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Association of the VACS Index with hospitalization among people with HIV in the NA-ACCORD

Yuhang Qian, MHS^a, Richard D. Moore, MD, MHS^b, Sally B. Coburn, MPH^a, Thibaut Davy-Mendez, PhD, MSPH^{c,d}, Kathleen M. Akgün, MD^{e,f}, Kathleen A. McGinnis, DrPH, MS^g, Michael J. Silverberg, PhD, MPH^h, Jonathan A. Colasanti, MD, MSPHⁱ, Edward R. Cachay, MD^j, Michael A. Horberg, MD, MAS^k, Charles S. Rabkin, MD^l, Jeffrey M. Jacobson, MD^m, M John Gill, MB, ChB, MScⁿ, Angel M. Mayor, MD, MS^o, Gregory D. Kirk, MD^{a,b}, Kelly A. Gebo, MD, MPH^{a,b}, Ank E. Nijhawan, MD, MPH^p, Keri N. Althoff, PhD, MPH^a, North American AIDS Cohort Collaboration on Research and Design (NA-ACCORD) of IeDEA

^aDepartment of Epidemiology, Johns Hopkins Bloomberg School of Public Health, Baltimore, MD, USA

^bDepartment of Medicine, Johns Hopkins School of Medicine, Baltimore, MD, USA

^cDepartment of Epidemiology, Gillings School of Global Public Health, University of North Carolina at Chapel Hill, NC, USA

^dDepartment of Psychiatry and Behavioral Sciences, Weill Institute for Neurosciences, University of California, San Francisco, CA, USA

^eDepartment of Internal Medicine and General Internal Medicine, VA Connecticut Healthcare System, West Haven, CT, USA

^fDepartment of Internal Medicine, Yale University School of Medicine, New Haven, CT, USA

^gVA CT Healthcare System, West Haven, CT, USA

^hDivision of Research, Kaiser Permanente Northern California, Oakland, CA, USA

ⁱDepartment of Medicine, Emory University School of Medicine, Atlanta, GA, USA

^jDivision of Infectious Diseases and Global Public Health, University of California at San Diego, San Diego, CA, USA

^kKaiser Permanente Mid-Atlantic Permanente Research Institute, Rockville, MD, USA

^lDivision of Cancer Epidemiology and Genetics, National Cancer Institute, National Institutes of Health, Department of Health and Human Services, Bethesda, MD, USA

^mDivision of Infectious Diseases, Department of Medicine, Case Western Reserve University School of Medicine, Cleveland, OH, USA

Correspondence to: Yuhang Qian, MHS, Department of Epidemiology, Johns Hopkins Bloomberg School of Public Health, 615 N. Wolfe Street, Baltimore, #E7142, MD 21205 (yqian24@jh.edu).

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ⁿDepartment of Medicine, University of Calgary, S Alberta HIV Clinic, 3330 Hospital Drive NW, Calgary, AB, T2N4N1, Canada

^oDepartment of Medicine, Universidad Central del Caribe at Bayamón, Puerto Rico

^pDivision of Infectious Diseases, Department of Internal Medicine, University of Texas Southwestern Medical Center, 5323 Harry Hines Boulevard, Dallas, TX 75390, USA

Abstract

Background: People with HIV (PWH) have a higher hospitalization rate than the general population. The Veterans Aging Cohort Study (VACS) Index at study entry well predicts hospitalization in PWH, but it is unknown if the time-updated parameter improves hospitalization prediction. We assessed the association of parameterizations of the VACS Index 2.0 with the 5-year risk of hospitalization.

Setting: PWH ≥ 30 years old with at least 12 months of antiretroviral therapy (ART) use, and contributing hospitalization data from 2000 to 2016 in North American AIDS Cohort Collaboration on Research and Design (NA-ACCORD) were included. Three parameterizations of the VACS Index 2.0 were assessed and categorized by quartile: 1) “baseline” measurement at study entry, 2) time-updated measurements, and 3) cumulative scores calculated using the trapezoidal rule.

Methods: Discrete-time proportional hazard models estimated the crude and adjusted associations (and 95% confidence intervals [CI]) of the VACS Index parameterizations and all-cause hospitalizations. The Akaike information criterion (AIC) assessed the model fit with each of the VACS Index parameters.

Results: Among 7,289 patients, 1,537 were hospitalized. Time-updated VACS Index fitted hospitalization best with a more distinct dose-response relationship (score <43: reference; score 43–55: aHR=1.93 [95% CI 1.66, 2.23], score 55–68: aHR=3.63 [95% CI 3.12, 4.23], score ≥ 68: aHR=9.98 [95% CI: 8.52, 11.69]) than study entry and cumulative VACS Index after adjusting for known risk factors.

Conclusions: Time-updated VACS Index 2.0 had the strongest association with hospitalization and best fit to the data. Healthcare providers should consider using it when assessing hospitalization risk among PWH.

Keywords

HIV; VACS Index; hospitalization

INTRODUCTION

The use of modern combination antiretroviral therapy (ART) has lengthened life expectancies among people with HIV (PWH) over the past two decades, although disparities in outcome by race and ethnicity, sex, and HIV acquisition risk group still persist¹. Consequently, the cumulative incidence and mortality due to non-AIDS defining conditions such as cardiovascular disease, chronic kidney or liver disease, and non-AIDS defining cancer have increased^{2,3}. While ART reduces the HIV-related hospitalization risk in

the short-term⁴, patients still face hospitalizations due to aging, treatment side effects or failures, and non-AIDS defining conditions⁵⁻⁸. Non-AIDS-defining hospitalizations are more common now than AIDS-defining hospitalizations⁹. Hospitalizations for AIDS-defining illnesses still occur, however, and the length of stay could be over 10 days⁵. Hospitalization is a marker of moderate to severe morbidity, and PWH want to avoid hospitalization due to the fear of treatment, high cost, and concurrent lowered quality of life and frailty^{6,10}. Identifying patients with high risk of hospitalization could be clinically important. Having an accurate understanding of the future risk of hospitalization may improve resource allocation in clinical practice (e.g. employing case managers for high-risk patients)^{6,11}.

The Veterans Aging Cohort Study Risk Index (VACS Index) 2.0 predicts 5-year mortality based on age, sex, race, routinely collected clinical biomarkers including CD4 count, HIV-1 RNA, and laboratory measurements of hemoglobin, aspartate and alanine transaminase (AST, ALT), platelets, creatinine and hepatitis C virus (HCV) status¹². The VACS Index 1.0 has been shown to predict all-cause mortality¹³, cardiovascular disease^{14,15}, neurocognitive dysfunction^{16,17}, inflammation¹⁸, and frailty fracture^{19,20}. Further, the VACS Index has been shown to have good predictive accuracy among sub-groups including women, men, Black, white, people with HIV-1 RNA <500 copies/ml, HIV-1 RNA >500 copies/ml, and young people^{13,21}. VACS Index 2.0 was shown to provide a more comprehensive means of tracking disease burden than an earlier restricted version of the VACS Index (1.0) that included only HIV-related risk factors and age¹³. VACS Index 2.0, which included continuous variables for albumin, white blood cell count (WBC), and body mass index (BMI), has improved discrimination for predicting 5-year mortality²².

Previous studies found strong association between VACS Index 1.0 at study entry and hospitalization within 2 years among veterans with HIV^{6,10} and women²³; the VACS Index 2.0 has not yet been shown to predict hospitalizations. Additionally, the parameterization of the VACS Index 2.0 may be important to predictive accuracy. Salinas and colleagues¹⁴ found that time-updated VACS Index models fitted hospitalization data better than the study entry and cumulative VACS Index 1.0 models with the composite outcome of myocardial infarction and mortality. The study entry VACS Index only reflects health status at the study-defined baseline. A cumulative measurement depends on the duration of time in a particular health status. A time-updated measurement reflects the latest state, and it might be more clinically valuable. Finally, the study by Salinas and colleagues¹⁴ was nested in the VACS study population, and results may be different in a more diverse non-veteran population.

Without a doubt, medical providers need a more reliable tool that captures the risk of hospitalization more precisely. Rather than predictions based on baseline parameters^{6,10}, a tool such as VACS Index 2.0 could capture the dynamic nature of beneficial effects of ART and PWH compliance with it and the longitudinal evolution of other comorbidities and aging that occur in PWH. Therefore, we aimed to estimate the associations of study entry, time-updated, and cumulative VACS Index 2.0 with 5-year hospitalization in a non-veteran population. Our results and parameterization estimates could guide medical providers and

inform health care policy decision-makers on how best to prioritize resources for PWH at high risk of hospitalization.

METHODS

Study population

The North American AIDS Cohort Collaboration on Research and Design (NA-ACCORD) is a region of the International Epidemiologic Databases to Evaluate AIDS (IeDEA) initiative that includes PWH enrolled in interval and clinical cohorts in the United States and Canada²⁴. Our source population were people with HIV in 5 clinical cohorts that provided hospitalization data and clinical measurements that are required for the VACS Index calculation²⁵. According to the pre-defined clinically significant range of age in the VACS Index 2.0²², we included PWH who were 30 to 75 years old in the NA-ACCORD. Subjects initiated ART for at least 1 year who had not been previously hospitalized, had at least one visit between 1/1/2000 and 12/31/2016, and had all variables required to calculate VACS Index 2.0 were under observation^{24,25} for up to five years or first hospitalization. We excluded the first 12 months of ART use due to the variability found in the VACS Index measurement in the first year after ART initiation²². We also excluded patients with indicators that were outside their clinically meaningful ranges²². Patients were censored if death occurs, and they were lost to follow-up if the date of the last VACS Index measurement preceded a gap of > 2 years. Patients without a VACS Index measurement at study entry (defined as within the window of 6 months before 6 months after study entry) and patients with hospitalization before study entry were excluded. We excluded patients that first hospitalized before the observation period because of health behavioral change²⁶ (e.g. smoking cessation) among patients after first-time hospitalization and different covariates set when the outcome was re-admission^{27,28}. Patients provided informed consent to their local cohorts that were reviewed and approved by their institutional review boards. The NA-ACCORD collaborative study was approved by the institutional review board of the Johns Hopkins School of Medicine.

Outcome

Our primary outcome was first-time all-cause hospitalization occurring within 5 years after study entry. The hospitalization data was from the electronic health records in each cohort's medical system. We excluded hospitalizations with length of stay of less than one day, because we could not distinguish one-day hospitalizations from outpatient procedures (e.g. endoscopy)²⁹. Patients with a hospitalization record missing complete admission and discharge dates were excluded from analyses.

VACS Index

The VACS Index 1.0 predicts 5-year all-cause mortality by summing the pre-assigned points for age, traditional HIV indicators (HIV-1 RNA and CD4 count), organ system injury indicators (e.g. hemoglobin, FIB-4, eGFR), and HCV infection^{8,18}. Higher VACS Index scores indicate an increased risk of mortality. The VACS Index 2.0, which added albumin, WBC, and BMI, has better discrimination and external validation than the VACS Index 1.0²².

VACS Index 2.0 was our exposure of interest. We investigated three parameterizations of the VACS Index: 1) measured at our defined study entry; 2) time-updated measurements based on receipt of healthcare; and 3) cumulative VACS Index using the time-updated measurements. VACS Index at study entry was assessed as closest to the study entry date as possible within the window of 6 months before to 6 months after the study entry date. Time-updated VACS Index was measured every time new laboratory data were available; this parameterization treated VACS Index as a time-varying variable with no lag¹⁴. Cumulative VACS Index was calculated as the area under the VACS Index curve to estimate the VACS Index score-years, similar to viremia copy-years (in copy-years/mL)^{30,31}.

Covariates

Sex (male and female), race/ethnicity (Hispanic, Non-Hispanic white, Non-Hispanic Black, Asian, Indigenous and Other/Unknown), HIV acquisition risk factor (history of injected drug use [IDU], men having sex with men (MSM), heterosexual, and other/unknown) were measured at the time of parent cohort enrollment, and time-fixed smoking (ever, never, and unknown) was measured based on recorded clinical diagnoses and/or questionnaire responses^{32,33}. Time-updated variables, including depression diagnosis (defined as depression diagnosis and no diagnosis of bipolar disorder) and calendar year (2000–2012 and 2012–2017)³⁴, were included in multivariable models of hospitalization and VACS Index. Selection of covariates was based on existing literature and scientific knowledge^{5,6,10,23,35–38}.

Statistical analyses

We compared demographic characteristics, HIV-1 RNA, CD4, and depression diagnosis at study entry by outcome status during follow-up. Continuous data were characterized by medians and interquartile ranges (IQR) and differences were tested with the Wilcoxon rank-sum test. Categorical variables were described by frequencies and percentages and differences were tested using χ^2 tests.

We used a discrete time-to-event approach for hospitalizations with month as the width of the discrete time interval. If more than one measurement per month was made for any variable needed to estimate the VACS Index 2.0, we used the monthly mean value with the exception of HIV-1 RNA (the maximum value in the month was used). The time-updated and cumulative VACS Index scores were carried forward for up to 12 months. BMI, a covariate of interest in our models, was carried forward for up to 24 months and the maximum value was used if more than one measurement was made in a month.

For each parameterization of the VACS Index, quartiles of the distribution of risk scores among those who were hospitalized were used as the cut-offs for categories of risk scores to ensure similar number of outcomes within each category. We plotted the hazard by the categories of the VACS Index to visualize the changes in hazard over time and test the proportional hazard assumption for each parameterization. Univariate and multivariable discrete time-to-event proportional hazard models were used to assess the association between different parameterizations of VACS Index and first-time all-cause hospitalization. We used complementary log-log regression models to estimate the hazard ratio and 95%

confidence intervals. Univariate models included each parameterization of the VACS Index as the only predictor. Covariates in the multivariable models included sex, race/ethnicity, smoking, HIV acquisition risk factor, depression, and calendar year. We used Akaike information criterion (AIC) to evaluate model fitness; models with lower AIC values had better fitness¹⁴. We used the magnitude and precision of the point estimates for the VACS Index quartiles to determine which parameterization best predicted hospitalizations within 5 years.

To examine whether time-updated VACS Index best predict hospitalization in all sex and race/ethnicity groups, we conducted sub-group analyses via stratified analyses. In sensitivity analyses, we expanded our study population to include patients with indicators that were outside their clinically meaningful ranges (i.e. 18–29-year-olds and those >75 years), substituted with the upper or lower boundaries of the ranges for the value (as previously demonstrated by Tate and colleagues²²). We lagged the VACS Index by one month in additional sensitivity analyses to determine the robustness of our findings to the timing of the measurement prior to hospitalization in our month-level discrete time-to-event approach. Analyses were performed using SAS 9.4 (SAS Institute Inc., Cary, North Carolina). Interpretation of statistical significance was guided by a p-value<0.05.

RESULTS

Of the 38,600 PWH in the 5 NA-ACCORD clinical cohorts with hospitalization data, 34,360 (89%) initiated ART and were on ART for at least 12 months and 7,289 (19%) met the additional inclusion criteria for our study (see Figure 1, Supplemental Digital Content 1, **which demonstrates the selection of study population**). A total of 246 participants were excluded due to missing year of hospitalization. The VACS Index input parameter that was missing among the greatest proportion of individuals was albumin 22%. The distributions of sex, race/ethnicity, and year of birth were similar between the source (n=38,600) and the study population (n=7,289) except for a slightly higher proportion of males (84% vs. 82%, p<0.01) and white (49% vs. 42%, p<0.01) in the study population (see Figure 1, Supplemental Digital Content 1, **which demonstrates the selection of study population**). The 7,289 study participants contributed 21,548 person-years and 1,537 hospitalizations. Only 5 died prior to hospitalization, loss to follow-up or administrative censoring. 61.6% of hospitalizations happened within two years after study entry; the median (IQR) of time from study entry to hospitalization was 1.5 (0.5 – 2.8) years and 3.7 (1.4 – 5.0) years for those who were censored. Hospitalized PWH were more likely to be female, Black, smokers, had injection drug use as their HIV acquisition risk factor, had a lower CD4 count, a higher viral load, and were more likely to be HCV co-infected. Patients with hospitalization had higher study entry VACS Index (Table 1).

The discrete-time hazard showed no visual evidence of non-proportionality by quartile of VACS Index measured at study entry, time-updated, or cumulative risk score (see Figure 2, Supplemental Digital Content 2, **which demonstrates the observed hazard of hospitalization**). Kaplan-Meier plots showed distinct differences in time to first hospitalization by quartiles of study entry VACS Index (log rank p-value <0.001, see Figure

3, Supplemental Digital Content 3, **which shows the hospitalization-free survival within five years**).

Increasing VACS Index scores at study entry, time-updated, and cumulative were significantly associated with increasing risk of hospitalization in unadjusted analyses (Table 2). After adjusting for sex, race and ethnicity, smoking, HIV acquisition risk factor, depression, and calendar year, all three parameterizations of the VACS Index scores were attenuated but remained statistically significantly associated with hospitalization. In multivariable models, the time-updated VACS Index had the strongest association with hospitalization in the highest quartile. Based on AIC measures (Table 2) of unadjusted and adjusted models, the time-updated VACS Index models fitted hospitalization data better than the study entry and cumulative VACS Index models.

In sub-group analyses, all parameterizations of increasing VACS Index were associated with increasing hospitalization risk among males, females, Black, white, and Hispanic (Figures 1 & 2). Similar to the primary analyses, the model with the time-updated VACS Index fitted the data best among these subgroups.

In sensitivity analyses, we used boundary values of pre-defined ranges of the indicators²² to substitute out-of-range values. The magnitude of the hazard ratio estimates for time-updated VACS Index were strengthened after including patients without plausible VACS Index indicators (n=1,108). The AIC measures of unadjusted and adjusted models indicated that the time-updated VACS Index provided more information regarding the risk of hospitalization than the study entry and cumulative VACS Index.

We did not lag VACS Index scores, which mimics the timing of the clinician's access to the score, but also may measure the VACS Index in the same month as hospitalization (removing the temporality of the VACS Index and hospitalization). The proportion of participants that had a different time-updated VACS Index score category in the month prior to hospitalization was 18% (276/1537). This proportion for cumulative VACS Index score was 6% (87/1537). The results were robust to sensitivity analyses lagging the time-updated and cumulative VACS Index by one month.

DISCUSSION

Consistent with prior studies of the VACS Index and numerous chronic disease outcomes^{6,10,14,23}, we found the risk of hospitalization increased with increasing VACS Index 2.0. The time-updated VACS Index 2.0 best predicted hospitalizations with a 10-fold increase in the risk of hospitalization for a score of 68 after adjusting for demographic characteristics and other risk factors including depression and calendar year.

Assessment closer to the time of event is more predictive. Although nadir HIV markers such as CD4 and HIV viral load are essential to consider, prognosis of the patients changes with ART and immune reconstitution. The presence of prevalent comorbidities after HIV diagnosis and aging play a clinically significant role in modifying the health status of an individual and the risk of hospitalization. Therefore, clinicians need to consider a tool that accounts for these factors. Previously, Salinas and colleagues¹⁴ found that

the time-updated VACS Index provided better information about the risk of myocardial infarction and mortality than the study entry and cumulative VACS Index. The cumulative score highly depended on the duration of a health status, and the generalizability was limited¹⁴. Our study adds to accumulating evidence that demonstrates the utility of the VACS Index in the clinical setting. In addition to the ability of the risk score to predict another outcome (namely, hospitalizations), it also shows a clear dose-response relationship of increasing risk of hospitalization with increasing VACS Index. Salinas and colleagues did not find an association between the VACS Index at study entry and myocardial infarction, whereas we found a significant, dose-response relationship with hospitalizations for all three parameterizations of the VACS Index. This suggests the VACS Index is apt to predict hospitalizations. Previous studies by Akgun^{6,10} and Hotton²³ and colleagues found VACS Index (as a continuous variable) measured at study entry had a positive association with hospitalizations with increasing VACS Index. Our study builds on these findings to suggest time-updated VACS Index parameterization is a better predictor of hospitalizations than measurement only at study entry or a cumulative measurement of VACS Index.

The time-updated VACS Index fitted hospitalizations best of the three parameterizations examined, and this was consistent across sex and race/ethnicity subgroups. Women had a higher proportion of hospitalizations than men, but the estimates were more extreme among men (see Table 1 and Figure 1). Sex disparities in HIV disease and hospitalization risk continue^{5,9,39-41}, and prior researches showed that women with HIV had higher rates of hospitalizations for opportunistic infection, lower access to treatment, and lower ART adherence than men^{39,42}. Cohen and colleagues⁴³ found that the VACS Index accurately predicted mortality among females but still had space for improvement in predictive accuracy (e.g. incorporating depression and transactional sex in the VACS Index). Our findings showed adjustment for additional characteristics including HIV acquisition risk factor and depression improved the fit of the model to predicting hospitalization by time-updated VACS Index among women. A prior study showed Black/African American PWH had a 42% higher hospitalization rate, and Hispanic PWH had an 18% lower rate than white PWH³⁹, and similar results were found in HIV elite controllers⁴⁰. Other studies^{5,9,41} found higher hospitalization rate in both Black and Hispanic than white. In the current study, the hospitalization rate among Black was higher than white, and Hispanic had a lower rate than white.

The time-updated VACS Index has great public health significance and prospective clinical application. First, it helps clinicians identify individuals at high-risk for hospitalization. Previous research shows that women, older patients, Blacks, and people who inject drugs have higher hospitalization rates than their reference populations^{38,39}. Future studies might investigate the applicability of building it into electronic health records (EHRs) and triggering more intensive diseases management including further follow-ups among patients with high risk of hospitalization. Healthcare providers might better distribute medical resources based on the time-updated VACS Index scores, including employing case managers for high-risk patients⁶. Second, the time-updated VACS Index is a comprehensive score that reflects earlier subtle organ injuries⁶. It can reflect the risk of conditions due to non-AIDS defining illness given that the patients have suppressed viral load and normal CD4 count. For instance, men are not considered anemic unless their hemoglobin is <13 ⁴⁴.

However, the VACS Index would be 10 points higher and indicate higher risk of mortality when hemoglobin is $<14^6$. Finally, demonstrations of the predictive accuracy of the VACS Index for numerous outcomes (including hospitalization) strengthens the use of the tool to balance study groups and control for potential confounders in observational studies¹³.

Our study has limitations. First, we only included patients 30 who survived after one year of ART and had never been hospitalized, and the limitation of generalizability to young adults still exists. We only included patients who have not previously been hospitalized and potential selection bias could lead to overestimating the performance of the VACS Index. Second, the measurements of the VACS Index are generated by HIV care visits and therefore the time between measurements can be different among individuals, creating time periods of missing data⁴⁵. We carried forward the input measurements and the VACS Index itself for varying lengths of time based on scientific knowledge about the speed at which the true input measurement may change. If the mechanisms driving missed appointments are also driving poorer health status than at the last clinical visit, carrying values forward will not capture the decline in health status. We categorized the VACS Index parameters based on quartiles to assess the dose-response relationships, and differences in association may be not only due to better predictive accuracy. Third, there was a limited sample size in Asians and an insufficient number of Indigenous individuals to conduct the analyses within this group. Fourth, the reasons for hospitalization were not considered and could influence the association between the VACS Index and cause-specific hospitalization. Fifth, we only adjusted behavioral factors (e.g. smoking, IDU) in our models, and future studies should assess whether incorporating these factors in the VACS Index improves its capability in assessing the risk of hospitalization. To our knowledge, the current study is the first study to compare the association between different parameterizations of VACS Index and hospitalization. The time-updated score incorporates changes in the health status of patients and has more value in predicting future hospitalization among PWH than VACS Index scores measured at study entry or cumulatively. All three parameterizations of the VACS Index demonstrated a dose-response relationship with hospitalization when the parameter was categorized into quartiles. We examined the three parameterizations of VACS Index in sex and race/ethnicity sub-groups to identify potential disparities.

In conclusion, the time-updated score best assessed the risk of hospitalization in the NA-ACCORD. Healthcare providers should consider using the time-updated VACS Index when assessing the risk of hospitalization among PWH. Further research may address the use of the VACS Index to assess the risk of re-admission at hospitalization discharge.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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- NA-ACCORD Study Administration:
- Executive Committee:** Richard D. Moore, Keri N. Althoff, Stephen J. Gange, Mari M. Kitahata, Jennifer S. Lee, Michael S. Saag, Michael A. Horberg, Marina B. Klein, Rosemary G. McKaig, and Aimee M. Freeman

Administrative Core: Richard D. Moore, Keri N. Althoff, and Aimee M. Freeman

Data Management Core: Mari M. Kitahata, Stephen E. Van Rompaey, Heidi M. Crane, Liz Morton, Justin McReynolds, and William B. Lober

Epidemiology and Biostatistics Core: Stephen J. Gange, Jennifer S. Lee, Raynell Lang, Brenna Hogan, Bin You, Elizabeth Humes, Lucas Gerace, Cameron Stewart, and Sally Coburn

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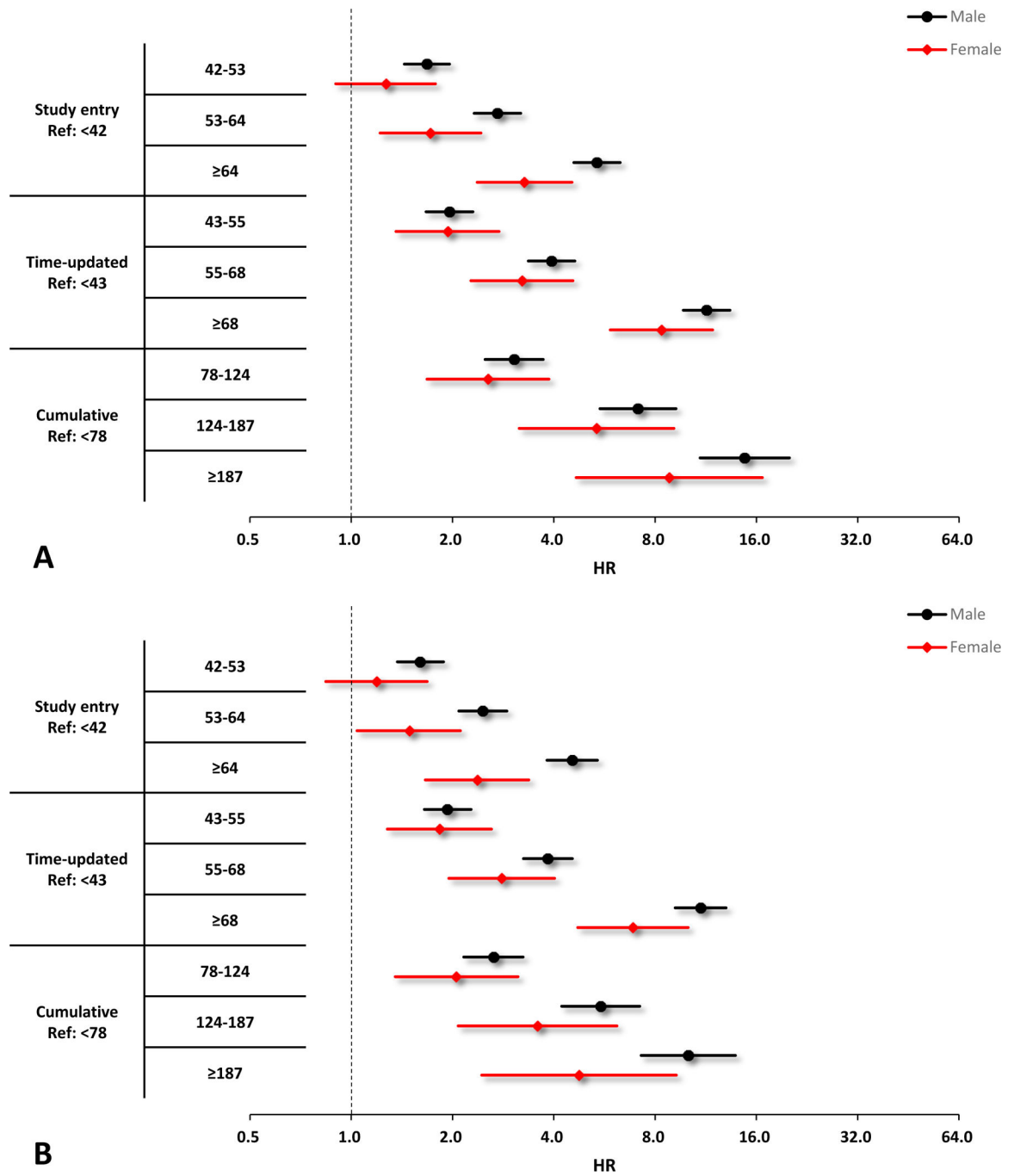
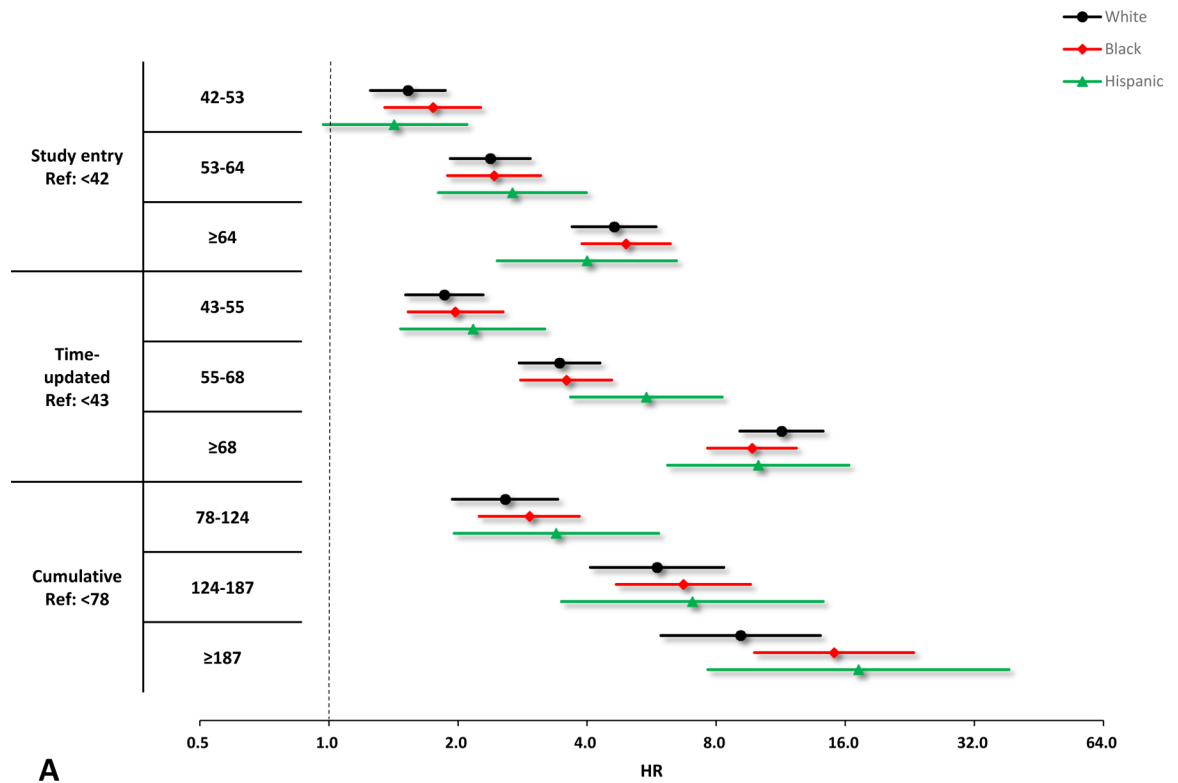
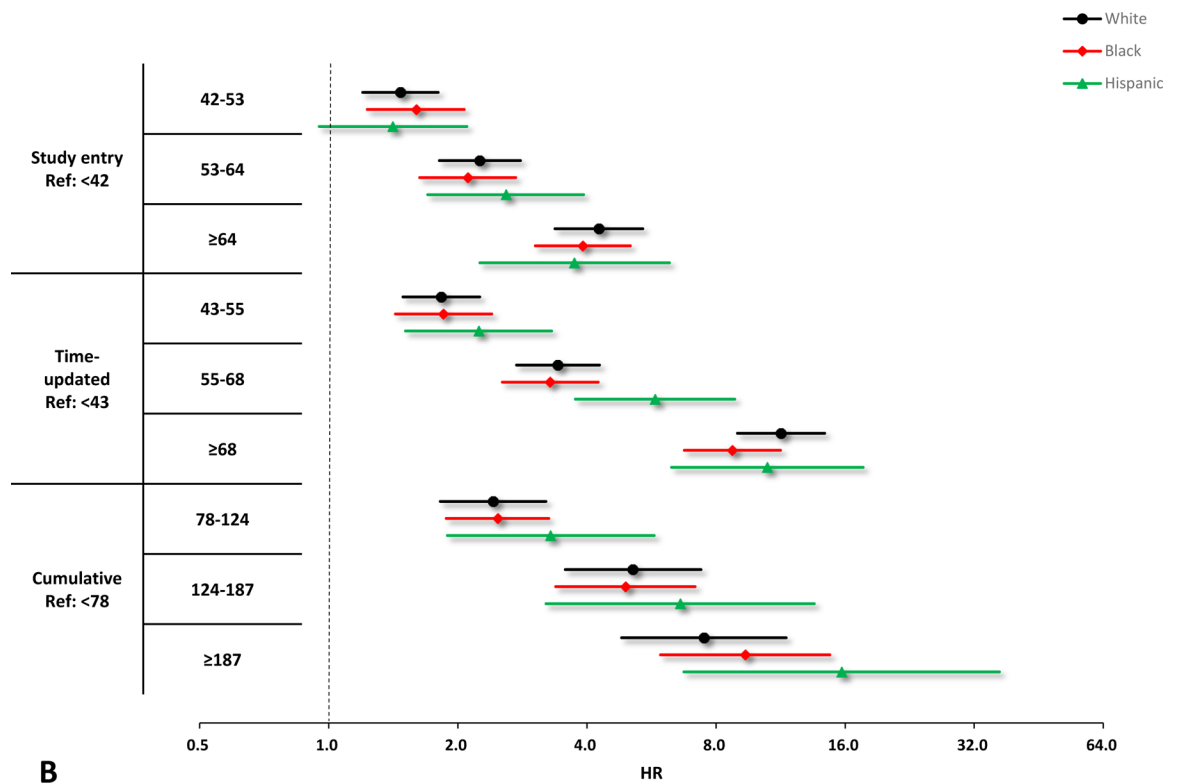


Figure 1. Crude and adjusted hazard ratios (HRs) and 95% confidence interval (CIs) of VACS Index scores for the risk of hospitalization by sex. A. Unadjusted results by sex, black circles denote male and red diamonds denote female. B. Adjusted results by sex, black circles denote male and red diamonds denote female. Adjusting variables include race/ethnicity, smoking, HIV acquisition risk factor, depression, and calendar year. All the HRs and 95% CIs are presented on a log2 scale.



A



B

Figure 2.

Crude and adjusted hazard ratios (HRs) and 95% confidence interval (CIs) of VACS Index scores for the risk of hospitalization by race/ethnicity. A. Unadjusted results by race/ethnicity, black circles denote white, red diamonds denote Black, and green triangles denote Hispanic. B. Adjusted results by race/ethnicity, black circles denote white, red diamonds denote Black, and green triangles denote Hispanic. Adjusting variables include sex, smoking, HIV acquisition risk factor, depression, and calendar year. All the HRs and 95% CIs are presented on a log₂ scale.

Table 1.Characteristics at study entry^a, by hospitalization^b status during follow-up

Characteristics ^c	No Hospitalization n=5752	Any Hospitalization n=1537
Age in year, median (IQR)	43 (36–49)	44 (38–51)
Male sex	4888 (85)	1221 (79)
Race/ethnicity		
Black	1650 (29)	669 (44)
White	2890 (50)	645 (42)
Hispanic	818 (14)	168 (11)
Asian	172 (3)	26 (2)
Indigenous	47 (1)	4 (0)
Other/unknown	175 (3)	25 (2)
BMI ^d , kg/m ³	25.3(23.0–28.2)	25.2(22.6–28.2)
Smoking		
Ever	3177 (55)	1074 (70)
Never	1053 (18)	214 (14)
Unknown	1522 (26)	249 (16)
HIV acquisition risk factor		
Injected drug use	527 (9)	317 (21)
Men having sex with men	3715 (65)	785 (51)
Heterosexual	1253 (22)	355 (23)
Other/Unknown	257 (4)	80 (5)
Quartile of study entry VACS Index score ^e		
<42	2805 (49)	374 (24)
42–53	1613 (28)	394 (26)
53–64	873 (15)	373 (24)
64	461 (8)	396 (26)
Log ₁₀ HIV-1 RNA in copies/mL, median (IQR)	1.7(1.6–2.6)	2.0(1.7–3.9)
CD4 count in cells/mm ³ , median (IQR)	456 (288–632)	349 (188–543)
Hemoglobin in g/dL, median (IQR)	14.4(13.4–15.2)	13.7(12.4–14.8)
FIB-4 value, median (IQR)	1.0(0.7–1.4)	1.2(0.8–1.7)
eGFR ^d in mL/min/1.73 m ² , median (IQR)	101 (86–112)	101.3(86–114)
Albumin in g/dL median (IQR)	4.3(4.0–4.5)	4.1(3.8–4.4)
White blood cell count ^d in 10 ³ /uL median (IQR)	5.3(4.3–6.5)	5.2(4.1–6.5)
Hepatitis C diagnosis	1092 (19)	550 (36)
Depression diagnosis ^d		
Yes	1448 (25)	354 (23)

Characteristics ^c	No Hospitalization n=5752	Any Hospitalization n=1537
No	4118 (72)	1130 (74)
Unknown	186 (3)	53 (3)
Median follow-up time (IQR) in years ^f	1.5 (0.5–2.8)	5.0 (3.2–5.0)

Abbreviations:

IQR=interquartile range

Statistics given in median (interquartile range) or n (%).

^aStudy entry defined as defined as 12 months after ART initiation, the cohort open date, the cohort-specific hospitalization observation start date, 30 years of age, or 1 January 2000, whichever came last.

^bHospitalization defined as first-time all-cause hospitalization occurring within 5 years after study entry. One-day discharges were excluded.

^cTested for significance with χ^2 and Wilcoxon rank-sum tests.

^dP-value not statistically significant.

^eStudy entry VACS Index score measured 6 months before to 6 months after study entry, selecting the measurement closest to study entry within the window.

^fFor hospitalized patients, the median follow-up time in years after removing hospitalization as a reason for study exit was the same as those who did were not hospitalized (median follow-up=5.0 (3.2, 5.0) years).

Table 2.

Crude and adjusted hazard ratios and 95% confidence intervals comparing time to first hospitalization by VACS Index score quartiles^a, and Akaike Information Criterion^b values for crude and adjusted complementary log-log regression models, among 7289 persons with HIV in NA-ACCORD, 2000–2016

Quartiles of VACS Index score	Person-years	Hospitalizations	Unadjusted HR (95% CI)	Adjusted HR (95% CI) ^c
Study entry VACS Index score				
<42	9583	374	1	1
42–53	6209	394	1.63 (1.42, 1.88)	1.53 (1.33, 1.77)
53–64	3762	373	2.56 (2.21, 2.95)	2.25 (1.94, 2.62)
64	1995	396	5.00 (4.34, 5.76)	4.02 (3.44, 4.70)
AIC values for the study entry VACS Index models			18281	18229
Time-updated VACS Index score				
<43	11327	349	1	1
43–55	5740	400	1.98 (1.72, 2.29)	1.93 (1.66, 2.23)
55–68	2980	395	3.84 (3.32, 4.43)	3.63 (3.12, 4.23)
68	1502	393	10.80 (9.34, 12.48)	9.98 (8.52, 11.69)
AIC values for the time-updated VACS Index models			17771	17752
Cumulative VACS Index score ^d				
<78	1018	377	1	1
78–124	2137	390	2.99 (2.50, 3.57)	2.52 (2.10, 3.02)
124–187	4660	384	6.94 (5.51, 8.75)	5.09 (4.01, 6.47)
187	13733	386	13.86 (10.55, 18.21)	8.68 (6.49, 11.60)
AIC values for the cumulative VACS Index models			18404	18312

^aVACS Index scores include age, CD4 count, viral load, hemoglobin, FIB-4, eGFR, HCV, albumin, WBC, and BMI. All parameterizations of the VACS Index scores are categorized into quartiles to ensure similar hospitalizations within each category.

^bAIC = $-2(\log\text{-likelihood}) + 2K$, K is the number of model parameters (the number of variables in the model plus the intercept). Log-likelihood is a measure of model fit. The lower the AIC value, the better the fit.

^cAdjusted variables include sex, race/ethnicity, smoking, HIV acquisition risk factor, depression, and calendar year.

^dCumulative VACS Index scores were calculated as VACS Index score-years.