) to 1.0 (perfect ability to discriminate) [10]. In general, the range of c-index values for prostate cancer is approximately 0.65–0.85 [11]. The PCO classifier application had a higher prognostic power than the other classifications examined. Accordingly, the PCO classifier application is suitable for predicting BCR in patients undergoing SBRT (Table4).

The PCO classifier application divides patients into three risk-groups based on total PCO classifier scores, ranging from 0 to 156 points. The 5-year BCR-free survival rates for our sample were as follows: 98.3% for the low-risk group, 95.4% for the intermediate-risk group, and 86.4% for the high-risk group. Previous investigations based on risk groups receiving SBRT reported 5-year BCR-free survival rates of the following: 93%–97% for low-risk groups, 86.2%–92% for intermediate-risk groups, and 74.1~80% for high-risk groups [6,16,27]. Based on the Kattan nomogram definition, the reported 5-year BCR-free survival rate was 95% for low risk, 90% for the intermediate risk, and 80% for high risk [27]. Our 5-year BCR-free survival rates are specific for prostate cancer patients treated with SBRT, while the others include patients treated with radical prostatectomy, external beam radiation therapy, and interstitial radiation therapy [9–12].

To generate a PCO classifier score, the PCO classifier application uses age at diagnosis, which is differently reported depending on the study. Age at diagnosis has been reported to predict BCR for prostate cancer [2,28]. Some classifiers, such as the D'Amico and Kattan nomogram recurrence risk groups, do not use age to predict BCR. D'Amico and Kattan nomogram use PSA, Gleason scores, and clinical stage as predictors of outcomes [9,10]. Others, such as the CAPRA score and the Candiolo classifier, use age as a predictor of outcomes. For the PCO classifier application, we decided to use age at diagnosis as a predictor of BCR based on one physician's comments. In addition, we observed that using this variable increased the predictive power of the PCO classifier application. In our results, age at diagnosis did correlate with biochemical outcomes after SBRT using the CyberKnife.

The PCO classifier application employs a modified risk level—a combination of pretreatment PSA and Gleason score—to increase the predictive power of the model. The modified risk level was revised for the PCO classifier application based on Katz's (2013) risk assessment [16]. While the modified risk level is not statistically significant in our results at a *p*-value of 0.05, the relationship is in the direction we predicted, and the effect size is substantial, providing an interesting finding. Thus, the modified risk level is able to segregate based on established risk assessment criteria, and it increased the prognostic power of the PCO classifier application.

We identify several potential limitations in our work. First, personalized medicine and molecular imaging are emerging approaches to improve the accuracy of traditional prediction methods. These could provide patients with a more personalized risk assessment of clinically relevant outcomes. Future research needs to use diverse factors and variables to predict treatment outcomes. Second, we used only three predictors for the PCO classifier application: (1) age at diagnosis, (2) clinical-radiological staging, and (3) the modified risk level, which is combination of pretreatment prostate specific antigen (PSA) and the Gleason score. We chose to use only these three predictors because the PCO classifier application aimed to calculate the risk using minimal, necessary information

to support prostate cancer patients' decisions on treatment. In addition, classifiers, such as the CAPRA score and the Candiolo classifier, require positive cores at biopsy as a predictor of BCR. We did not use biopsies as a predictor for the PCO classifier application. Our model can be extended to use other predictors if they are identified as necessary or potentially advantageous to the model's accuracy. Future research should be conducted to include other predictors. Third, 809 patients treated with SBRT and followed for 5 years at a single institution were included in this study. Future research should compare the results using data from other hospitals or a longitudinal observational database, such as the Cancer of the Prostate Strategic Urological Research Endeavor (CaPSURE) database, with various stages and treatments of the prostate [29]. Fourth, we used the ASTRO definition for BCR, even though other research has emphasized that the Phoenix definition is a superior predictor of patient outcomes, such as distant metastasis, cause-specific mortality, and overall mortality [30]. We stand by our decision to use the ASTRO definition, because it is a predictor of distant metastasis and cause-specific mortality, just not overall mortality [30]. The ASTRO definition has resulted in substantially higher estimates of BCR at 5 years than has the Phoenix definition [22]. Because our study was interested in BCR, the ASTRO definition seemed like the correct choice, even if it is controversial. Future research should substitute the Phoenix definition for the ASTRO definition and compare the results. Finally, there are 18 prostate cancer patients with BCR in our study. We developed the PCO classifier application based on 18 patients among 809 patients. The BCR rate in this study is an un-meditated rate. It is a real BCR rate. However, a future study could collect big data from multiple hospitals to use more patients with BCR.

5. Conclusions

The PCO classifier application predicts BCR in patients undergoing SBRT, and we have developed the prostate clinical outlook visualization system (PCOVS) based on the PCO classifier application [13]. Age at diagnosis, clinical-radiological staging, pretreatment PSA, and Gleason scores are important components for predicting BCR after SBRT. The PCO classifier application has the potential to be a tool for employing readily available parameters to stratify prostate cancer patients and to predict probabilities of BCR after SBRT.

Author Contributions: S.K.M. was involved in the study design, revision of the PCO classifier, and revision of the manuscript, and was a major contributor to the study. M.J.R. was involved in the study design, writing of the manuscript, and interpretation of results, and was a major contributor to the development of the PCO classifier. J.P. was involved in the study design, development of the PCO classifier, and writing of the manuscript. S.P.C. and S.S. were involved in the collection of the data, chart review, and interpretation of data. A.D. was involved in the interpretation of the PCO classifier and revision of the manuscript and was a major contributor to the study design. I.Y.C. was involved in the study design.

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Conflicts of Interest: Sean P. Collins is a clinical consultant for Accuray Inc. and receives an educational grant to fund a research coordinator in the Department of Radiation Medicine at Georgetown University Hospital. The other authors declare that they have no conflicts of interests.

Ethics Approval: This study follows the IRB regulations of the Georgetown University Medical Center (protocol 12-1175).

Availability of Data and Materials: Please contact the authors for the data request. The visualization software has been published as open source code under an Apache 2.0 license, and it available at OSEHRA.ORG.

Appendix A. Referenced Risk Assessment

Classification	Criteria [16]
Low	Gleason score \leq 6 and PSA \leq 10 ng/mL
Intermediate	Gleason score = 7 or PSA > 10 and PSA \leq 20
High	Gleason score ≥ 8 or PSA > 20

Prob. of 4-Year BCR-Free Rate	Cutoff of Total Score	Range of Total Score	PCO Class	N	%
99%	34	0–34	Low	137	16.9
90%	115	35-115	Intermediate	570	70.5
80%	141	116–156	High	102	12.6

Appendix B. PCO Classifier and Cutoff of Total Score

Appendix C. Life Table of BCR

	bRFS (Biochemical Relapse Free Survival) Rates—Follow-Up (Years)						
PCO Class	1	2	3	4	5		
Low	100.0	100.0	100.0	98.3	98.3		
Intermediate	99.5	99.5	96.3	96.3	95.4		
High	97.2	89.2	86.4	86.4	86.4		

Appendix D. The PCO Classifier Table with Patients' Scores

N. 1.C. 1 D. 1 T 1	Clinical Stage	Age at Diagnosis			
Modified Kisk Level	Cillical Stage	Under 50	60–69	70–79	Over 80
	T1	0	33	67	100
Gleason score ≤ 6 and	T2a	1	34	68	101
$PSA \le 10 \text{ ng/mL}$	T2b	2	35	69	102
	T2c-T3	3	36	70	103
	T1	13	46	80	113
Gleason score \leq 6 and	T2a	14	47	81	114
PSA > 10 and PSA \leq 20	T2b	15	48	82	115
	T2c-T3	16	49	83	116
	T1	26	59	93	126
C_{1}	T2a	27	60	94	127
Gleason score = 7 (3 + 4)	T2b	28	61	95	128
	T2c-T3	29	62	96	129
	T1	40	73	107	140
Chargen agent $-7(4+2)$	T2a	41	74	108	141
Gleason score = 7 (4 + 3)	T2b	42	75	109	142
	T2c-T3	43	76	110	143
	T1	53	86	120	153
Gleason score ≥ 8 or	T2a	54	87	121	154
PSA > 20	T2b	55	88	122	155
	T2c-T3	56	89	123	156

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