

# Substance and polysubstance use at 20 years old: a latent class analysis

MM Brennan, D Mongan, A Doyle, M Cavallaro,  
SR Millar, B Galvin, L Zgaga, B Smyth, E Nixon,  
JH Ivers, C McCrory, C Walsh, N McCarthy



**Trinity College Dublin**  
Coláiste na Tríonóide, Baile Átha Cliath  
The University of Dublin



**Fás Aníos in Éirinn**  
Growing Up in Ireland



# INTRODUCTION

Polysubstance use has been associated with overdose, mental ill-health & sexual risk behaviour (Daskalopoulou, 2014)

Among those seeking drug treatment in Ireland in 2023, 59% reported polydrug use (HRB, 2022)

Among festival attendees aged  $\geq 18$  in Ireland in 2019, 86.8% reported polysubstance use (Ivers, 2021)

Limited knowledge about polysubstance use patterns among the general young adult population in Ireland



# RESEARCH QUESTIONS



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1. What are the patterns of substance and polysubstance use at 20 years old in a general young adult population in Ireland?
2. What are the individual, family, social and environmental factors that predict substance use patterns at 20 years old?

# METHODS

## Growing Up in Ireland Cohort '98

Two-stage clustered sampling:

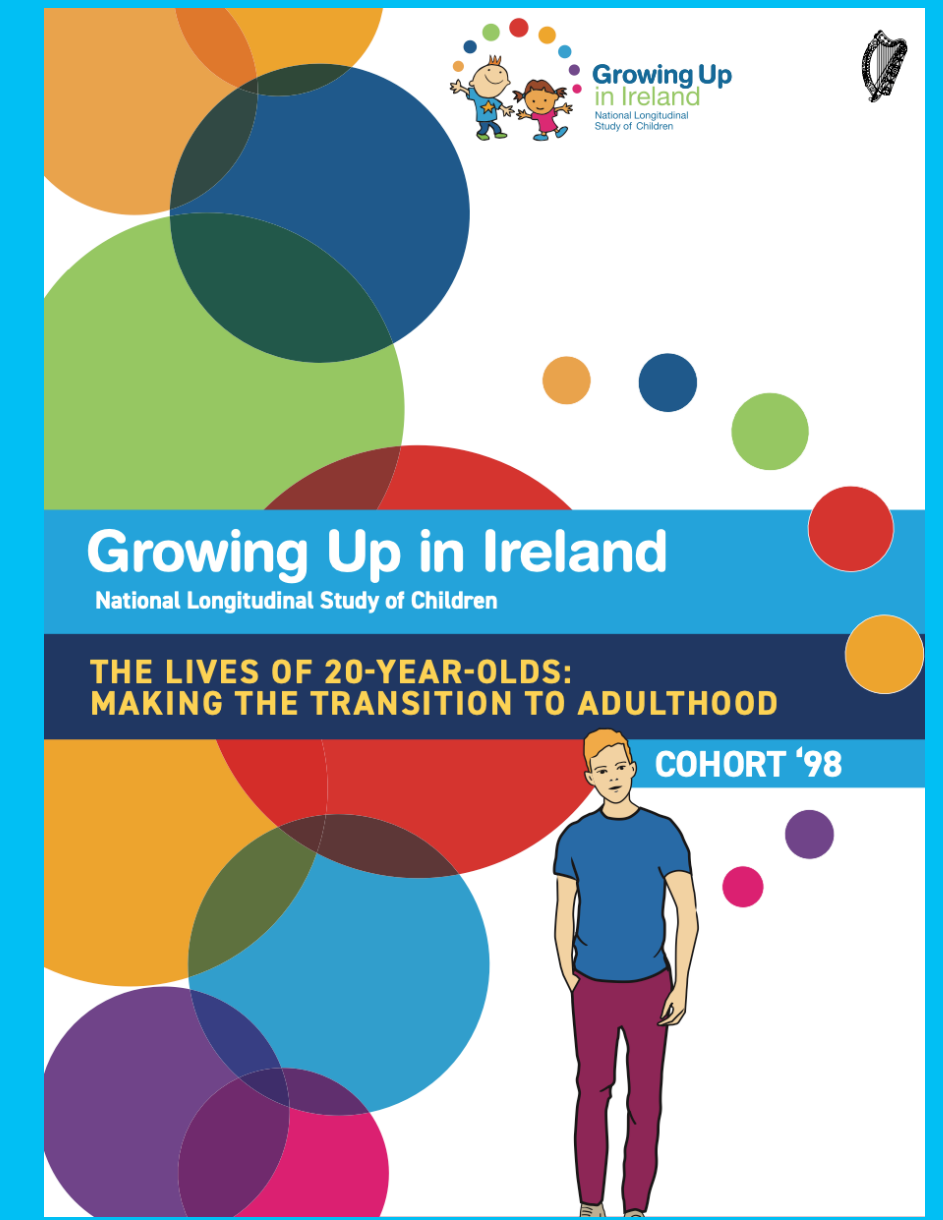
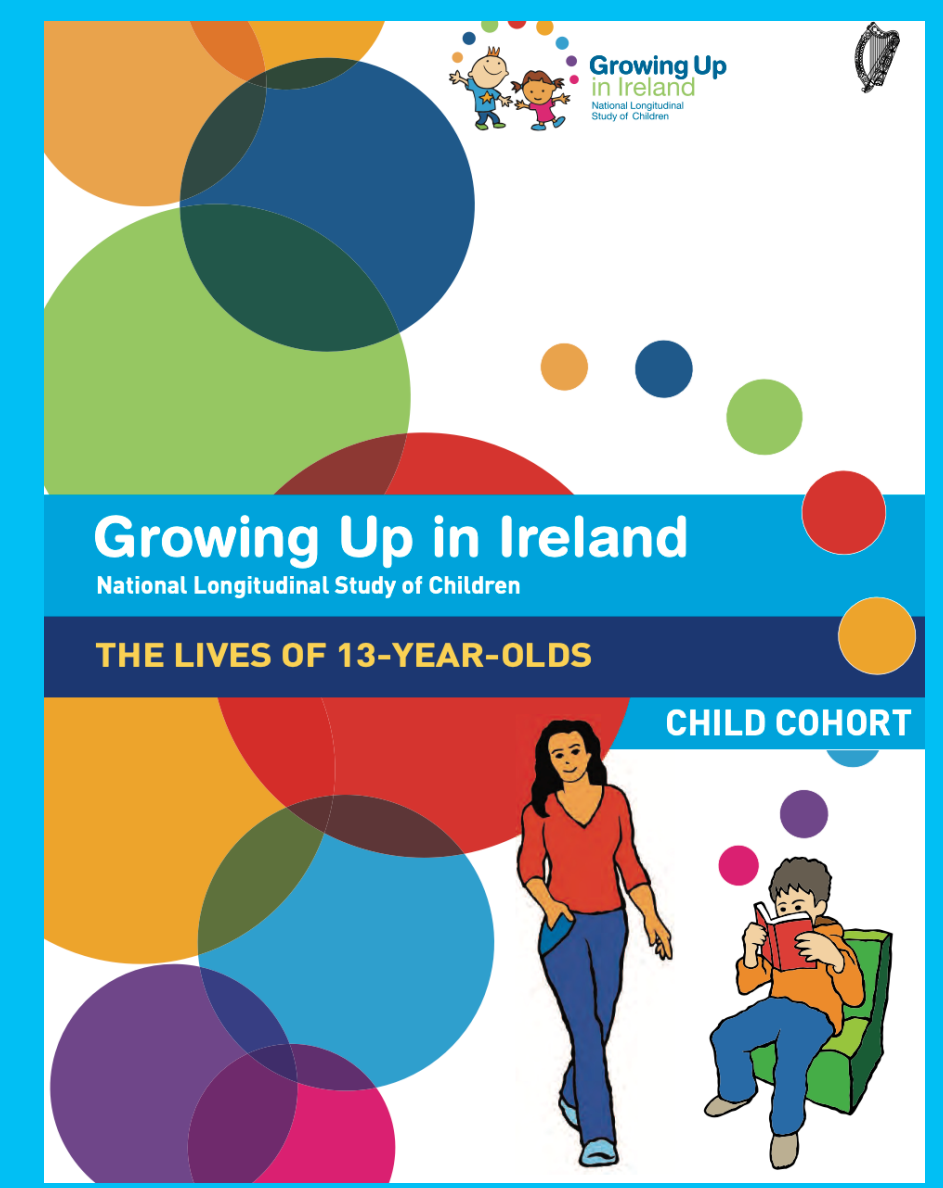
- Primary school system as initial sampling frame

Initial sample size:

- 8568 nine-year-olds
- 1 in every 7 nine-year olds resident in the country

4 waves of data collection completed

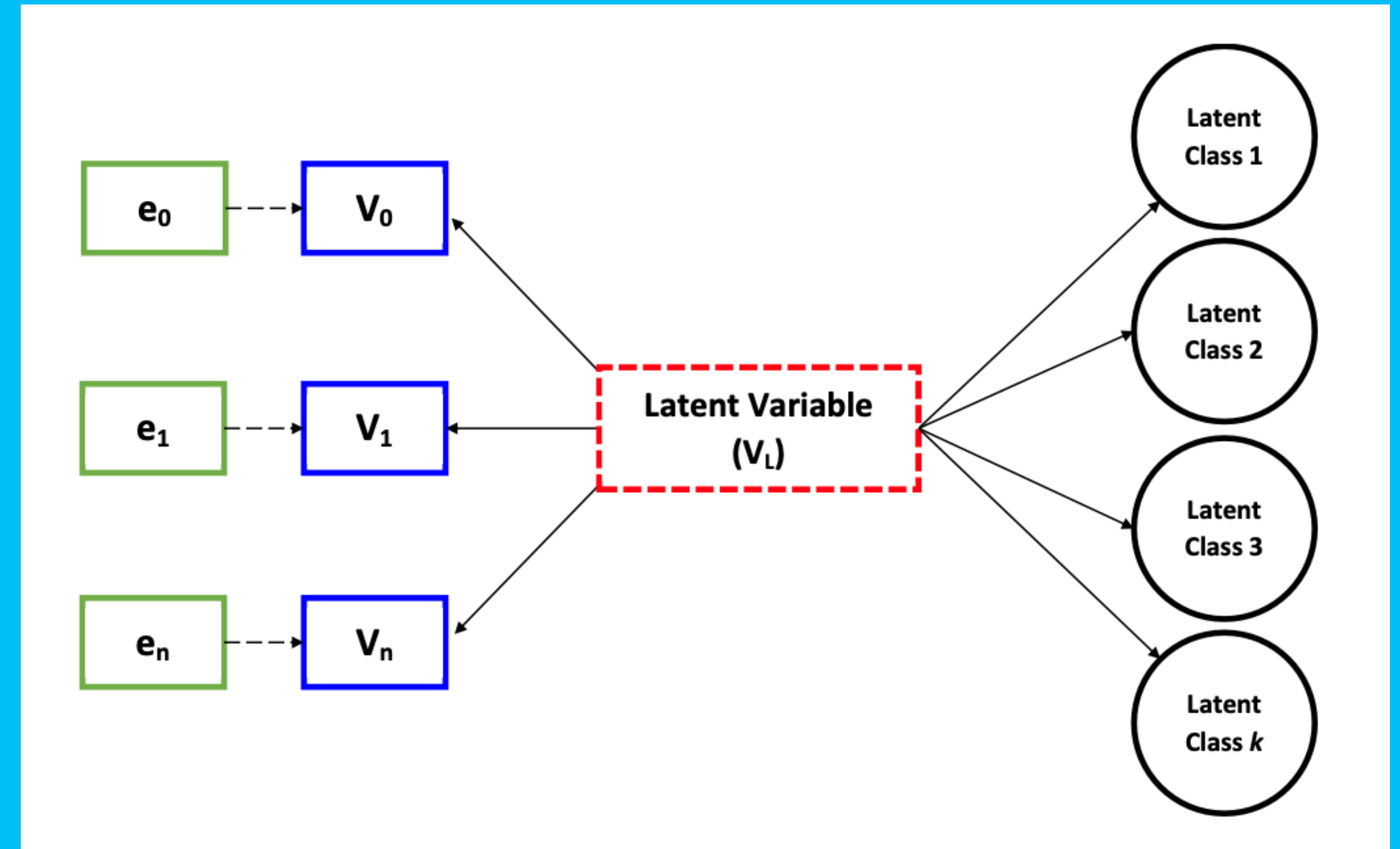
Study population included those who completed Waves 1–4, excluding those who reported use of a fictitious drug and those missing observations on all substance use indicators (N=4695)



# METHODS

Latent class analysis - a statistical method that can infer subgroups or “latent classes” in a population grouped probabilistically based on a set of indicator variables.

- $V_0$  AUDIT score
- $V_1$  E-cigarette
- $V_2$  Tobacco
- $V_3$  Cannabis
- $V_4$  Cocaine
- $V_5$  Ecstasy
- $V_6$  Ketamine
- $V_7$  Other drugs



Aflaki, 2022

# METHODS



## Three Step Latent Class Analysis in R and STATA

**Daniel Tompsett and Bianca L De Stavola**

Great Ormond Street Institute of Child Health, University College London

[https://www.stata.com/meeting/uk22/slides/UK22\\_Tompsett.pdf](https://www.stata.com/meeting/uk22/slides/UK22_Tompsett.pdf)

Estimate series of latent class models (one- to six- classes)

Model selection: fit indices, correlation matrices, theory

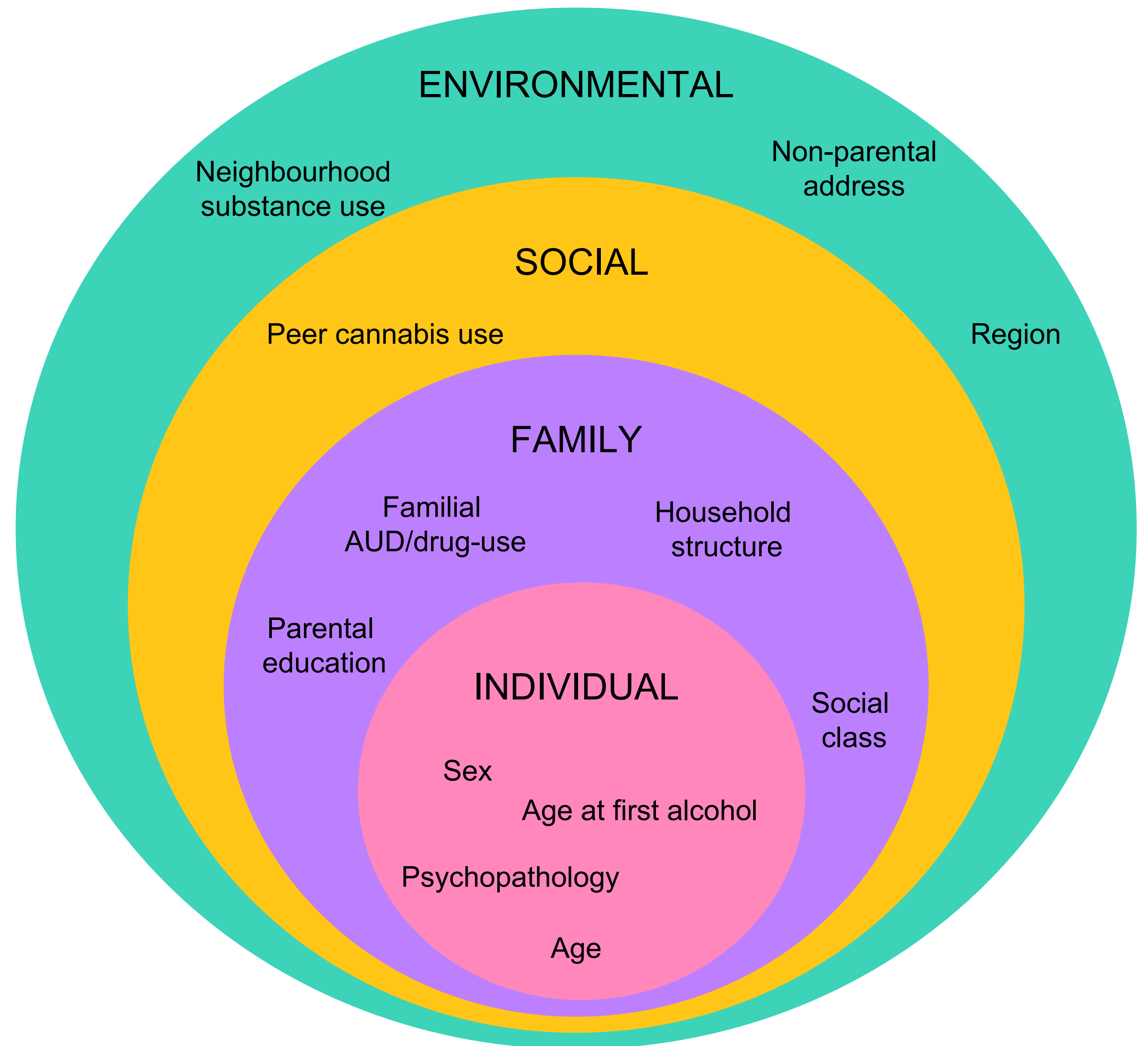
Once class selected -> modal allocation of participants to each class

Misclassification probabilities estimated to account for uncertainty in class allocation



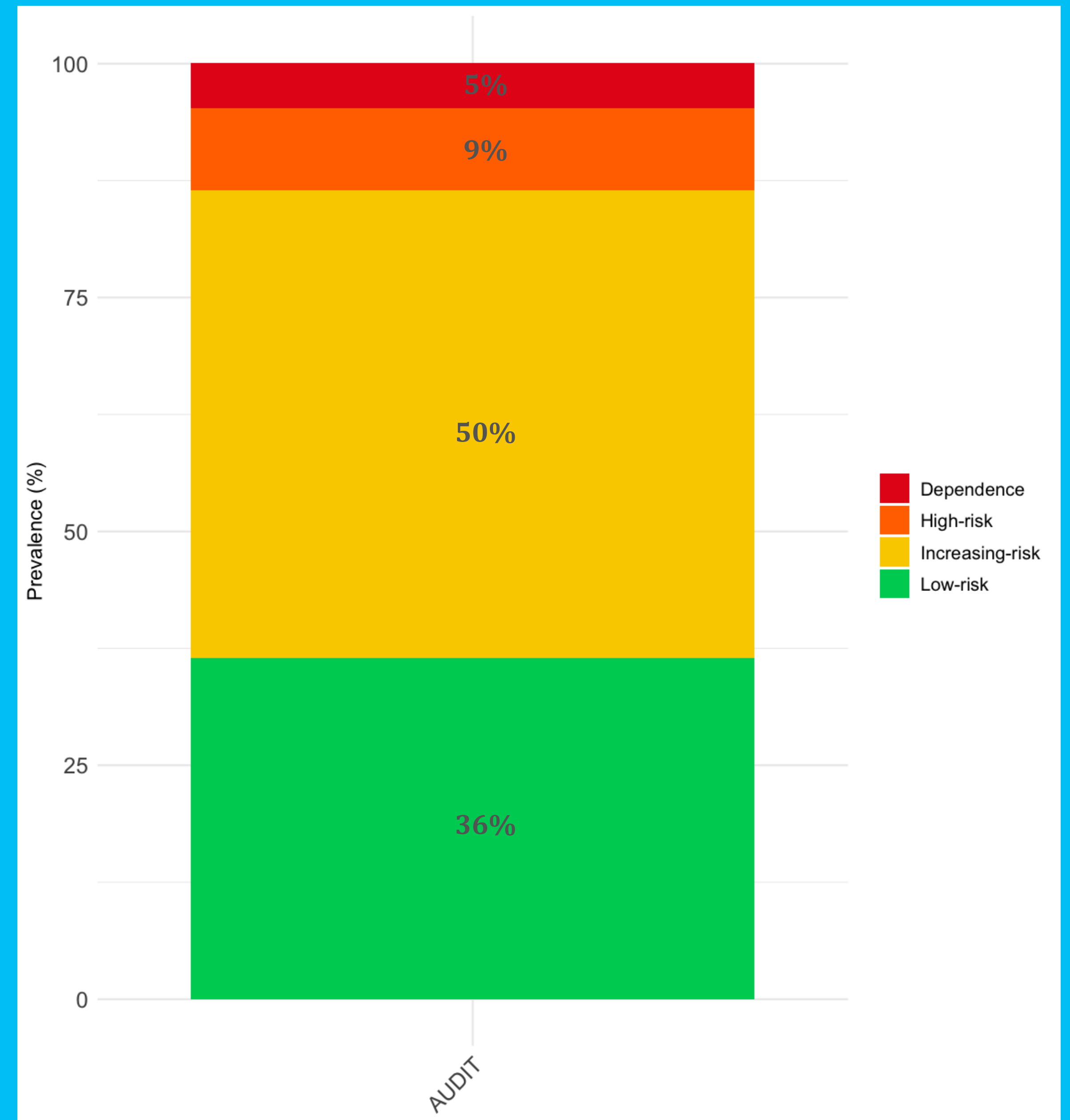
# METHODS

Survey-weighted multinomial logistic regression models used to examine associations between substance use latent class membership & individual, family, socio-environmental factors



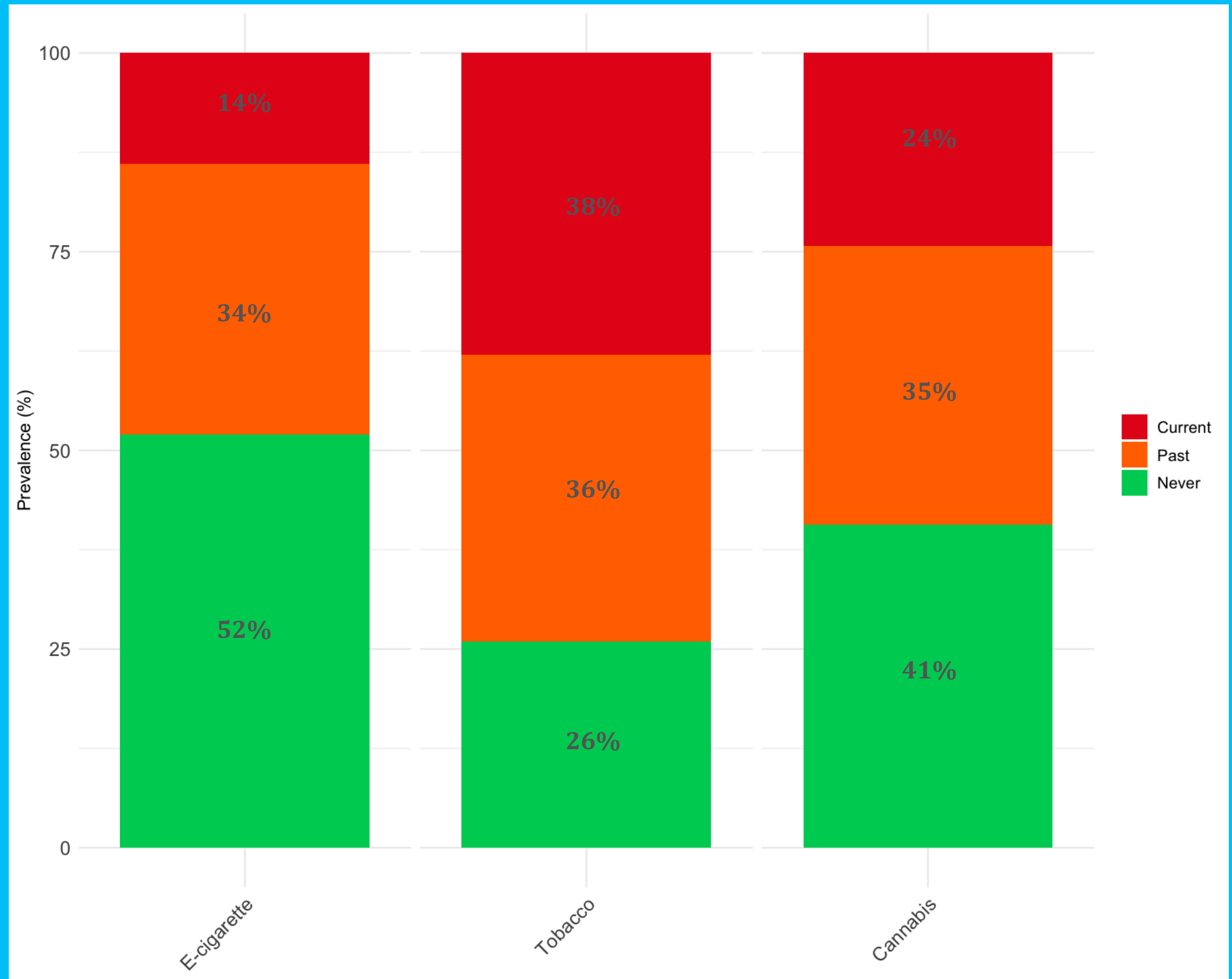
# RESULTS: PREVALENCE

Alcohol Use Disorder  
Identification Test  
(AUDIT) scores  
at 20 years old



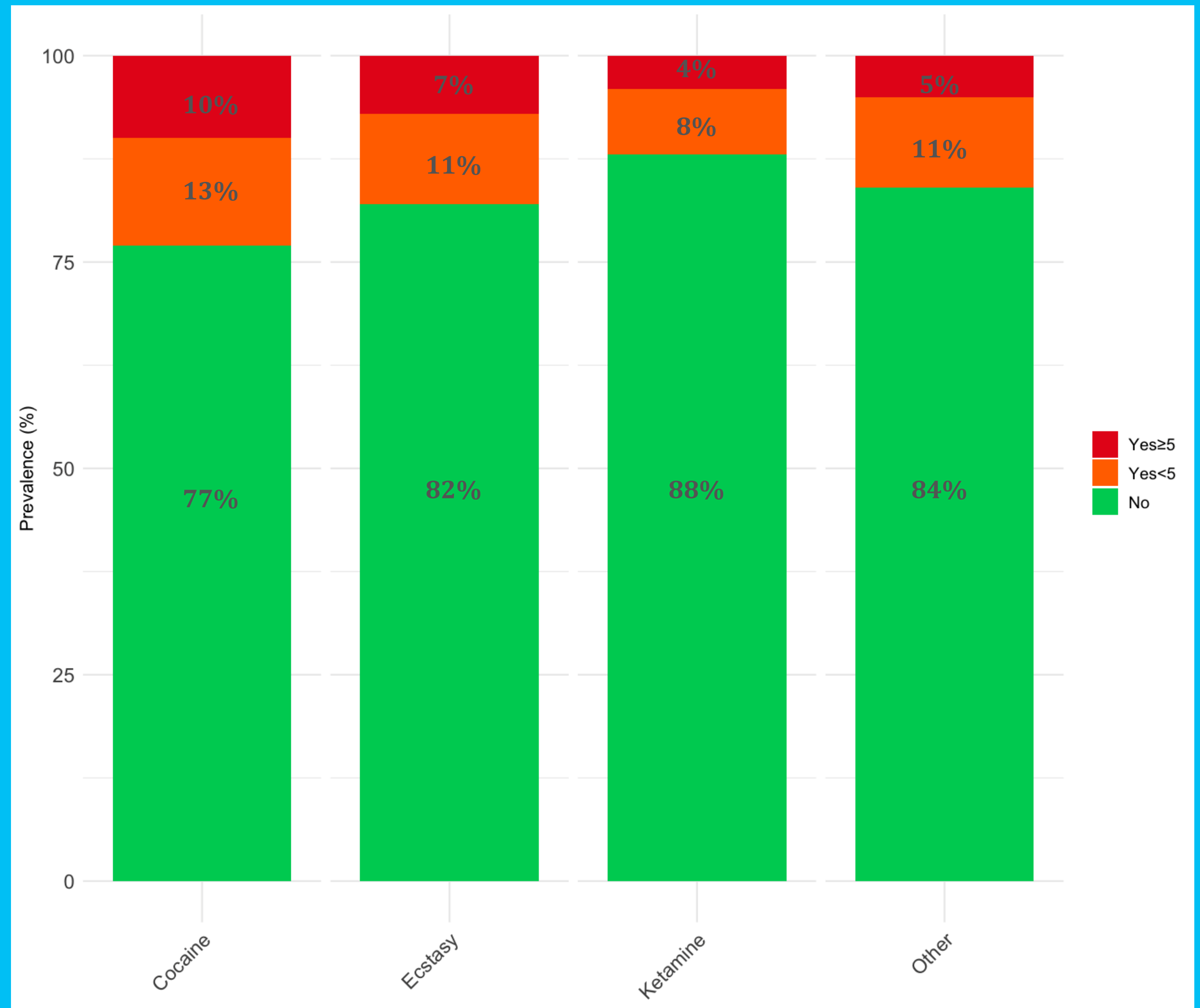
# RESULTS: PREVALENCE

E-cigarette, tobacco  
& cannabis use at 20  
years old



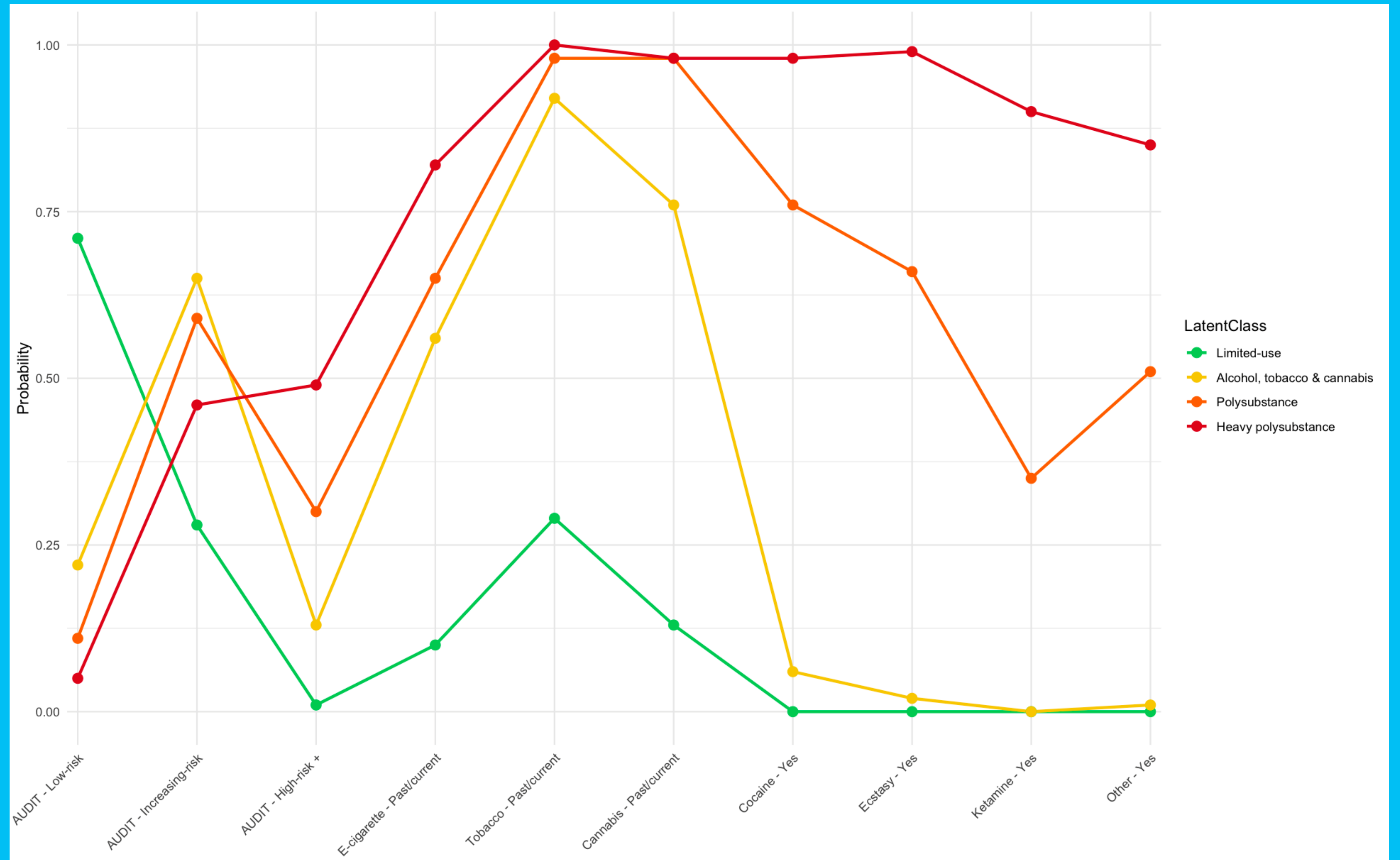
# RESULTS: PREVALENCE

Cocaine, ecstasy,  
ketamine and other  
drug use at 20 years  
old



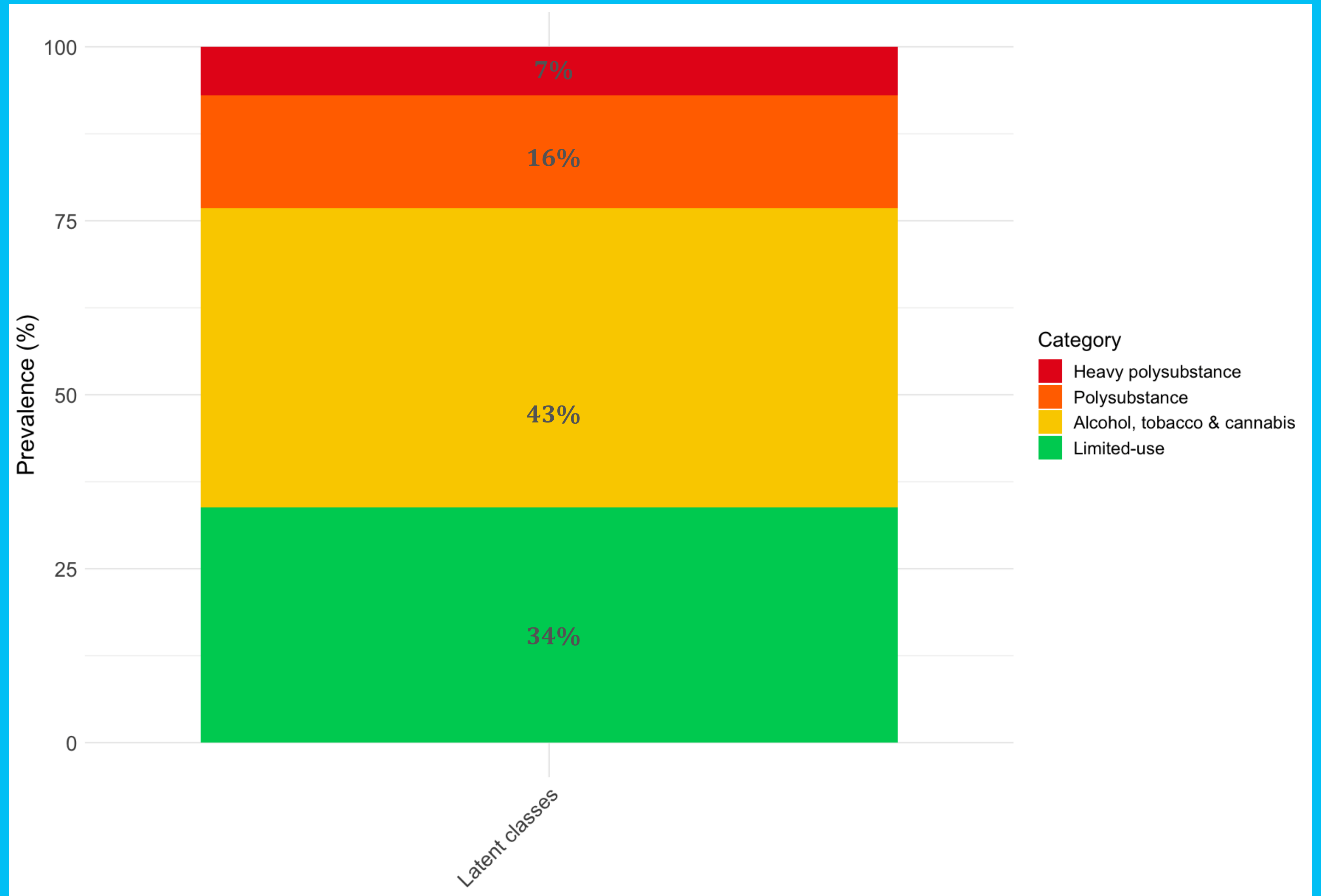
# RESULTS: TREND GRAPH

Latent classes of  
substance use at  
20 years old



# RESULTS: PREVALENCE

Latent classes of  
substance use at  
20 years old



# RESULTS: INDIVIDUAL FACTORS

	Alcohol, tobacco, cannabis Vs Limited-use (ref)	Polysubstance Vs Limited-use (ref)	Heavy polysubstance Vs Limited-use (ref)
<i>Individual</i>	<b>aOR (95% CI)</b>		
<b>Age at outcome</b> (per year older)	1.23 (0.75–2.04)	1.21 (0.64–2.29)	1.55 (0.81–2.95)
<b>Sex</b>			
Female	Ref	Ref	Ref
Male	1.30 (0.95–1.80)	1.63 (1.13–2.35)	2.65 (1.68–4.18)
<b>Age at first alcoholic drink</b>			
≤14	Ref	Ref	Ref
15	1.35 (0.74–2.46)	0.95 (0.52–1.74)	0.72 (0.37–1.40)
16	0.53 (0.33–0.83)	0.26 (0.16–0.42)	0.11 (0.06–0.20)
17	0.29 (0.18–0.47)	0.09 (0.05–0.16)	0.04 (0.02–0.09)
≥18/no alcohol	0.03 (0.01–0.09)	0.01 (0.00–0.05)	0.00 (0.00–2.49)
<b>SDQ conduct</b>			
Normal	Ref	Ref	Ref
Borderline	0.98 (0.63–1.51)	1.20 (0.70–2.04)	1.23 (0.66–2.28)
Abnormal	0.88 (0.49–1.61)	0.81 (0.41–1.60)	1.24 (0.58–2.62)
<b>SDQ hyperactivity</b>			
Normal	Ref	Ref	Ref
Borderline	0.91 (0.52–1.59)	0.70 (0.37–1.31)	0.61 (0.28–1.32)
Abnormal	1.47 (0.89–2.42)	1.19 (0.66–2.15)	1.31 (0.69–2.49)
<b>SDQ emotional</b>			
Normal	Ref	Ref	Ref
Borderline	0.66 (0.44–1.01)	0.66 (0.39–1.14)	0.51 (0.29–0.99)
Abnormal	0.84 (0.57–1.24)	0.76 (0.47–1.22)	0.62 (0.32–1.19)
<b>SDQ peer problems</b>			
Normal	Ref	Ref	Ref
Borderline	0.65 (0.42–1.01)	0.59 (0.34–0.99)	0.64 (0.33–1.23)
Abnormal	0.59 (0.39–0.88)	0.51 (0.31–0.86)	0.34 (0.17–0.68)

# RESULTS: INDIVIDUAL FACTORS



<i>Individual</i>	<b>Alcohol, tobacco, cannabis Vs Limited-use (ref)</b>	<b>Polysubstance Vs Limited-use (ref)</b>	<b>Heavy polysubstance Vs Limited-use (ref)</b>
	<b>aOR (95% CI)</b>		
<b>Age at outcome</b> (per year older)	1.23 (0.75–2.04)	1.21 (0.64–2.29)	1.55 (0.81–2.95)
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# RESULTS: FAMILY FACTORS

	Alcohol, tobacco, cannabis Vs Limited-use (ref)	Polysubstance Vs Limited-use (ref)	Heavy polysubstance Vs Limited-use (ref)
<i>Family</i>	aOR (95% CI)		
<b>Household social class</b>			
Professional	Ref	Ref	Ref
Managerial & technical	0.97 (0.63–1.50)	0.83 (0.50–1.38)	1.29 (0.67–2.50)
Non-manual	1.24 (0.74–2.09)	1.16 (0.62–2.16)	2.05 (0.92–4.53)
Manual	1.47 (0.87–2.49)	0.87 (0.46–1.64)	1.58 (0.70–3.58)
Other	1.27 (0.52–3.14)	1.04 (0.39–2.72)	2.33 (0.69–7.86)
<b>Parental education</b>			
3rd level degree	Ref	Ref	Ref
3rd level non-degree	0.61 (0.41–0.91)	0.78 (0.49–1.24)	0.50 (0.28–0.89)
High secondary &/ Tech/Voc	0.60 (0.41–0.88)	0.70 (0.44–1.11)	0.39 (0.22–0.69)
Low secondary	0.41 (0.22–0.76)	0.74 (0.37–1.49)	0.20 (0.08–0.52)
<b>Household structure</b>			
Two-parent	Ref	Ref	Ref
One-parent	0.94 (0.55–1.60)	1.35 (0.77–2.39)	0.86 (0.43–1.71)
<b>Familial AUD/drug-use</b>			
Not reported	Ref	Ref	Ref
Yes	2.15 (1.19–3.89)	2.45 (1.26–4.74)	3.79 (1.89–7.62)

# RESULTS: FAMILY FACTORS

<i>Family</i>	<b>Alcohol, tobacco, cannabis Vs Limited-use (ref)</b>	<b>Polysubstance Vs Limited-use (ref)</b>	<b>Heavy polysubstance Vs Limited-use (ref)</b>
	<b>aOR (95% CI)</b>		
<b>Household social class</b>			
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# RESULTS: SOCIO-ENVIRONMENTAL FACTORS

	Alcohol, tobacco, cannabis Vs Limited-use (ref)	Polysubstance Vs Limited-use (ref)	Heavy polysubstance Vs Limited-use (ref)
<i>Social</i>	<b>aOR (95% CI)</b>		
<b>Peer cannabis use</b>			
No	Ref	Ref	Ref
Yes	3.14 (2.29–4.32)	6.67 (4.51–9.86)	13.50 (6.25–29.18)
<i>Environmental</i>			
<b>Neighbourhood substance use</b>			
Not common	Ref	Ref	Ref
Common	0.75 (0.44–1.25)	0.81 (0.45–1.43)	0.67 (0.28–1.58)
<b>Non-parental address at age 20</b>			
No	Ref	Ref	Ref
Yes	1.75 (1.26–2.45)	1.94 (1.30–2.91)	2.32 (1.40–3.84)
<b>Household region at age 20</b>			
Outside Dublin	Ref	Ref	Ref
Dublin	1.03 (0.71–1.50)	1.31 (0.85–2.02)	1.94 (1.14–3.33)

# RESULTS: SOCIO-ENVIRONMENTAL FACTORS

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<b>aOR (95% CI)</b>			
<b>Peer cannabis use</b>			
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<b>Household region at age 20</b>			
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# RESULTS: PEER CANNABIS USE IN MORE DETAIL

Unweighted and weighted descriptive statistics for peer cannabis use at 17 years old and its association with latent class membership at 20 years old estimated using weighted multivariable\* logistic regression models (N=4644)

	Unweighted	Weighted	Alcohol, tobacco, cannabis Vs. Limited use (ref)	Polysubstance Vs. Limited use (ref)	Heavy polysubstance Vs. Limited use (ref)
	N (%)		aOR (95% CI)		
<b>Peer cannabis use</b>					
None	1956 (42.12)	2030 (43.70)	Ref	Ref	Ref
A few	1381 (29.74)	1298 (27.94)	2.37 (1.69–3.33)	4.28 (2.80–6.54)	6.11 (2.64–14.12)
Some	792 (17.05)	753 (16.22)	4.50 (2.55–8.28)	8.64 (4.82–15.48)	15.92 (6.26–40.51)
Most/All**	515 (11.09)	564 (12.14)	9.45 (3.01–29.66)	35.01 (11.69–104.88)	105.29 (27.79–398.92)

## FOOTNOTE

ATC = alcohol, tobacco and cannabis.

\*Multivariable models were adjusted for all the same factors as in the main paper

\*\*"Most" and "All" categories were collapsed due to issues with implausible odds ratios that were felt likely to reflect small N in "All" category old (Wave 3). Only 87 (1.87%, unweighted) / 102 (2.20%, weighted) reported that "All" their friends used cannabis at 17 years old

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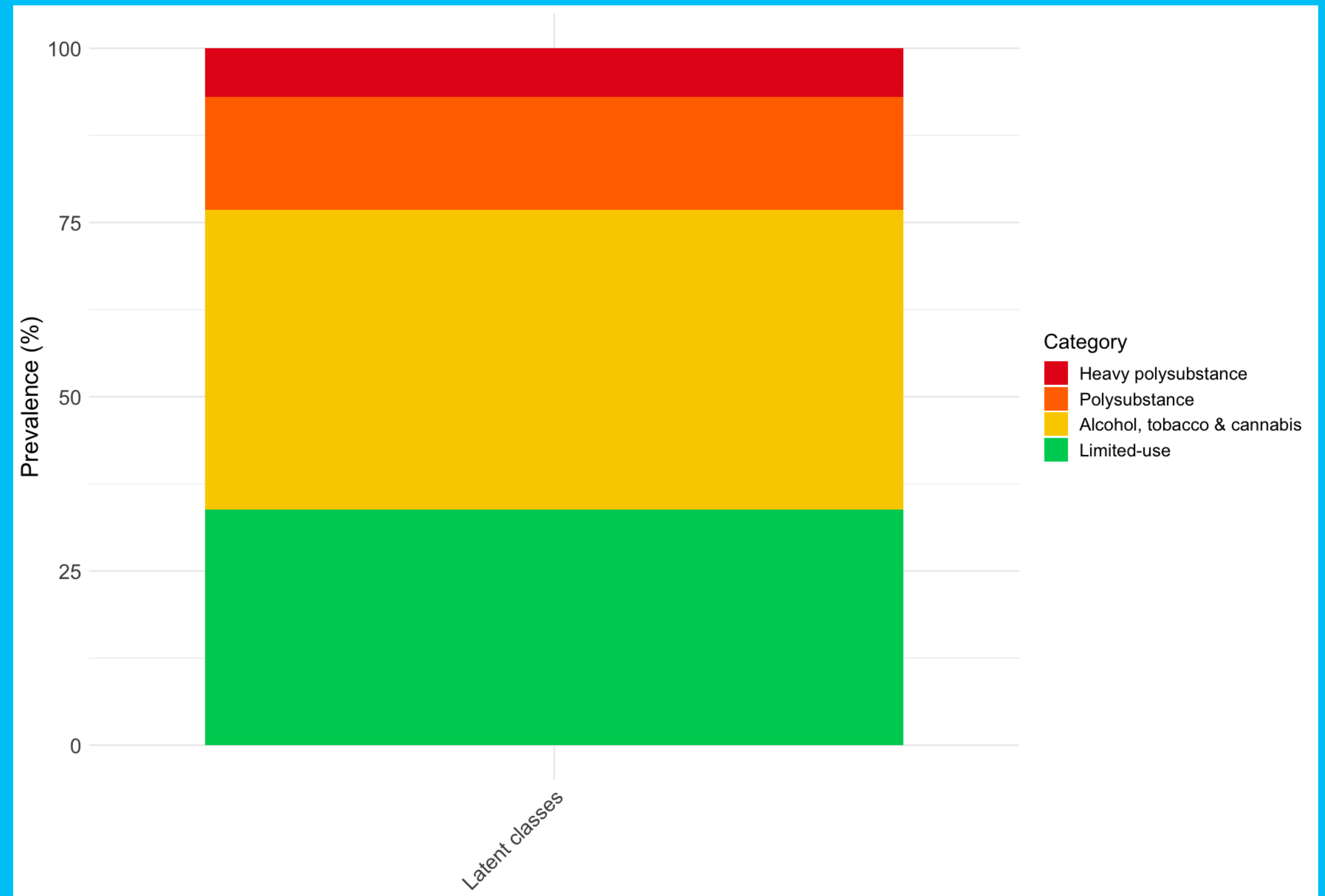
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# DISCUSSION

We estimate that nearly a quarter of 20-year-olds in Ireland are polysubstance users

Higher than international estimates (although varied methods used)

Strong associations with early alcohol use, peer cannabis use and familial substance use.





# STRENGTHS

- Policy-relevant research gap
- Use of LCA to identify distinct groups of substance users
- Identification of longitudinal predictors
- Large, nationally representative sample

# LIMITATIONS

- Inter-wave attrition - adjusted for using provided survey weights



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# POLICY IMPLICATIONS

Estimated scale and pattern of polysubstance use at 20 years old highlights the need for action

Individual, family & socio-environmental predictors guide potential interventions in childhood and early adolescent years



# ACKNOWLEDGEMENTS

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Thanks to all my co-authors



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