Multilevel Measures of Education and Pathways to Incident Herpes Simplex Virus Type 2 in Adolescent Girls and Young Women in South Africa

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A B S T R A C T

Purpose: Schooling is associated with a lower risk of Herpes simplex virus type 2 (HSV-2) in adolescent girls and young women, but there is little understanding of the pathways underlying this relationship.

Methods: We used data from adolescent girls and young women in South Africa enrolled in the HIV Prevention Trials Network 068 study. We tested a structural equation model where individual household and community education measures were associated directly and indirectly with incident HSV-2 through HIV knowledge, future aspirations, age-disparate partnerships, sex in the last 12 months, and condomless sex.

Results: Community, household, and individual measures of schooling were all associated with incident HSV-2 infection through mediated pathways that increased the likelihood of having sex. Low school attendance (<80% of school days) increased the likelihood of having sex through increased age-disparate partnerships and reduced future aspirations. Fewer community years of education increased the likelihood of having sex through increased age-disparate partnerships. Parental education level was indirectly associated with HSV-2

IMPLICATIONS AND CONTRIBUTION

Community, household, and individual measures of education are associated with incident HSV-2 infection in adolescent girls and young women in South Africa. Lower mean year of education operates through increasing partner age and likelihood of having sex. Low school attendance operates through both increased

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overall, although we could not identify the individual pathways that were responsible for this association.

Conclusions: Community and individual schooling interventions may reduce the risk of HSV-2 infection by influencing the likelihood of having sex, partner age, and future aspirations.

partner age and low future aspirations.

Adolescent girls and young women (AGYW) in South Africa are disproportionately at risk of sexually transmitted infections (STIs) including Herpes simplex virus type 2 (HSV-2) and HIV. Patterns of HSV-2 prevalence show a strong differential by sex, with an estimated prevalence of 29% among young South African women compared with 10% in young South African men aged 15–26 years [1]. Risk of STIs in AGYW is strongly correlated with social and structural factors including gender inequity, stigma and discrimination (around HIV or access to health care), poverty, and education [2–4]. In our prior analyses among AGYW in South Africa, we found that low school attendance and school dropout were associated with over twice the risk of both incident HIV and HSV-2 [5]. Yet, there is limited research to provide a more in-depth understanding of this relationship, including determining whether household and community measures of education influence risk and examining the underlying pathways between schooling and HSV-2 infection.

Connections of parental and community education with HSV-2 infection

Individual education has been associated with both HSV-2 and HIV infection and is strongly correlated with parental and community education levels [6–8]. However, these measures have rarely been studied independently. Parental educational attainment is associated with socioeconomic disadvantage and a reduced prevalence of HIV [9]. At the community level, individual HIV knowledge can be increased through interaction with other community members with an equal or higher education level [10]. Negative gender norms are pervasive in many community settings in South Africa and have also been associated with access to education, intimate partner violence, and sexual behaviors [11–13]. Other measures that are correlated with community education such as community cohesion, group membership, and civic participation are associated with increased sexual behaviors among AGYW and with the risk of STIs [8,14–20].

Mediators between education and HSV-2

Research on pathways for the relationship between education at any level (individual, family, and community) and HSV-2 infection is similarly lacking. Our previous research from South Africa found that partner age difference and number of sexual partners both singly mediated the relationships between individual school attendance and incident HIV and HSV-2 infection [21]. Although that study provided some evidence that partner characteristics are important in the relationship between school attendance and HIV and HSV-2 infection, schooling is likely to influence other sexual behaviors. Furthermore, no studies have examined group-level education measures or other related mediators that have been hypothesized to be important in the

relationship between education and HSV-2 infection, such as condomless sex and knowledge about sexual health, particularly when mediators are considered simultaneously.

We used a comprehensive review by Jukes et al. [22] to develop our theoretical model. Given the lack of research on HSV-2 and the similar pathways in the relationship between schooling and HIV infection, we used theoretical literature on HIV to guide our selection of mediators. We hypothesized that increased individual-level school attendance would be related to a reduced risk of incident HSV-2 through two distinct mediation steps whereby education first influences HIV knowledge, age-disparate partnerships, or future aspirations and, through these factors, affects sexual behavior (Figure 1). HIV knowledge will be used to test the common hypothesis that more educated individuals are more exposed to preventative information about STIs and may be more likely to change their behaviors to prevent infection [22–25]. Future aspirations will be used to determine if more educated individuals have different aspirations for the future, making them less inclined to engage in sexual activity that elevates exposure to STIs [22,26,27]. Finally, partner age difference is included to examine the idea that educated individuals have different social and sexual networks based on being in school that might make them less exposed to infection [5,22]. In the second mediation step, we will examine how the first-stage mediators influence sexual behaviors that can directly influence HSV-2 acquisition, including condomless sex and increased likelihood of sex in the last 12 months.

Overall, this study builds on our previous research by testing a structural equation model for the relationship between multi-level measures of education and risk of incident HSV-2 infection among AGYW in South Africa. First, we tested the global fit of our theory-based structural equation model to the available empirical data. Second, we examined if individual, household, and community measures of education were associated with risk of incident HSV-2. Third, we explored chained mediation pathways including through first-stage (HIV knowledge, future aspirations, and sexual networks) and second-stage (sex in the last 12 months and condomless sex) mediators (Figure 1).

Methods

Study population

We used longitudinal data from the HIV Prevention Trials Network (HPTN) 068 study in rural South Africa. HPTN 068 was a randomized trial to determine if providing cash transfers, conditional on school attendance, would reduce the incidence of HIV in AGYW [28,29]. The trial enrolled 2,533 AGYW in 2011 who were aged between 13 and 20 years, were not pregnant or married, had a parent/guardian in the household, and were enrolled in grades 8–11. The study included AGYW living in 28 villages within the MRC/Wits Rural Public Health and Health

Transitions Research Unit (Agincourt) in rural Mpumalanga Province, South Africa. The area is the site of the Agincourt Health and Socio-Demographic Surveillance Site, which includes an annual census of more than 115,000 people. The area is rural with little infrastructure, high levels of poverty, unemployment, and migration and high levels of social protection (80% receiving the child support grant) [30]. We included girls who were HIV and HSV-2 negative at baseline and had at least two annual follow-up visits to examine mediation, ensure temporal ordering, and isolate incident infections [29].

Young women were randomized 1:1 to the control or intervention arm and were followed annually from enrollment until study completion (up to 3 years in 2015) or graduation from high school, whichever came first. Young women remained in the study if they dropped out of school, were married, or became pregnant. Each annual visit included an Audio Computer-Assisted Self-Interview survey and a test for HIV/HSV-2 for those who previously tested negative. Institutional review board approval was obtained from the University of North Carolina at Chapel Hill and the University of the Witwatersrand Human Research Ethics Committee as well as the Provincial Department of Health's Research Ethics Committee.

Ascertainment of exposures, outcome, mediators, and covariates

The main exposure of time-varying, individual school attendance was defined as the percentage of school days attended in the months between study visits based on high school attendance registers [5,29]. The exposure was dichotomized as high ($\geq 80\%$ school days) versus low attendance ($< 80\%$ school days), using the cutoff from the cash transfer intervention [5,28]. Other multilevel measures of education included baseline parental level of education and time-varying community mean years of education (based on reported village if the girl moved). Parental education was a categorical variable defined using four categories: no school, primary school, some secondary school, and completed secondary or higher education. Mother's educational level was used unless the mother had died, in which case father's educational level was used. Mean community years of education was a continuous variable created using village-level information from the Agincourt HDSS census about the village where the girl reported currently living [30]. This variable was constructed as the mean of the total years of education reported by all individuals living in a specific village. The outcome of incident HSV-2 infection was defined as new cases of HSV-2 detected following enrollment [28].

The time-varying mediators that were examined in our study were future aspirations (hope for the future), condomless sex in the last 3 months, age-disparate partnerships (partner aged ≥ 5 years), having sex in the last 12 months, and HIV knowledge (Figure 1). Hope for the future was a continuous variable constructed using a scale that was created and validated using the HPTN 068 cohort [31]. The hope for the future scale consists of 12 items with a 4-point Likert response from "1" for totally disagree to "4" for totally agree. All sexual behaviors were self-reported. Condomless sex in the last 3 months was defined as not using a condom at the last vaginal or anal sex. Having an age-disparate partnership was defined as having at least one sexual or nonsexual partner ≥ 5 years older. This categorization has been used in prior HPTN 068 analyses and is conventional in the literature [32]. Condomless sex and sex in the last 12 months were coded as 0 if the girl did not have sex in the last 12 months,

and partner age was coded as 0 if she did not report a partner. HIV knowledge score was used as a proxy for general knowledge about the prevention of STIs and was defined as the number of questions answered correctly using a six-question scale [33]. HIV knowledge was dichotomized as answering more than 50% of questions correctly versus less than 50%. Mediators were ascertained from the time point after exposures and before the outcome ascertainment.

Covariates that were included in all models were age at baseline, intervention assignment at baseline, and baseline socioeconomic status (SES). SES was constructed using principal components analysis with assets and divided into quartiles. Age was selected as a covariate as it is one of the strongest factors related to risk of HSV-2 infection [34], and SES was selected as it is closely linked to education level [22]. Randomization arm was included in all models to account for the original study design of the randomized trial.

Statistical analysis

We used structural equation modeling in *Mplus* version 8.1 (Muthén & Muthén, Los Angeles, CA) to test our model for the relationship between multilevel measures of education and risk of HSV-2 infection including through all mediators (Figure 1). We used a discrete-time survival model with the *Mplus* Bayes estimator and noninformative priors before examining mediation paths. The Bayesian estimator was used instead of other available estimation options (e.g., maximum likelihood) because it simultaneously (1) includes cases with partial data, (2) allows for correlated residuals among the multiple mediators, (3) computes optimal asymmetric credible intervals [CIs] (the Bayesian analog of confidence intervals used in frequentist statistics) for indirect effects, (4) allows for multiple mediators in a sequential arrangement (chained mediation), and (5) can be used to test a specific model within the structural equation modeling framework [35]. For continuous mediators, the model uses a normal distribution; for binary mediators and the HSV-2 outcome, a probit distribution with underlying latent variables with a standard normal residual distribution is assumed. Therefore, the coefficients (B) represent linear regression coefficients between exposures and the underlying latent representations for binary variables, including HSV-2 (i.e., the change in the continuous underlying latent variable per 1-unit change in the exposure). We report standardized coefficients and 95% credible intervals (CI). Global model fit for the proposed standard error of the mean (SEM) was assessed using the posterior predictive p (PPP) value. PPP values close to .50 indicate excellent model-data fit, whereas PPP values close to 0 or 1 indicate poorer fit [36].

We estimated both the indirect association through each of the mediated paths and the direct association not through each mediator for each exposure [37]. To account for the sequence of mediators, we modeled first-stage mediators (knowledge, hope for the future, and age-disparate partner), second-stage mediators affected by first stage mediators (sex in the last 12 months and condomless sex) and then HSV-2 affected by all mediators. Covariates were included in the model for the first-stage mediators and the outcome.

Results

Of the 2,533 young women enrolled in the original trial, we included 1,691 girls who were HSV-2 and HIV negative at baseline and had at least three visits (at baseline and two follow-up

visits later). There were 120 incident HSV-2 infections over the study period in 6,723 study visits. At baseline, the median age was 15 years (interquartile range 14–16), 3.7% had an age-disparate partnership, 19.5% had sex in the last 12 months, 60.0% had a low hope for the future score (below median of 35), 63.0% had low HIV knowledge, 5% had condomless sex in the last 3 months, and 96.6% had high attendance in school (>80% school days; Table 1). About 17% had a parent with no education, and the mean years of community education was 6.6, representing the completion of some primary school. Over the entire study period, girls reported having a partner in the last 12 months at 29.2% of visits, an older partner at 6.5% of visits, and unprotected sex at 7.8% of visits.

For the specified structural equation model, the PPP value was .30, indicating satisfactory global model-data fit [36]. The percent of the variance in HSV-2 explained by the model was 21.9% (95% CI: 13.3%–31.5%). Table 2 shows associations for the first step of the chained mediation pathway, examining how multilevel exposures of education affect first-stage mediators (low hope for the future, HIV knowledge, and age-disparate partnerships). At the individual level, young women with low school attendance had a lower hope for the future ($B: -.12$; 95% CI: $-.09$ to $-.15$) and had a higher propensity of having an age-disparate partnership ($B: .15$; 95% CI $.11$ – $.18$). At the household level, young women with a parent with some secondary ($B: -.04$; 95% CI $-.01$ to $-.08$) and primary education ($B: -.05$; 95% CI $-.01$ to $-.08$) had lower hope for the future, compared with a parent who had completed secondary education. At the community level, lower mean years of education was associated with a higher propensity of having an age-disparate partnership ($B: .08$ per 1-year decrease in mean education; 95% CI: $.04$ – $.12$).

Table 3 shows associations between the first-stage mediators (hope for the future, HIV knowledge, and age-disparate partnerships) and second-stage mediators (condomless sex and sex in the last 12 months). All first-stage mediators were associated with sex in the last 12 months. Low hope for the future and age-disparate partnerships were associated with condomless sex, whereas HIV knowledge was not.

Table 4 shows the third step of the mediation chain examining associations between the second-stage mediators (condomless sex and sex in the last 12 months) and incident HSV-2 infection. Young women who had sex in the last 12 months had a .53 higher propensity of HSV-2 infection (95% CI $.23$ – $.82$). However, condomless sex was not associated with an increased incidence of HSV-2 ($B: .27\%$; 95% $-.04$ to $.57$).

Overall, all three multilevel measures of education were indirectly associated with incident HSV-2 infection through our mediators of interest (Table 5). At the individual level, lower school attendance was associated with a higher propensity of HSV-2 indirectly ($B: .04$; 95% CI $.02$, $.06$) and overall ($B: .09$; 95% CI $.02$, $.16$; Table 5). At the household level, compared to having a parent that completed secondary school, we found an indirect association for not completing secondary school on HSV-2 ($B: .01$; 95% CI $.00$ – $.02$). At the community level, a 1-year decrease in the mean level of village education was associated with a .01 (95% CI $.01$ – $.35$) increase in the underlying propensity of HSV-2 infection. We did not identify a total association between community education and HSV-2. In this instance, the total association could be null because these associations operated in opposite directions and therefore could have canceled each other out (Table 5) [38].

Figure 1. Conceptual model of individual, household and community measures of education leading to HSV-2 infection in young women*. This is a conceptual model and not an analytic model (e.g., DAG or SEM graph). Covariates (not shown in diagram for clarity): age, SES, intervention randomization arm. *Definitions: Low school attendance <80% of school days, age-disparate relationship (partner aged ≥ 5 years), low HIV knowledge ($\leq 50\%$ correct); Community mean years of education. HSV-2, Herpes simplex virus type 2.

Figure 2 shows the chained (sequential) mediation pathways for the indirect associations between each measure of education and incident HSV-2 infection. Low school attendance increased incident HSV-2 infection by increasing the propensity of an age-disparate partnership ($B: .05$; 95% CI $.02$ – $.09$) and increasing

Table 1

Baseline characteristics of young women aged 13–20 without prevalent HSV-2 infection and at least three follow-up visits in Agincourt, South Africa, from March 2011 to December 2012 (N = 1,691)

	n (%)	Median (IQR)
Young women's age at baseline (y)		15 (14–16)
13–14	685 (40.5)	
15–16	772 (45.6)	
17–18	203 (12.0)	
18–20	31 (1.8)	
High attendance in school ($\geq 80\%$)	1,624 (96.6)	
Household wealth		
Low	428 (25.3)	
Middle to low	5,466 (25.3)	
Middle	400 (23.7)	
High	395 (23.4)	
Parental education at baseline (household)		
No school	258 (16.8)	
Primary school	371 (24.2)	
Some secondary school	467 (30.4)	
Completed secondary or higher	440 (28.7)	
Community mean years of education		6.6 (6.1–6.9)
Community max years of education		8 (7–8)
Hope for the future score (continuous)		32 (26–38)
Low hope for the future score (below median)	1,006 (60.0)	
Low HIV knowledge ($\leq 50\%$ correct)	1,042 (63.0)	
Sex in the last 12 mo	327 (19.5)	
Age-disparate relationship (partner aged ≥ 5 y)	60 (3.7)	
Ever had sex	318 (18.8)	
Any condomless sex in last 3 mo	84 (5.0)	
CCT randomization arm	912 (53.9)	

Total N = 1,691; missing: age 0; randomization arm 0; SES 2; age difference 55; sex in last 12 months 15; school attendance 10; physical violence 37; ever had sex 2, partner in last 12 months 15; HIV knowledge 38; hope for the future 16; parental education 155; condomless sex 13.

HSV-2 = Herpes simplex virus type 2; IQR = interquartile range.

Table 2

Linear regression coefficients (B) and 95% credible intervals (CIs) for the associations in step 1 of the mediation pathway^a

Exposures	Outcome		
	Hope for the future	Older partner	Knowledge
	B (95% CI)	B (95% CI)	B (95% CI)
Low attendance	-.12 (-.09, -.15)	.15 (.11, .18)	-.00 (-.05, .05)
Household-level education			
No school	.01 (-.03, .04)	.01 (-.05, .06)	.03 (-.04, .10)
Primary school	-.05 (-.01, -.08)	.03 (-.02, .09)	.03 (-.04, .10)
Some secondary school	-.04 (-.01, -.08)	.05 (-.00, .11)	-.01 (-.07, .06)
Completed secondary	0	0	0
Mean years of community education	-.02 (-.05, .01)	.08 (.04, .12)	.04 (-.04, .08)

Bold values are $p < 0.05$.

^a Adjusted for SES, age, and randomization arm.

hope for the future ($B: .003$; 95% CI $.001-.01$), which then increased sex in the last 12 months. At the household level, we did not identify any specific pathways. At the community level, a 1-year decrease in the mean level of education was associated with a higher propensity of incident HSV-2 infection because young women were more likely to have an age-disparate partnership and then more likely to have sex in the last 12 months ($B: .03$; 95% CI $.01-.05$).

Discussion

Low attendance in school, lower community mean years of education, and lower parental level of education were all indirectly associated with HSV-2 infection through mediation. Sequential mediation pathways ultimately operated through an increased likelihood of having sex. Low school attendance increased the probability of having sex through reduced future aspirations and increased age-disparate partnerships. Lower community years of education increased probability of sex through increased age-disparate partnerships. Lower parental education level was associated with HSV-2 through mediators, although we could not identify the individual pathways that were responsible for this association.

Our results are consistent with prior studies showing a strong relationship between individual school attendance and HSV-2 infection [2,5] and identifying that this relationship operates through increased age-disparate partnerships and likelihood of having sex [21]. However, we further identify multistep mediation pathways underlying these associations and show that both

Table 3

Associations for step 2 of the mediation pathway

Exposures	Outcome	
	Condomless sex	Sex in the last 12 m
	B (95% CI)	B (95% CI)
Hope for the future	-.10 (-.15, -.05)	-.06 (-.10, -.02)
Partner age difference (≥ 5 y)	-.50 (-.55, -.45)	.68 (.64, .72)
HIV knowledge	-.02 (-.11, -.06)	.16 (.08, .23)

Bold values are $p < 0.05$.

CI = confidence interval.

Table 4

Associations for step 3 of the mediation pathway^a

Exposures	Outcome
	HSV-2
	B (95% CI)
Condomless Sex	.27 (-.04, .57)
Sex in the last 12 mo	.53 (.23, .82)

N = 6,723 person-time observations from 1,691 participants.

Bold values are $p < 0.05$.

CI = confidence interval; HSV-2 = Herpes simplex virus type 2.

^a Adjusted for low attendance, household-level education, community mean education, socioeconomic status, age, randomization arm.

increased age-disparate partnerships and reduced hope for the future increase likelihood of having sex and risk of HSV-2. Our results support previous findings that school attendance may prevent HIV and HSV-2 by reducing opportunities for sexual activity and encouraging partnerships with same-age peers rather than older partners when sexual activity does occur [21]. However, we add to these findings with evidence to support the hypothesis that young women who are in school have different aspirations for the future that reduce risk of HSV-2, in this case by reducing likelihood of having sex [26,27,39]. Structural interventions to increase individual school attendance make AGYW feel more hopeful about the future, changing sexual behavior. Building positive future aspirations is particularly critical for AGYW in contexts such as the ADHSS area, where there are limited opportunities for employment or higher education and AGYW may feel pressure to start a family. In addition, the indirect association between parental education and HSV-2 highlights the importance of positive role models and support for young women, which can increase individual aspirations to complete school [6,7].

Table 5

Linear regression coefficients (B) and 95% credible intervals (CIs) for the total, direct, and total indirect associations of each multilevel exposure of education with incident HSV-2 infection^a

	Total	Total indirect	Direct
	B (95% CI)	B (95% CI)	B (95% CI)
Community: mean years of education	-.01 (-.08, .07)	.02 (.01, .03)	-.03 (-.10, .05)
Household: parental level of education			
No school	-.01 (-.11, .08)	.00 (-.01, .23)	-.02 (-.12, .08)
Primary school	-.11 (-.22, -.001)	.01 (.00, .03)	-.12 (-.23, -.01)
Some secondary school	-.04 (-.14, .06)	.01 (.00, .02)^b	-.05 (-.15, .05)
Completed secondary (ref)	0	0	0
Individual: Low school attendance	.09 (.02, .16)	.04 (.02, .06)	.05 (-.02, .12)

HSV-2 = Herpes simplex virus type 2.

^a Bold value represents is $p \leq .05$; N = 6,723 person-time observations from 1,691 participants.

^b Lower bound is .001 due appears as .00 due to rounding.

Figure 2. Significant pathways for the effect of multilevel measures of schooling on incident HSV-2 infection*. *All paths were significant at $\alpha < .05$; Path for mean community level of education ($B: .03$; 95% CI $.01-.05$); Path for school attendance through future aspirations ($B: .00$; 95% CI $.00-.01$); path for school attendance through partner age ($B: .05$; 95% CI $.02-.09$); $N = 6,723$ person-time observations from 1,691 participants. *Definitions: low school attendance $< 80\%$ of school days, age-disparate relationship (partner aged ≥ 5 years), low HIV knowledge ($\leq 50\%$ correct); Community mean years of education. HSV-2, Herpes simplex virus type 2

We identified an indirect association between decreased community mean years of education and increased incidence of HSV-2 infection that operated through an increased probability of having an age-disparate partnership. These findings could be related to men in more education communities perceiving risk to be higher in relationships with younger women and not engaging in these relationships [40]. Or, community education may be a marker for other community-level variables that affect HSV-2 acquisition such as gender norms, community cohesion, group participation, and stigma and discrimination, which are related to HIV risk [8,14–20]. More research is needed regarding how these other factors correlate with community-level education to understand how to best intervene, but we do see that age-disparate relationships, a strong determinant of HIV risk, can be changed through community-level characteristics.

Our study is one of the first to investigate chained mediation pathways that involve multiple factors in the relationship between multilevel measures of education and incident HSV-2. However, many of the mediators of this relationship are self-reported sexual behaviors, which may have resulted in under-reporting, socially desirable reporting, or recall biases. Second, to examine mediation, our sample was limited to participants who had at least two follow-up visits, and participants may be older. In addition, the use of three visits limited our power to examine incident HIV infection, and therefore, only incident HSV-2 was examined as an outcome. Given our specification of a model with relatively few covariates, it is also possible that we are not including important confounders. We did not explicitly model loss to follow-up in the analysis, but retention was high in the study (87% control and 95% intervention) [29]. The remaining few cases with partial data were included in the structural equation modeling under the relatively mild conditionally missing at random assumption via Bayesian estimation. Finally, we used a comprehensive review by Jukes et al. [22] to develop our theoretical model for the relationship between education and HIV infection and therefore assume that pathways in that review are most likely.

We used the Bayesian SEM approach implemented in *Mplus* because it was the only approach that allowed us to test an

SEM with multiple, sequential mediators and assess model fit. However, this approach is limited to interpretability. In addition, the associations obtained are not estimates of parameters that can be defined as hypothetical interventions, as they would be if using a causal inference framework, obtaining estimates of parameters that correspond to hypothetical interventions in the context of complex SEMs with multiple sequential mediators is an area of ongoing research. Finally, our method assumes that there is no interaction between exposure and mediator.

In conclusion, household, community, and individual measures of schooling were associated with incident HSV-2 infection among AGYW, and this relationship primarily operated through likelihood of having sex. Low attendance in school led to both increased age-disparate partnerships and reduced aspirations for the future, which increased the likelihood of having sex. Lower community education influenced HSV-2 through increased age-disparate relationships. Structural interventions to increase access to education are important to elevate future aspirations and decrease age-disparate partnerships, thus reducing risk of HSV-2 infection. In addition, increasing the community level of education could be a way to reduce the risk of STIs in young women by reducing age-disparate partnerships.

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