




# Identifying Risk Profiles of Malignant Prostate Cancer Surgical Delay Using a Person-Centered Approach to Understand Prostate Cancer Disparities: The Constellation of Health Determinants Using Latent Class Analysis on Cancer Registry Data

American Journal of Men's Health  
November-December 2020: 1–9  
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DOI: 10.1177/1557988320984282  
journals.sagepub.com/home/jmh  


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## Abstract

Surgical prostate cancer (PCa) treatment delay (TD) may increase the likelihood of recurrence of disease, and influence quality of life as well as survival disparities between Black and White men. We used latent class analysis (LCA) to identify risk profiles in localized, malignant PCa surgical treatment delays while assessing co-occurring social determinants of health. Profiles were identified by age, marital status, race, county of residence (non-Appalachian or Appalachian), and health insurance type (none/self-pay, public, or private) reported in the Tennessee Department of Health cancer registry from 2005 to 2015 for adults  $\geq 18$  years ( $N = 18,088$ ). We identified three risk profiles. The highest surgical delay profile (11% of the sample) with a 30% likelihood of delaying surgery  $>90$  days were young Black men,  $<55$  years old, living in a non-Appalachian county, and single/never married, with a high probability of having private health insurance. The medium surgical delay profile (46% of the sample) with a 21% likelihood of delay were 55–69 years old, White, married, and having private health insurance. The lowest surgical delay profile (42% of the sample) with a 14% likelihood of delay were  $\geq 70$  years with public health insurance as well as had a high probability of being White and married. We identified that even with health insurance coverage, Blacks living in non-Appalachian counties had the highest surgical delay, which was almost double that of Whites in the lowest delay profile. These disparities in PCa surgical delay may explain differences in health outcomes in Blacks who are most at-risk.

## Keywords

prostate cancer, surgical treatment delay, latent class analysis, health disparities

Received September 24, 2020; revised December 2, 2020; accepted December 7, 2020

Prostate cancer (PCa) is the most commonly diagnosed cancer and the second leading cause of cancer death among men in the United States (Siegel et al., 2020); compared to Whites, Black men are more likely to develop PCa. Furthermore, Black men are also more likely to have advanced prostate cancer, and 2.4 times more likely to die from it (Howlader et al., 2012; Stokes et al., 2013). Although survival outcomes have improved in general population, the difference in PCa incidence,

survival, and mortality rates in Black and White men represents the largest health disparities of any malignancy (Gilligan, 2005).

The underlying causes for these PCa disparities are unclear but involve complex multiple determinants of health including biological, cultural, access to health care, and sociodemographic differences. Regional and nationally representative data from the United States suggest that race and ethnicity strongly correlate with survival following a PCa diagnosis



(Adams et al., 2017; Benjamins et al., 2016; Chornokur et al., 2011; Dess et al., 2019; Krimphove et al., 2019). In a systematic review, Chornokur et al. (2011) found survival and diagnostic differences in surgical intervention, radiation therapy, and nonaggressive treatments between Black men and White men with PCa. Black men were also more likely to experience a longer wait times between diagnosis and treatment (incidence rate ratio [IRR] = 1.19) compared to White men, while sociodemographic, clinical, and psychosocial factors were not able to explain these racial differences (Kinlock et al., 2016). Similarly, using the National Center for Health Statistics death files, Benjamins et al. (2016) analyzed racial disparities in PCa in the 50 largest U.S. cities from 1994 to 2004. Results revealed that even after controlling for differences in the stage at diagnosis and treatment, there were still significant disparities between Black and White men in PCa mortality (Benjamins et al., 2016).

The Institute of Medicine has identified the timely delivery of health-care services as one of six primary goals for improving the quality of health care in the United States (Corrigan, 2005). Treatment delay (TD) was defined as the time between PCa diagnosis and treatment initiation. TD is associated with increased risk for biochemical recurrence and survival (Freedland et al., 2006; Nguyen et al., 2005; O'Brien et al., 2011), especially for patients with aggressive, high-risk neoplasms. TD is also a potentially modifiable factor that may also contribute to racial disparities in PCa diagnosis and treatment initiation (Stokes et al., 2013). Schmid et al. (2016) examined differences in quality of life and survival outcomes among recipients of radical prostatectomy using the Surveillance, Epidemiology, and End Results (SEER)–Medicare linked database. Schmid et al. (2016) found that Black men undergoing radical prostatectomy treatment tended to have longer wait time between diagnosis and surgery (average of 79 days), were less likely to undergo lymph node dissection, more likely to experience postoperative complications, have subsequent emergency department visits as well as readmissions to hospital compared to non-Hispanic Whites (i.e., 71 days).

PCa disparities are also based on geography. States in the United States may experience issues pertaining to health-care access and screening in specific regions like

Appalachia when compared to non-Appalachian regions (Yao et al., 2017), in addition to racial disparities. PCa disparity studies in the Appalachian region, while predominantly White with low racial/ethnic diversity, have reported lower incidence but higher mortality (Myint et al., 2018, 2019; Yao et al., 2017). Moreover, TD may present differently in Appalachian compared to non-Appalachian areas. A study by McDonald et al. (2020) revealed that the highest incidence rate and aggressive type of PCa was found in non-Appalachian urban Pennsylvania compared to rural and urban Appalachian areas. Differential PCa outcomes within and between the Tennessee Appalachian and non-Appalachian regions while accounting for race are, however, limited. Furthermore, geography and residence in Tennessee present a unique opportunity to understand PCa disparities as they present in Appalachian and non-Appalachian counties.

Given the racial/ethnic differences in PCa incidence as well as how TD impacts quality of life and survival outcomes, it is necessary to identify profiles of risk through factors that may influence the delay of surgical treatment of PCa while accounting for Appalachian and non-Appalachian areas in Tennessee. To fill this gap in the literature, this study used latent class analysis (LCA)—a person-centered approach—to examine the constellation of health determinants in PCa surgical TD on the Tennessee Cancer Registry (TCR) data. We identified risk profiles of patients who experienced TD by co-occurring sociodemographic determinants of health reported in TCR data from 2005–2015. Profiles identified may help explain health disparities to be intervened upon. Moreover, the purpose of this study was not to make a clinical recommendation as we recognize the current debate on overtreatment of PCa (Yang et al., 2017). This study intended to identify factors in TD and whether there were differences in TD between Black and White men in Tennessee.

## Materials and Methods

### Study Population and Data Source

The study population included all male Tennessee residents aged  $\geq 18$  years diagnosed with histologically confirmed PCa as the primary site of diagnosis as coded by the

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International Classification of Diseases for Oncology, Third Edition (ICD-O-3) and reported to the TCR from January 1, 2005 to December 31, 2015. The TCR is a population-based, central cancer registry serving the citizens of Tennessee and was established by state law to collect and monitor cancer incidence (<https://www.tn.gov/health/health-program-areas/tcr/tennessee-cancer-registry-data.html>). The research protocol and access to the data for this study went to full review by the Tennessee Department of Health Institutional Review Board (IRB) and was approved on 1 February 2018 (TDH-IRB 1057486). The National Institutes of Health – Intramural Research Program IRB – Human Research Protections Program – Office of Human Subjects Research Protections determined that our protocol did not involve human subjects and was excluded from IRB review (18-NIMHD-00722). Analysis was performed on a total of 18,088 localized malignant/invasive cases. Data used for this analysis are restricted but available by request to the Tennessee Department of Health TCR (<https://www.tn.gov/education/data/data-downloads/request-data.html>). All analytical files are available by reasonable request.

### Latent Variable Indicators

The latent outcome was surgical TD of localized malignant PCa. We used the following sociodemographic variables for our LCA model: race, age at diagnosis, marital status, county of residence, health insurance type, and surgical TD. Race was categorized into White, Black, or other. The other race category included participants that self-identified as American Indian/Alaska Native and Asian or Pacific Islander. Age was categorized into three groups based on the U.S. Preventive Services Task Force screening recommendations for PCa (i.e., <55; 55–69; and  $\geq 70$ ; US Preventive Services Task Force, 2018). Marital status was grouped into four categories as (a) single, never married; (b) married, which includes common law; (c) divorced/separated; and (d) widow/widower. Area of residence was based on county of diagnosis/residence and was coded as either Appalachian or non-Appalachian based on Appalachian Regional Commission demarcations (Pollard et al., 2020). Type of health insurance was categorized as: (a) not insured and/or self-pay; (b) public that included Medicaid, Medicare, Military/TRICARE, Veterans Affairs, and Indian/Public Health Service; and (c) private that included managed care, health maintenance option (HMO), preferred provider organization (PPO), or fee-for-service. The distal outcome of surgical TD—based on the extant literature (Ginsburg et al., 2020; Graefen et al., 2005; Korets et al., 2012; Reichard et al., 2019)—was coded as (a)  $\leq 90$  days, (b)  $>90$ –180 days,

(c)  $>180$ –365 days, and (d)  $>365$  days from the date patients were diagnosed to when surgical treatment was provided and recorded in the TCR.

### Covariates

Tumor grade (i.e., I–IV) was accounted for in our final model as a covariate to assess PCa grade differences between identified TD profiles.

### Statistical Analysis

We first conducted a descriptive analysis to report the characteristics of the TCR localized malignant PCa study sample. Second, we performed LCA, a person-centered analytical method, to identify and characterize PCa surgical TD profiles associated with conditional probabilities of observed sociodemographic and geographic indicators using delay in surgical treatment as a distal outcome. To select the best fitting LCA model, we employed a comparative approach that compares multiple models (i.e., 1-class to 6-class solution) by Bayesian information criterion (BIC), sample size adjusted-BIC (SSA-BIC), Lo-Mendell-Rubin (LMR) adjusted likelihood-ratio-test (LRT), parametric bootstrapped (PB) LRT, and entropy. Entropy provides an index of reliability for separation of classes (Nylund et al., 2007). Once the final model was selected, a multinomial logistic regression was used to assess the role of tumor grade between profiles. All analyses were performed in Mplus 8.4 (Muthén & Muthén).

## Results

### Patients' Sociodemographic Characteristics

Localized malignant PCa cases were primarily White (84.4%) followed by Black (14.9%) and predominantly of non-Hispanic origin (99.5%). The sample was mostly 55–69 years of age (64.1%) and married (83.0%) having either public (45.0%) or private (54.0%) health insurance. The sample was almost evenly distributed between Appalachian and non-Appalachian residence. The majority of patients (54.6%) were recorded as having grade II tumor. Nearly 80% of the sample reported a  $\leq 90$ -day delay in surgical treatment (Table 1).

### Latent Class Risk Profiles Delay

The best fitting LCA model was a three class-solution with an entropy of 0.69 as seen in Table 2. The three classes were named lowest, medium, and highest delay profile based on the probabilities for delaying PCa

**Table 1.** Localized Malignant Prostate Cancer Patient Sample Descriptives (N = 18,088).

<b>Race</b>		
White	15,254	84.4%
Black	2,699	14.9%
Other	128	0.7%
<b>Hispanic origin</b>		
No	16,104	99.5%
Yes	80	0.5%
<b>Age at diagnosis</b>		
18–54	2,652	14.7%
55–69	11,587	64.1%
≥70	3,849	21.3%
<b>Marital status</b>		
Single	1,220	7.5%
Married	13,535	83.0%
Divorced/Separated	1,042	6.4%
Widow/Widower	511	3.1%
<b>County of residence</b>		
Non-Appalachian	9,300	51.4%
Appalachian	8,785	48.6%
<b>Health insurance type</b>		
None	181	1.0%
Public	7,803	45.0%
Private	9,373	54.0%
<b>Tumor grade</b>		
I	1,472	8.3%
II	9,200	54.6%
III	7,095	39.8%
IV	50	0.3%
<b>Delay in surgical treatment</b>		
90 days or less	14,511	80.3%
90–180 days	3,380	18.7%
180–365 days	500	2.8%
More than 365 days	183	1.0%

surgical treatment. Class 1 or the lowest surgical delay profile represents 42% of sample, had high conditional likelihoods of being primarily White (92.3%), ≥70 years at diagnosis (51.6%), married (83.7%), and residing in Appalachian county (54.3%) compared to all delay profiles. Class 1 had the highest conditional probability of utilizing public health insurance (89.3%).

Class 2, or the medium delay profile (46% of sample), had the highest likelihoods of being predominantly White (96.0%), between ages 55 and 69 years (76.4%), married (85.8%), with private health insurance (87.6%). Class 3, the highest delay profile, constitutes 12% of sample, had the highest likelihood of being Black (80.9%) and living in non-Appalachian county (90.0%). This class/group was also younger, as they had the highest conditional probability of being <55 years of age (28.4%). The highest delay group also had the highest conditional probabilities of being single (17.2%) or divorced/separated (10.2%). This

delay group had a 30% and 69% conditional probability of having public and private health insurance, respectively. See Table 3 for all conditional probabilities. Using multinomial logistic regression, we found that the highest delay profile had 22% lower odds (95% CI [.67, .90]) of having a grade II tumor compared to patients with grade I in the lowest delay profile (Table 4). Figure 1 provides a comparison of surgical TD categories by profile.

## Discussion

Evidence suggests that, overall, Black men experience worse health outcomes from PCa compared to White men. Factors contributing to these disparities include unequal access to health-care services leading to delay in diagnosis and treatment (Adams et al., 2017; Benjamins et al., 2016; Chornokur et al., 2011; Krimphove et al., 2019), but limited research exists on the profiles or the group of populations most likely to delay treatment. In this study, we used a person-centered approach to determine profiles of patients at-risk of surgical TD for localized malignant PCa from a statewide cancer registry. Our findings make two major contributions to the literature on health disparities in the surgical treatment of PCa. First, we found three profiles of patients who delayed PCa surgical treatment. These groups were based on sociodemographic factors, health insurance type, and geographic region of residence. Second, we found that the profiles that were most likely to delay surgical treatment were Black, younger adults with private insurance, single or separated/divorced, and residing in a non-Appalachian county. Moreover, tumor grades did not differentiate between profile differences, with the exception of the highest TD profile; that is, the highest TD profile had lower odds of being treated for grade II tumor when compared to the lowest TD profile.

The Appalachian region of the United States faces health disparities in cancer burden. Disparities in PCa survival among Appalachian residents are well documented in Kentucky, though the difference was related to high comorbidity score, high poverty rate, and low education (Myint et al., 2018, 2019). In contrast to current findings, our results based on TCR data show that the group with highest delay (i.e., >90 days from diagnosis) in PCa surgical treatment did not reside in Appalachian counties. The lowest and medium PCa surgical delay profile groups had slightly higher conditional probabilities to reside in Appalachian counties and married compared to the highest delay profile. Nonetheless, the lowest risk profile of delay was comparatively older at time of diagnosis and had publicly provided health insurance. Among the medium and highest delay profiles, both had a high conditional probability to have private health insurance. These findings are consistent with Al Rowas et al. (2017), who reported that private health insurance is associated

**Table 2.** Latent Class Analysis Model Fits for Comparison (N = 18,088).

	BIC	SSA-BIC	Entropy	LMR-LRT	p value	PB-LRT	p value
1-Class Solution	142,863.9	142,822.6	-	-	-	-	-
2-Class Solution	137,660.7	137,574.9	0.662	5,301.8	.000	5,340.4	.000
3-Class Solution	136,502.5	136,372.2	0.693	1,286.1	.000	1,295.4	.000
4-Class Solution	136,324.3	136,149.5	0.731	313.2	.138	315.5	.000

Note. BIC = Bayesian information criterion; SSA-BIC = sample size adjusted-Bayesian information criterion; LMR = Lo-Mendell-Rubin; LRT = adjusted likelihood-ratio-test; PB = parametric bootstrapped.

**Table 3.** Latent Class Analysis of Localized Malignant Prostate Cancer Surgical Delay Groups With Conditional Probabilities (N = 18,088).

	Class 1 Lowest Delay N = 7,620 42%	Class 2 Medium Delay N = 8,391 46%	Class 3 Highest Delay N = 2,077 12%
<b>Race</b>			
White	0.923	0.960	0.179
Black	0.070	0.034	0.809
Other	0.007	0.006	0.011
<b>Age at diagnosis</b>			
Under 55	0.000	0.236	0.284
55–69	0.484	0.764	0.686
70 and over	0.516	0.000	0.030
<b>Marital status</b>			
Single, never married	0.051	0.068	0.172
Married/Common law	0.837	0.858	0.707
Divorced/Separated	0.049	0.066	0.102
Widow/Widower	0.063	0.009	0.020
<b>County of residence</b>			
Non-Appalachian	0.457	0.456	0.900
Appalachian	0.543	0.544	0.100
<b>Health insurance type</b>			
No insurance/Self-pay	0.001	0.013	0.032
Public insurance	0.893	0.112	0.289
Private Insurance	0.107	0.875	0.678
<b>Delay in surgical treatment</b>			
90 days or less	0.855	0.787	0.697
90–180 days	0.144	0.177	0.237
180–365 days	0.021	0.027	0.050
More than 365 days	0.010	0.008	0.017

**Table 4.** Multinomial Logistic Regression of Tumor Grade Covariates Using (Class 1) Lowest Delay as Reference ( $N = 17,817$ ).

	Class 2				Class 3			
	Medium Delay				Highest Delay			
	OR	95% CI		<i>p</i> value	OR	95% CI		<i>p</i> value
		Lower	Upper			Lower	Upper	
Grade I	ref.	-	-	-	ref.	-	-	-
Grade II	0.96	0.76	1.21	.723	<b>0.78</b>	<b>0.67</b>	<b>0.90</b>	<b>.001</b>
Grade III	1.06	0.84	1.35	.623	0.99	0.86	1.14	.891
Grade IV	1.77	0.58	5.43	.316	1.51	0.70	3.29	.296

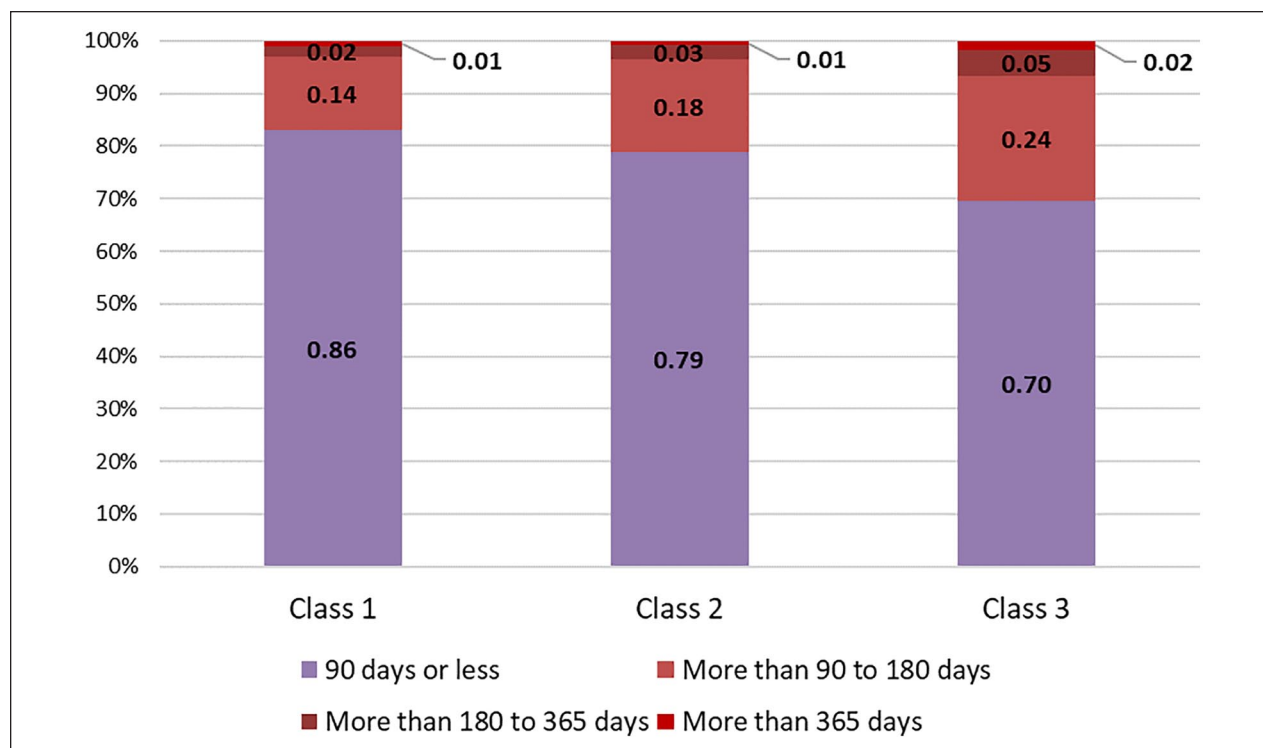
with delay in seeking care and treatment due to high cost-related co-pays and deductibles compared to publicly insured individuals (15.6% vs. 8.1%, respectively).

Our results suggest that despite being insured, Black men, more specifically middle-age adults, were less likely to undergo surgery to treat PCa. This is alarming as the higher likelihood among Black men to have advanced PCa is evidenced (Howlander et al., 2012; Stokes et al., 2013). It is also shown that Black patients with PCa are more likely to die due to the disease. Our study adds to the evidence on the underlying factors associated with higher mortality among Black patients with PCa. Factors at the patient level that may be driving excess mortality are mistrust, health-seeking behaviors, rurality, and clinical or system-level factors (Kan et al., 2018). Although access to health care has been known to be a main driver of health disparities and is also an important predictor of treatment behavior (Burt et al., 2018; Gordon et al., 2019; Noonan et al., 2016), our study shows that patients delayed treatment despite having health insurance coverage. A recent study by Gordon et al. (2019) analyzed the North Carolina Prostate Cancer Comparative Effectiveness and Survivorship Study and reported that Black patients were more likely to consider cost (69.2%), treatment (69.2%), and recovery time (73.3%) as important therapeutic decision-making factors compared to White patients (34.9%, 33.8%, and 46.9%, respectively). Another study used SEER data to assess trends in PCa treatment from 2004 to 2014 concluded significant differences exist by patient age, insurance status, socioeconomic status (SES), and geographical residence (Burt et al., 2018).

Our findings indicated that having private health insurance may not be a sufficient factor to determine early treatment initiation for PCa, and that treatment delays may manifest as constellations of social determinants. Getting timely treatment and reducing delays for Black adults with aggressive PCa is crucial for improving survival outcomes and reducing cancer disparities. It is, therefore, critical that these social determinants are given

a major consideration in the development of effective interventions. Moreover, the role of Appalachian and non-Appalachian regions in context of TD and the social determinants must be further explored to understand the complex cancer health disparities affecting men. Multilevel intervention studies are needed to focus on patient, clinician, and health-care system-level factors to address these PCa disparities.

Nevertheless, to address PCa health disparities and inequities, we must go beyond census bureau categories of race/ethnicity. Attention needs to be given to data collection in cancer registries to gather more detail on racial/ethnic categorizations to include biological ancestry and biomarkers (e.g., prostate-specific antigen; tumor necrosis factor alpha) for more personalized risk assessments, interventions, and medical treatment. To further improve risk categorizations, cancer registry data will also need to collect geographic context of socioeconomic and ecological factors. The granular level of geography must go beyond the county and zip code level to include neighborhood as well as housing history. SES like family income would considerably improve the person-centered models as well as socioecological factors to better target risk mitigation efforts and health promotion. Socioecological factors would include environmental exposure from early adverse events (e.g., violence, crime) to toxicants and xenobiotics (e.g., total tobacco exposure, air pollution, radon, pesticides). Behavioral and health risk factors such as alcohol consumption, binge drinking, physical activity from work or exercise, and diet would have improved our risk profiles further. Therefore, future policies regarding cancer registry data collection should include more contextual data to help understand risk in context to prevent disparate health outcomes in an effective and efficacious manner to intervene upon the most salient factors given a specific at-risk PCa treatment profile. Through the collection of contextual cancer data risk assessments can we move beyond linear categorizations of risk by race and ethnicity to targeted person-centered



**Figure 1.** Surgical delay profiles by class.

care to meaningfully address cancer health disparities and move toward health equity.

### Strength and Limitations

This study contributes to the limited knowledge on PCa surgical TD by identifying risk profiles of patients in Tennessee, a unique geographical region currently not covered in the SEER program (National Cancer Institute Surveillance Epidemiology and End Result Program, 2020). Although the study used standard and validated measures involving a large population of PCa patients not in the SEER program, there were few limitations. First, we were limited by the retrospective administrative variables available to us. Cancer registries are not mandated to collect SES data such as income and education, and quality of treatment received by patients. Additionally, demographic variables are only collected at the time of diagnosis and hence may not be up-to-date. Despite the large sample size, the results may not be generalizable to the entire U.S. population because the TCR is tasked with collecting cancer data covering the state of Tennessee as well as patients diagnosed and/or treated for cancer in state although they are residents of neighboring states. Nonetheless, the findings are significant because they provide a better understanding of subgroups/population most at-risk to delay PCa treatment in Tennessee.

### Conclusion

This study identified three risk subgroups—lowest, medium, and highest PCa surgical TD profiles/subpopulations—based on patient sociodemographic and geographic residence as well health insurance characteristics. In particular, we identified that even with health insurance, young Blacks aged <55 years, living in non-Appalachian counties, had the highest surgical delay, which was almost double that of the whites in the lowest delay class. These findings have important policy implications to inform utilization of private health insurance for required surgical treatment cases of treatable PCa. Furthermore, the disparities in PCa surgical delay may explain differences in health outcomes in Blacks who are most at-risk; however, structural factors, clinical care, and treatment outcomes could play a role in these delays but were not available for analysis. Lastly, the use of person-centered approaches can help health researchers better identify cancer risk profiles or subpopulations, and the underlying determinants that may be overlooked, but needed for tailored interventional programs to address PCa disparities.

### Acknowledgments

We would like to thank Kevin Villalobos for his time and support. Drs. Montiel Ishino and Williams' efforts were supported by the Division of Intramural Research, National Institute on Minority Health and Health Disparities, National Institutes of

Health. Dr. Rina Das's effort was supported by the Division of Extramural Scientific Programs, National Institute on Minority Health and Health Disparities, National Institutes of Health. The content of this work is solely the responsibility of the authors and does not necessarily reflect the views of the National Institutes of Health. The National Institutes of Health, Emory University, University of Georgia, and Tennessee Cancer Registry did not have a role in the design of the study; collection, management, analysis, and interpretation of the data; preparation, review, [or approval of the manuscript]; and decision to submit the manuscript for publication. Tennessee Department of Health data used in this study was obtained from the Tennessee Cancer Registry, Tennessee Department of Health (TDH). Use of these data does not imply TDH agrees or disagrees with any presentations, analyses, interpretations or conclusions herein.

### Credits

FW and FAMI conceived and designed the study. FW and MW acquired the data. FAMI and CR cleaned, managed analyzed and interpreted the results. RD and JT drafted the first manuscript and modified by EC. MW and RD substantially modified the submitted version of the manuscript. All authors read and approved the final version of the manuscript.

### Declaration of Conflicting Interests

The author(s) declared no potential conflicts of interest with respect to the research, authorship, and/or publication of this article.

### Funding

The author(s) received no financial support for the research, authorship, and/or publication of this article.

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### Supplemental Material

Supplemental material for this article is available online.

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