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# EVP's Impact on US Adult cigarette prevalence: Insights from Machine Learning Analysis

Serafino Teseo, Thomas Verron, Xavier  
Cahours, Thomas Nahde

# Report about NHIS survey tobacco-related results

Summer 2023:

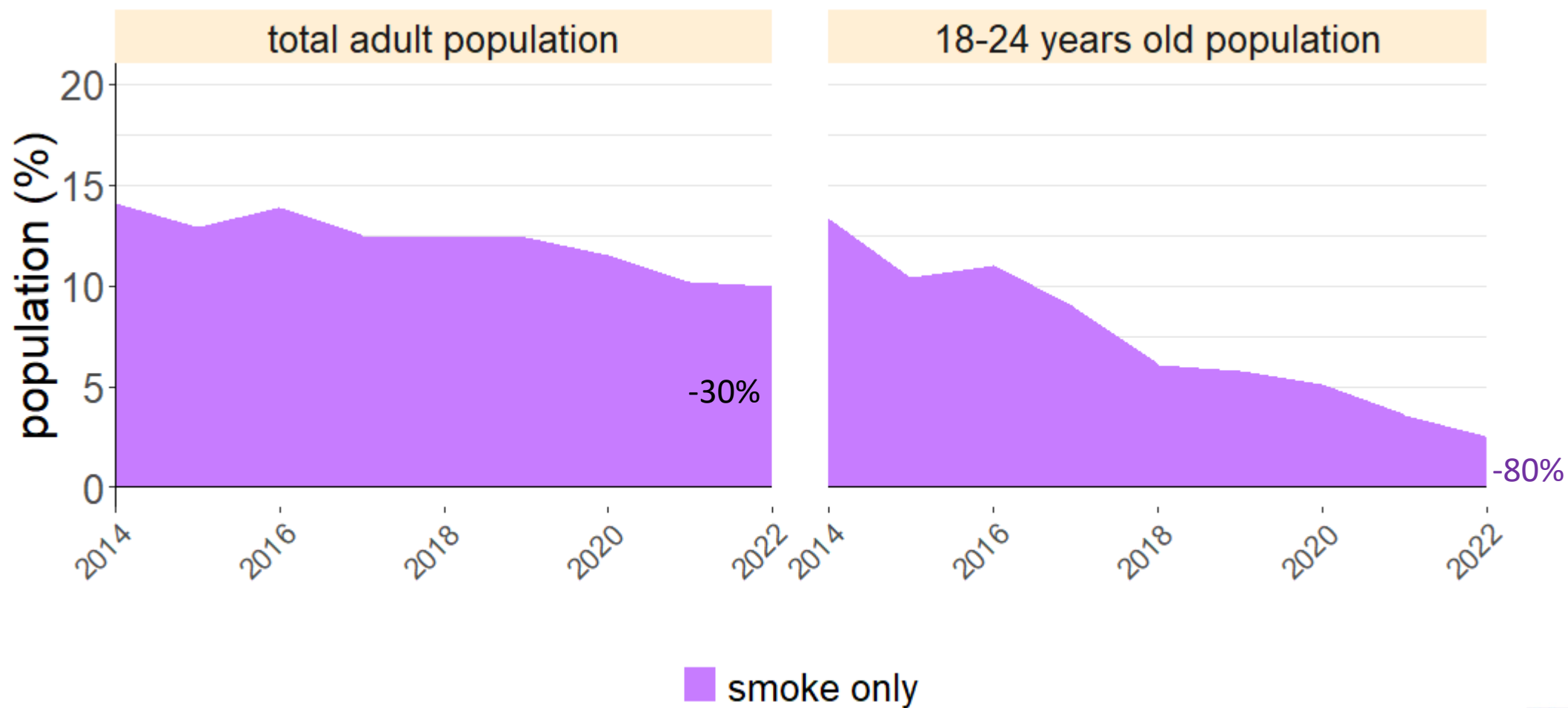
CDC Full Dataset Released: Encouraging Re US  
Total Nicotine Sustainability



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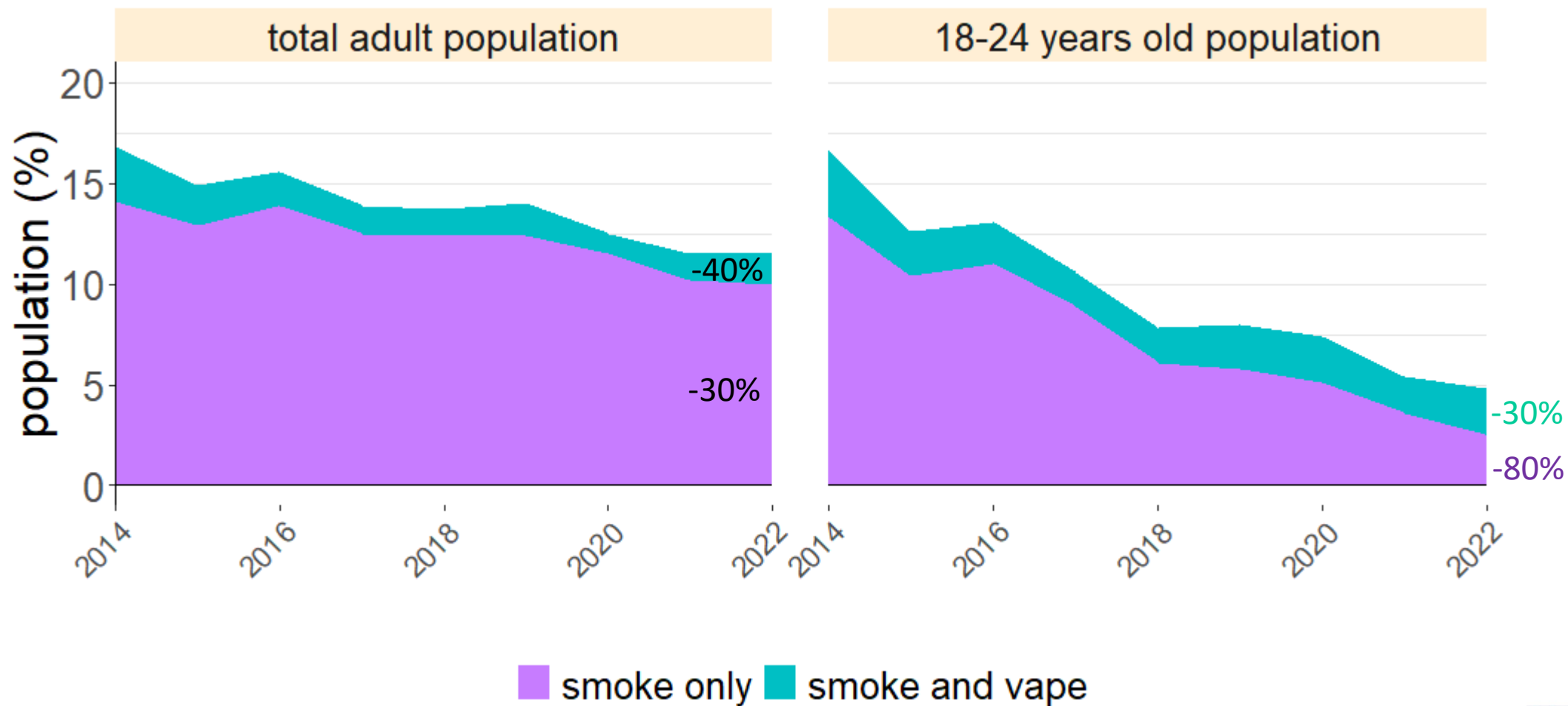
# Smoking-only prevalence has declined over time, especially among young adults



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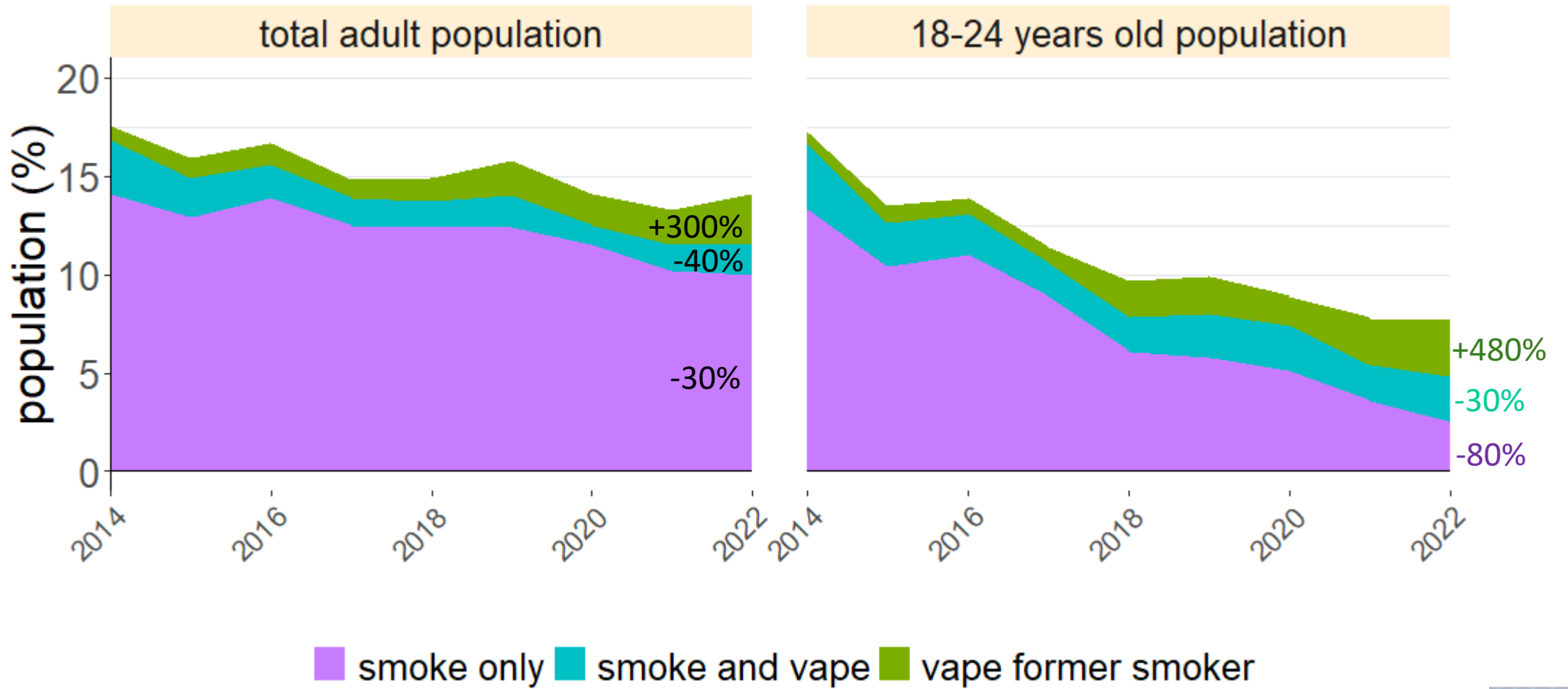
# Dual prevalence has also declined over time



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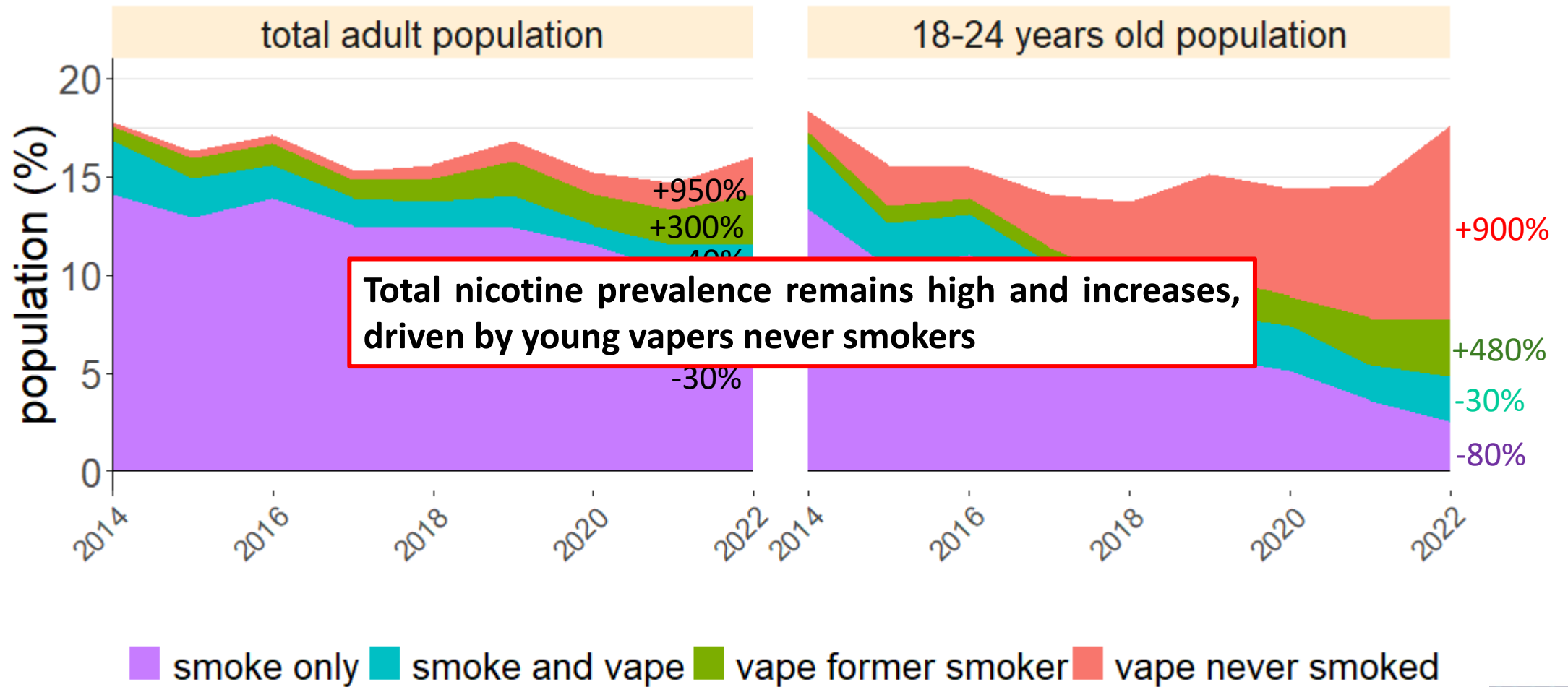
# Vapers former smokers: 3- to 5-fold increase



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# Vaping among never smokers: > 9-fold increase



## Beyond study conclusions: Harm Reduction insights

### Open questions:

- Do US nicotine prevalence changes depend on EVP introduction?
- What are the effects of EVP introduction?

### Objective:

- Determine EVP effects on US nicotine prevalence using time series forecasting



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# Time series forecasting

- Time series: a series of data points indexed in time order
- Time series forecasting: using models to predict future values based on past values
- Facebook Prophet: explicitly models data as a combination of cycles including seasonal changes, trends etc.
- **We collected pre-2013 data and integrated with current data**
- **Based on these data, we simulated smoking prevalence in a hypothetical scenario where EVPs have never been introduced**



Prophet

<https://facebook.github.io/prophet/>

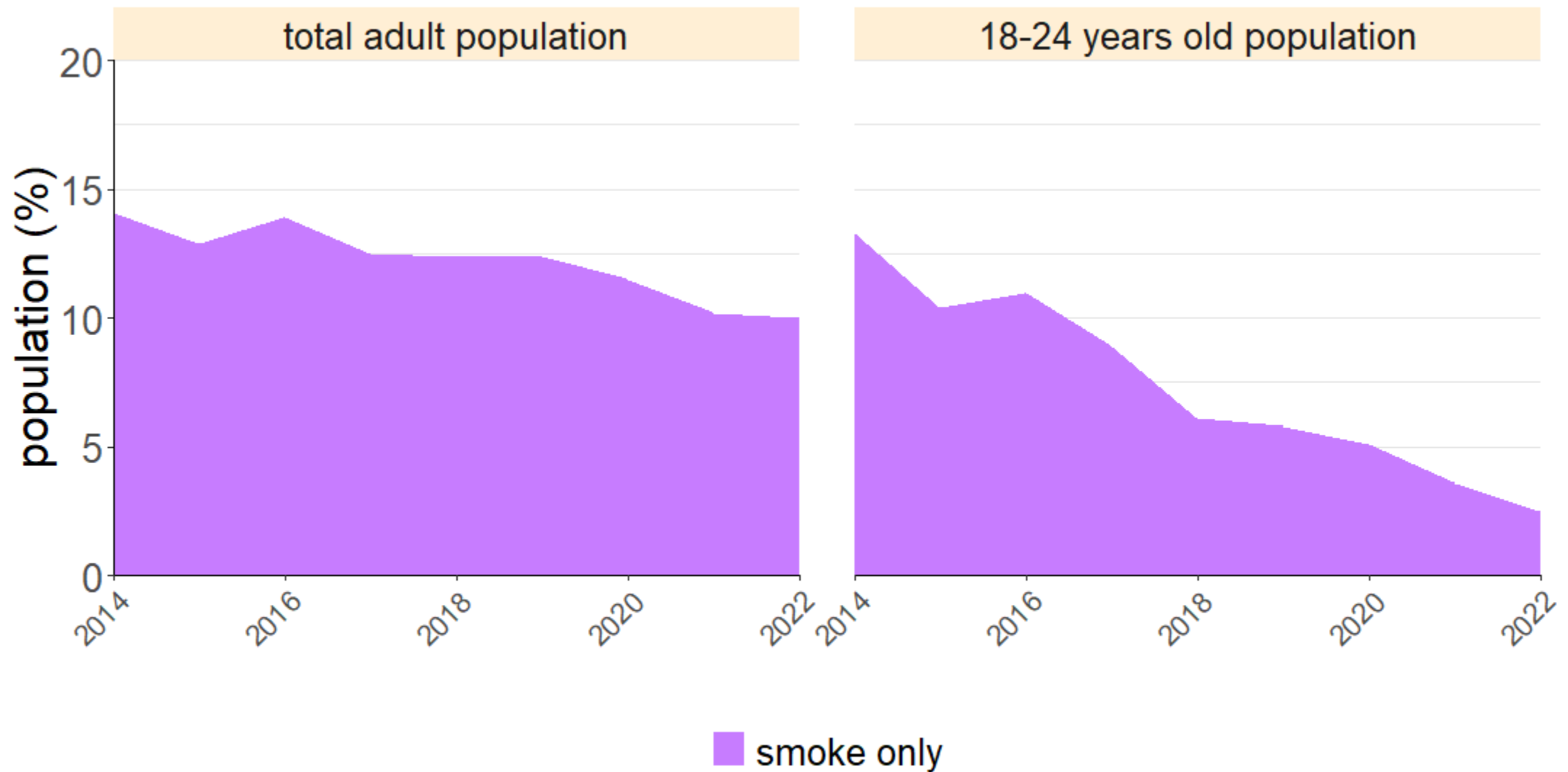


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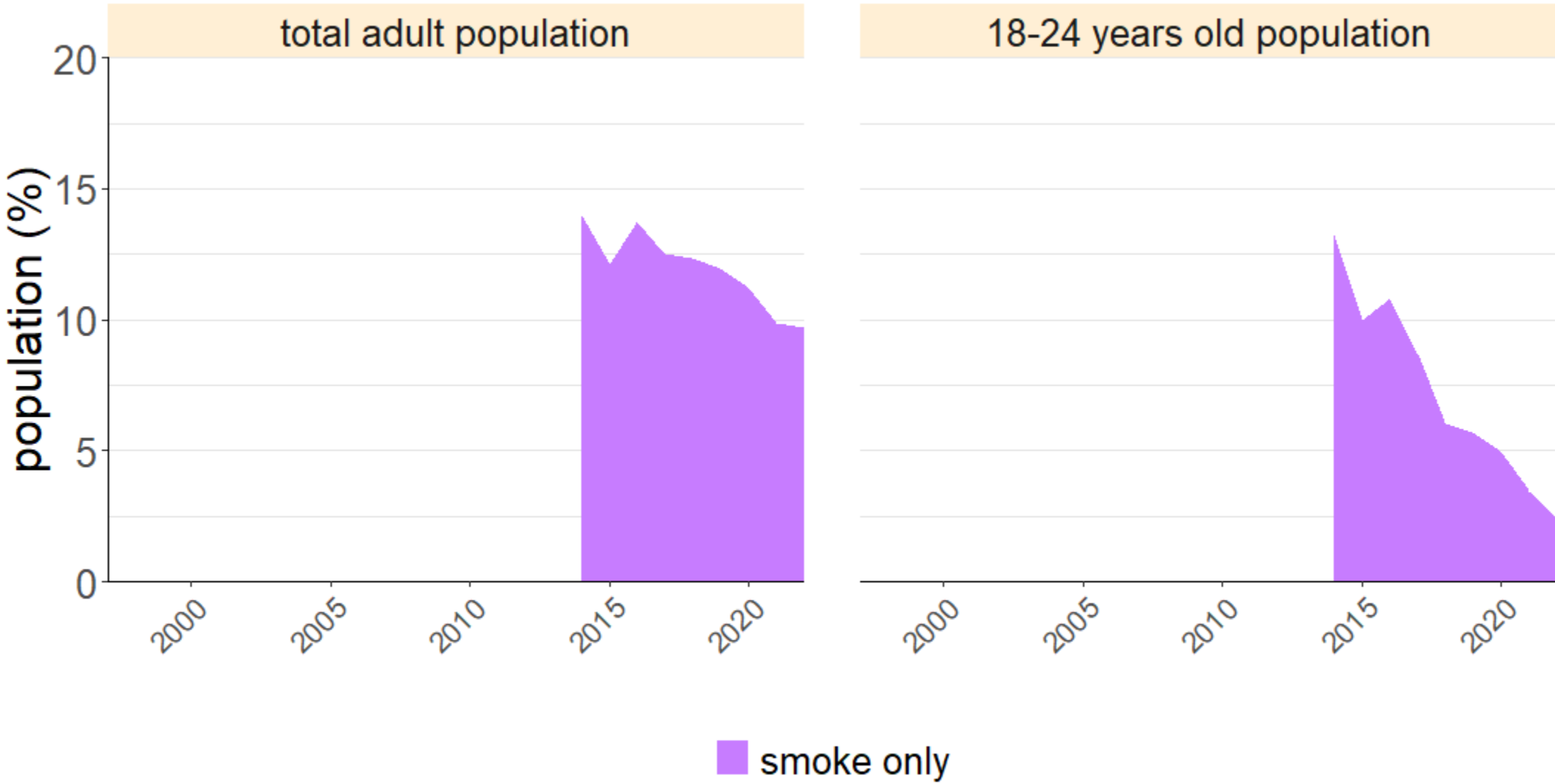
# Reproducing NHIS smoking prevalence results



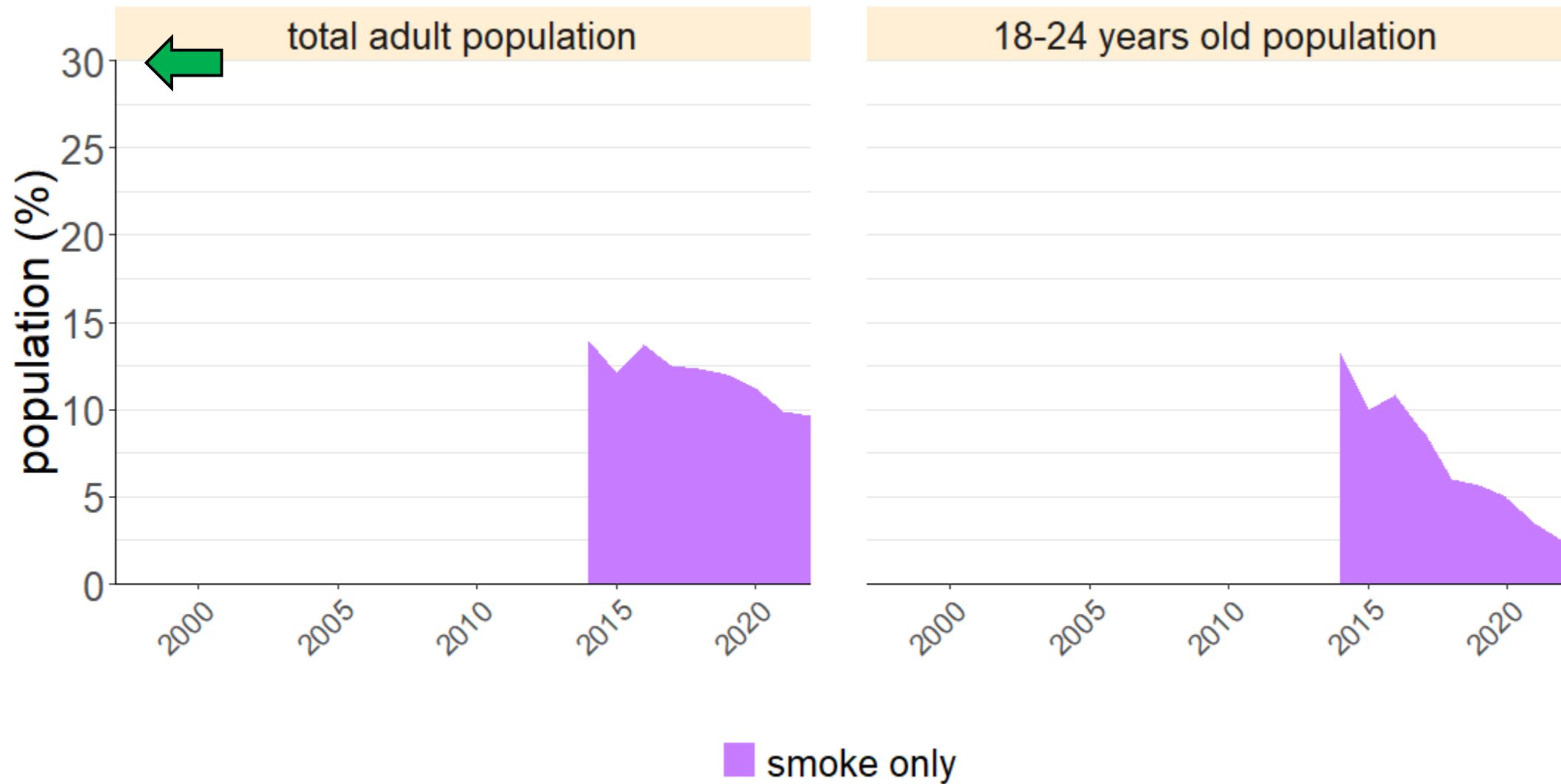
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# Scaling NHIS smoking prevalence results



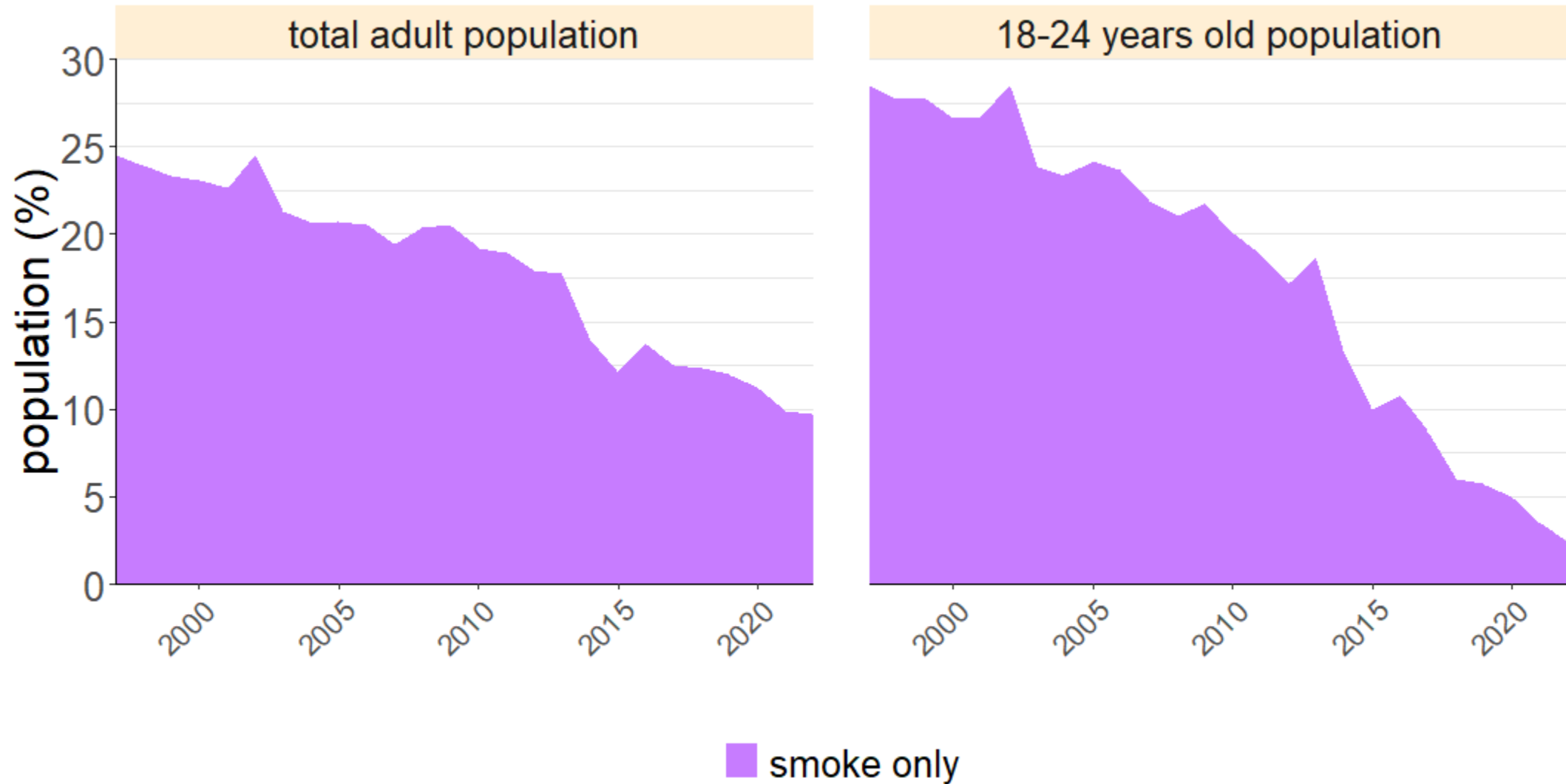
# Scaling NHIS smoking prevalence results



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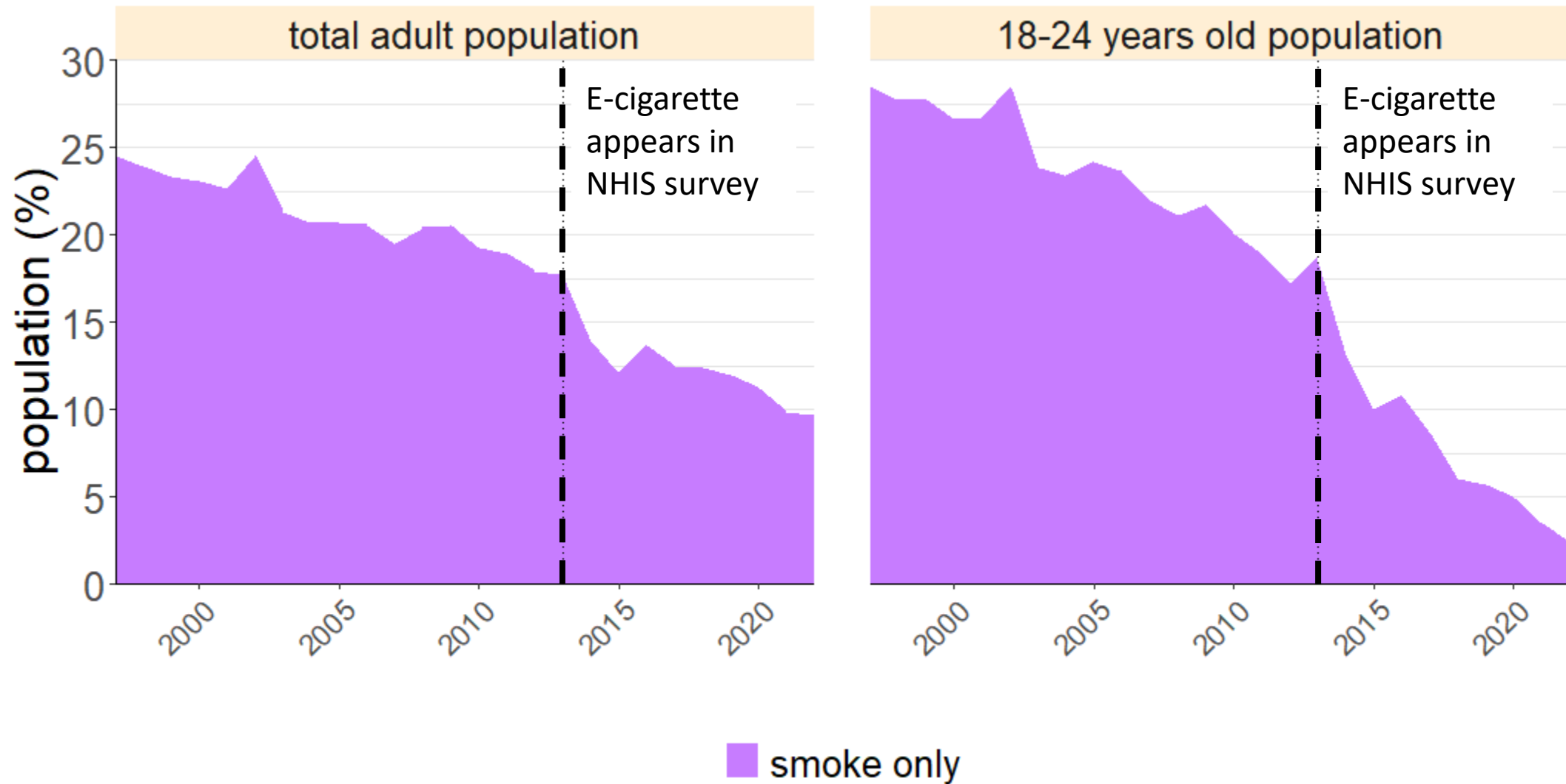
# Extending time window from 8 to 25 years



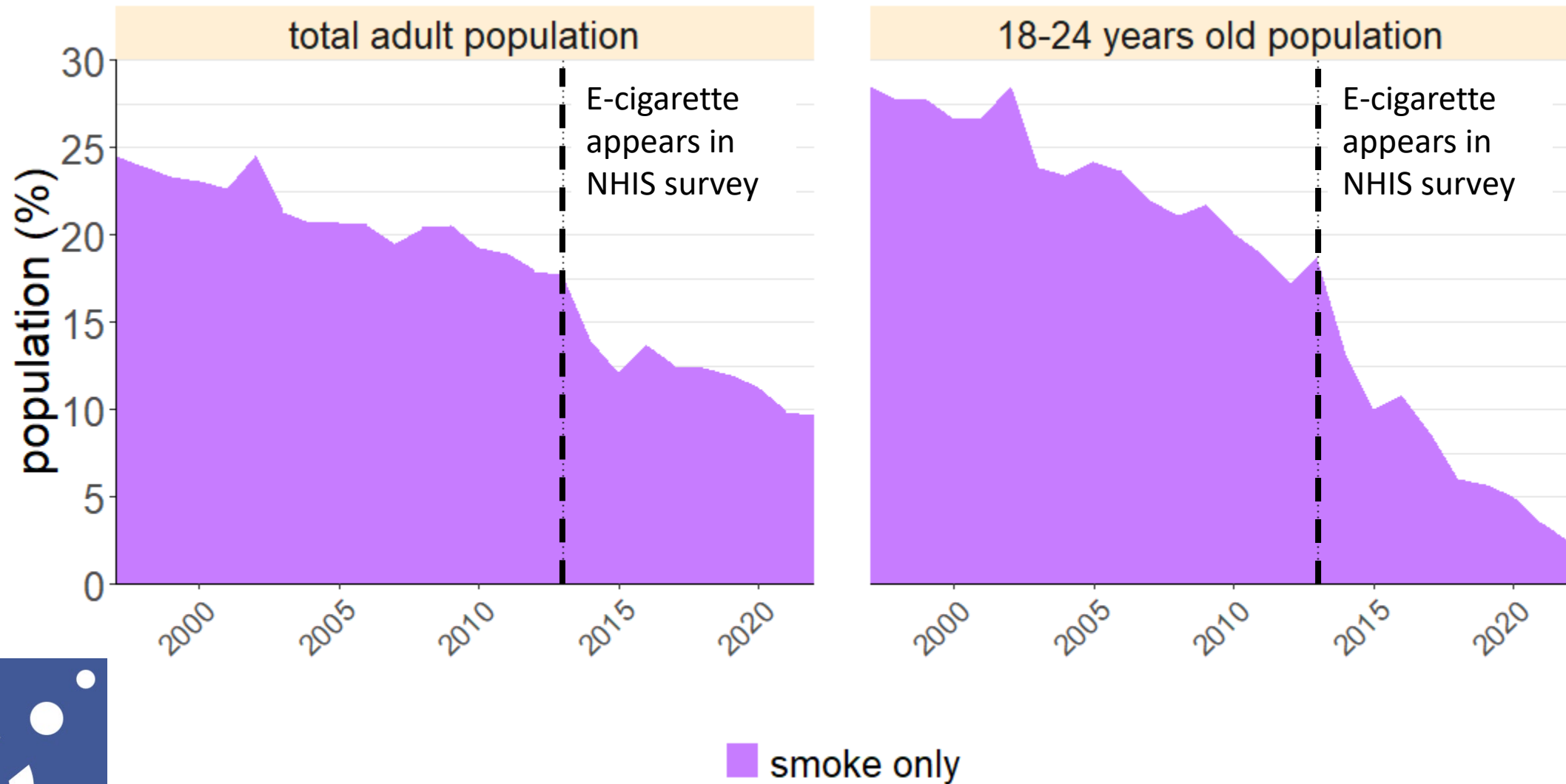
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# Separating pre- and post-EVP eras



# Separating pre- and post-EVP eras



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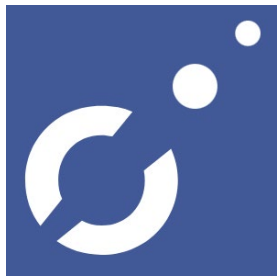
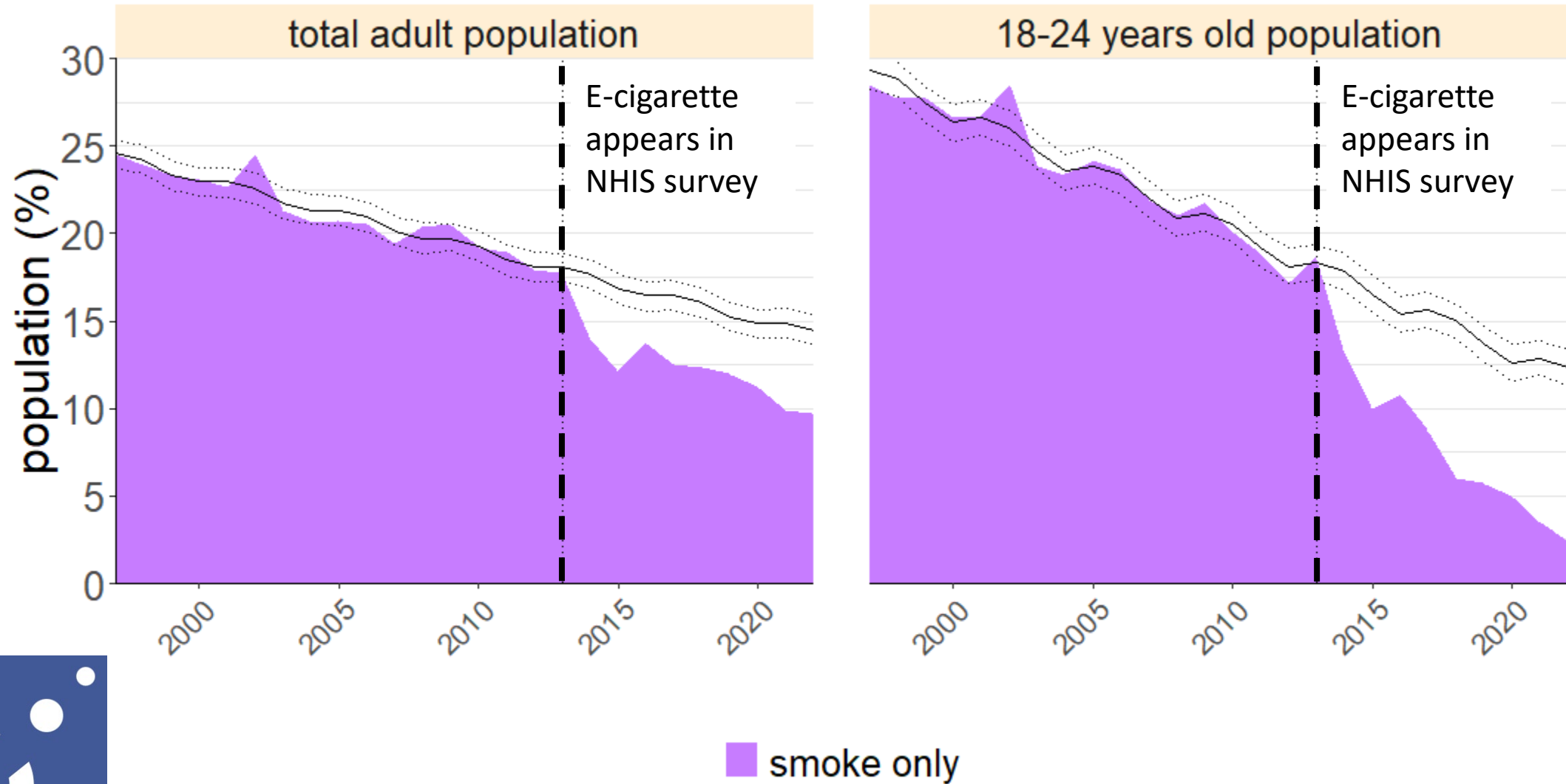
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# Simulating smoking prevalence without EVPs



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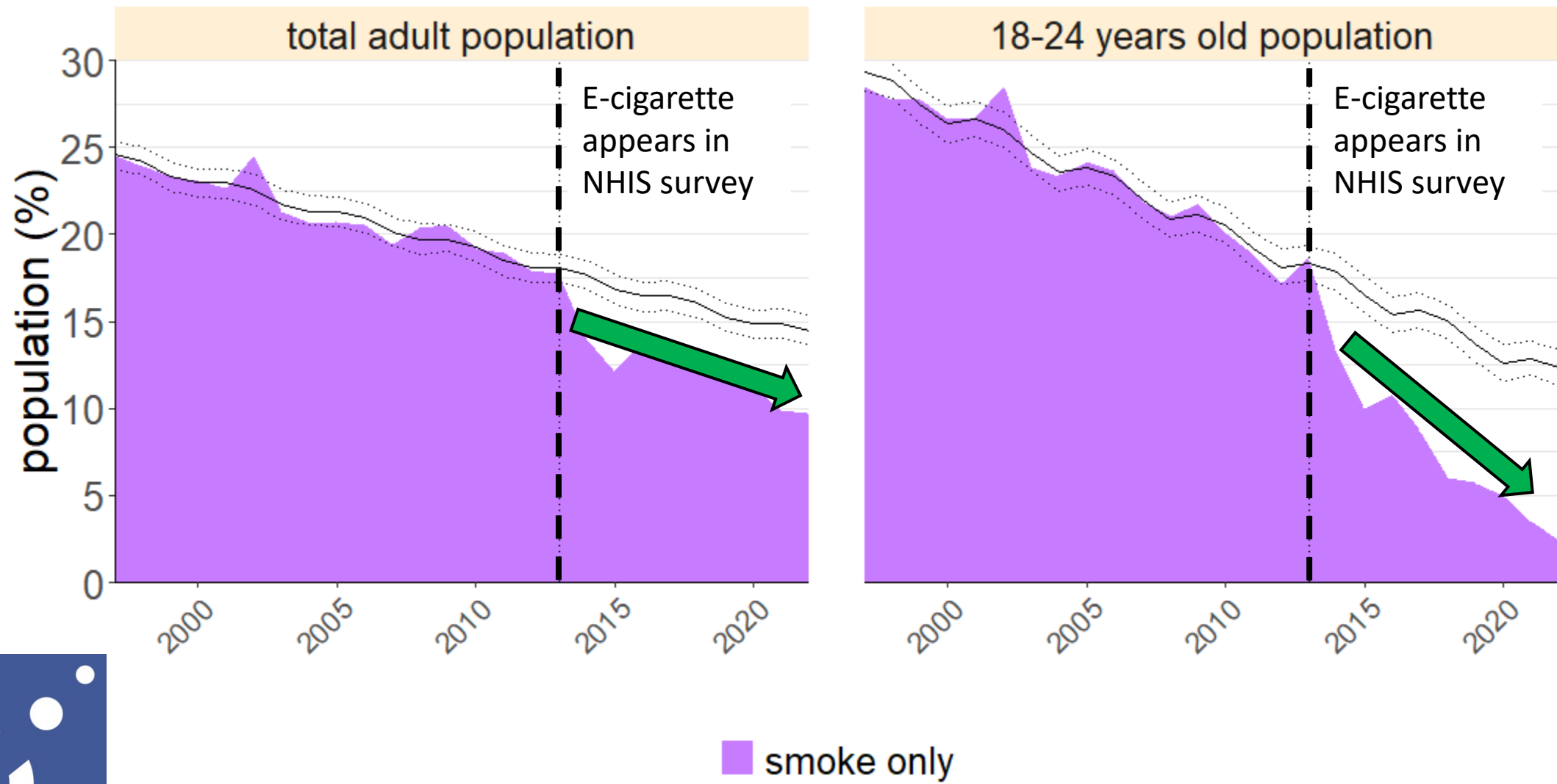
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# Possible EVP effects on TOTAL nicotine prevalence: Scenario 1

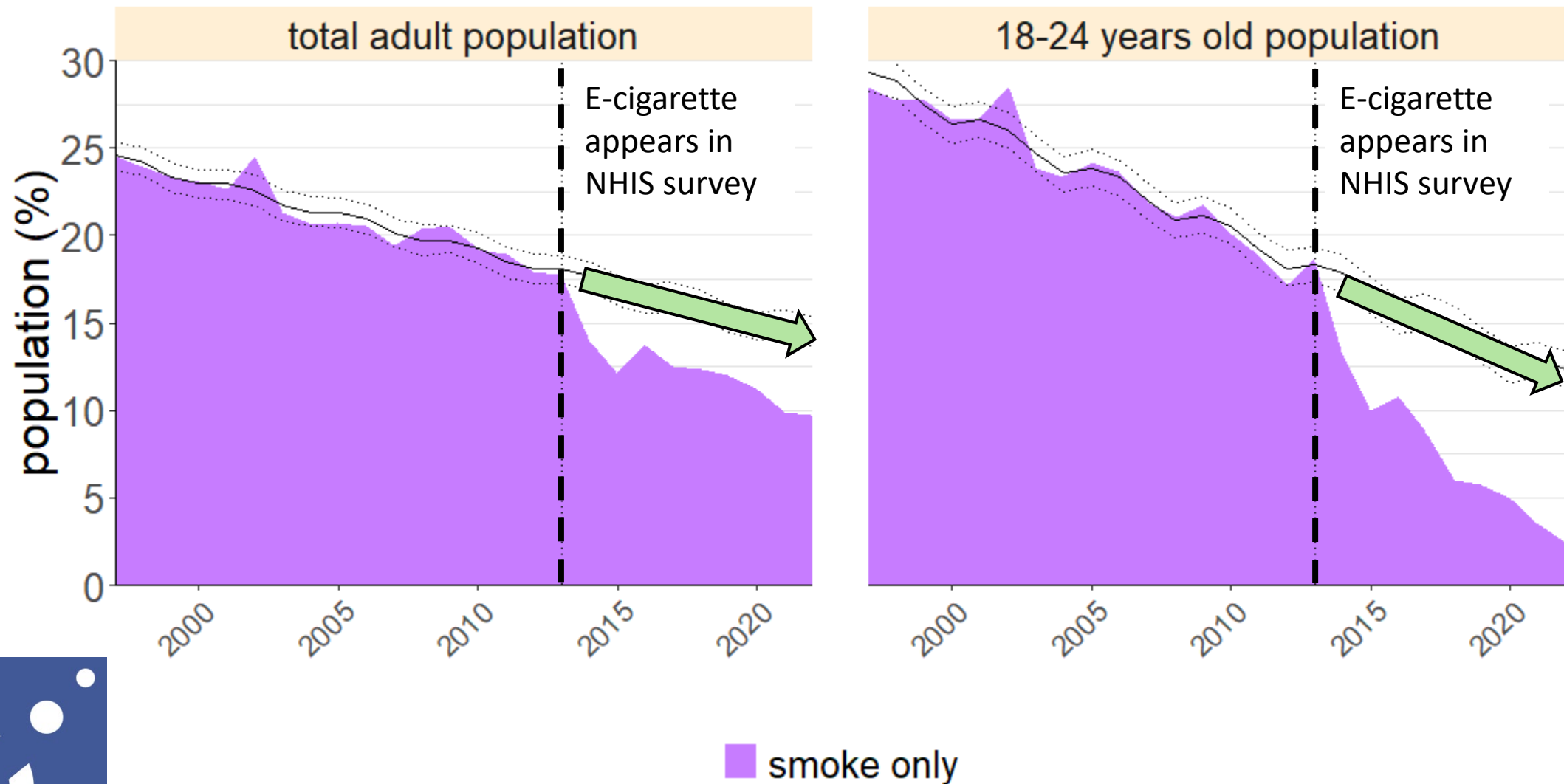


<https://facebook.github.io/prophet/>





# Possible EVP effects on TOTAL nicotine prevalence: Scenario 2



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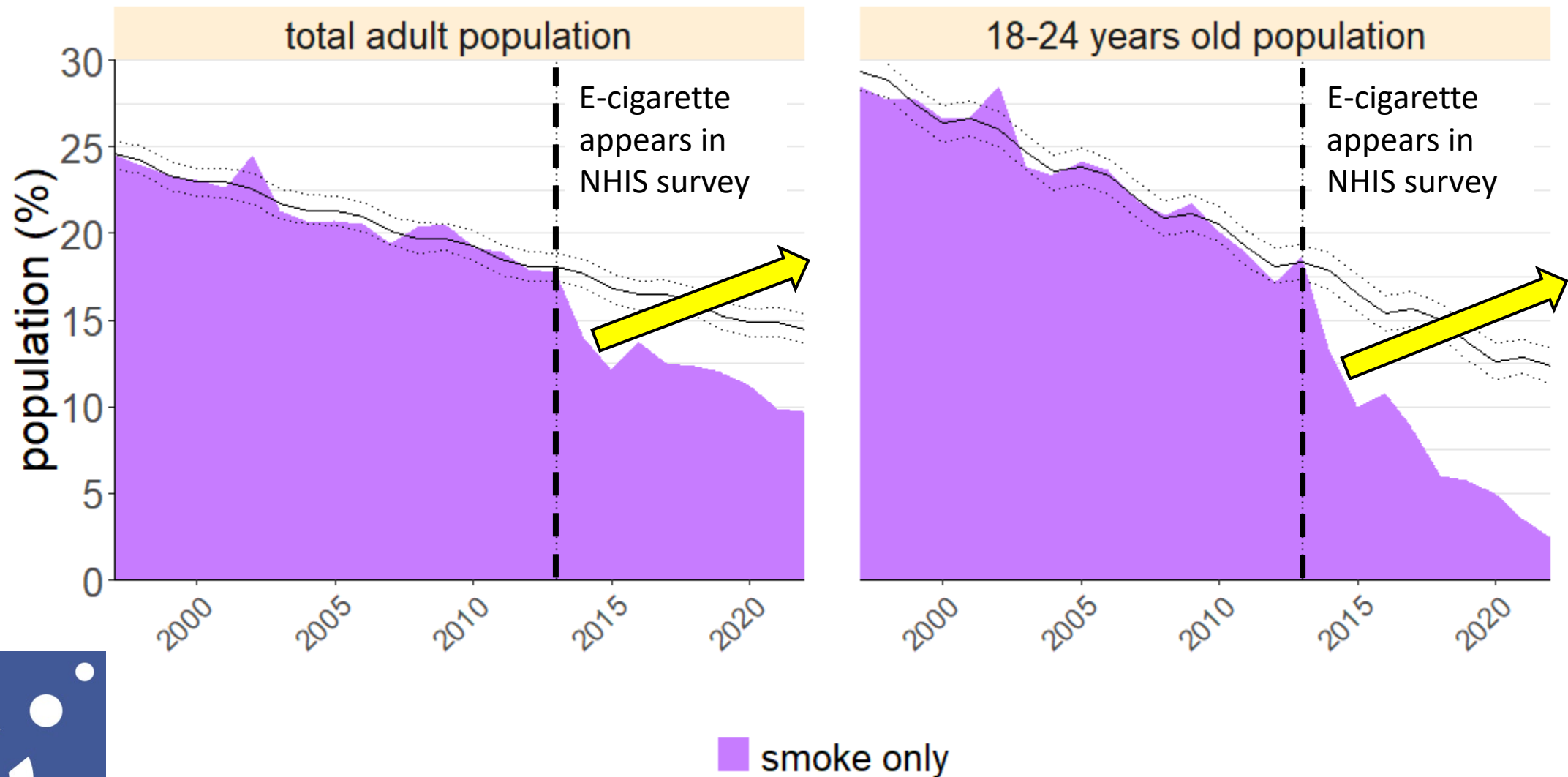
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# Possible EVP effects on TOTAL nicotine prevalence: Scenario 3



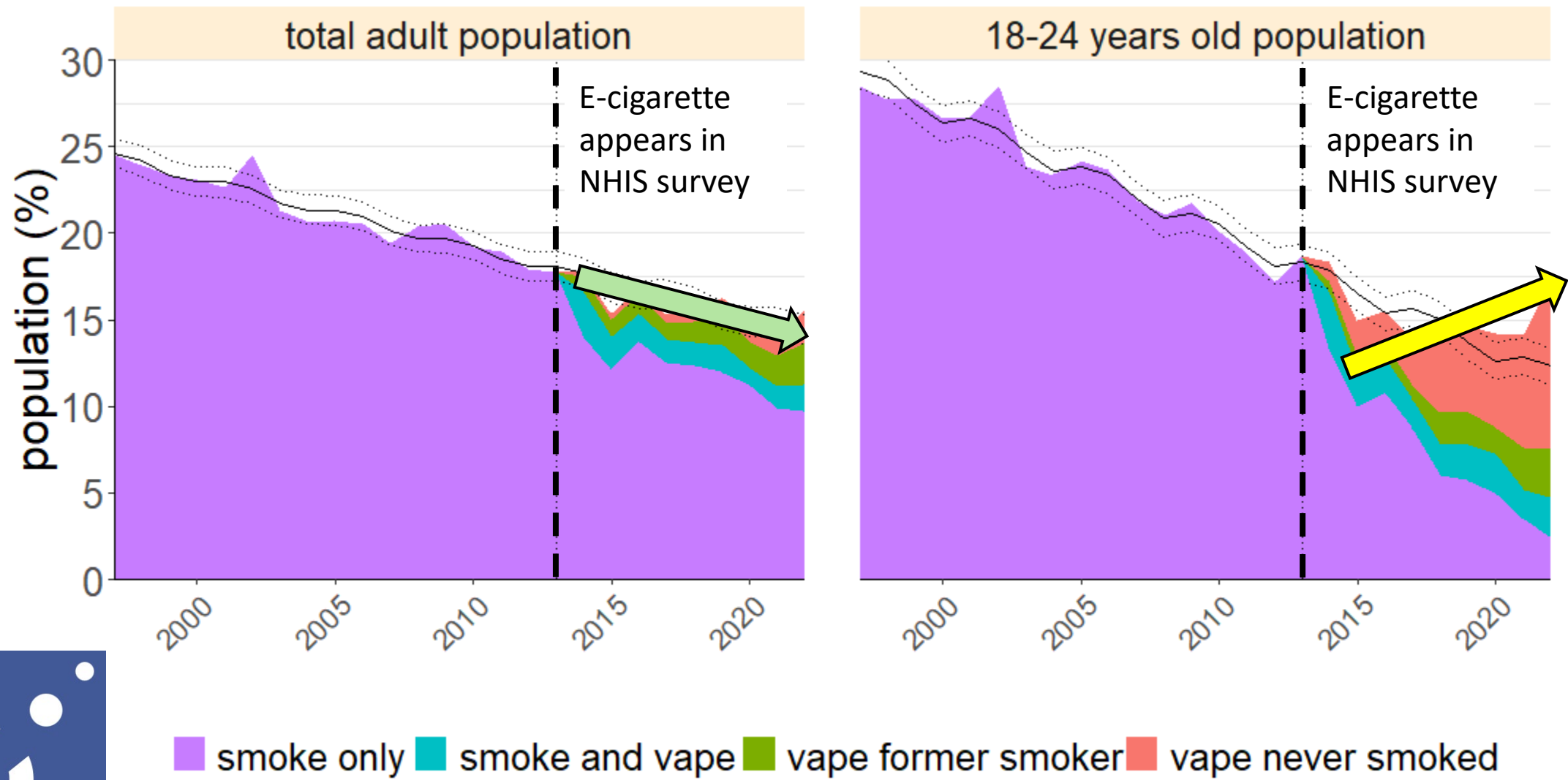
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# Possible EVP effects on TOTAL nicotine prevalence

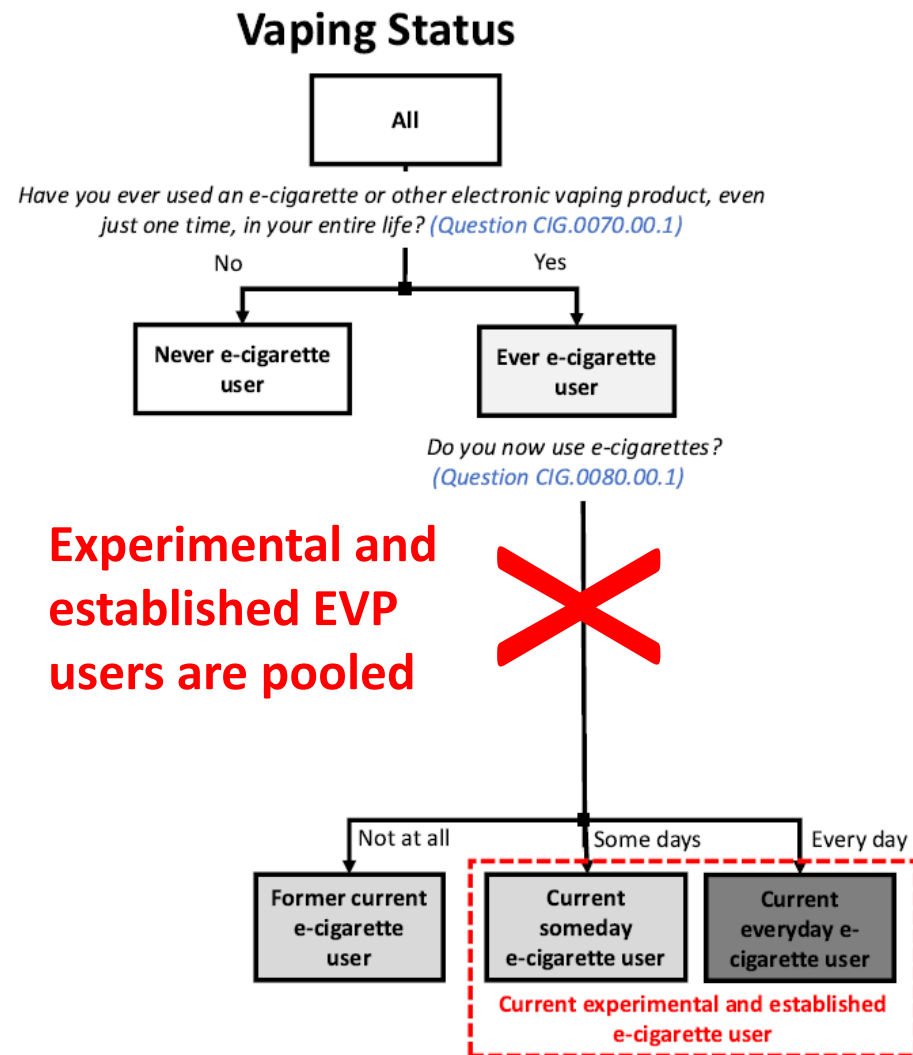
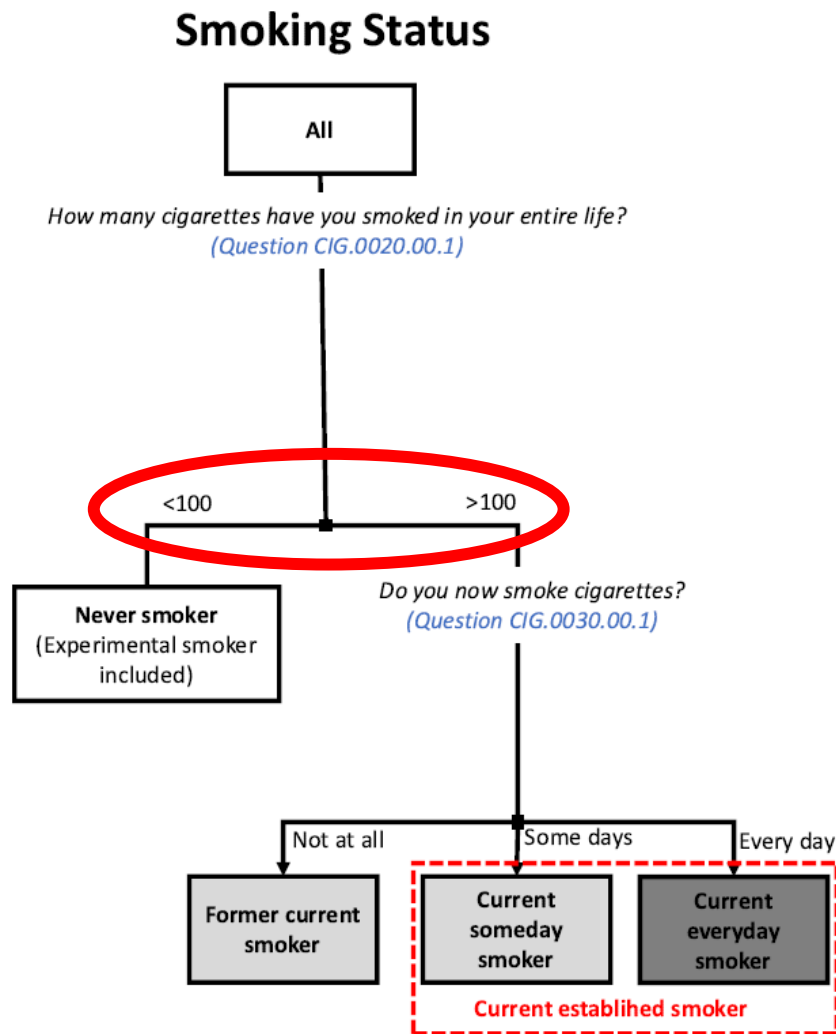


<https://facebook.github.io/prophet/>

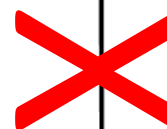


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# Smoker and EVP user definitions are mismatched

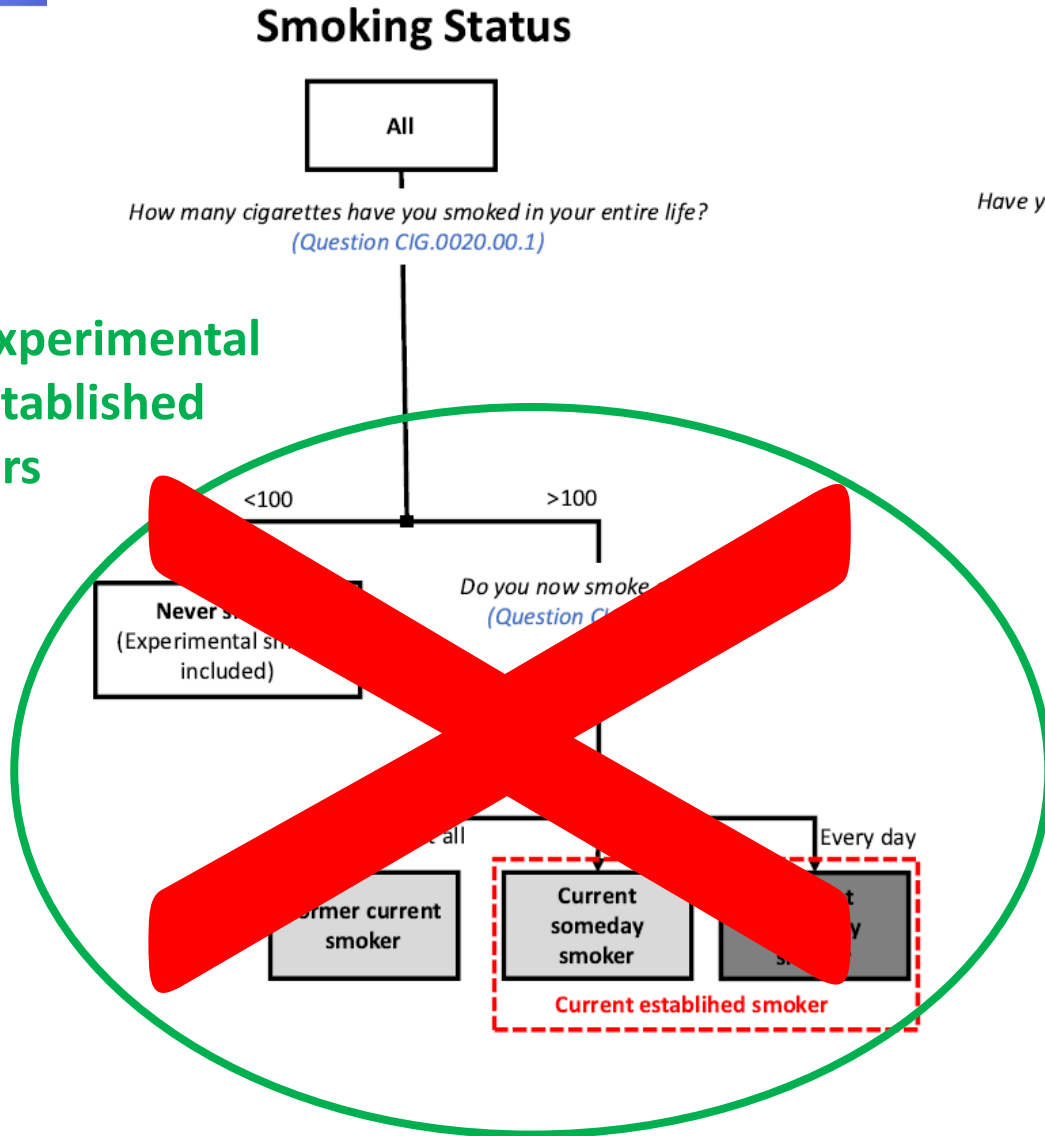


Experimental and established EVP users are pooled

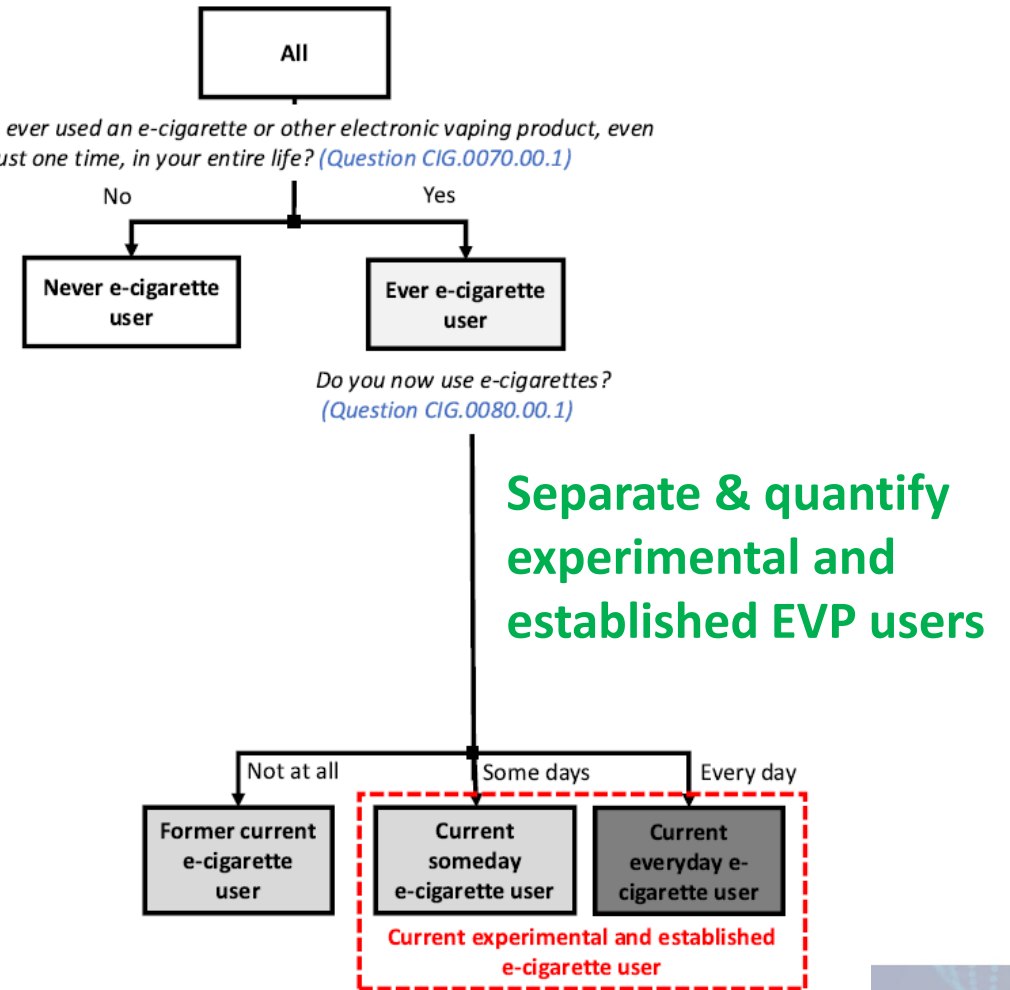


# Possible intervention to correct our analysis

Pool experimental and established smokers



## Vaping Status



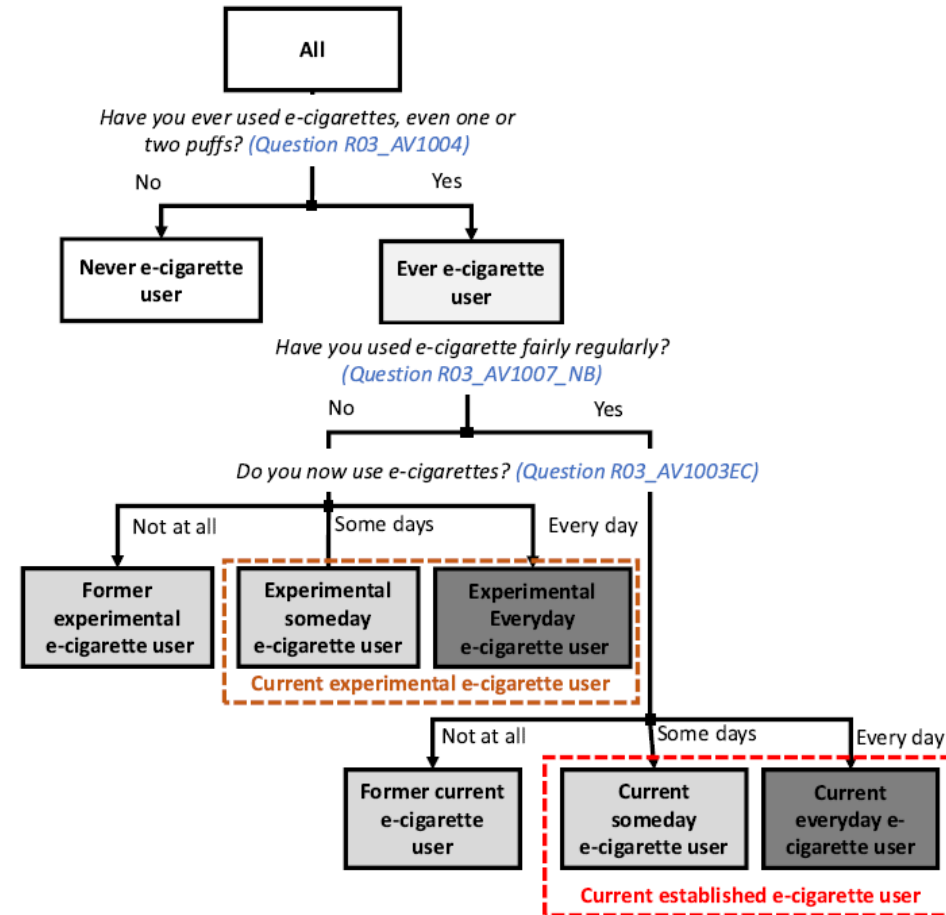
# Extrapolating established EVP user frequencies



Replenishment sample  
(wave 4 (2017))

- 8000 naive individuals
- EVP already popular in 2017

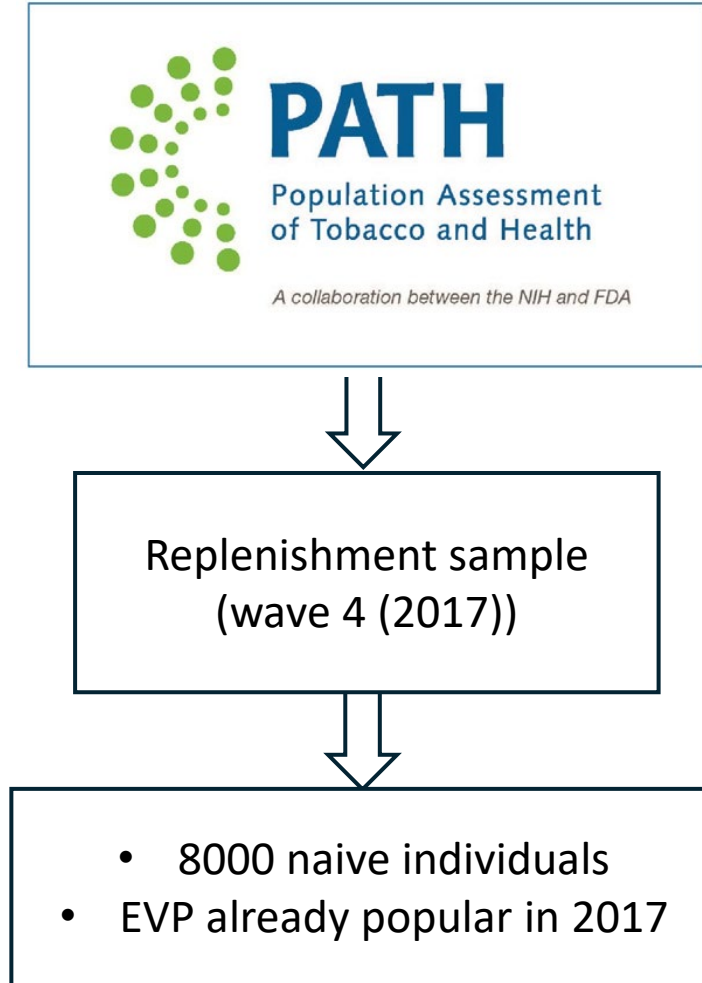
## Vaping Status



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# Established EVP user frequencies can be used to adjust CDC data



**% of established EVP users among  
Total EVP users:**

**56% for adults overall  
57% for young adults**

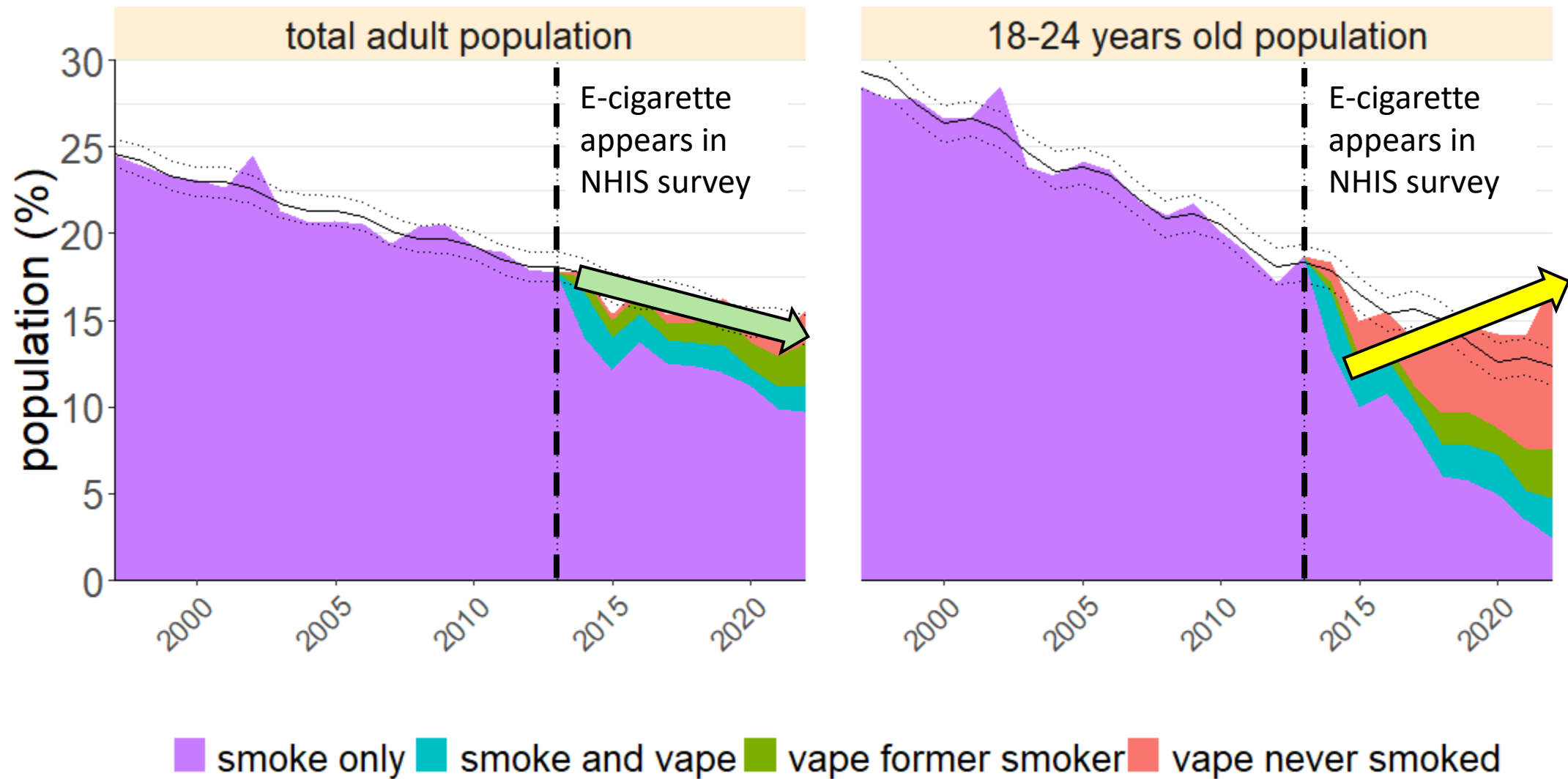


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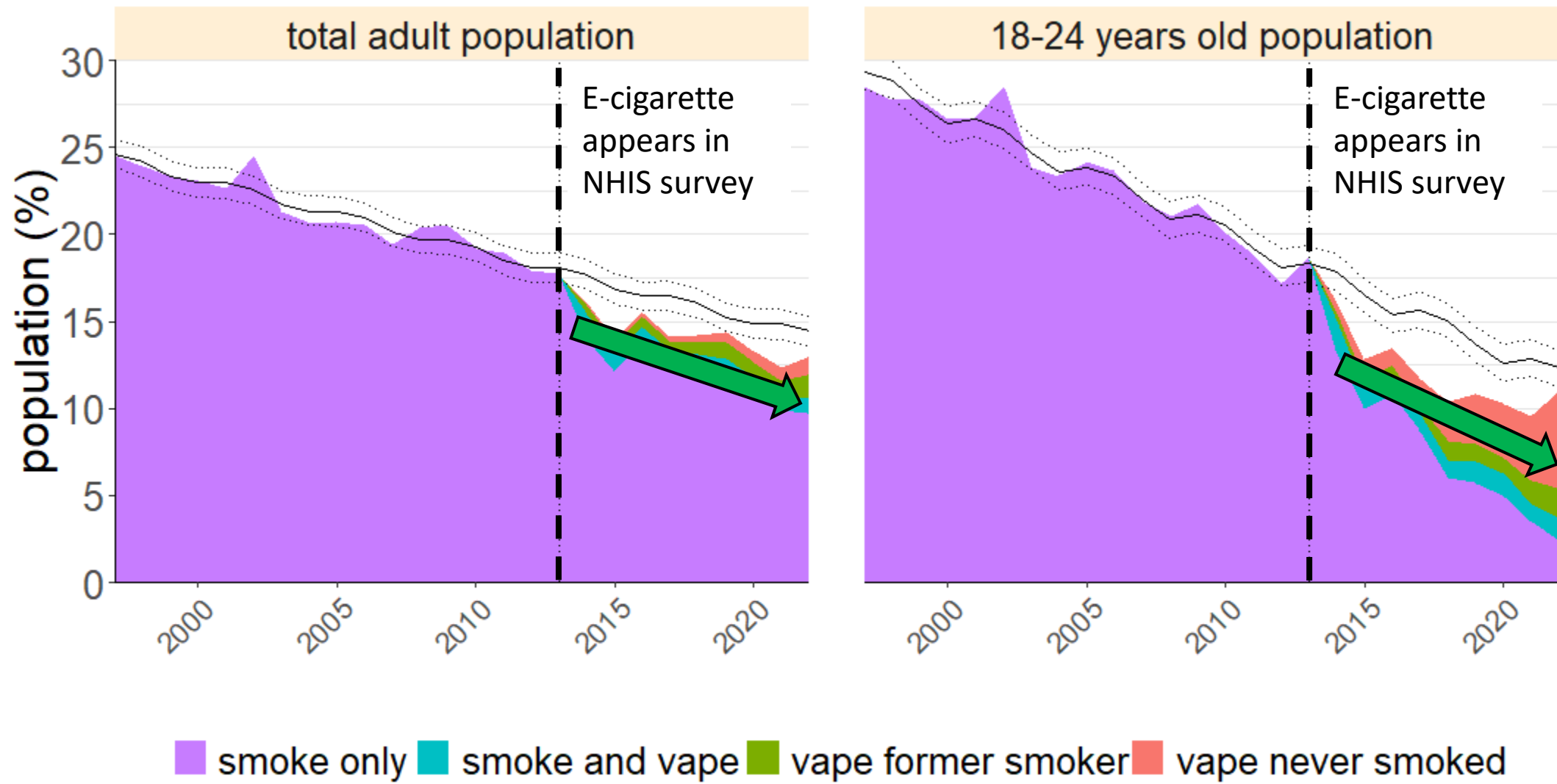
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# EVP prevalence before adjustment



# EVP prevalence after adjustment



# Summary

- Substantial smoking decrease in the last 25y, with acceleration since EVP introduction, especially in young adults → **EVPs likely strong contributors to the decline of cigarette smoking**
- Potential oversight of the equity research study. Mismatch of definitions of cigarette smokers and EVP users, **total nicotine prevalence still below the smoking-only predicted trend**
- Potential increase in EVP use among young adults from 2020 to 2022



# Take home messages

- **Current studies are not reliable and comparable. There is critical need to standardized and consistent definitions within consumer behavior studies**
- **High potential from state-of-the-art machine learning models: integrating past with current data produces realistic measures of a product's potential impact over time → accurate predictions are key in tobacco harm reduction**



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# Acknowledgements



Xavier Cahours



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