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Clusters of Adverse Childhood Experiences and Unmet Need for Care Coordination

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Abstract

Background: The lack of consensus on how to measure ACEs limits our estimation of their impact on health outcomes and understanding of which ACE clusters drive unmet care coordination (CC) needs.

Objectives: 1) Identify latent classes of ACEs among a representative group of U.S. children; 2) Examine the association between these classes and unmet needs for CC.

Participant and Setting: Using the 2016-2017 National Survey of Children's Health, we sampled children ages 0-17 the who had seen >1 healthcare provider within 12 months (n=38,758).

Methods: We conducted latent class analyses and weighted logistic regression analyses to examine associations between latent classes and unmet need for CC.

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Results: We identified seven distinct classes: household poverty and parental divorce, household poverty and parental death, household poverty only, household substance abuse and witnessing violence, multiple ACEs, household poverty and child discrimination, and household poverty and household mental illness. Children in the following classes had the greatest odds of unmet need for CC: household poverty only (AOR 2.0; 95% CI, 1.42- 2.84), household poverty and household mental illness (AOR 1.67; 95% CI, 1.15- 2.44), multiple ACEs (AOR 2.31; 95% CI, 1.53- 3.50), and household poverty and child discrimination (AOR 3.55; 95% CI, 1.71-7.37).

Conclusions: Children who experienced specific combinations of ACEs, have an increased risk of unmet need for CC, with those experiencing both poverty and discrimination having the highest odds of unmet need for CC. Discrimination widens the gap of unmet CC need for poor children.

Keywords

adverse childhood experiences; child health services; latent class analysis

INTRODUCTION

Although adverse childhood experiences (ACEs) have been linked to poor health outcomes in children and adults, there is currently no consensus on quantifying the impact of multiple ACEs.(Anda et al., 2021; Debowska et al., 2017; Hughes et al., 2017; McLennan et al., 2020) ACEs often coexist, and the inter-related nature of different ACEs has significant implications for how they are evaluated.(Dong et al., 2004) Studies examining associations between ACEs and a particular health outcome or health service need have traditionally taken an approach of tabulating dichotomous indicators to calculate a cumulative ACE score. Accumulative score approach provides information about the "dose" of the overall ACE exposure, which is useful for examining dose-dependent relationships. However, there is increasing interest in alternative methods of evaluating ACEs, namely studying ACE clusters which may be greater drivers for a particular health outcome or health service need among children and adults.(Barboza, 2018; Lanier et al., 2018; Lee et al., 2020; Lew & Xian, 2019; McKelvey et al., 2020; O'donnell et al., 2017) One concern is that the cumulative score approach assumes that each ACE is equally weighted and equally impacts the outcome of interest. Further, the cumulative ACE score approach does not sufficiently capture the nuances needed to understand ACEs' inter-related nature and the complex relationship between ACE clusters and particular child health outcomes or health service needs. (Dong et al., 2004; Finkelhor, 2018; McLaughlin & Sheridan, 2016; Negriff, 2020)

Because ACE exposure is associated with numerous physical and behavioral health outcomes, individuals with more ACE exposures may have unique health services needs and may access multiple systems of care.(M. Bellis et al., 2017; M. A.; Bellis et al., 2019; Koball et al., 2019; Peterson et al., 2018) Caregivers of children who have experienced ACEs may have more challenges in effectively supporting their child through the healthcare system.(Berg et al., 2018; Fairbrother et al., 2005) Care coordination (CC) is a process that can help caregivers in navigating the healthcare system to meet their child's needs.(Antonelli et al., 2008; Turchi et al., 2009) There is data to suggest that children who have endured ACEs have challenges receiving the needed CC.(Bethell et al., 2014) However, there are critical gaps in identifying the ACE clusters with greater unmet CC needs. Addressing this

gap will inform the development of CC interventions across the multiple care systems that children who endure ACEs may access. The aims of this study were as follows: 1) using latent class analysis (LCA), identify classes of ACEs among children who have seen a healthcare provider in the last 12 months, and 2) examine the association between these ACE latent classes and unmet need for CC.

METHODS

Data Source and Study Population

We obtained data from the 2016-2017 National Survey of Children's Health (NSCH), which is a nationally representative cross-sectional phone, mail, and web-based survey that collects data on the physical and emotional health of children ages 0-17 years old as well as educational activities and use of health services. U.S. households were randomly selected to complete a screening survey identifying the number of children in the home and children with special health need (CSHCN) status. One child was randomly selected from the household, and a caregiver was asked to complete the focal survey for that child.(US Census Bureau, 2018) Our study population was restricted to children 0-17 years old who had seen more than one healthcare provider in the last 12 months and whose caregivers responded to questions about ACE exposures. The Children's National Hospital Institutional Review Board deemed this study as exempt.

Measures

Adverse Childhood Experiences: For the NSCH, an expert panel developed nine questions about ACE exposures based on a literature review.(Bethell et al., 2017; Felitti et al., 1998) Parents and caregivers were asked how often the family had difficulty paying for basic necessities with the family's income (*household poverty*). The respondents also indicated whether the child had ever experienced the following: *parental divorce, parental death, parental incarceration,* witnessing *domestic violence,* being a victim/witness of *neighborhood violence,* living with a *household* member with *mental illness,* living with a *household* member with *mental illness,* living with a *household* member with *substance abuse* problems, and being treated unfairly due to race/ethnic group (*child discrimination*). The first ACE exposure (*household poverty*) was measured using a 4-point Likert scale (very often, somewhat often, rarely, never). We dichotomized very often and somewhat often to "yes" responses, whereas rarely and never responses were dichotomized to "no" responses. The remaining eight ACE exposure questions were reported as dichotomous yes/no responses. We used the nine NSCH ACEs variables to identify latent classes of ACE exposures. The ACE latent classes served as the primary independent variable in the logistic regression analyses.

Unmet Need for Care Coordination: The outcome of interest for the logistic regression analyses was unmet need for CC. The CC questions in the NSCH module were as follows: "Does anyone help you arrange or coordinate this child's care among the different doctors or services that this child uses?"; "During the past 12 months, have you felt that you could have used extra help arranging or coordinating this child's care among the different health care providers or services?"; "During the past 12 months, how often did you get as much help as you wanted with arranging or coordinating this child's health care?"

et al., 2019)

Based on a system from prior studies, we defined *unmet need for CC* as caregivers who reported: 1) needing extra help for coordinating care and only sometimes or never receiving as much help as needed, or 2) someone helped with coordinating care, needing extra help,

Study Covariates: We included child and household characteristics that may influence our independent and outcome variables.(Brown et al., 2017; Council on Children with Disabilities and Medical Home Implementation Project Advisory Committee, 2014; Toomey et al., 2013) Child socio-demographic characteristics included age, sex, race/ethnicity, insurance status (private, public, public and private, or uninsured), CSHCN status. CSHCN denotes having a chronic condition defined using a 5-item CSHCN screener which is part of the NSCH survey.(Bethell et al., 2002) Family socio-demographic characteristics included household income (0-99%, 100-199%, 200-399, or >400% of the Federal Poverty Level [FPL]), family structure (two-parent household, mother-only household, or other family structure), primary language spoken at home (English or another language) and parental education level (less than high school, high school, some college or higher).

and only sometimes or never receiving as much help as needed. (Brown et al., 2014; Miller

Analysis

Latent Class Analysis and Class Enumeration: Latent class analysis (LCA) is a model-based, person-centered analytic approach of identifying unobserved groups where clustering is based on formal statistical procedures in which the optimal number of classes is determined based on formal statistical procedures.(Collins & Lanza, 2009; B. O. Muthén, 2002; Wang & Wang, 2019) We used LCA to identify distinct classes of children with respect to their ACE exposures. We estimated a series of LCA models with an increasing number of latent classes and iteratively comparing each successive class (k) model with the previous class (k-1) model. Akaike's information criterion (AIC), Bayesian information criterion (BIC), sample-size adjusted BIC (aBIC), Lo-Mendell-Rubin likelihood ratio test (LMR) and adjusted Lo-Mendell-Rubin likelihood ratio test (aLMR) goodness of fit measures for each model were used for model comparisons. Bootstrap likelihood ratio test (BLRT), was not available for the NSCH's complex study design. We selected the most optimal model based on: lower AIC, smaller sample size BIC and aBIC, as well as significant values for LMR and aLMR for the k-class model relative to the k-1 class model. (Akaike, 1987; Lo et al., 2001; Nylund et al., 2007; Sclove, 1987) Entropy values closer to one indicated how well the model formed very distinct classes.(Celeux & Soromenho, 1996) After selecting the model of best fit, we used posterior probabilities of class membership to assign each child to their most likely ACE latent class. We named the latent classes based on the common ACE exposure in each group. We used Mplus version 8.4 to estimate the LCA models (L. K. Muthén & Muthén, 1998) and accounted for the complex survey design.

Multivariate Regression to Assess Associations: The estimated latent class membership was saved as a categorical variable and merged with the original sample data. Then, we conducted logistic regression analyses to examine the association between the latent classes and unmet need for CC. We retained children with no ACE exposures in the study and classified them as the reference group (Class 0). We used a chi-squared test to

measure bivariate relationships and logistic regression to examine the association between ACE latent classes and odds of unmet need for CC. The child and household covariates were controlled in the logistic regression model and we applied survey weights derived from the National Center for Health Statistics in all model estimations.

RESULTS

Sample Characteristics

Descriptive statistics of the weighted sample are summarized in Table 1. The average age of the study population (N=38,758) was 8.8 years old. There were slightly more males (52.1%) than females (47.9%). Most children were White Non-Hispanic (53.6%), English speaking (87.6%), privately insured (59.9%), had non-CSHCN status (73.4%), lived in two-parent households (75,1%), and had parents who had received some college education or higher (75.3%). Approximately 48% of children had 1 or more ACEs.

Latent Class Analysis of the ACEs

LCA model comparisons are shown in Table 2. All the goodness of fit measures favored seven or more classes. In comparison between seven and eight class models, information criterion indices (AIC, BIC and aBIC) favored eight classes, but LMR and aLMR tests favored seven classes. We selected the seven-class model for further analysis because of an entropy value (entropy = 0.917) closest to one. The seven-class model showed a distinct pattern of ACE clusters (Figure 1): Class 1 - household poverty and parental divorce (14.2%), Class 2 - household poverty and parental death (1.8%), Class <math>3 - household poverty only (9.6%), Class 4 - household substance abuse and witnessing violence (2.6%), Class <math>5 - multiple ACEs (6.7%), Class 6 - household poverty and child discrimination (2.0%), and Class 7 - household poverty and household mental illness (6.2%). Children who had not experienced any ACEs were neither included in the LCA nor excluded from the study. Instead, they were assigned to Class <math>0 - no ACEs (56.9%) reference group.

Weighted demographic descriptive statistics for each latent class are presented in Table 3. All characteristics were associated with the latent class membership (p<0.05) except for age, gender, and household income. Children in all latent classes were older than the sample average age of 8.8 except Class 0 (no ACEs; 7.95) and Class 3 (household poverty only; 7.97). White Non-Hispanic children accounted for over 50% of the population within Class 0 (no ACEs, 59.1%), and Class 7 (household poverty and household mental illness; 62.2%), while Black Non-Hispanic children were over-represented in Class 6 (household poverty and child discrimination; 38.5%). Children with public insurance were over-represented in Class 2 (household poverty and parental death; 50.9%), Class 3 (household poverty only; 43.2%), and Class 5 (multiple ACEs; 59.0%). Most children lived in two-parent households except those in Class 2 (household poverty and parental death; 46.4%) and Class 5 (multiple ACEs; 36.5%). Most parents across all classes received some college-level education or higher, with Class 6 (household poverty and child discrimination; 82.4%) having the highest percentage. Children with CSHCN status were over-represented in Class 5 (multiple ACEs; 50.3%). In Table 4, the highest prevalence for unmet need for CC was among children in Class 6 (household poverty and child discrimination).

Effect of Latent Class Membership on Report of Unmet Need for CC

After controlling for all covariates, children in Class 3 (*household poverty only*), Class 5 (*multiple ACEs*), Class 6 (*household poverty and child discrimination*), and Class 7 (*household poverty and household mental illness*) had significantly greater odds of unmet needs for CC compared to children with no ACEs (Table 5). The largest effect size was seen among children in Class 6 (*household poverty and child discrimination*) who had over three times the odds (aOR 3.55; 95% CI 1.15-2.44) of unmet need for CC.

DISCUSSION

The purpose of this study was to examine the association between ACE latent classes and unmet need for CC in U.S. children. This study's findings validate prior findings, extend the work of previous studies, and provide novel hypotheses for future inquiry. Our findings provide evidence that U.S. children who have seen more than one healthcare professional in the last 12 months have distinct ACE clusters. We also found that children in the following latent classes had significantly higher odds of unmet need for CC compared to children with no ACEs: household poverty only (class 3), multiple ACEs (class 5), household poverty and child discrimination (class 6), as well as the household poverty and household mental illness classes (class 7).

Our latent class findings both corroborate previous studies and identify novel classes. Like prior studies, we found the following latent classes: multiple ACEs,(Barboza, 2018; Lacey et al., 2020; Lanier et al., 2018; Lew & Xian, 2019; Thompson et al., 2020) children with household poverty and household mental illness,(Lanier et al., 2018) children with household poverty only,(Lew & Xian, 2019) children experiencing the combination of household poverty and parental divorce,(Stempel et al., 2017) and children with exposures to household substance abuse and violence.(Lanier et al., 2018)

To our knowledge, the household poverty and child discrimination class has not been identified in prior LCA analyses of ACEs. Perceived racial discrimination has predominantly been studied in adults(Paradies et al., 2015), but growing literature has shown that children experience racial discrimination directly and vicariously through their caregiver's experience.(Heard-Garris et al., 2018; Pachter & Coll, 2009) Among adults, racial discrimination is associated with deferred or underutilized needed healthcare services, increased mistrust of the healthcare system, and sub-optimal patient-provider communication.(Ben et al., 2017; Burgess et al., 2008) Caregivers who note perception of racial discrimination also reported unmet healthcare needs for the child and decreased patient-family satisfaction.(Auslander, W. F., Thompson, S. J., Dreitzer, D., & Santiago, 1997; Paine et al., 2018) Any or all of these factors may lead to a higher unmet need for CC for children who have experienced racial discrimination.

This finding highlights that racism is a public health threat and an underlying driver of healthcare inequities throughout the life-course.(Feagin & Bennefield, 2014; Malawa et al., 2021) Race/ethnicity and poverty are often conflated, but they have a complex and non-causal relationship. Race is distinct from racism. While the former is a social construct that separates individuals based on physical characteristics such a skin color or ancestry,

the latter is a system of prejudice or oppression directed against a person or group of people based on racial classification.(Amutah et al., 2021; Bailey et al., 2020) The finding of highest odds of unmet need for CC among the household poverty and child discrimination latent class compared to children with no ACEs highlights that racism rather than race drives adverse health or healthcare need outcomes. More work is needed to understand how interpersonal and systemic efforts such as acknowledging bias, providing culturally competent care, and improving shared decision making can aide in disrupting institutional racism and its disparate effects on health service delivery outcomes such as unmet need for CC.(Jindal et al., 2020; Johnson, 2020)

Household poverty and household mental illness may be associated with unmet need for CC due to diminished resources and caregiver reserve.(Chaudry & Wimer, 2016; Fairbrother et al., 2005; S. Gupta & Ford-Jones, 2014) In contrast to the discrimination measure, the measurement of poverty and mental illness was assessed within context of the household and not as directly experienced by the child. There also are some systems in place to identify and attempt to address the healthcare system needs of families experiencing poverty or caregivers with mental illness. (Stein Berman et al., 2018; Weiss-Laxer et al., 2016) In contrast, there are limited systems for identifying and addressing the needs of patients who endure discrimination. In this study, poverty was a significant driver in unmet for need CC with differential impact depending on the additional ACE in the cluster. This finding suggests poverty may be a unique and inciting ACE in the accumulation of other ACEs.(Braveman et al., 2018; A. Gupta, 2017; Pelton, 2015) Given the co-occurring nature of ACEs, routine assessments of poverty should continue alongside additional interventions to reduce child exposure to poverty.

Extending work from prior studies, our findings using a nationally representative sample support the use of ACE latent classes to measure exposure to multiple ACEs and estimate associated outcomes. Such an approach provides more nuanced information to understand the inter-related nature of ACEs. The multiple ACEs latent class identified a population with a high ACE combination, which may be a large driver in unmet service needs. The children in the multiple ACEs latent class had a 50% or greater probability of being exposed to parental divorce, household substance abuse, parental incarceration, domestic violence, household mental illness, and poverty. This clustering of ACEs can inform the selection of interventions which may be more specific or intensive to assist in meeting the health needs of children in that sub-group.

Strengths and Limitations

This study has several strengths, including a large and nationally representative population, extending findings from prior studies on ACE latent classes and identifying a novel ACE latent class of poverty and discrimination with high odds of unmet need of CC. The findings of the study should be viewed with some limitations in mind. This cross-sectional survey relies on parental retrospective reports of ACEs and CC needs. No information was collected on the timing and duration of the ACE nor of the timing of CC need in relation to the ACE, thus causality cannot be inferred. CC questions were only asked of parents who noted their child saw more than one healthcare provider and may under-estimate need, as families

whose children only see one healthcare provider may have CC needs as well. The NSCH did not evaluate for physical or sexual abuse, which may lead to under-estimation of ACE exposure and the extent of unmet need for CC.

CONCLUSION

Within a population of U.S. children who have seen more than one healthcare provider in the last 12 months, there are ACE latent classes who have increased odds of unmet need for CC. These sub-groups included children in the household poverty only, multiple ACEs, household poverty and child discrimination, as well as the household poverty and household mental illness latent classes. These findings suggest the need to consider how the latent class approach may provide more nuanced information for evaluating the impact of multiple ACEs on health outcomes and health service needs. The sub-group of children exposed to household poverty and child discrimination had the highest odds of unmet need for CC. Additional studies are needed to fill gaps in disrupting institutional factors contributing to discrimination and inequities in health service need outcomes.

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Abbreviations:

ACEs	Adverse Childhood Experiences
СС	Care Coordination
CSHCN	Children with special health care needs
FPL	Federal Poverty Level
NSCH	National Survey of Children's Health

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Figure 1: Probability of each ACE type across the seven latent classes

Table 1:

Descriptive statistics of study population (n= 38,758)

	Frequency	Percentage	Mean (SE)
Age (years)			8.84 (8.71-8.96)
Child Sex			
Female	18,577	47.9%	
Male	20,181	52.1%	
Child Race/Ethnicity			
White Non-Hispanic	20,790	53.6%	
Hispanic	9,058	23.4%	
Black Non-Hispanic	4,887	12.6%	
Other Non-Hispanic	4,023	10.4%	
Insurance			
Private	23,170	59.8%	
Public	11,755	30.3%	
Public and Private	2,198	5.7%	
Uninsured	1,639	4.2%	
Household Income			
0-99% FPL	7,418	19.1%	
100-199% FPL	7,926	20.5%	
200-399% FPL	10,395	26.8%	
400% FPL or more	13,015	33.6%	
Family structure			
Two parent family	29,107	75.1%	
Single parent (mother only)	6,244	16.1%	
Other family type	3,407	8.8%	
Parental Education			
Less than high school education	2,736	7.1%	
High school or GED Degree	6,821	17.6%	
Some college or higher	29,196	75.3%	
Household Language			
English	33,944	87.6%	
Other Language	4,814	12.4%	
CSHCN Status			
Yes	10,310	26.6%	
No	28,448	73.4%	
Adverse Childhood Experiences			
0 ACEs	20,305	52.4%	
1 ACEs	9,658	24.9%	
2 ACEs	4,197	10.8%	

	Frequency	Percentage	Mean (SE)
3 ACEs	1,992	5.1%	
4 ACEs	2,608	6.7%	

Table 2:

Latent Class Model Fit Comparisons

Model	AIC	BIC	aBIC	LMR p-value	aLMR p-value	Entropy
1-Class	136378.47	136447.99	136419.39	-	-	-
2-Class	127008.51	127155.27	127094.89	<.0001	< 0.0001	.821
3-Class	124456.79	124680.80	124588.64	<.0001	< 0.0001	.725
4-Class	122503.52	122804.78	122680.84	<.0001	< 0.0001	.776
5-Class	121768.61	122147.11	121991.39	.0001	.0002	.857
6-Class	121138.30	121594.05	121406.55	.0032	.0036	.905
7-Class	120635.36	121168.35	120949.07	.0019	.0021	.917
8-Class	120272.16	120882.40	120631.34	.2099	.2141	.840

Note: AIC-Akaike Information Criterion; BIC-Bayesian Information Criterion; aBIC-Adjusted BIC; LMR LR- Lo- Mendell-Rubin likelihood ratio test; ALMR LR- Adjusted LMR LR test; Entropy- Entropy statistic. -: Not applicable.

Table 3:

Descriptive statistics of the latent class groups (n= 38,758)

	Class 0 N= 22,035	Class 1 N= 5,511	Class 2 N= 704	Class 3 N= 3,711	Class 4 N= 1,009	Class 5 N= 2,613	Class 6 N= 768	Class 7 N= 2,407	p-value
% of total sample	56.9%	14.2%	1.8%	9.6%	2.6%	6.7%	2.0%	6.2%	
Average child age	7.95	10.18	11.24	7.97	9.19	11.15	11.28	10.00	>0.05
Child Sex									
Female	48.2%	48.0%	47.6%	46.1%	51.5%	46.4%	50.0%	49.1%	0.8855
Male	51.8%	52.0%	52.4%	53.9%	48.5%	53.6%	50.0%	50.9%	0.8855
Child Race/Ethnicity									
White Non-Hispanic	59.1%	49.1%	37.8%	46.7%	45.6%	50.0%	13.8%	62.2%	0.001
Hispanic	21.6%	27.4%	25.7%	28.2%	29.6%	20.6%	26.4%	16.2%	0.001
Black Non-Hispanic	8.1%	16.3%	31.2%	16.2%	16.2%	18.3%	38.5%	8.9%	0.001
Other Non-Hispanic	11.1%	7.3%	5.31%	9.0%	8.6%	11.1%	21.4%	12.7%	0.001
Insurance									
Private	74.8%	46.1%	38.5%	39.1%	51.1%	26.5%	56.3%	59.2%	0.001
Public	18.5%	41.3%	50.9%	43.2%	40.6%	59.0%	33.3%	31.4%	0.001
Public and Private	3.3%	7.7%	7.2%	10.7%	4.5%	9.0%	6.24%	6.6%	0.001
Uninsured	3.4%	5.0%	3.4%	7.0%	3.8%	5.5%	4.1%	2.8%	>0.05
Household Income									
0-99% FPL	11.7%	28.8%	32.9%	28.7%	18.1%	32.6%	20.4%	17.0%	0.001
100-199% FPL	15.3%	24.7%	25.8%	31.5%	23.7%	26.6%	19.0%	22.7%	0.001
200-399% FPL	26.9%	25.3%	21.3%	28.1%	24.2%	25.6%	30.9%	31.4%	< 0.05
400% FPL or more	46.1%	21.2%	20.0%	11.7%	34.1%	15.2%	29.7%	29.0%	0.001
Family structure									
Two parent family	92.3%	42.3%	22.2%	81.7%	73.6%	31.4%	72.8%	73.5%	0.001
Single parent (mother only)	42.8%	41.6%	46.4%	13.6%	14.4%	36.5%	22.4%	19.2%	0.001
Other family type	3.4%	16.1%	31.4%	4.6%	12.1%	32.1%	4.9%	7.3%	0.001
Parental Education									
Less than high school education	5.7%	8.25%	9.4%	10.7%	11.2%	8.24%	8.3%	3.7%	0.001
High school or GED Degree	12.4%	25.1%	32.7%	23.5%	18.5%	28.8%	9.3%	14.5%	0.001
Some college or higher	81.9%	66.7%	57.9%	65.8%	70.3%	63.0%	82.4%	81.8%	0.001
Household Language									
English	86.4%	90.4%	91.9%	80.9%	88.1%	96.1%	81.9%	94.5%	0.001
Other Language	13.6%	9.6%	8.1%	19.1%	11.9%	3.9%	18.1%	5.5%	0.001
CSHCN Status									
Yes	19.8%	29.0%	27.8%	29.1%	29.8%	50.3%	34.0%	42.6%	0.001
No	80.2%	71.0%	72.3%	70.9%	70.2%	49.7%	66.0%	57.4%	0.001

All socio-demographic variables were significantly different at the p <0.05 level between the class groups, except for age (only ages 8 and 10), gender and household income (only at the 200-399% FPL level)

Table 4:

Prevalence of Unmet Need for CC by ACEs Latent Class Membership

Latent Class	Weighted % with Unmet Need for CC
Class 0: No ACEs	24.2 ***
Class 1: Household Poverty and Parental Divorce	29.9 ***
Class 2: Household Poverty and Parental Death	34.5 ***
Class 3: Household Poverty only	40.9 ***
Class 4: Household Substance Abuse and Witnessing Violence	37.9 ***
Class 5: Multiple ACEs	50.0 ***
Class 6: Household Poverty and Child Discrimination	53.2***
Class 7: Household Poverty and Household Mental Illness	39.7***

*** p 0.001

Table 5:

Associations of Unmet Need for CC and Latent Class Membership

Latent Class	Unadjusted OR (95% CI)	Adjusted OR (95% CI)
Class 0: No ACEs	Reference	Reference
Class 1: Household Poverty and Parental Divorce	1.34 (0.97- 1.86)	1.06 (0.73 - 1.53)
Class 2: Household Poverty and Parental Death	1.65 (0.73- 3.74)	1.04 (0.49- 2.22)
Class 3: Household Poverty only	2.17 (1.53- 3.09)***	2.01 (1.42- 2.84) ***
Class 4: Household Substance Abuse and Witnessing Violence	1.91 (1.10 - 3.33)*	1.58 (0.84- 2.97)
Class 5: Multiple ACEs	3.14 (2.28- 4.33) ***	2.31 (1.53- 3.50) ***
Class 6: Household Poverty and Child Discrimination	3.56 (1.93- 6.58)***	3.55 (1.71-7.37)***
Class 7: Household Poverty and Household Mental Illness	2.06 (1.39- 3.06)***	1.67 (1.15- 2.44)*

Adjusted for age, sex, race insurance status, household income, family structure, parental education, language spoken at home and CSHCN; Ref: Reference

* p 0.05

** p 0.01

*** p 0.001