

**A prostate cancer risk calculator (PCRC-MRI): Use of clinical and magnetic resonance imaging data to predict biopsy outcome in North American men**

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**Funding:** R01CA218547 and R01CA195505 from the National Cancer Institute and UL1TR000124 from University of California, Los Angeles Clinical and Translational Science Institute.

**Cite as:** Kinnaird A, Brisbane W, Kwan, et al. A prostate cancer risk calculator (PCRC-MRI): Use of clinical and magnetic resonance imaging data to predict biopsy outcome in North American men. *Can Urol Assoc J* 2021 October 18; Epub ahead of print. <http://dx.doi.org/10.5489/cuaj.7380>

Published online October 18, 2021

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**Abstract**

**Introduction:** A functional tool to optimize patient selection for magnetic resonance imaging (MRI)-guided prostate biopsy (MRGB) is an unmet clinical need. We sought to develop a prostate cancer risk calculator (PCRC-MRI) that combines MRI and clinical characteristics to aid decision-making for MRGB in North American men.

**Methods:** Two prospective registries containing 2354 consecutive men undergoing MRGB (September 2009 to April 2019) were analyzed. Patients were randomized into five groups, with one group randomly assigned to be the validation cohort against the other four groups as the discovery cohort. The primary outcome was detection of clinically significant prostate cancer (csPCa) defined as Gleason grade group  $\geq 2$ . Variables included age, ethnicity, digital rectal exam (DRE), prior biopsy, prostate-specific antigen (PSA), prostate volume, PSA density, and MRI score. Odds ratios were calculated from multivariate logistic regression comparing two models:

one with clinical variables only (clinical) against a second combining clinical variables with MRI data (clinical+MRI).

**Results:** csPCa was present in 942 (40%) of the 2354 men available for study. The positive and negative predictive values for csPCa in the clinical+MRI model were 57% and 89%, respectively. The area under the curve of the clinical+MRI model was superior to the clinical model in discovery (0.843 vs. 0.707,  $p<0.0001$ ) and validation (0.888 vs. 0.757,  $p<0.0001$ ) cohorts. Use of PCRC-MRI would have avoided approximately 16 unnecessary biopsies in every 100 men. Of all variables examined, Asian ethnicity was the most protective factor (odds ratio [OR] 0.46 [0.29–0.75]) while MRI score 5 indicated greatest risk (OR15.8 [10.5–23.9]).

**Conclusions:** A risk calculator (PCRC-MRI), based on a large North American cohort, is shown to improve patient selection for MRGB, especially in preventing unnecessary biopsies. This tool is available at <https://www.uclahealth.org/urology/prostate-cancer-risk-calculator> and may help rationalize biopsy decision-making.

## Introduction

Prostate cancer diagnostics have evolved in the last decade due to the addition of multiparametric magnetic resonance imaging (MRI) to guide biopsy.<sup>1</sup> Prostate MRI allows visualization of most clinically significant prostate cancers (csPCa) and permits targeted biopsy of the lesion.<sup>2–4</sup> The American Urological Association and the Society of Abdominal Radiology released a joint recommendation that MRI-guided biopsy (MRGB) should be performed in all men undergoing prostate biopsy when quality MRI imaging is available.<sup>5</sup> Consequently, use of MRGB is growing.<sup>6</sup> Because MRGB is resource-intensive, there is a need to improve selection of patients for whom the new technology would best be applied. Thus, an accessible tool that incorporates MRI data into prostate cancer risk stratification would fill an important unmet need.

Improving efficiency of prostate biopsy is also important because of the potential complications of the procedure.<sup>7</sup> As many as 6.9% of men may be hospitalized within 30 days after prostate biopsy, most often for bacterial infection.<sup>7</sup> Infectious complications are increasing and expensive, costing a median of over \$4000 U.S. for each event.<sup>8</sup> In fact, approximately 50% of the costs attributed to a prostate biopsy are due to complications.<sup>9</sup> Transperineal biopsy, which has not yet been widely adopted in the U.S. may reduce infectious complications, but pain, urinary retention, hematospermia, and hematuria remain common.<sup>8</sup> Thus, increasing efficiency of biopsy would ease a current burden on healthcare systems.

Risk calculators are tools that use available data to predict the likelihood of an outcome and assist informed decision-making. Regarding prostate cancer, several ‘pre-MRI era’ risk calculators that assist with the decision to biopsy have been published. These include the Prostate Cancer Prevention Trial Risk Calculator (PCPTRC) and the European Randomized Study of Screening for Prostate Cancer (ERSPC) risk calculator.<sup>10,11</sup> While the ERSPC risk calculator has

been updated to include MRI data,<sup>12</sup> currently lacking is an interactive utility for predicting biopsy outcomes based on a North American cohort that includes MRI data. This distinction in data source is a pitfall of risk calculators because it limits their use outside of the population from which they are derived.<sup>13</sup> Therefore, we sought to create a risk calculator to predict clinically significant prostate cancer (csPCa) in men undergoing MRGB in a large North American cohort.

## Methods

### *Study design*

We analyzed data from prospective observational cohorts of men undergoing MRGB at UCLA and Cornell between 9/2009 and 4/2019 (Figure 1). These sites were selected because of lengthy commonality of personnel and technology for MRGB (>10 years). Men previously diagnosed with prostate cancer (active surveillance) were excluded. Subjects were randomized equally into 5 groups. We randomly chose 1 group (n=469) to be the validation cohort against the other 4 groups (n=1885) as the discovery cohort.

### *Primary outcome: Detection of csPCa defined as Gleason grade group $\geq 2$*

#### *Imaging*

Multiparametric MRI of the prostate was performed with 3 Tesla magnets with pelvic phased-array coils. MRIs were interpreted by experienced genitourinary radiologists. Before the Prostate Imaging Reporting and Data System (PI-RADS) was introduced, regions of interest (ROI) were graded using an in-house Likert scale with scores concordant to those used in PI-RADS, version 2 (v2).<sup>14</sup> Beginning in late 2014, ROIs were graded using the PI-RADSv2 scoring system. The ROIs were interpreted and contoured by radiologists using DynaCAD (Invivo/Philips, USA) and ProFuse software (Eigen, USA).

#### *MRI-guided biopsy*

Combined targeted and systematic biopsies detect more csPCa than either strategy alone.<sup>15,16</sup> Therefore, all men underwent combined targeted and systematic sampling. The Artemis (Eigen, USA) MRI/US fusion device was used as previously described (Figure 2).<sup>15</sup>

#### *Statistical analyses*

T-tests (or Wilcoxon rank-sum) and Chi-square tests were used to compare patient and clinical characteristics between discovery and validation cohorts. We conducted multivariate logistic regressions on the discovery and validation cohorts to calculate odds ratios for covariates and subsequent predicted probabilities for each patient. We chose two sets of covariates *a priori* based on risk factors identified in other models<sup>12,17</sup>: the clinical covariates were age, ethnicity, abnormal digital rectal exam (DRE), prior negative biopsy and PSA, and the MRI covariates were prostate volume, PSA density (<0.15 vs  $\geq 0.15$  ng/mL/cc) and MRI score. Family history of

first-degree relative with prostate cancer was included in a post-hoc analysis as an exploratory clinical variable. We constructed a ‘Clinical’ model that included only the clinical covariates and a ‘Clinical+MRI’ model that included both sets of covariates. Models using MRI score only, and MRI score in addition to PSA density were also constructed. A two-sided p-value 0.05 was considered significant. Receiver operating characteristic curves were plotted to evaluate the value of the final models as well as components of each model. We also calculated net benefit (using true positive and false positive rates) and net reduction in ‘unnecessary’ biopsies for both models.<sup>18</sup> All analyses were conducted in SAS 9.4 (Cary, NC) by co-author L.K..

### ***Ethical approval***

UCLA and Cornell human research ethics boards approved of the collection and usage of patient data (UCLA: #11001580; Cornell: #1509016548)

### **Results**

MRGB was performed in 2354 consecutive men (1594 from UCLA, 760 from Cornell). Mean (SD) age was 65 years (7.8) and 63% were Caucasian. Median (IQR) PSA and prostate volume were 6.5 ng/mL (4.7, 9.5) and 48 cc (35, 68), respectively. Twenty-one percent of men had a family history of prostate cancer, 38% previously had a negative biopsy and 81% had an MRI score  $\geq 3$  (Table 1). At MRGB, 40% of men had benign histology, 20% had Gleason Grade Group 1 and 40% had csPCa (Figure 1). There were no significant differences between men randomized to the discovery and validation cohorts used for analysis (Supplementary Table 1).

The odds ratios from the Clinical and Clinical+MRI multivariate logistic regressions for detecting csPCa in the discovery cohort are shown in Table 2 (univariate logistic regressions are shown in Supplementary Table 2). The two covariates that were associated with the greatest reduction in csPCa risk were clinical covariates Asian ethnicity (OR=0.46, 95%CI 0.29-0.75) and previous negative biopsy (OR=0.54, 95%CI 0.42-0.69), while the covariate associated with the greatest increase in risk was the MRI score (score 4: OR=3.96, 95%CI 2.79-5.62; score 5: OR=15.8, 95%CI 10.5-23.9; referent is MRI score <3). Age, abnormal DRE, PSA, and elevated PSA density were also independently associated with increased risk of csPCa (Table 2). A post-hoc analysis including available family history data (n=1552) in the Clinical+MRI model gives an insignificant odds ratio of 1.07 (95%CI 0.77-1.47, p=0.72).

The AUC of the Clinical+MRI model was superior to that of the Clinical model in both discovery (0.843 vs. 0.707; p<0.0001) and validation (0.888 vs. 0.757; p<0.0001) cohorts (Figure 3). The AUC of the Clinical+MRI model outperformed MRI+PSA density (0.843 vs. 0.796; p<0.0001) and MRI alone (0.843 vs. 0.760; p<0.0001) (Figure 3).

To estimate the value of PCRC-MRI, the concept of a risk threshold was employed. Risk threshold is the actionable level of risk at which biopsy would be recommended. At a risk threshold of 20% (i.e. 0.20 probability of csPCa detection), the Clinical+MRI model reduced the number of false positives by 37% and improved the positive predictive value by 14% compared to the Clinical model (Supplementary Table 3). Furthermore, using a 20% biopsy threshold we

calculated a net benefit of 23.7% from the Clinical model and 27.6% from the Clinical+MRI model. The additional 3.9% net benefit conferred a net reduction of 16 unnecessary biopsies in every 100 men by using the PCRC-MRI.

## Discussion

Data from 2354 North American men undergoing MRGB were used to create a predictive tool for prostate cancer, the PCRC-MRI risk calculator. This instrument uses conventional clinical data and data derived from prostate MRI to determine the probability of detecting csPCa at biopsy. With a large multi-institutional sample of patients and an AUC of 0.89 in the validation cohort, the PCRC-MRI risk calculator compares favorably to other risk-assessment tools for predicting presence of csPCa.<sup>12,17,19</sup>

Approximately one million prostate biopsies are performed annually in the U.S. and 191,930 new prostate cancer cases are anticipated in 2020.<sup>7,20</sup> The majority of these biopsies are currently performed using ultrasound-guided sampling of the organ, an approach that dates from the 1980s. However, ultrasound fails to visualize most prostate cancers, leaving detection to a chance encounter of the biopsy needle with cancerous tissue. This ‘blind’ technique appears to detect fewer clinically significant cancers and more clinically insignificant tumors compared to MRGB.<sup>3</sup> Usage of MRGB is increasing,<sup>6</sup> but nevertheless prostate biopsy is not without complication. Nearly 7% of men may be hospitalized within one month of biopsy, most often for bacterial infection.<sup>7</sup> Other complications are less severe, but still bothersome and may require additional medical evaluation. Use of the PCRC-MRI may help patients avoid unnecessary biopsy, mitigating detection of clinically insignificant disease and procedural complications.

Accuracy of prostate biopsy for csPCa is increased when MRI guidance is used.<sup>2,3,15</sup> After a decade of study and hundreds of supportive conclusions, MRGB is now recommended for all men undergoing prostate biopsy if the resources permit.<sup>5</sup> csPCa is most likely to be detected if MRGB combines targeted and systematic biopsies.<sup>15,16</sup> The combination is required because as many as 15-25% of csPCa are invisible on MRI, necessitating the addition of systematic cores.<sup>16,21</sup> This strategy accurately predicts final tumor grade in 96.5% of radical prostatectomy specimens.<sup>16</sup> All patients in the cohort used to create PCRC-MRI underwent combined targeted and systematic template biopsy (Figure 2).

The PI-RADS scoring system is a universally accepted method for determining suspicion of prostate cancer on MRI. Using template mapping biopsy as ‘ground truth,’ a score of 5 on the updated version of PI-RADS (version 2) has high sensitivity and specificity for the presence of csPCa.<sup>22</sup> However, mid-range scores are only moderately predictive of csPCa, and there is debate as to whether PI-RADS 3 lesions even require biopsy.<sup>2,15</sup> One strategy that has been commonly adopted to aid in biopsy decision-making is the combination of PI-RADS score with PSA density. For example, the likelihood of detecting csPCa is elevated in a man with a PI-RADS 3 lesion and a PSA density >0.15 ng/mL/cc compared to a PI-RADS 3 lesion and a low PSA density.<sup>23</sup>

PCRC-MRI, which combines multiple variables of clinical and MRI data, may especially help biopsy decision-making in a man with a midrange PI-RADS score. PCRC-MRI outperforms the commonly employed strategies of decision-making discussed above (Figure 3). Therefore, this tool may improve patient selection for MRGB and reduce the number of unnecessary biopsies. For example, two men --- both 64 years-old with PSA 6 ng/ml, normal DRE, and PI-RADS 3 lesions in prostates of 45cc volume --- may be advised to undergo biopsy. However, using PCRC-MRI, the first man (Caucasian with no previous negative biopsy) is predicted to have a 21% risk for csPCa (Supplementary Figure 1), while the second man (Asian with a previous negative biopsy) has a predicted risk of 6%. If using only MRI score to determine need for biopsy, the risk for each man is approximately 25% and biopsy would be performed in both.<sup>4</sup> However, at a risk threshold of 10, 15, or 20%, a biopsy would be performed on the first man and not recommended for the second.

While other risk calculators have been proposed, none have been developed as an interactive tool using MRI data for men in North America. This is important because prostate cancer risk is influenced by variables such as ethnicity and geography. A strength of PCRC-MRI is the inclusion of ethnicity as a variable. It is of interest to note that African American ethnicity did not increase risk of csPCa. Access to care rather than biology may account for putative aggressiveness of PCa in African American men.<sup>24</sup> Specifically, when MRI-guided biopsy is used there is no appreciable difference in detection rate or aggressiveness of csPCa between African American and other men.<sup>25</sup> Asian ethnicity was the single most important protective factor indicating absence of csPCa, in accordance with recently published work.<sup>26</sup> Other available tools either do not report ethnicity or include relatively few absolute numbers of minority men.<sup>12,17</sup>

The interaction between ethnicity and geography, influenced by environmental factors such as diet, may affect prostate cancer biology. For example, Japanese men living in Japan have markedly different gene expression in radical prostatectomy specimens compared to Japanese men living in the United States.<sup>27</sup> Furthermore, the age-standardized rate for prostate cancer is greater in North America than Europe (73.7 vs. 62.1 per 100,000 people).<sup>28</sup> In fact, when the PCPTRC (U.S. men) was used to predict prostate cancer in Europeans, the benefit of that risk calculator was lost.<sup>29</sup> While the updated ERSPC risk calculator was externally validated in another set of western European men, its value has not been established in a North American population.<sup>30</sup> Taken together, these data help to explain the limitations of a risk calculator used outside of the population from which it is derived.

The risk threshold at which to perform biopsy will likely be the result of an informed-decision discussion between doctor and patient. In this regard, the PCRC-MRI provides information beyond that of clinical data alone. Specifically, the risk calculator improved PPV and NPV at any biopsy risk threshold above 10% (Supplementary Table 3). At a biopsy threshold of 20%, use of the PCRC-MRI would avoid 16 unnecessary biopsies in every 100 men.

Importantly it accomplishes this refinement at no additional cost to the healthcare system, as all the input data required are standard-of-care for MRGB.

Limitations of the study include that all biopsies were performed using a transrectal approach via the same fusion device (Artemis). However, published results with other fusion devices and other biopsy approaches (transperineal) are similar to those reported here, suggesting that the biopsy platform should not materially affect the predictive utility of the instrument. The risk calculator only applies to North American men. While somewhat under-represented, African American men are not at any greater risk for PCa than Caucasian men, as discussed above. Men of Asian descent, who comprise the most rapidly growing ethnicity in North America, were well-represented. All MRI studies and MRGBs were performed by highly experienced radiologists and urologists, which may limit generalizability of the results. Family history of prostate cancer data were not available from one site. Nevertheless, the large sample size and prospective, uniform data collection offset the above limitations. Future modifications of the PCRC-MRI risk calculator might involve addition of biomarker or genomic data and expansion of the study sample to include men from other populations, allowing general application.

### **Conclusions**

A prostate cancer risk calculator (PCRC-MRI), which employs both clinical and MRI data, provides a useful tool to predict presence of csPCa at biopsy in North American men. Usage of PCRC-MRI would reduce unnecessary biopsies and requires only standard-of-care inputs.

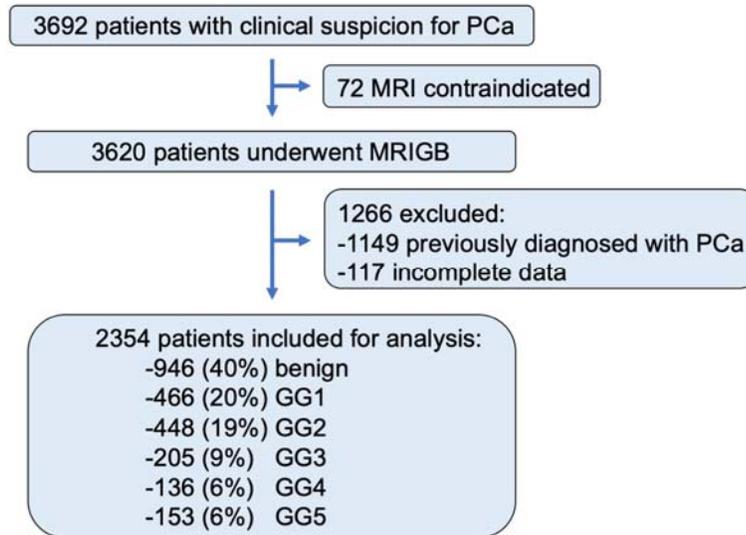
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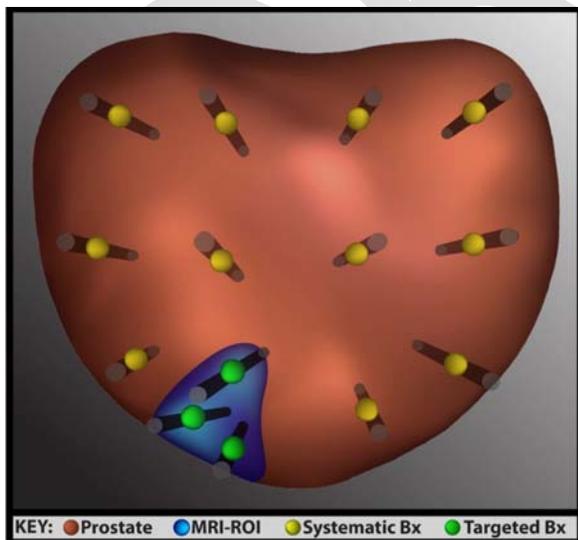
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## Figures and Tables

**Fig. 1.** Flow diagram of participants. Of the final 2354, 1594 came from UCLA and 760 from Cornell. Study dates were between 9/2009 and 4/2019. GG: Gleason grade group; MRI: magnetic resonance imaging; MRGB; MRI-guided biopsy; PCa: prostate cancer.

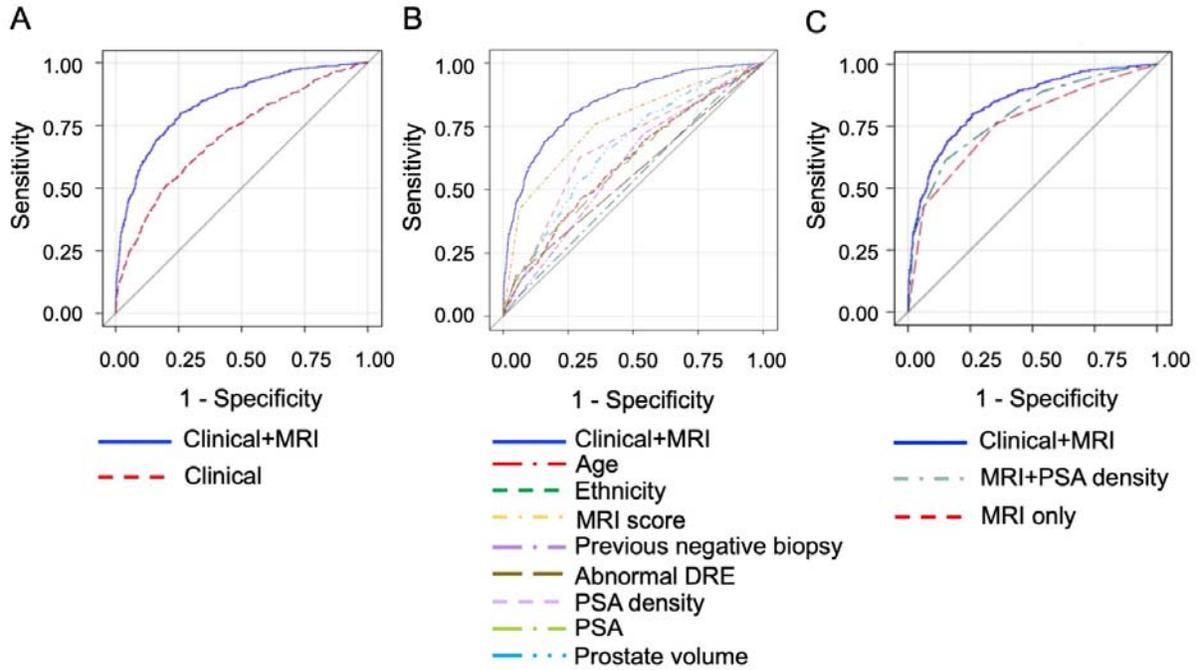


**Fig. 2.** Biopsy schema: magnetic resonance imaging (MRI)-targeted biopsies (green) and systematic biopsies (yellow), magnetic resonance imaging region of interest (MRI-ROI) (blue), and prostate (brown). Combined targeted and systematic biopsy was performed in all patients.<sup>15,16</sup>



**Fig. 3.** ROC of models from the discovery cohort. (A) Overall comparison. Note that the clinical+MRI model is superior to clinical model (AUC 0.843 vs. 0.707,  $p < 0.0001$ ). (B) Components of the clinical+MRI model, compared to the full model. (C) Comparison of the

clinical+MRI model to MRI+PSA density and MRI score alone. Clinical+MRI is superior to both MRI+PSA density (AUC 0.843 vs. 0.796,  $p < 0.0001$ ) and MRI alone models (AUC 0.843 vs. 0.760,  $p < 0.0001$ ). AUC: area under the curve; DRE: digital rectal exam; MRI: magnetic resonance imaging; PSA: prostate-specific antigen; ROC: receiver operating characteristic,



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<b>Table 1. Baseline characteristics of study sample (n=2354)</b>	
Age (years), mean (SD)	65.0 (7.8)
Ethnicity, n (%)	
Caucasian	1491 (63)
African American	141 (6)
Asian	171 (7)
Other	116 (5)
Unknown	435 (18)
Abnormal DRE, n (%)	
Yes	231 (10)
No	1655 (70)
Unknown	468 (20)
Family history of prostate cancer <sup>*</sup> , n (%)	
Yes	332 (21)
No	1220 (79)
Previous negative biopsy, n (%)	
Yes	905 (38)
No	1449 (62)
PSA (ng/mL), median (IQR)	6.5 (4.7, 9.5)
Prostate volume (cc), median (IQR)	48 (35, 68)
PSA density, n (%)	
<0.15	1344 (57)
≥0.15	1010 (43)
MRI score	
Negative (≤2)	452 (19)
3	677 (29)
4	730 (31)
5	495 (21)

<sup>\*</sup>n=1552, UCLA data only. DRE: digital rectal exam; IQR: interquartile range; MRI: magnetic resonance imaging; PSA: prostate-specific antigen; SD: standard deviation.

<b>Table 2. Adjusted odds ratio of clinically significant prostate cancer in the discovery cohort (n=1885)</b>		
	<b>Clinical model OR (95% CI)</b>	<b>Clinical + MRI model OR (95% CI)</b>
Age at biopsy	<b>1.05 (1.03, 1.06)</b>	<b>1.06 (1.04, 1.07)</b>
Ethnicity		
African American vs. Caucasian	1.25 (0.82, 1.92)	1.27 (0.78, 2.07)
Asian vs. Caucasian	<b>0.62 (0.41, 0.95)</b>	<b>0.46 (0.29, 0.75)</b>
Other vs. Caucasian	1.21 (0.75, 1.94)	1.21 (0.70, 2.08)
Unknown vs. Caucasian	0.98 (0.76, 1.28)	0.92 (0.67, 1.25)
DRE abnormality (yes vs. no/unknown)	<b>3.06 (2.15, 4.34)</b>	<b>2.37 (1.56, 3.63)</b>
Previous negative biopsy (yes vs. no)	<b>0.41 (0.33, 0.51)</b>	<b>0.54 (0.42, 0.69)</b>
PSA	<b>1.06 (1.04, 1.08)</b>	<b>1.02 (1.00, 1.04)</b>
PSA volume		<b>0.98 (0.98, 0.99)</b>
PSA density		<b>2.41 (1.81, 3.22)</b>
MRI score		
3 vs. negative		<b>1.67 (1.15, 2.42)</b>
4 vs. negative		<b>3.96 (2.79, 5.62)</b>
5 vs. negative		<b>15.85 (10.51, 23.89)</b>

CI: confidence interval; DRE: digital rectal exam; MRI: magnetic resonance imaging; PSA: prostate-specific antigen.