

# E-cigarette taxes on pre-pregnancy & prenatal smoking and birth outcomes

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# Blurb

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- Applied health economist by trade (GSU PhD in Public Policy, 2018)
- Two main work streams @AIR
  - Operation and implementation support for the Advanced APMs
  - Development and testing of healthcare quality measures
- External research on program and policy evaluation

# Disclaimer

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- Research reported in this publication was supported by the National Institute on Drug Abuse of the National Institutes of Health under Award Number R01DA045016 (PI: Michael F. Pesko)
  - My involvement in the study is independent of the Award
- Tobacco-related funding source over the last 10 years: None.
- Content is solely the responsibility of the authors & does not necessarily represent the official views of the National Institutes of Health and does not represent the views of AIR










# Overview

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- What's the impact of e-cig tax rates on pre-pregnancy & prenatal smoking and birth outcomes?
  - Expectant mothers and those expecting to become pregnant may be motivated to quit smoking using e-cigs
- A growing number of states & counties have levied e-cig taxes
  - MN was the first state to levy an ad valorem tax on e-cigs in 2010
  - E-cig taxes have been in effect in 34 jurisdictions by Dec 2020
  - Tax adoption is staggered
  - *Standardized e-cig tax rate*
- U.S birth records data (2013 to 2020) – collaborative effort btwn National Center for Health Statistics (NCHS) and the States
  - Pre-pregnancy (3mo before pregnancy) smoking
  - Prenatal smoking (any & avg. number smoked/day)
  - Birth outcomes
- *Presenting new results from those in the working paper; results subject to change*

# Preview

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- Hypothesis
  -  E-cig tax adoption →  cost of e-cigs →  use of e-cigs →  or  cig smoking →  or  birth outcomes
- E-cig taxes
  -  pre-pregnancy & 3<sup>rd</sup> trimester vaping
  -  pre-pregnancy & prenatal smoking by 0.4 – 0.5 ppt (7% – 9%)
  - Limited impact on birth outcomes

# Structure

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1. Background
2. Data, variables, and methods
3. Results
4. Extensions (brief)
5. Summary and discussion

# E-cigarette Regulations

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- Potential substitutability of traditional cigs & e-cigs presents a challenge to policymakers
  - » Taxing & restricting access to e-cigarettes may help ↓ nicotine intake
  - » But may ↓ harm reduction & cessation efforts among smokers
  - » E-cigs contain fewer toxicants than combustible tobacco, but are not harmless (National Academies of Sciences, Engineering, and Medicine 2018)
- States & localities have adopted e-cig policies in various forms
- As of October 2021
  - » Early policies focused on youth access (51 states)
  - » Next, states adopted policies prohibiting use in bar (19 states), restaurants (20 states), & private worksites (18 states)
  - » More recent efforts have focused on taxation (30 states)

# Tobacco Product Use During Pregnancy

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- Per CDC, smoking while pregnant increases the risk for pregnancy complications, is harmful to babies before and after they are born, and is strongly discouraged by healthcare professionals
  - 7.2% of women smoked cigs while pregnant (CDC, 2018)
  - Behavior linked with low birthweight, preterm birth, & birth defects





# Tobacco Product Use During Pregnancy

- Vaping while pregnant is also discouraged, as nicotine
  - is a health danger for pregnant women and developing babies
  - can damage a developing baby’s brain and lungs
  - can lead to
    - » low birthweight
    - » preterm birth
    - » impaired early life health and human capital development
    - » infant mortality
    - » later-life proclivity to nicotine-containing products
- PRAMS data for two states in 2015 (Kapaya et al., 2019)
  - 10.8% vaped in the three months prior to pregnancy
  - 7.0% vaped at the time of pregnancy
  - 5.8% vaped in the first trimester
  - 1.4% vaped at birth



# Tobacco Product Use During Pregnancy

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- Many pregnant women perceive e-cigs as less harmful than traditional cigs for the fetus & helpful in smoking cessation
  - e.g., Wagner, Camerota, & Propper (2017)
- Vaping while pregnant can cause similar harms to the fetus as does the use of traditional cigs
  - Whittington et al. (2018) – Literature review
- **Health benefits of vaping over smoking during pregnancy aren't clear**
  - Vaping during pregnancy is worse than not using any nicotine products

# Literature

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- Small literature on the effects of e-cigarette policies on pre-pregnancy & prenatal smoking, & birth outcomes
- Three studies explore the effect of e-cigarette policy variation on prenatal smoking using birth records
  - » E-cig indoor air laws ↓ prenatal smoking cessation for pregnant women, had little effect on birth outcomes (Cooper & Pesko, 2017), but ↑ infant mortality (Cooper & Pesko, 2022)
  - » E-cig MLSA laws ↓ prenatal smoking cessation rates for rural pregnant teens but had little effect on birth outcomes (Pesko & Currie, 2019)
- Few studies examine how cigarette taxation affected pre-pregnancy and prenatal smoking
- Studies focusing on e-cig tax rates generally found evidence of substitution in other populations

# Birth Records Data

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## National Center for Health Statistics

- Administrative data; Restricted use; Contain geocodes
- Collected and used the most recent data available (2020)
- Introduced the revised birth record form in 2003
  - » Revised form contains Qs on **smoking in each trimester & 3 months prior to pregnancy** (pre-pregnancy)
    - However, this info is self-reported
  - » State's adoption of revised form is staggered
- No info on e-cigarette use yet

# Building The Main Analysis Sample

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Started sample in Jan 2013, defined by **conception month** and **conception year**

- Birth records data only provide birth delivery date. Thus, need to estimate pregnancy date
  - » 3 critical pieces: birth year, birth month, and gestational length (weeks)
  - » Few assumptions:
    - Birth month = the end of the month (not start of the month) (e.g., June means 6/30 and not 6/1)
    - Gestational length (week) = start of the week (e.g., week 30 means full 29 weeks and day 1 in the 30<sup>th</sup> week and not full 30 weeks)
    - Baby was born in the middle of the month and middle of the week
    - 1<sup>st</sup> trimester = point of ovulation (16 days since conception)
    - 2<sup>nd</sup> trimester = week 14 of conception
    - 3<sup>rd</sup> trimester = week 28 of conception
    - Pre-pregnancy = 3 months prior to the point of ovulation

# Building The Main Analysis Sample

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- Ended sample in Dec 2019, defined by **conception month** and **conception year**
  - Doesn't mean births occurred in 2020 are excluded; therefore, births in 2020 from conception in 2019 are included
- Removed CT, NJ, and RI due to low adoption rate of revised birth record form by 2013 (sample starting year)
- Removed moms with missing smoking info, gestational length info, residing overseas, and non-singleton births (very modest deletion in each)
- Removed births in HI in 2013 due to very high pct. of missing smoking info
- Retained moms with missing info in demographics (very few records)
  - Recoded missing into a separate category and controlled for in model
- Main analysis sample  $\approx$  25M records (births) over study period

# Other Analysis Samples

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- Infant mortality data (2013 – 2018)
  - Generally, a one-year lag
  - Similar data cleaning logic applied
- Panel version of birth records data (2013 – 2020)
  - Take advantage of four time points in the birth records data
    - » 3 months before pregnancy, 1<sup>st</sup> trimester, 2<sup>nd</sup> trimester, and 3<sup>rd</sup> trimester
  - Data reshape (wide → long)
- Pregnancy Risk Assessment Monitoring System (PRAMS)
  - Vaping questions; descriptive analysis

# Main Outcome Variables (Cigarette Consumption)

- Any prenatal smoking (0-1)
  - 1: reported smoking cigarettes in any of the trimesters. 0: otherwise
- Avg. number of cigarettes smoked per day during pregnancy (continuous)
  - Simple weighted avg. of # of cigs smoked in each of the trimesters
- Number of trimesters smoked cigs
  - Categorical (0, 1, 2, 3)
- Any pre-pregnancy smoking (0-1)
  - Pre-pregnancy means no more than 3 months prior to pregnancy
- Any pre-pregnancy vaping (0-1); any 3rd trimester vaping (0-1)



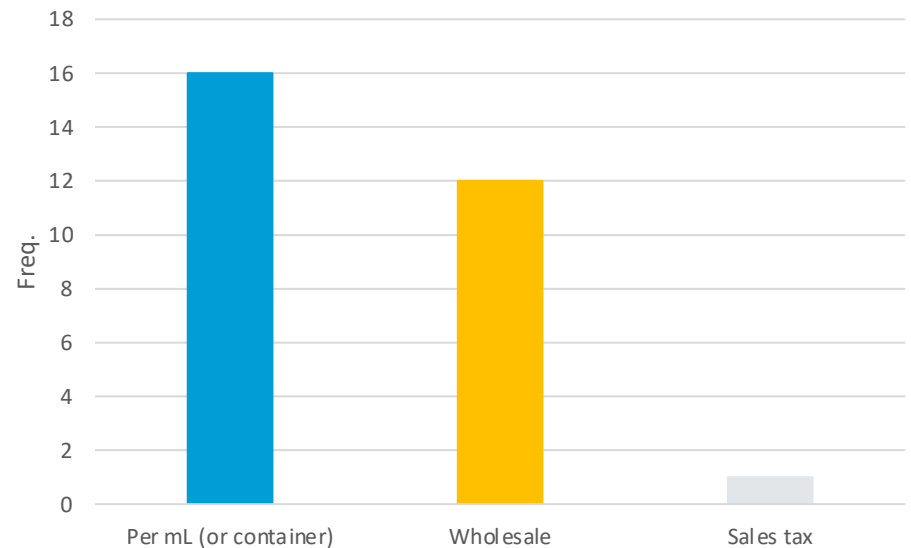
# Main Outcome Variables (Birth Outcomes)

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- Gestational length (weeks)
- Premature birth (0-1)
  - 1: gestational length < 37 weeks; 0: otherwise
- Birth weight (in grams)
- Low birth weight (0-1)
  - 1: birth weight < 2500 grams; 0: otherwise
- Small for gestational age (0-1)
  - 1: for a given gestational length, birth weight < 25<sup>th</sup> pctl. of the birth weight dist. 0: otherwise
- Extra small for gestational age (0-1)
  - 1: like the above, but use 10<sup>th</sup> pctl. as cutoff
- Five min Apgar score (categorical)
  - 5 categories; each is scored 0, 1, or 2; so Apgar ranges from 0 to 10
- Same-year infant death (0-1)

# Main Regressor (Standardized E-cig Tax Rate)

- By 2020, a total of 29 localities (mostly states; excluding localities in AK) has levied taxes on e-cigs **However,**
  - Unlike cig taxes (fixed amt. per pack), e-cig taxes are *unit-specific*
  - Fixed tax amt. per fluid milliliter (mL) and/or container
  - Percent tax on the wholesale price; ad valorem
  - Percent tax on the retail price; sales taxes



# Main Regressor (Standardized E-cig Tax Rate)

- Cotti C, et al. (2021) – **Tob Control** introduced a publicly available dataset of standardized e-cig taxes, measured as *an average tax rate per mL of fluid* at the state-county-year-quarter level.
- How they did it (high-level)
  - NielsenIQ Retail Scanner Data (store-UPC-week level)
  - UPC-level e-cig sales (qty. and \$) + e-cig product characteristics
  - Convert ad valorem and other taxes to their excise tax equivalent for each tax jurisdiction
  - Ad valorem → Tax per fluid mL

$$\text{Tax per mL}_{loc,t} = \text{ad valorem rate}_{loc,t} \times \text{wholesale price per mL}_{t=2013} \times (1 - \text{markup})$$

- Estimation of wholesale price per fluid mL in 2013
  - » Calculate the sales-weighted avg. retail price per fluid mL across jurisdictions NOT adopting e-cig tax by the end of 2020 in year 2013
  - » Use only 2013 (year 1 NRSD started categorizing e-cigs) to reduce the influence of other time-varying factors
  - » Subtract an estimated retailer markup of 35%

# Main Regressor (Standardized E-cig Tax Rate)

- Analogously,

- Sales tax → Tax per fluid mL

$$\text{Tax per mL}_{loc,t} = \text{sales tax rate}_{loc,t} \times \text{retail price per mL}_{t=2013}$$

- » Calculate the sales-weighted avg. retail price per fluid mL across jurisdictions NOT adopting e-cig tax by the end of 2020 in year 2013
- » Use only 2013 to reduce the influence of other time-varying factors

- Tax per container → Tax per fluid mL

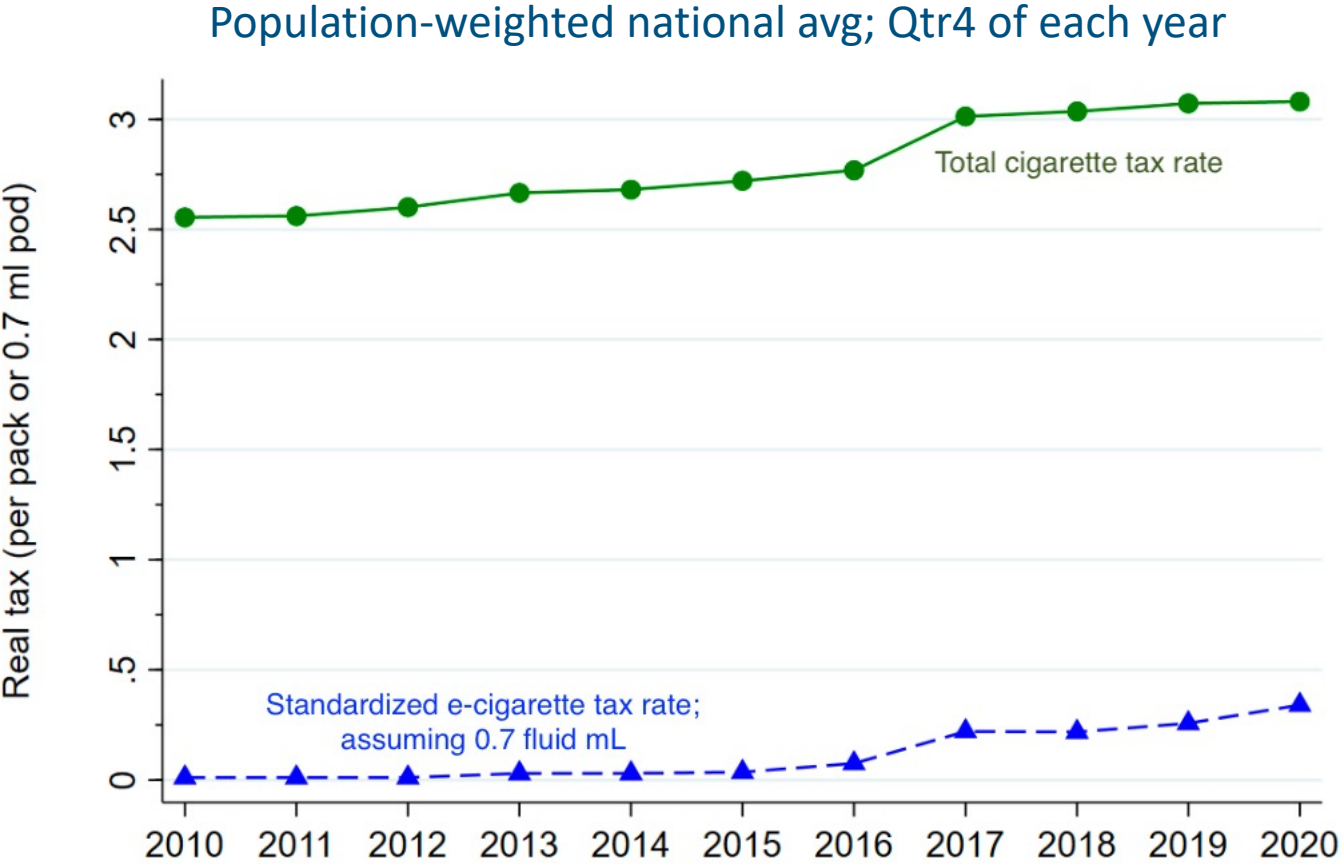
$$\text{Tax per mL}_{loc,t} = \text{tax per container}_{loc,t} \times \text{container per mL}_{t=2013}$$

- » Calculate the sales-weighted avg. container per fluid mL across jurisdictions NOT adopting e-cig tax by the end of 2020 in year 2013
- » Use only 2013 to reduce the influence of other time-varying factors

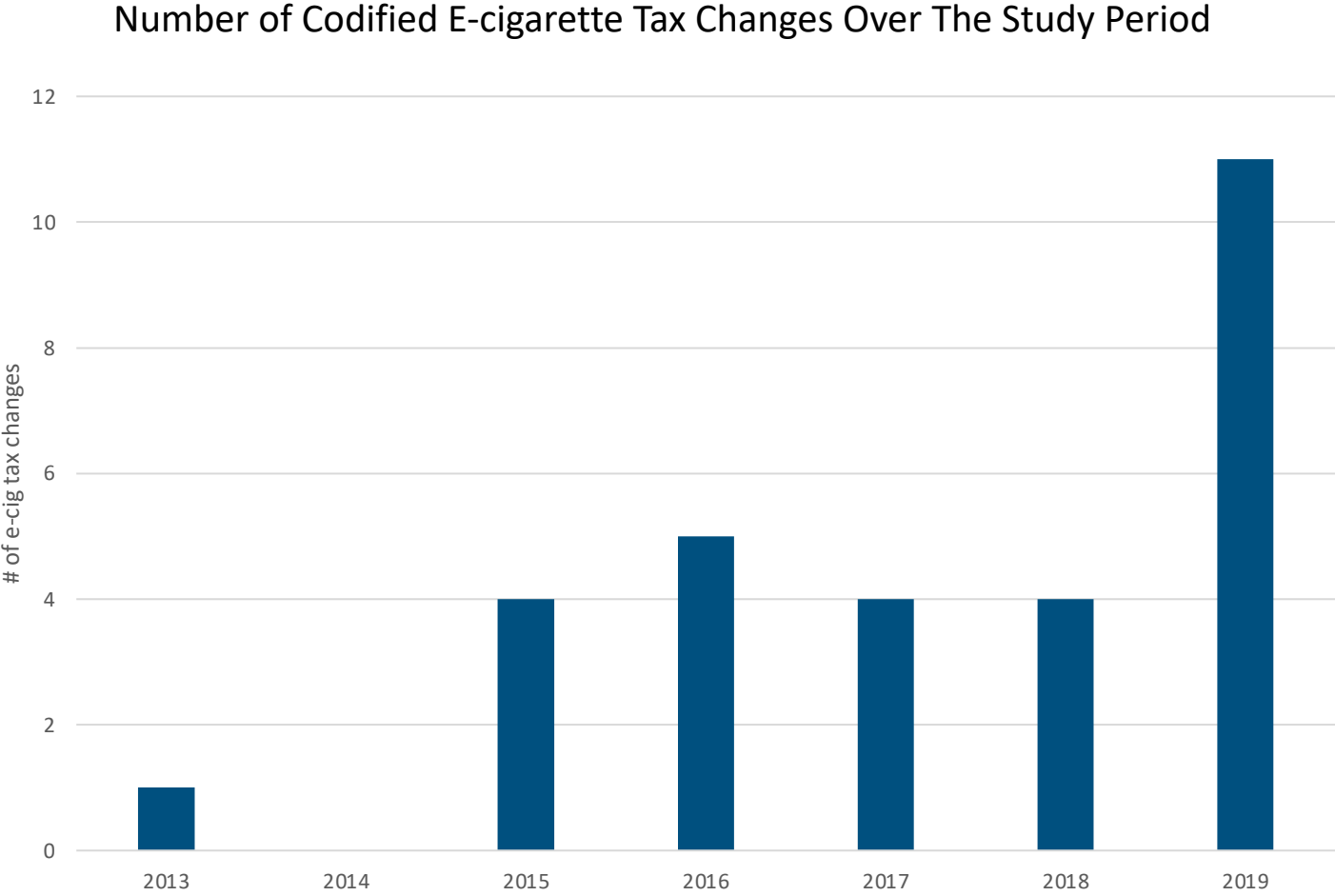
- We merge the standardized e-cig tax rate to birth records data at the level of *state-county-conception(year)-conception(quarter)*

# Main Regressor (Standardized E-cig Tax Rate)

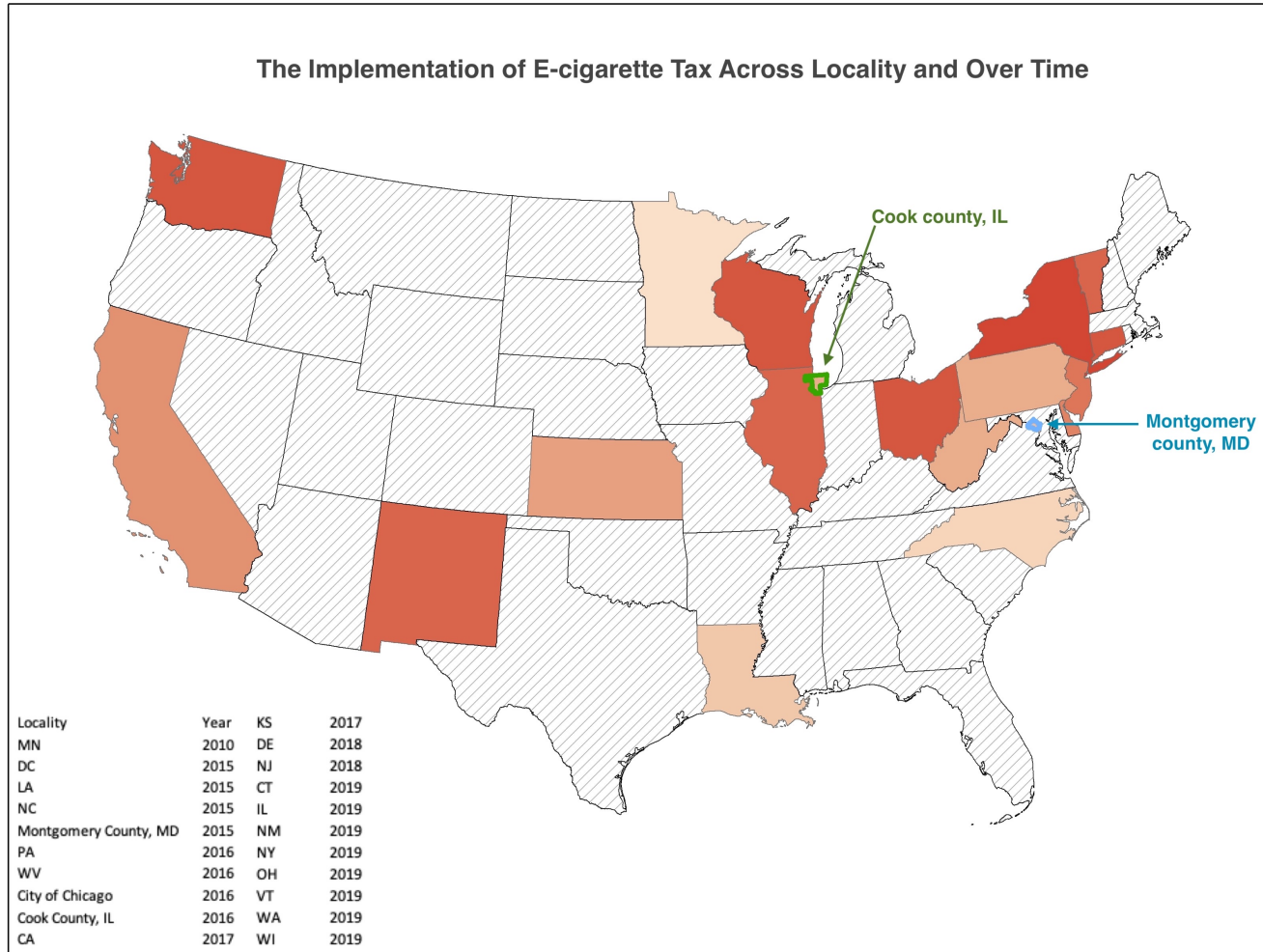
Comparison of standardized e-cig tax rate to the total (federal + state + local) cig tax rate over time



# Main Regressor (Standardized E-cig Tax Rate)



# Localities W/ E-cig Tax By The End of Study Period



# Add'l Policy Controls

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- Cigarette tax rate (federal + state + local)
  - » Source: CDC STATE System + American Non-Smokers Rights Foundation
- Index of indoor smoking restrictions (private workplaces, bars, and restaurants)
  - » Pct. of population in a given county/year/quarter subject to the comprehensive ban
  - » Source: American Non-Smokers Rights Foundation
- Index of indoor vaping restrictions (similar to the above)
- Any e-cigarette minimum legal sales age law
  - » Source: CDC STATE System + American Non-Smokers Rights Foundation
- Index of Tobacco 21 Law
  - » Source: Tobacco21.org
- Fraction of quarter over year for a given state with temporary e-cig sales ban
  - » Source: Authors' review of public information
- Fraction of quarter over year for a given state with ACA Medicaid expansion
  - » Source: Kaiser Family Foundation + Maclean, Pesko, and Hill (2019) – Economic Inquiry ([link](#))



# Mother's Demographics

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All demographic variables are categorized and their missing values are included as a separate category

- » Age at the time of delivery
- » Race
- » Primary source of payment (e.g., Medicaid, Private insurance, Self-pay, etc.)
- » Marital status
- » Education status
- » Mother's total birth counts (living and dead)

# Empirical Methods – Cross-sectional

$$Outcome = \beta_1 Tax + \Theta \cdot Dmgrpchs + \Phi \cdot Policy\_Cntrls + FEs + \varepsilon$$

- What's the level of these variables?
  - » ① each record in the birth records data denotes a birth delivery for a women residing in a given **state, county, year, and month**.
    - Recall, we est. conception year and month for every birth
    - Outcome vars and demographics are at this level
  - » ② Standardized e-cig tax rates are at the level of state, county, conception(year), and conception(quarter)
    - Recall, we merged e-cig taxes to each row in birth data using the geocode info (residence) and est. conception year and conception quarter.

# Empirical Methods – Cross-sectional

$$Outcome = \beta_1 Tax + \Theta \cdot Dmgrpchs + \Phi \cdot Policy\_Cntrls + FEs + \varepsilon$$

- What's the level of these variables?
  - » ③ some policy variables are at the same level as standardized e-cig tax rate, and they are:
    - Total cig tax rate, index of indoor smoking (vaping) restrictions, any e-cig MLSA law, any tobacco 21 law
  - » ④ some policy variables are at the level of state, conception year, and conception quarter, and they are:
    - Fraction of quarter over year with temporary vape ban and with ACA Medicaid expansion

# Empirical Methods – Cross-sectional

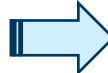
$$Outcome = \beta_1 Tax + \Theta \cdot Dmgrpchs + \Phi \cdot Policy\_Cntrls + FEs + \varepsilon$$

- What are the fixed effects (FEs)?
  - » ① FEs = dummy variables (each category is controlled for by itself)
  - » ② County FEs
  - » ③ Time FEs = conception year  $\times$  conception month (e.g, 2015-Jan)
  - » ④ Mixed FEs = state of residence  $\times$  conception year (e.g., MD-2015)
- How we handle standard errors?
  - » Cluster them at the level of state with a small tweak: we treat Cook County, IL and Montgomery County, MD as if they were states

# Empirical Methods – Panel Analysis

- How did we reshape the original birth records data

Birth_ID	CIG_0	CIG_1	CIG_2	CIG_3
1001	0	0	1	1

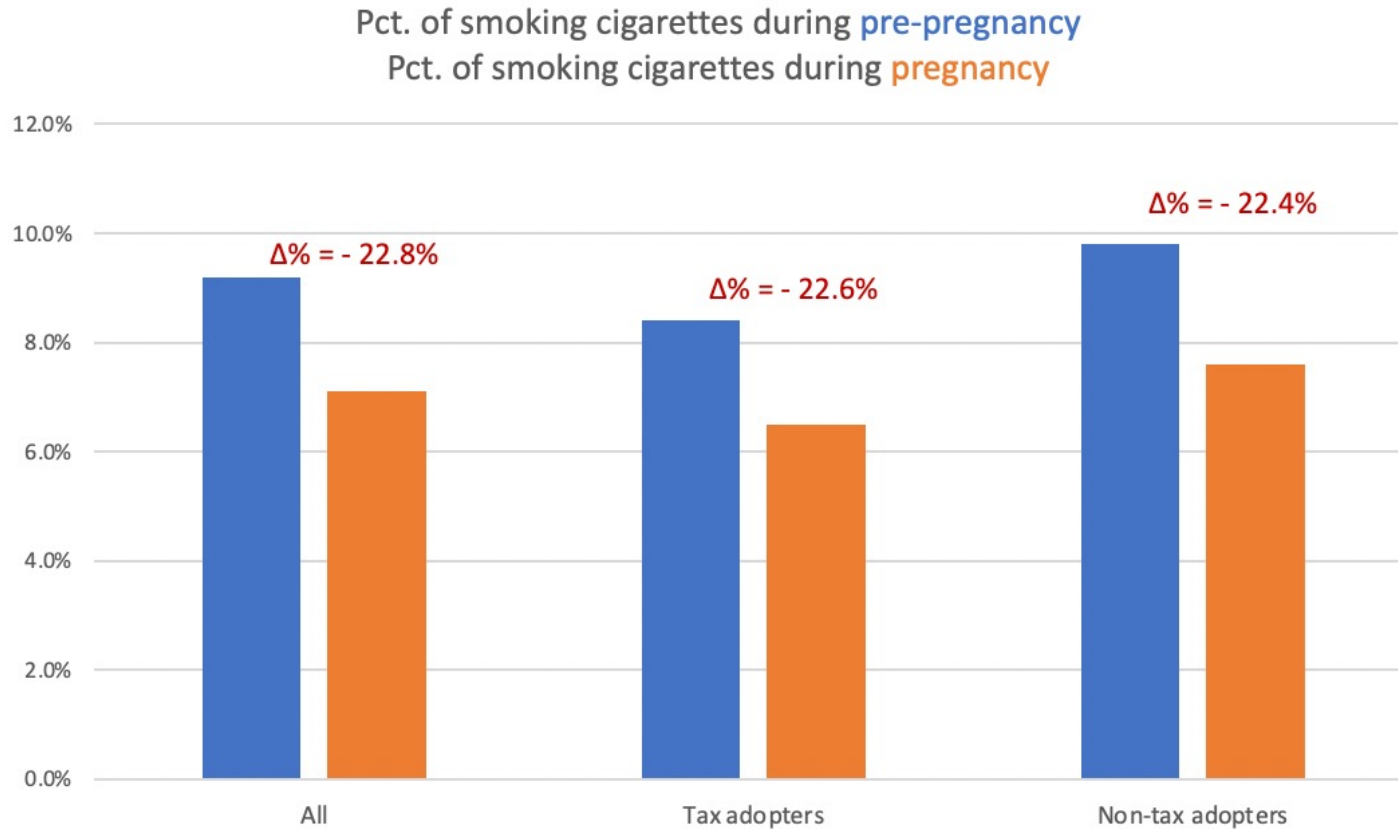


Birth_ID	Trimester	CIG
1001	0	0
1001	1	0
1001	2	1
1001	3	1

$$Outcome = \beta_1 Tax + \Theta \cdot Demographics + \Phi \cdot Policy\_Cntrls + FEs + \varepsilon$$

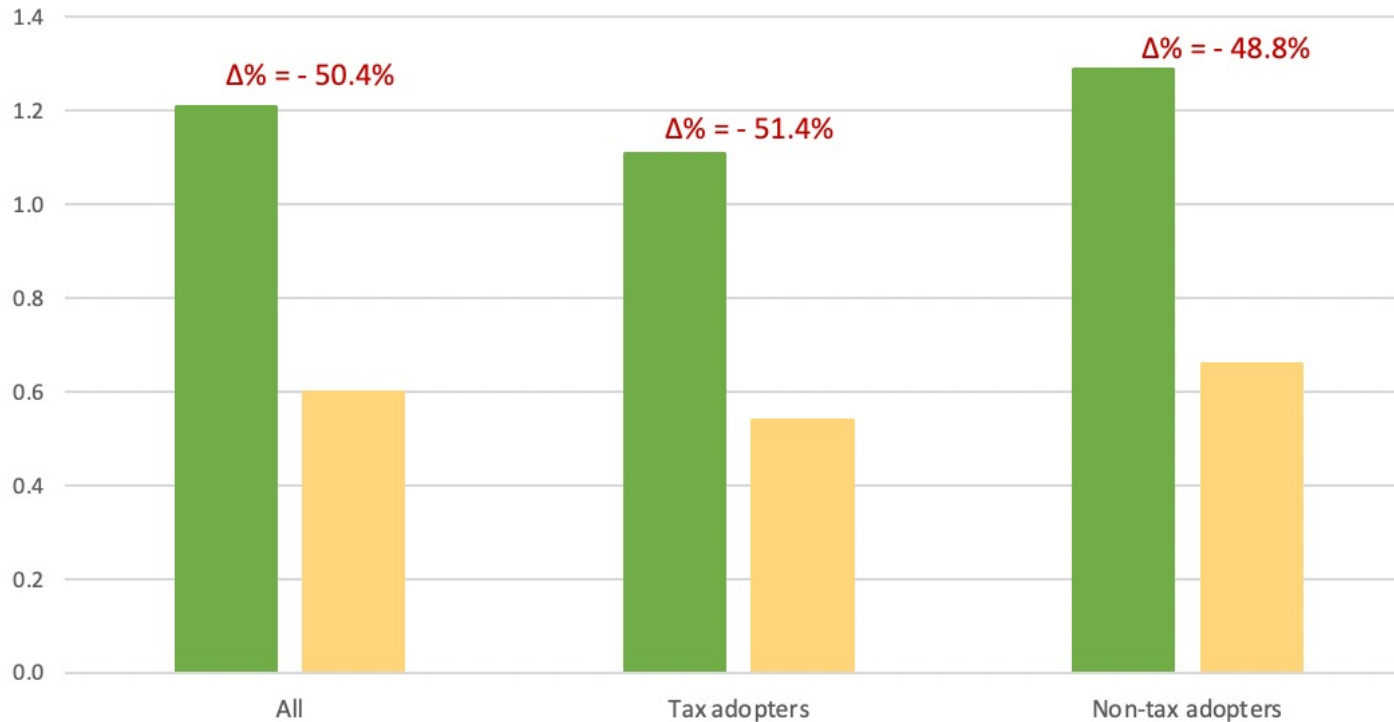
- How policies get merged into this long-fmtd dataset?
  - » Geo-location + Year of trimester (0,1,2,3) start + Qtr of trimester (0,1,2,3) start
- What are the fixed effects (FEs)?
  - » Birth FEs + Trimester FEs
- No need for demographics
- Cluster std.errs in the same fashion

# Summary Statistics (Selected Few)



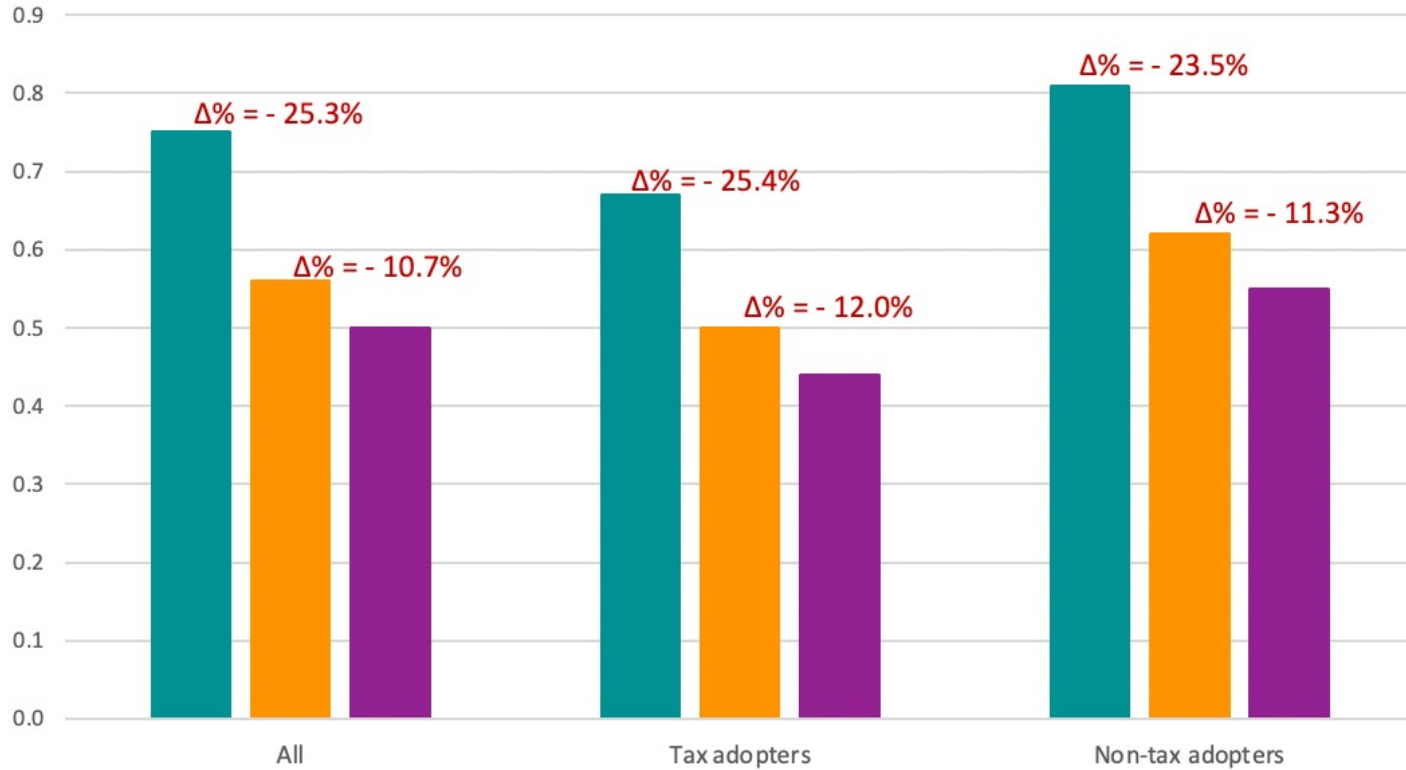
# Summary Statistics (Selected Few)

Avg. # of cigarettes smoked/day during **pre-pregnancy**  
Avg. # of cigarettes smoked/day during **pregnancy**



# Summary Statistics (Selected Few)

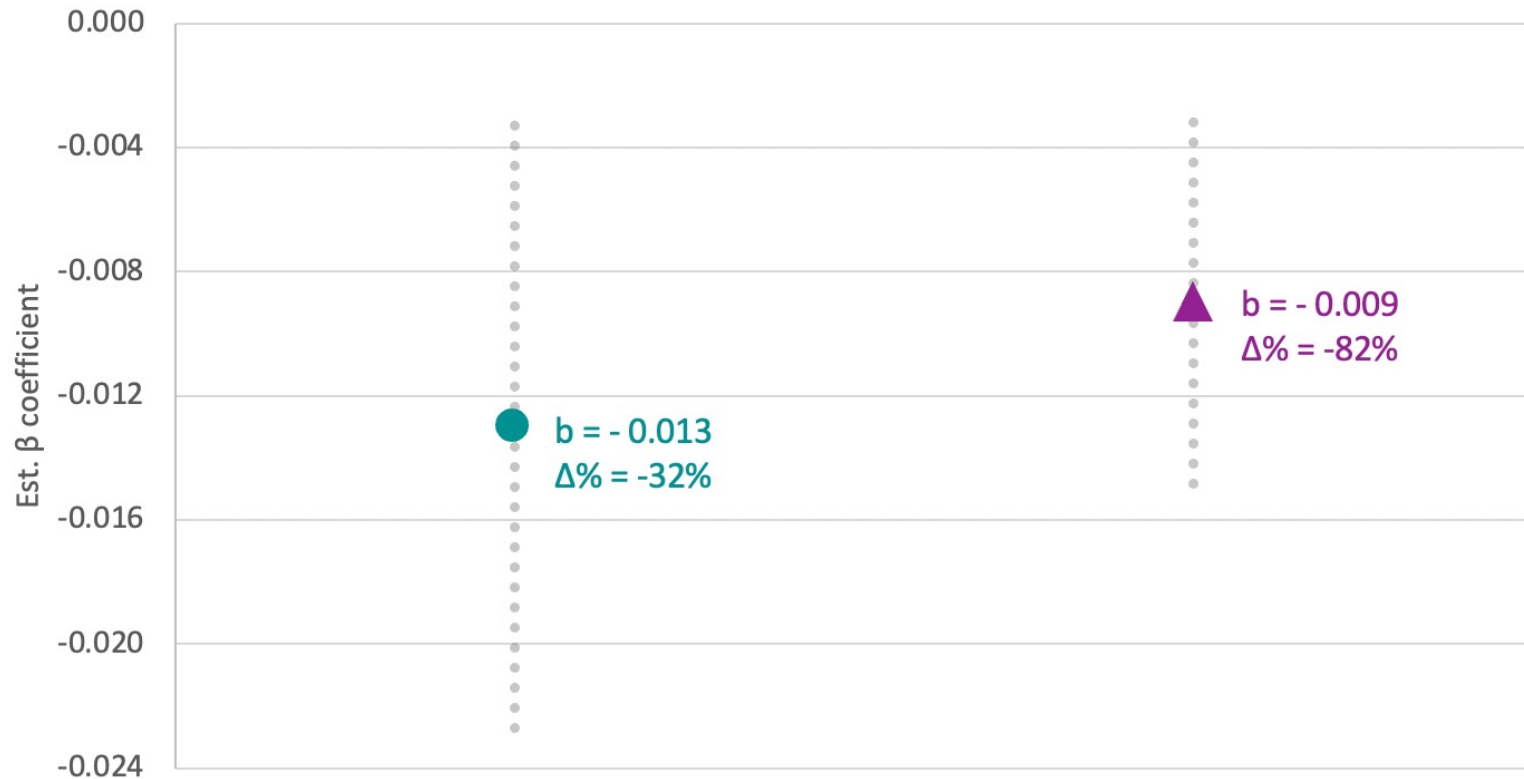
Avg. # of cigarettes smoked/day during 1st, 2nd, and 3rd trimester





# Summary Regression Results (selected few)

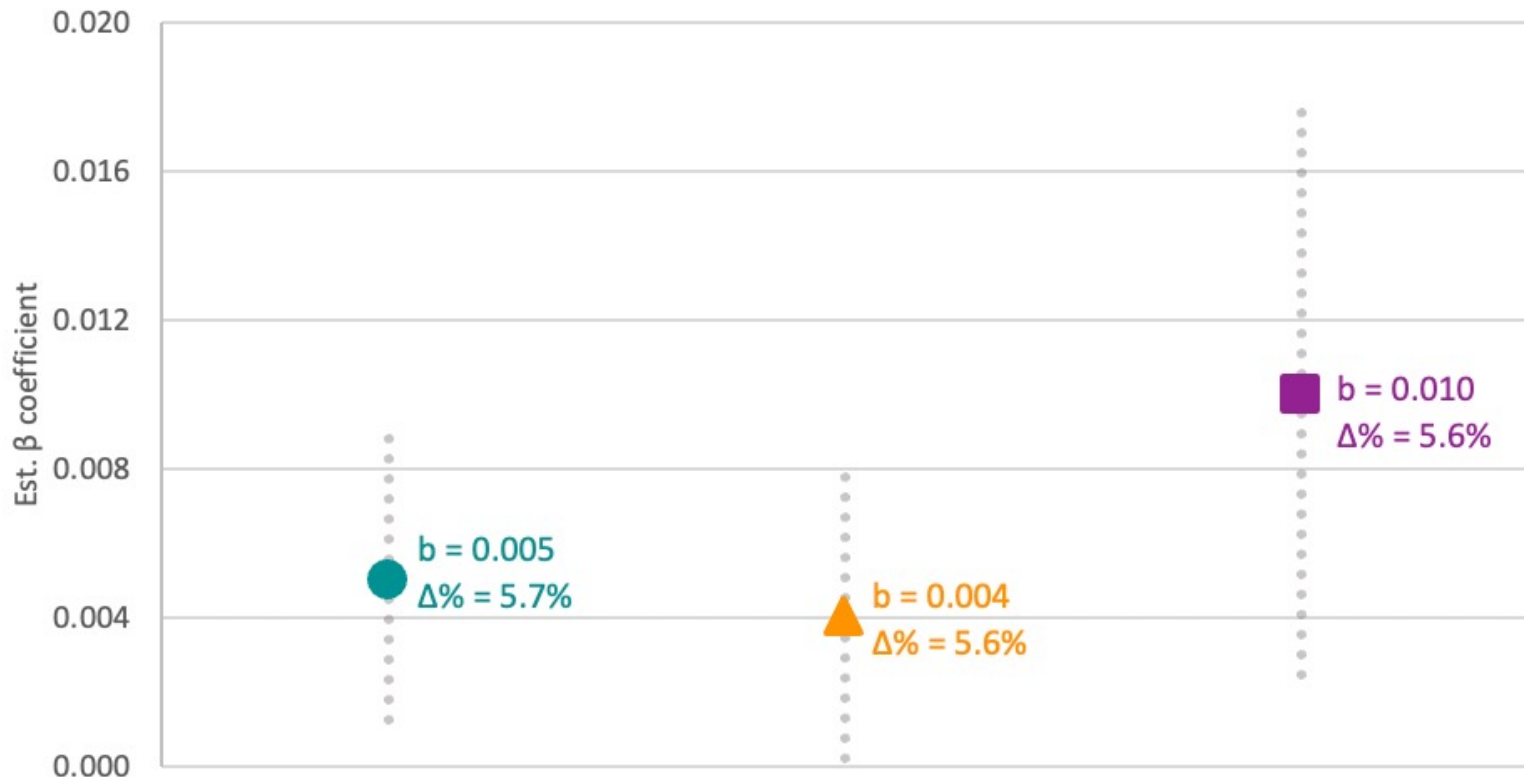
Effects of Stdzd E-cig Tax Rate on **Any Pre-pregnancy Vaping**  
and **Any 3rd Trimester Vaping**



Note: each shape-color combination denotes a separate regression  
PRAMS data; Full set of controls (demographics + policies) is included in regressions

# Summary Regression Results (selected few)

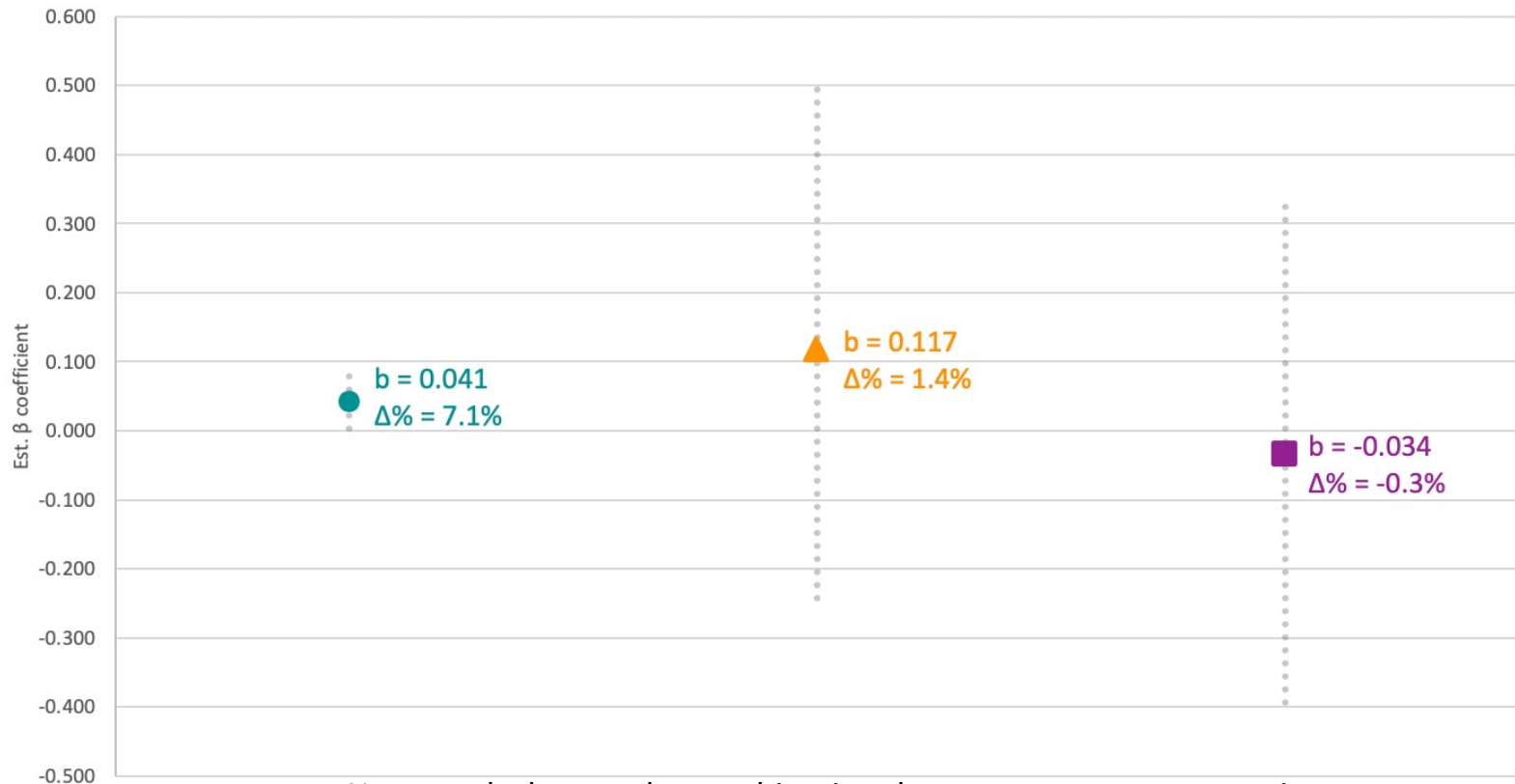
Effects of Stdzd E-cig Tax Rate on Pre-pregnancy, Prenatal Smoking and # of Trimesters Smoked Cigs



Note: each shape-color combination denotes a separate regression  
Full set of controls (demographics + policies) is included in regressions

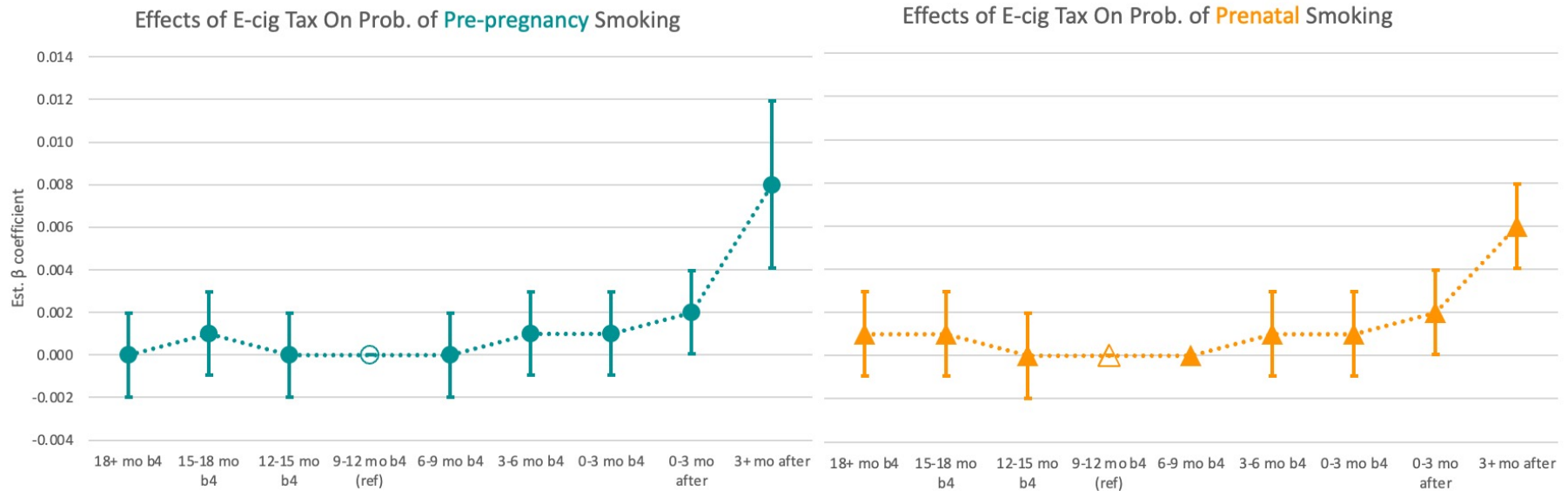
# Summary Regression Results (selected few)

Effects of Stdz'd E-cig Tax Rate on **Avg. # of Cigs Smoked/Day During Pregnancy**,  
**Avg. # of Cigs Smoked/Day Among Smokers During Pregnancy**, and  
**Avg. # Cigs Smoked/Day Among Smokers During Pre-pregnancy**



Note: each shape-color combination denotes a separate regression  
Full set of controls (demographics + policies) is included in regressions

# Summary Regression Results (Event-Study, ES)



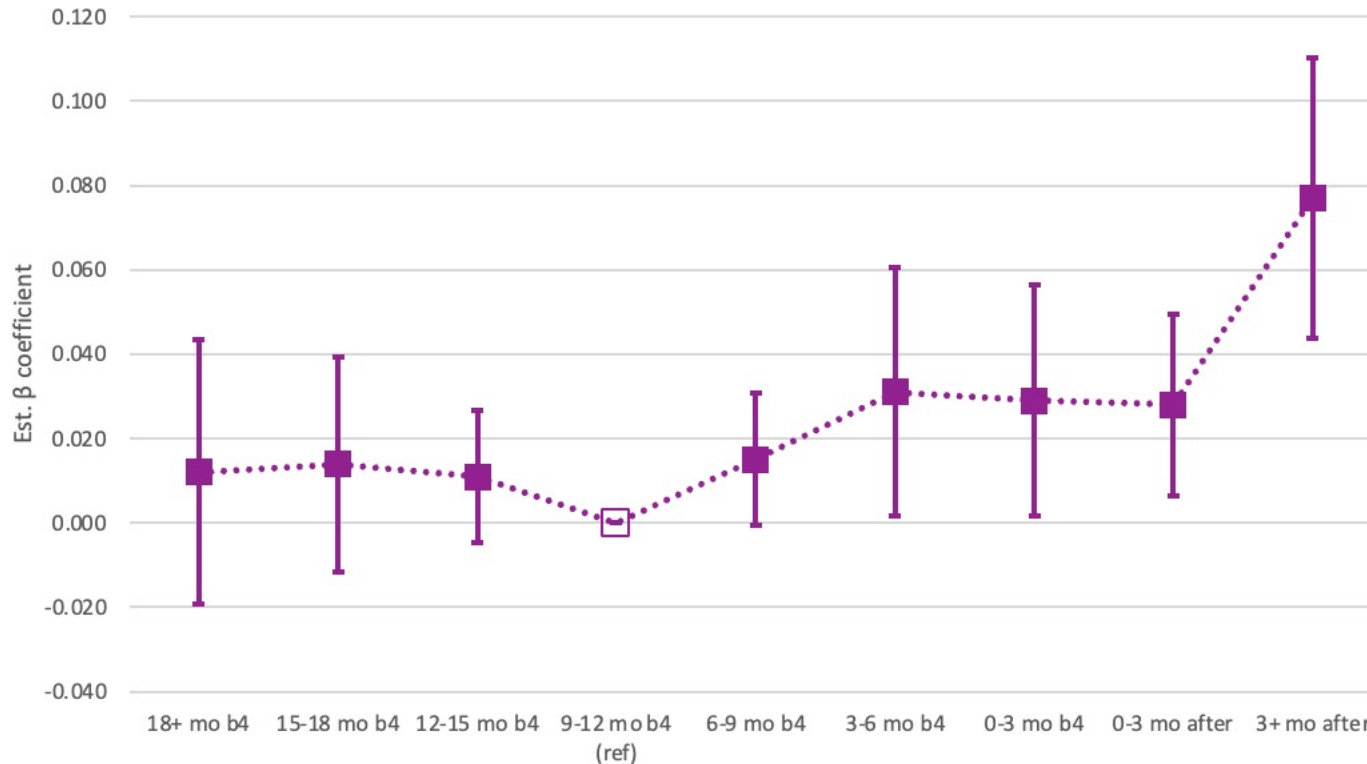
Note: Leads and lags denote the relative difference in months between mom's pregnancy and the time e-cigarette taxes went into effect.

Reference group: moms whose pregnancy precedes e-cigarette tax implementation by 9 to 12 months

Full set of controls (demographics + policies) is included in regressions

# Summary Regression Results (ES)

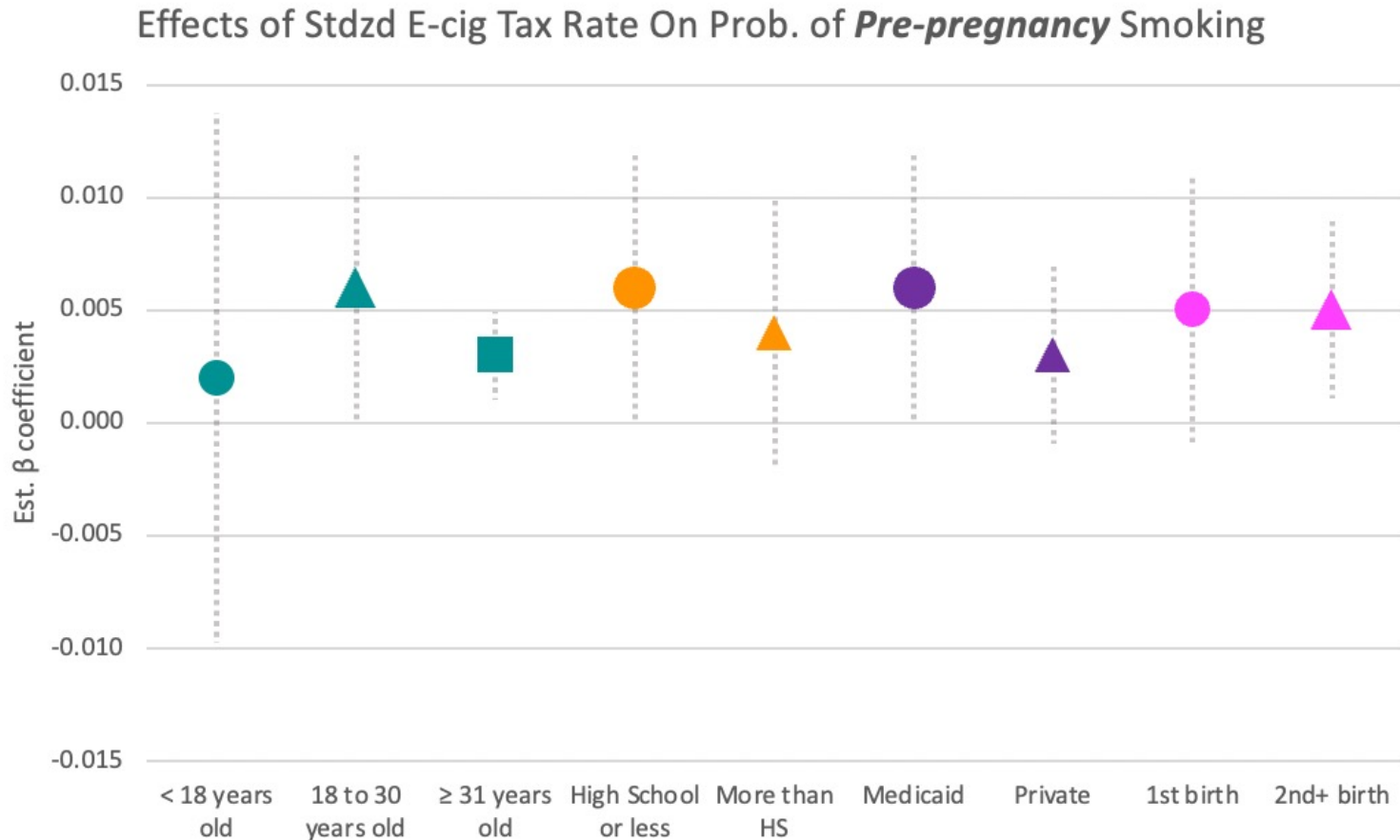
Effects of E-cig Tax On Avg. # of Cigarettes Smoked During Pregnancy



Note: Leads and lags denote the relative difference in months between mom's pregnancy and the time e-cigarette taxes went into effect.

Full set of controls (demographics + policies) is included in regressions

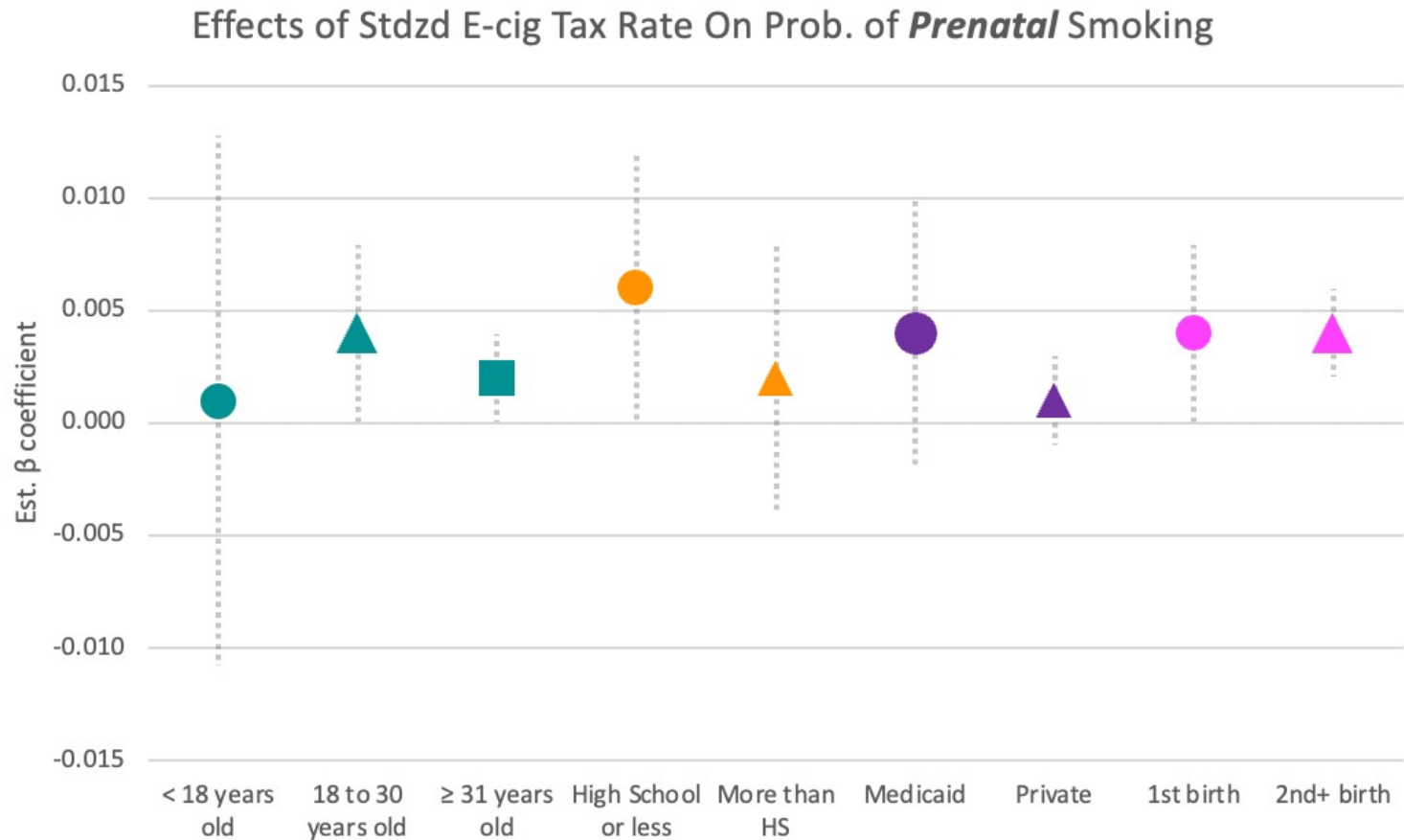
# Summary Regression Results (Tax Effect Het.)



Note: Each shape-color combination denotes a separate (sub-sample) regression.

Full set of controls (demographics + policies) is included in regressions

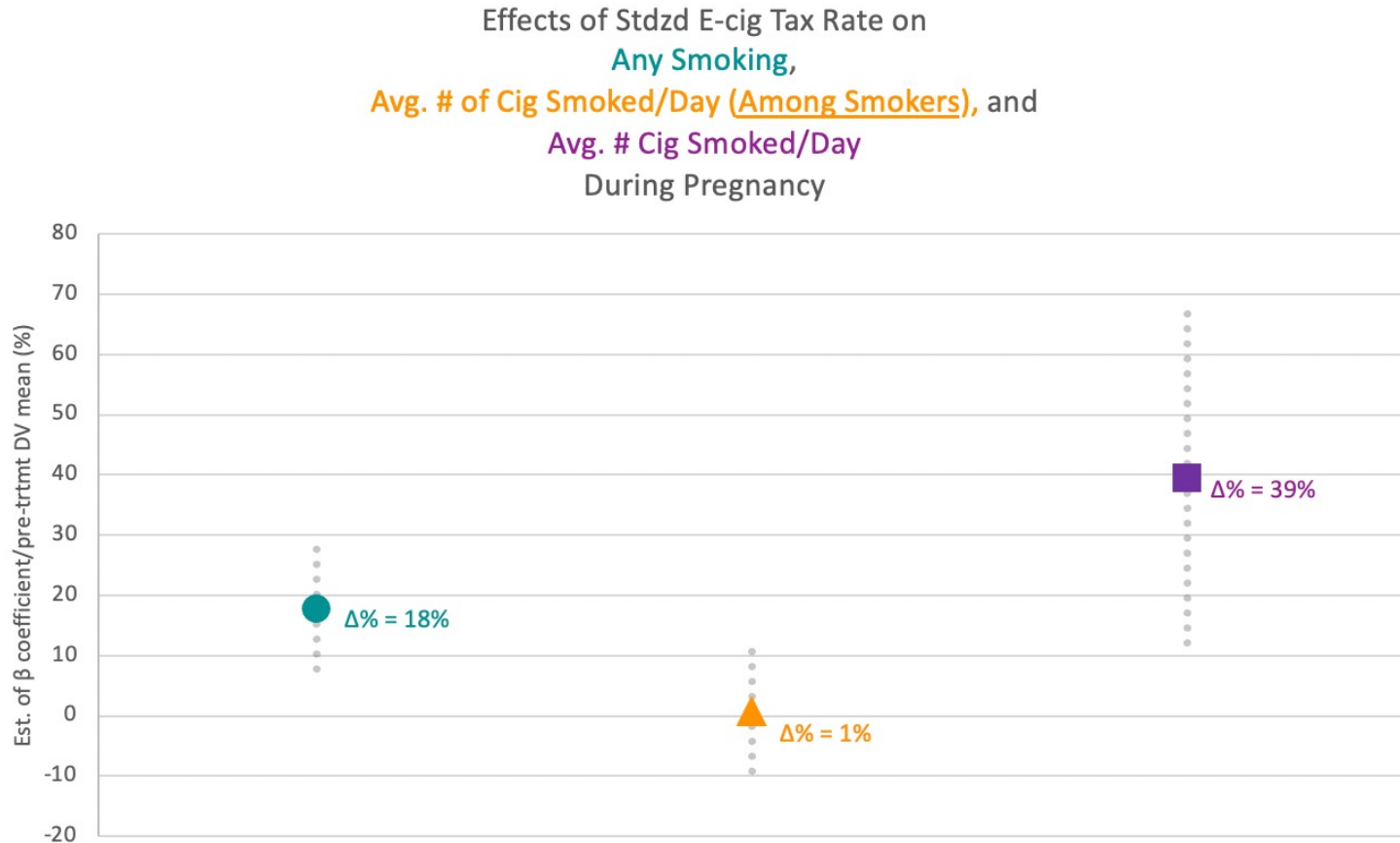
# Summary Regression Results (Tax Effect Het.)



Note: Each shape-color combination denotes a separate (sub-sample) regression.

Full set of controls (demographics + policies) is included in regressions

# Summary Regression Results (Panel Analysis)



Note: Each shape-color combination denotes a separate regression.  
Policy variables, Birth FEs, and Trimester FEs are controlled for in regressions.



# Summary Regression Results (Birth Outcomes)



Note: Each shape-color combination denotes a separate regression.  
The full set of controls (demographics + policies + FEs) is controlled for in regressions

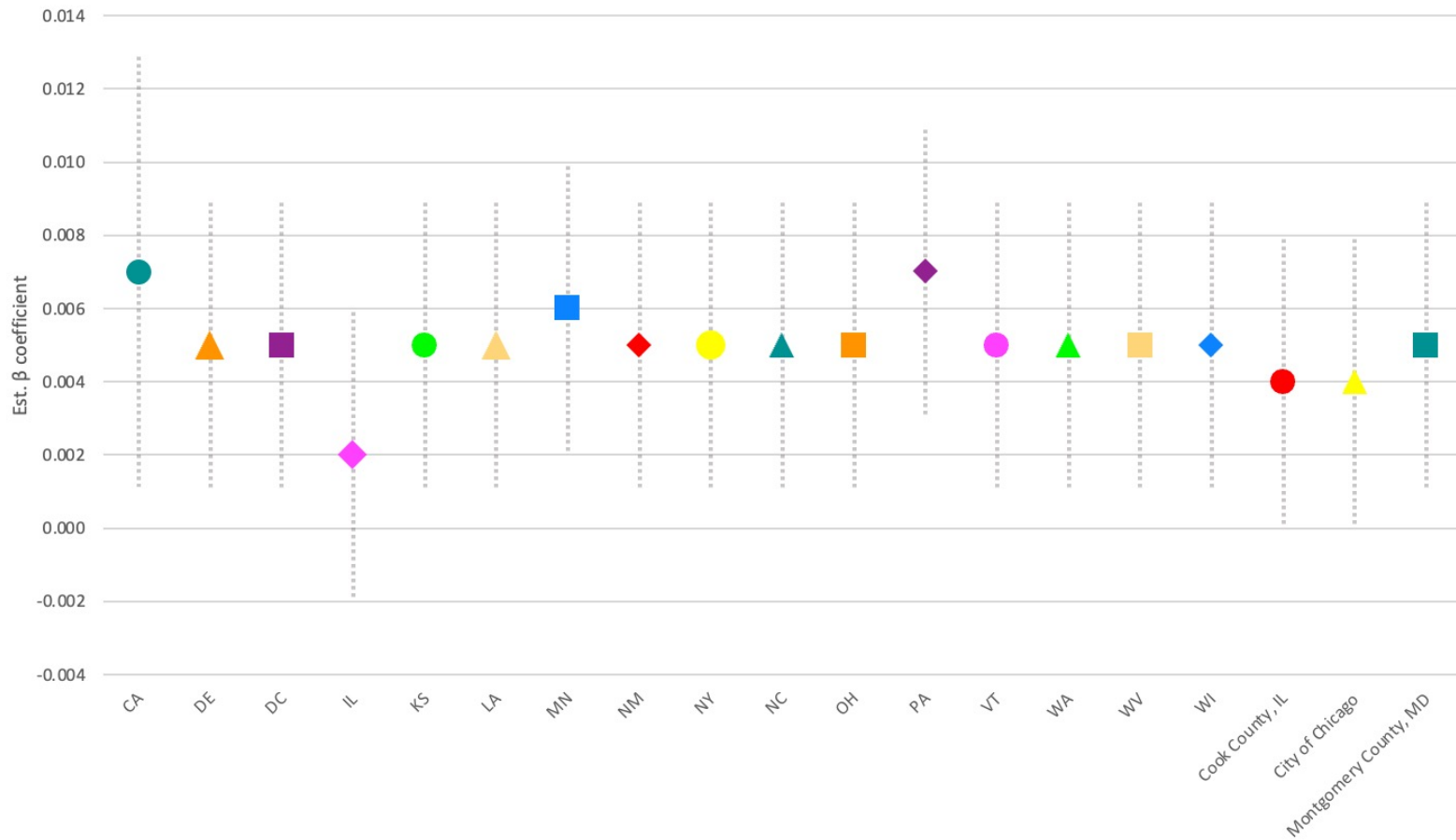
# Extension – Robustness Checks

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1. Replace standardized e-cig tax rate with its dichotomized version (0-1)
  - » Address concerns raised in recent literature on the conventional DD setup
  - » Execute Goodman-Bacon decomposition
2. Compare  $\beta$ s across models that a) without demographic nor policy controls; b) with demographics only; c) with both demographics and policy controls
  - » Note, FEs are always in
3. Shift the reference group used in ES-style regression to a different point
4. Examine the extent to which e-cig tax effect is correlated with composition of births (i.e., is pregnancy itself affected by e-cig taxes)
5. Check balance of data (or correlates of e-cigarette taxes and demographics and policy controls)
6. Start the analysis sample in 2011
7. Cluster standard errors at a different level
8. Check sensitivity of results to using a different retailer markup rate
9. And many more ...

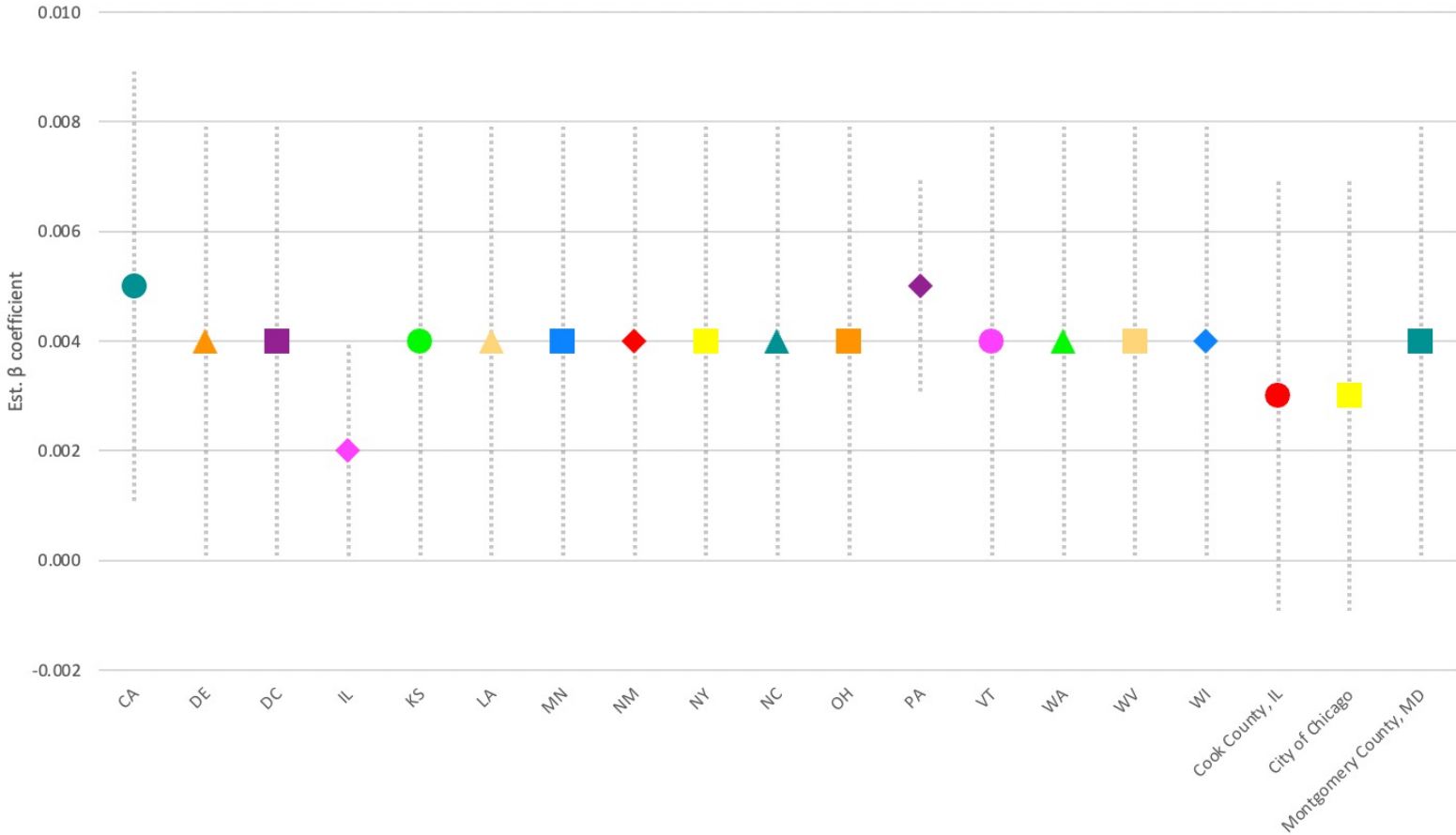
# Extension – (Leave-One-Out Analysis)

Effects of Stdzd E-cig Tax Rate On Prob. of *Pre-pregnancy* Smoking



# Extension – (Leave-One-Out Analysis)

Effects of Stdzd E-cig Tax Rate On Prob. of *Prenatal* Smoking



# Summary of Findings

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## 1. What we investigated?

- » Impact of e-cigarette taxes (in particular, the standardized e-cig tax rate) on pre-pregnancy and prenatal smoking and vaping, and birth outcomes

## 2. What we found?

- » E-cig taxes led to higher pre-pregnancy and prenatal smoking
- » The increased prenatal smoking is likely not due to e-cig taxes alone
  - Some portion of the increase may be carry-over from the increased pre-pregnancy smoking
- » Smoking declines monotonically as the birth date nears, and increased prenatal smoking attributable to e-cig taxes is concerning → discouraged smoking cessation
- » Combine the first-stage effect from PRAMS: for every 3 moms who didn't use e-cigs due to higher e-cig taxes, one of them used cigarettes instead
- » No stat. sig impact on birth outcomes (nicotine is harmful for fetal dev. regardless of tobacco products + small effects on cigarette smoking to have meaningful birth impacts)

# Discussion (Brief)

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While no stat. sig. effect on birth outcomes, increased smoking during pregnancy is concerning from a public health standpoint:

- » Pre-pregnancy smoking carried over to prenatal smoking, which may carry over to post-pregnancy smoking: Negative childhood development issues due to second-hand smoke exposure
- » Missed opportunity for smoking cessation for the mother, with potentially harmful consequences for her own health

# Discussion (Brief)

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Current literature on smoking during pregnancy and the health of newborn

- » Smoking during pregnancy is the number one risk factor for having a low birth weight infant (Almond et al., 2005)
- » In-utero exposure to cigarette smoke has been shown to directly impact the developing brain and impair early health and human capital development (Breslau et al., 1994; Bublitz and Stroud, 2011; Basten et al., 2015; Banderali et al., 2015; Akshoomoff et al., 2017)
- » Reduced prenatal smoking improves children's human capital development, especially for low socioeconomic status children (Settele and Van Ewijk, 2018)

E-cigarettes continue to alter the tobacco marketplace. Active policy area across the country.

# Link To Study (<https://www.nber.org/papers/w26126>)



## The Effect of E-Cigarette Taxes on Pre-pregnancy and Prenatal Smoking

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Advancing Evidence.  
Improving Lives.

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