

# Tax progressivity and top incomes: Evidence from tax reforms

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# Point of departure

- Decrease in tax progressivity and top taxation
- Question: **How has the tax progressivity decline affected the income distribution?**
- Difficult to answer:
  - Post-tax distribution: quite clear
  - Pre-tax distribution: less clear
  - Interdependence of progressivity and inequality
- Previous studies: mostly correlational evidence
  - Slemrod (1996); Slemrod & Bakija (2000); Brewer, Saez & Sheperd (2010); Duncan & Sabrionova Peter (2016); Saez (2017); Roine, Vlachos, Waldenström (2009); Piketty, Saez & Stantcheva (2014)

# This study

- **Tax reforms**
  - Sudden, large-scale, short-term (Data 1980s-2000s: WID, OECD)
  - Two measures: Average rate progression, Top marginal tax rates
- **Top income shares**
  - Annual, pre-tax, many countries (Data: WID)
- **Synthetic control method (SCM)**
  - Offers “causal” estimation framework
  - (We also run panel regressions)
- Main contribution: “Causal” (reduced-form) link
- Main problem: No microdata (lack of compositional info etc)

# Outline of the presentation

1. Introduction
2. Empirical method: SCM
3. Main results
4. Robustness
5. Mechanisms
6. Conclusions

## 2. Empirical method: Synthetic Control Method (SCM)

- When to use the SCM?
  - Treatment (reform) in **one (or very few) unit**, ex. single-country occasion
  - Using a small number of controls to build a counterfactual
- Basic idea with SCM: Data-driven approach to create a **counterfactual country** (SCG), a weighted average of selected *non-treated* countries
  - Treated and non-treated countries should be *similar* in their economy, demography, politics, etc.
  - The control variables, the better (but all must not be used in the end)
  - NB: One must also account for the *likelihood of treatment*
    - Use variables that are important for this (here: top income shares, tax policy variables)

# Pros and cons with the SCM

## A. Advantages with the SCM

- a) When treatment occurs in only a single unit
- b) When pre-treatment characteristics in treated unit differs from the average of non-treated units (as in Diff-in-Diff)
- c) Transparent, data-driven process: control group clearly observed
- d) Flexible when treatment varies (SCG units may get zero weight)

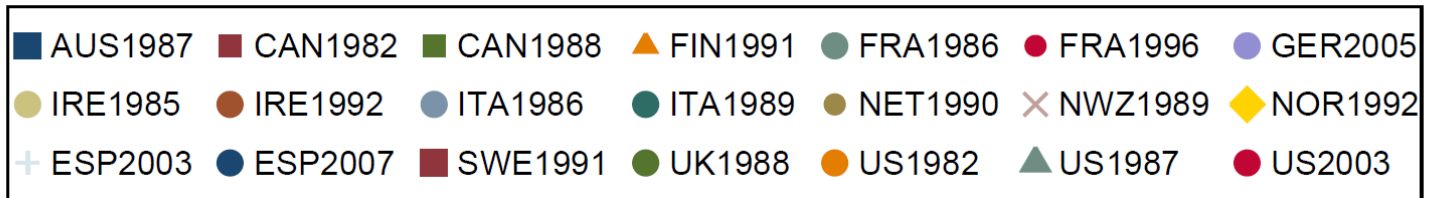
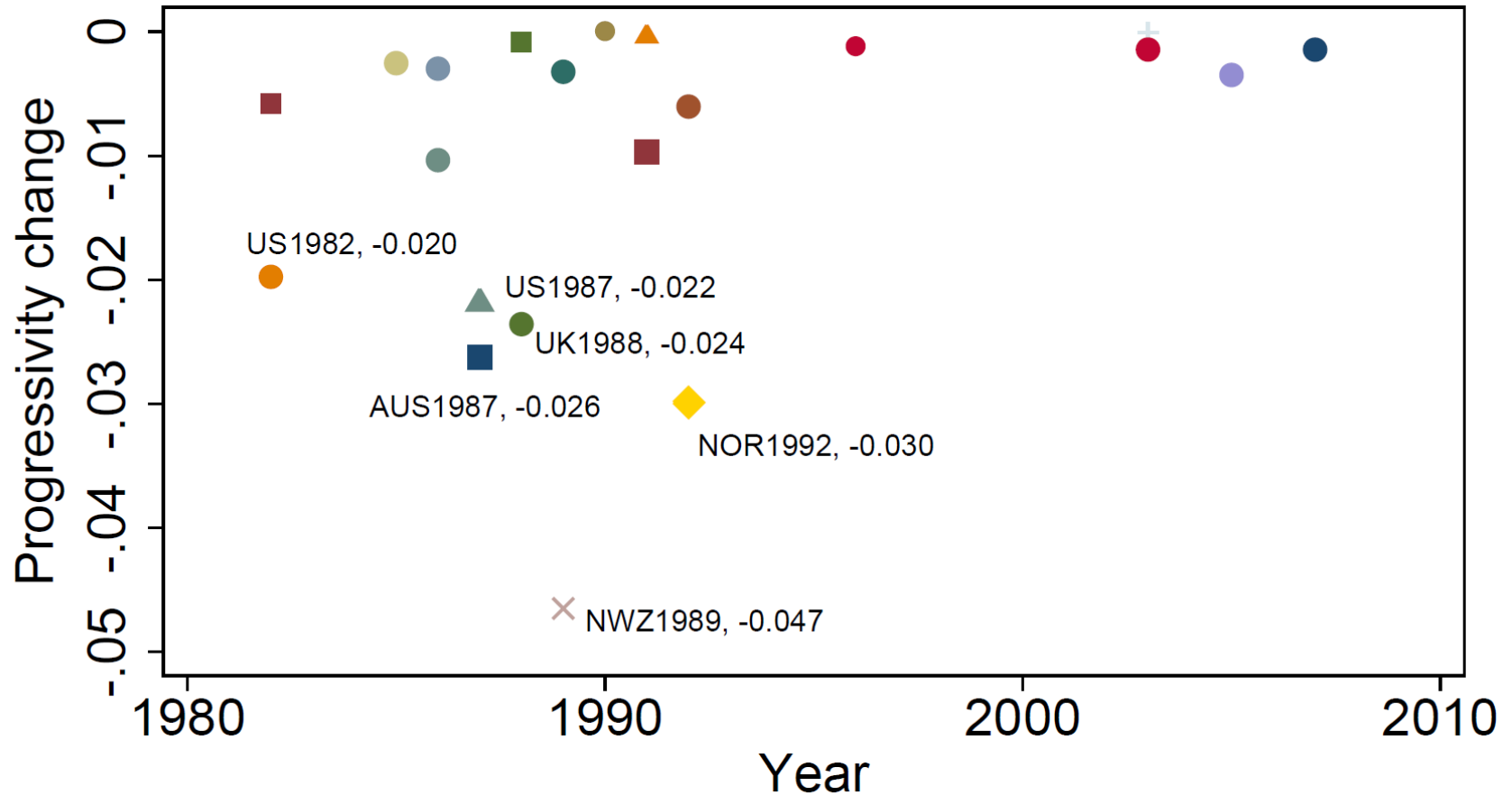
## B. Problems with the SCM

- a) No established inference (significance, confidence intervals)
- b) Control variables may drive SCG selection; "theory-less"
- c) Assumption about parallel post-treatment trends

# Empirical strategy here: Tax progressivity and top incomes

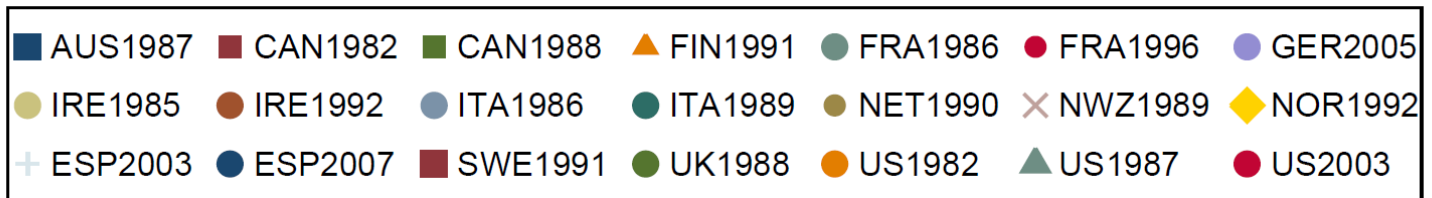
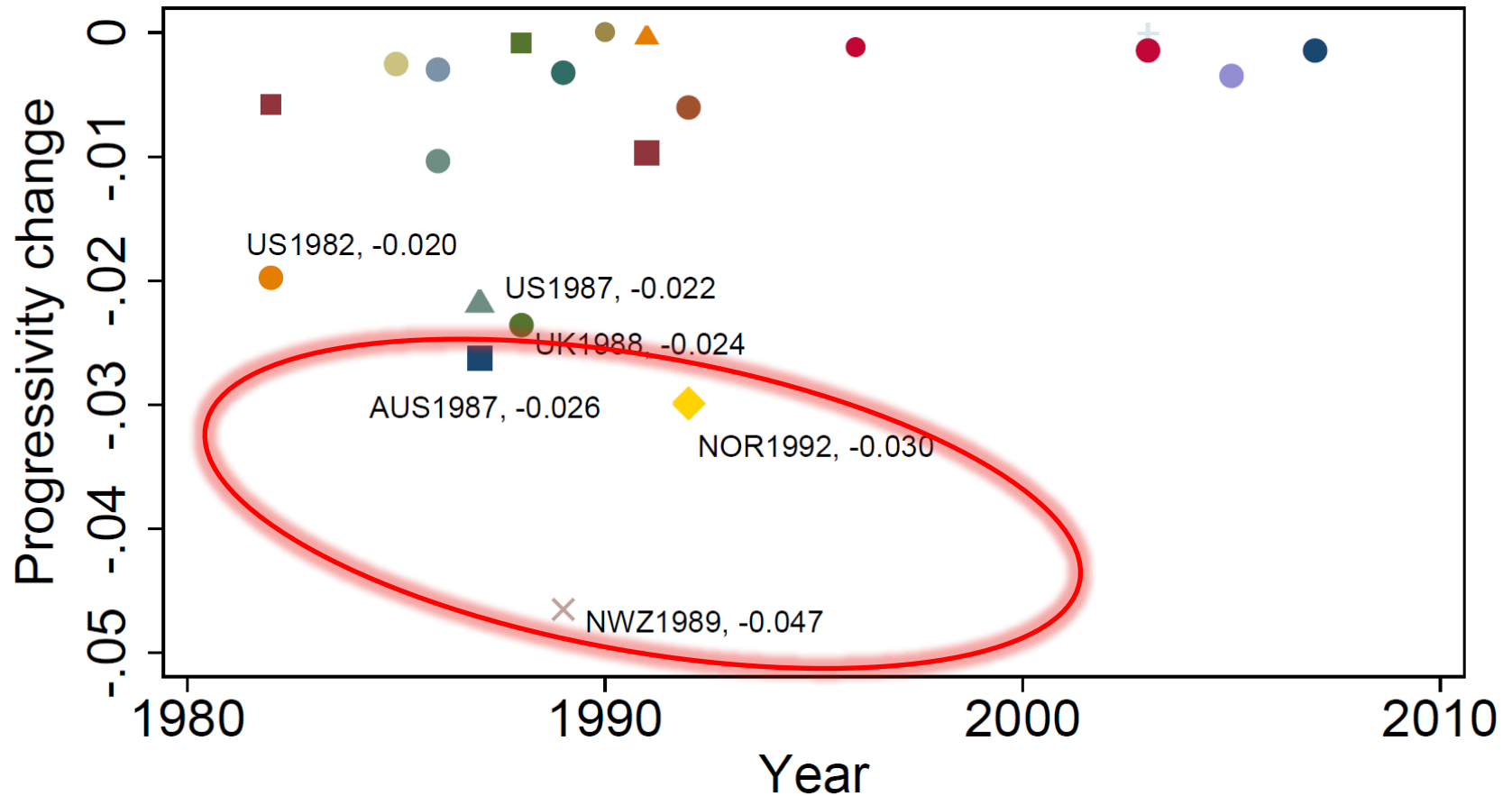
- **Step 1:** Identify *significant* tax reforms in terms of how much they reduced income tax progressivity
  - Use change in  $ARP = \frac{ATR^{top} - ATR^{ave}}{(Y^{top} - Y^{ave})/Y^{ave}}$
- **Step 2:** Estimate *synthetic control groups (SCG)*
- **Step 3:** Evaluate difference treated/non-treated series (main effect)
- **Step 4:** Robustness, inference of SCM
- **Step 5:** Mechanism analysis

# Step 1: How much did progressivity decline during the reform? (*Changes in Average Rate Progression*)



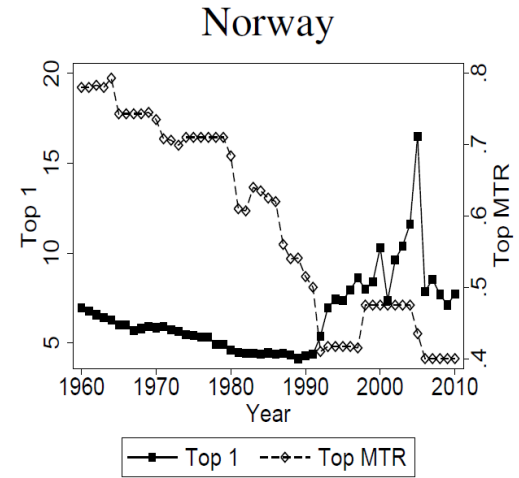
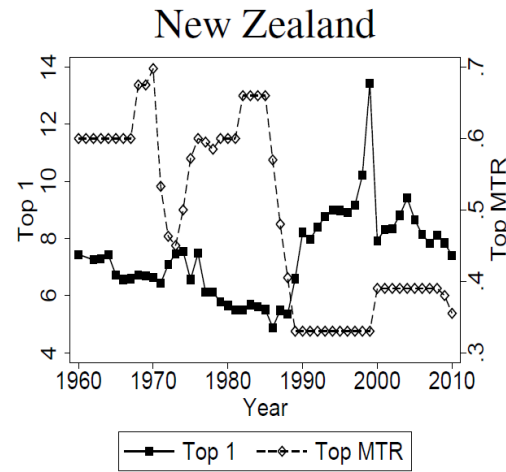
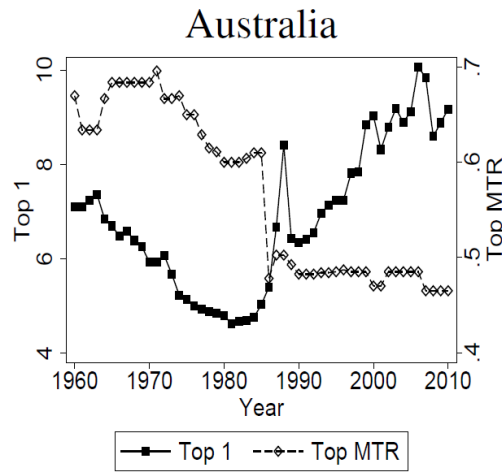


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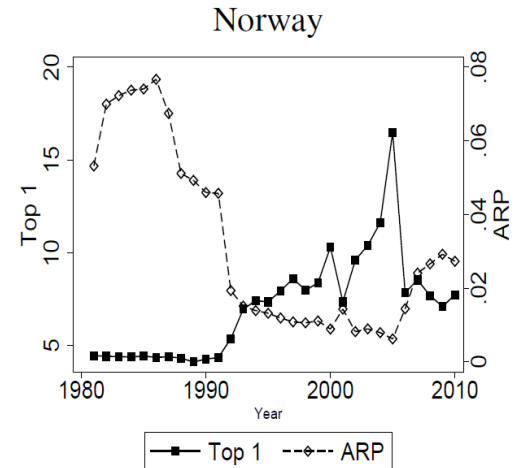
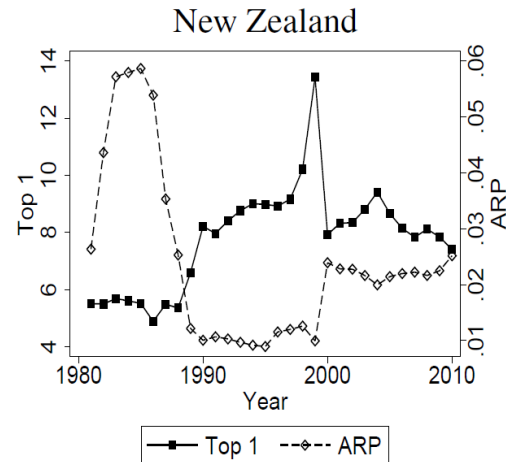
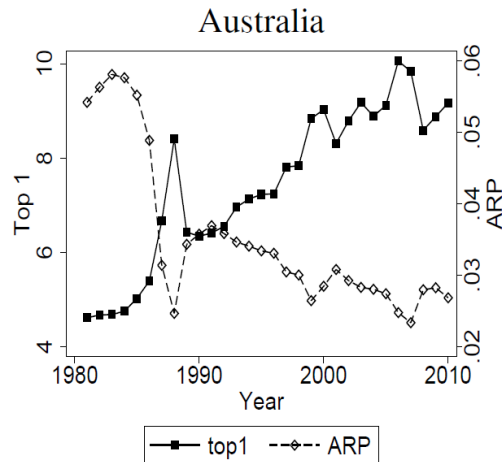


# Inspecting the data: Top 1% vs. Progressivity (ARP, MTR)

a) Top 1 vs  $MTR^{top}$



b) Top 1 vs  $ARP$



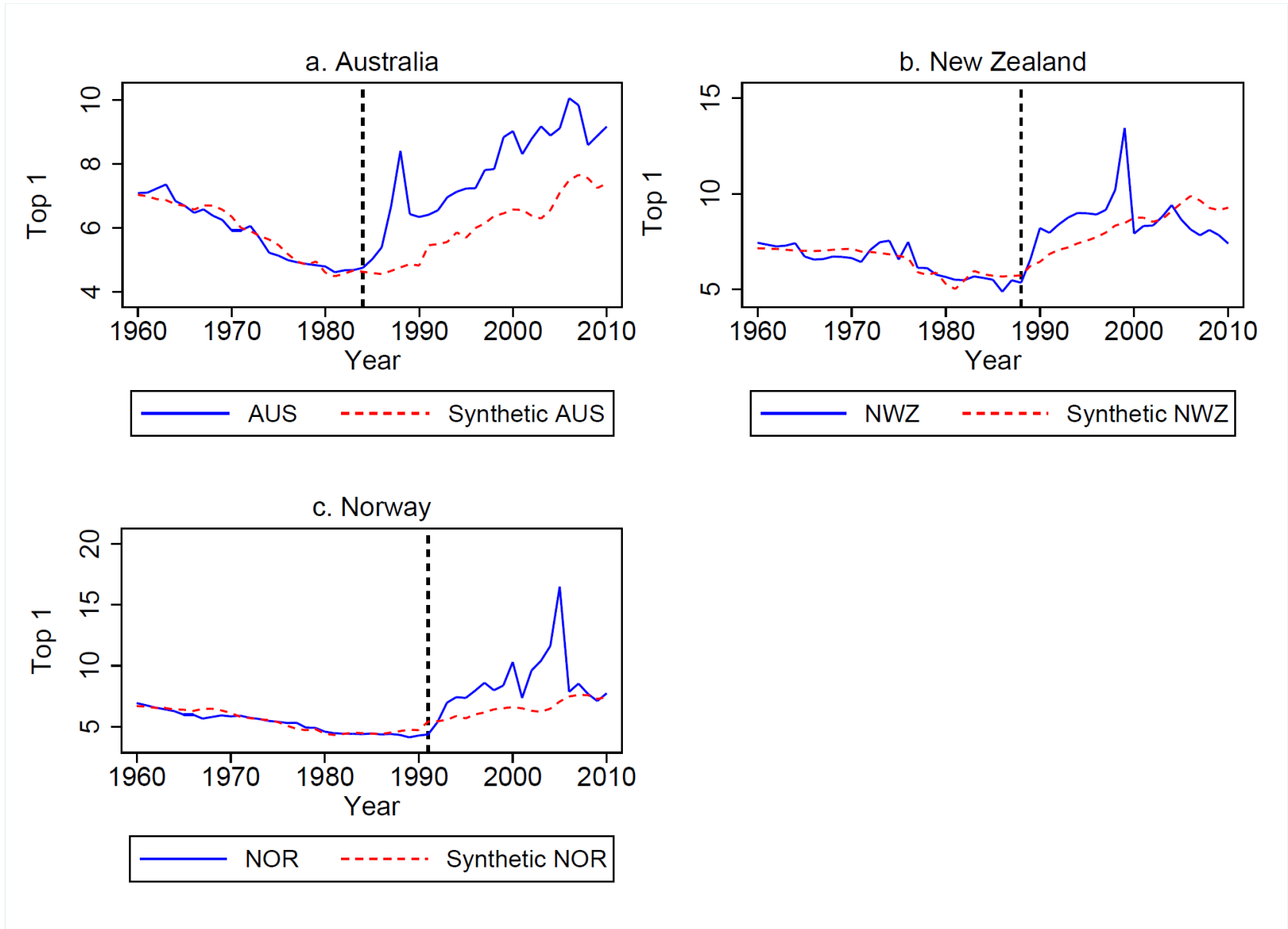
# Synthetic control group (SCG) estimation

- **Step 2:** SCG estimation for the treated countries: AUS, NOR, NZL
  - Use method of Abadie, Diamon & Heinmuller (2010)
  - Use pool of control variables (economy, demography, politics, tax system etc) to choose the *optimal* SCG
    - Baseline: GDPpc, Trade, Finance, Hours, Union, Educ, MTR, Debt growth, ARP
  - Compute SCG outcome
    - Weighted average of SCG outcomes
    - Note: The SCG is specific for each top fractile-country

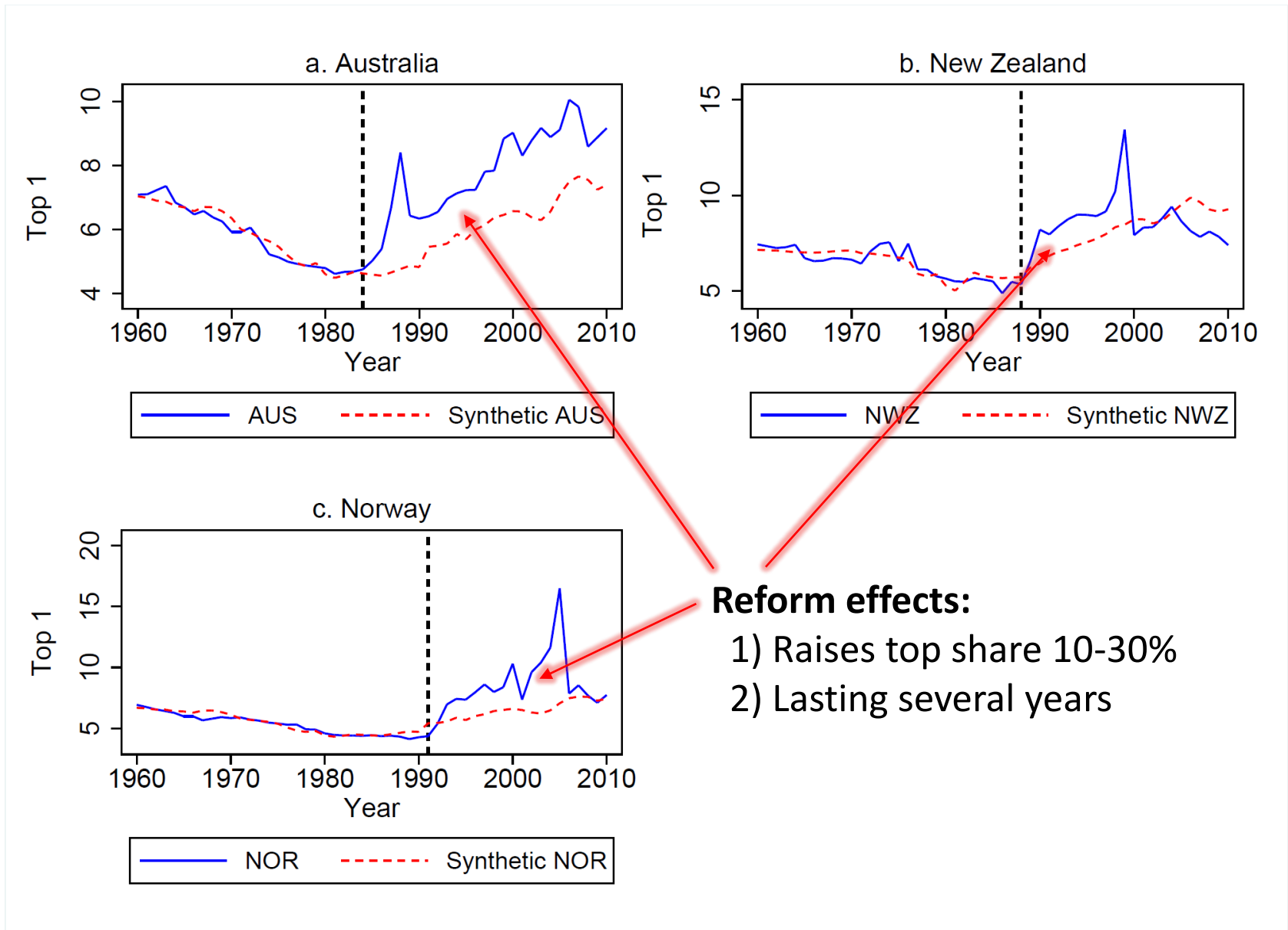
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  - Compute SCG outcome
    - Weighted average of SCG outcomes
    - Note: The SCG is specific for each top fractile-country
- **Step 3:** Plot series of treated country and SCG.
  - Same outcome (top income share) in treated country and non-treated SCG.
    - Interpretation: *Effect of tax reform on top income share*
  - This difference is the main SCM estimate
    - NB: We control for tax levels, so even SCG may change their taxes

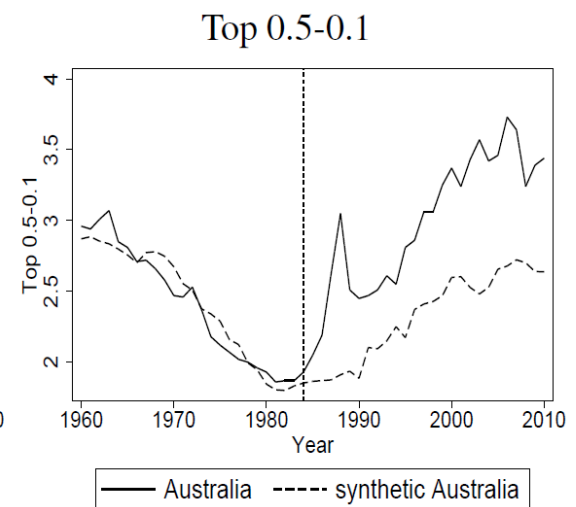
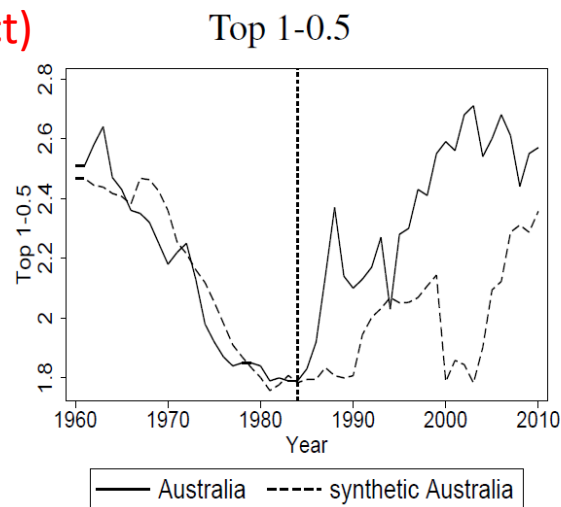
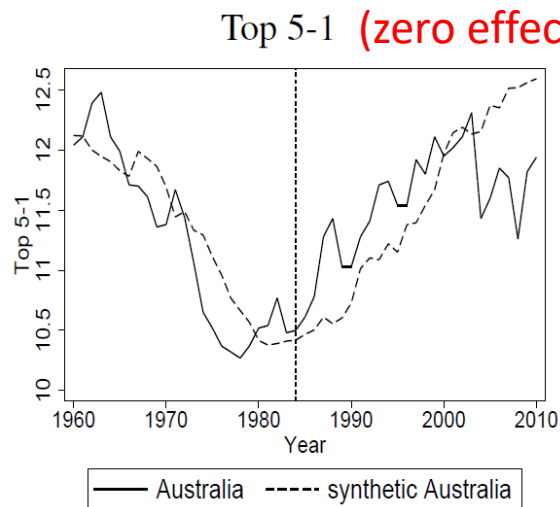
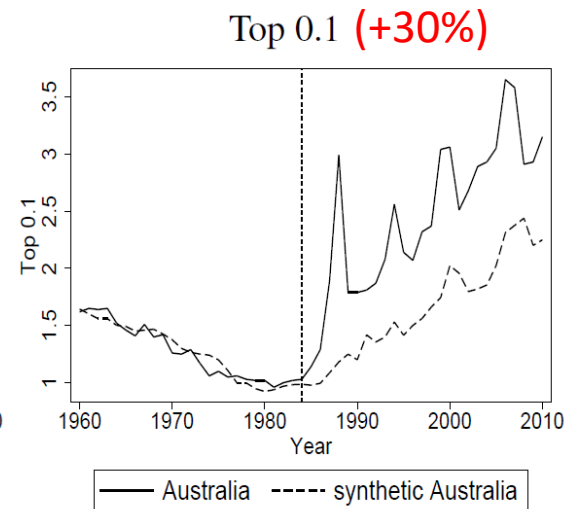
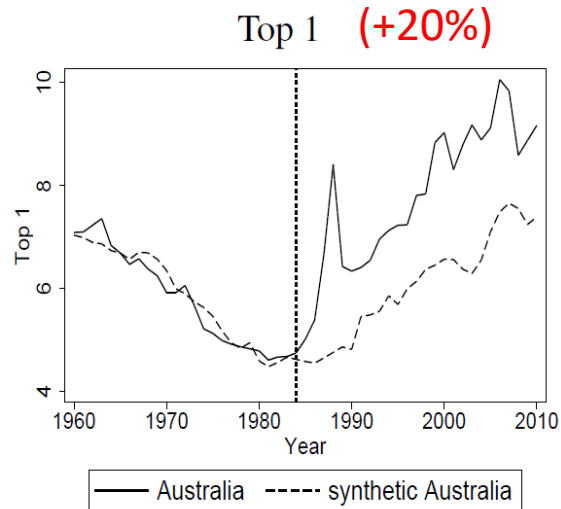
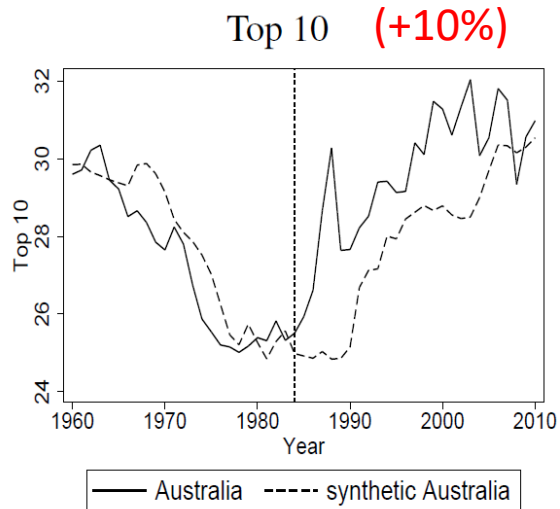
### 3. Results: Top 1% share – treated (tax reform) vs control



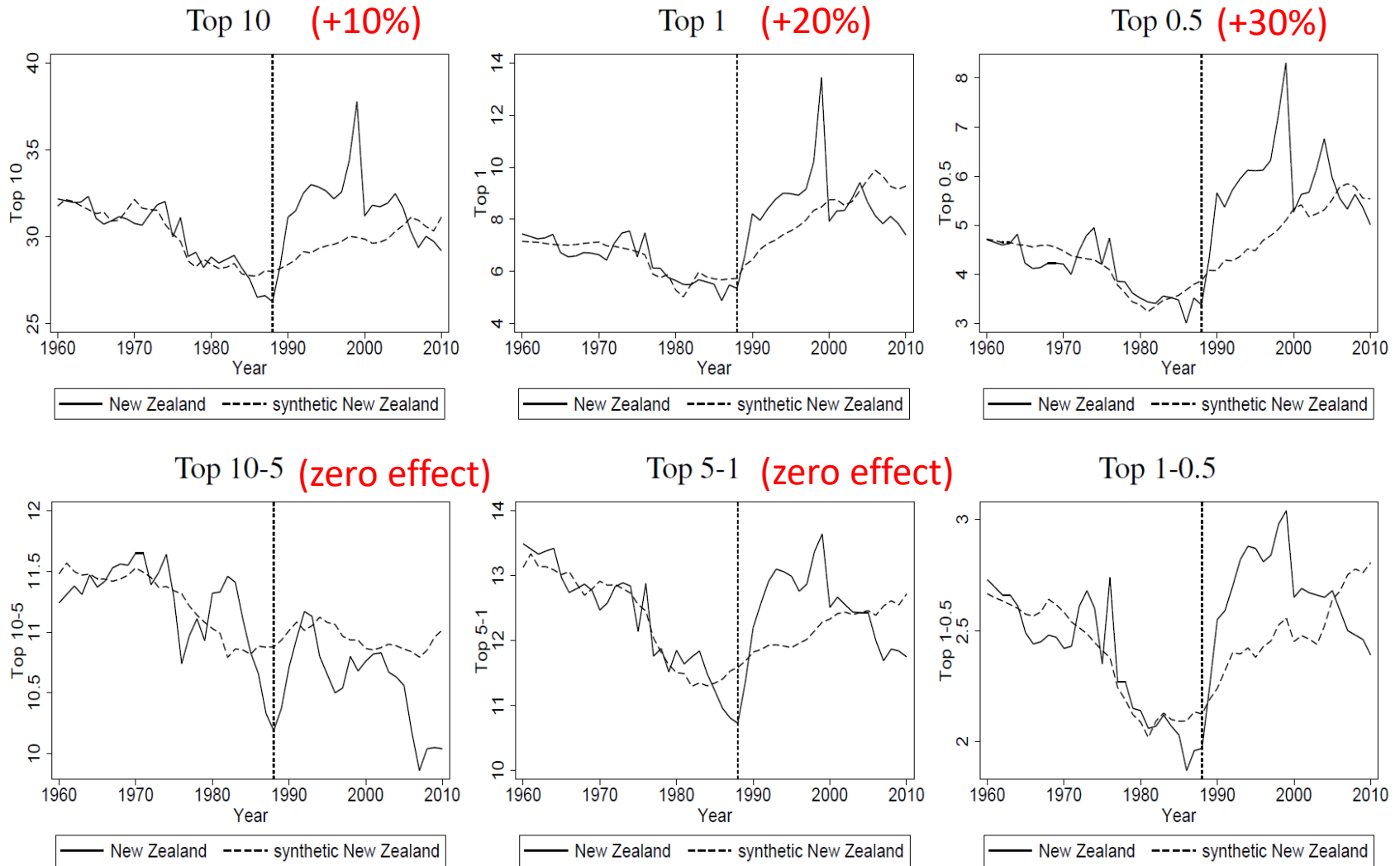
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# Heterogeneous responses: Australia



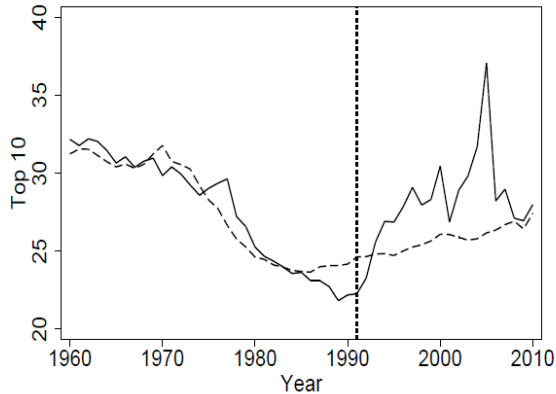
# Heterogeneous responses: New Zealand





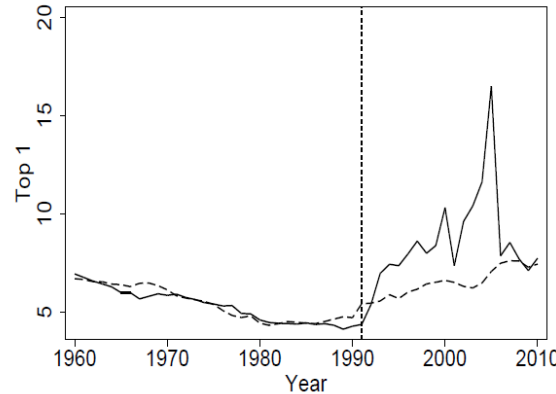
# Heterogeneous responses: Norway

Top 10 (+10%)



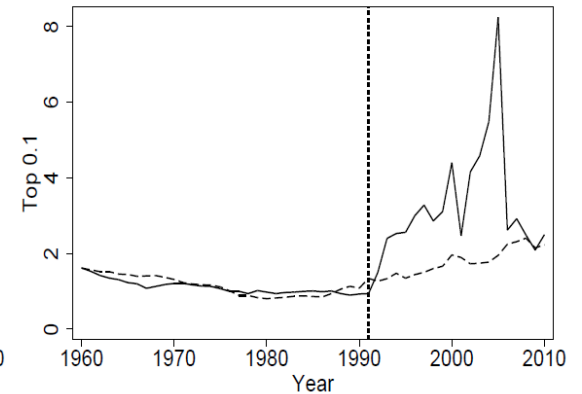
— Norway    - - - synthetic Norway

Top 1 (+20%)



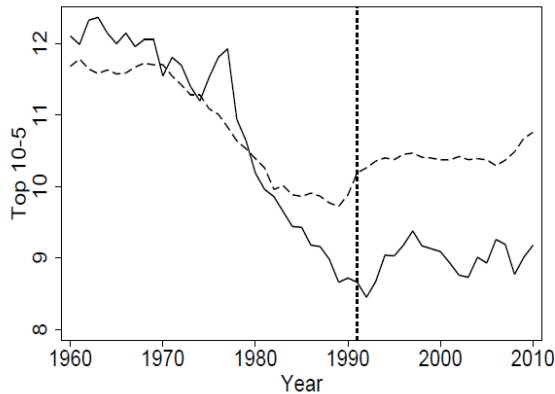
— Norway    - - - synthetic Norway

Top 0.1 (+30%)



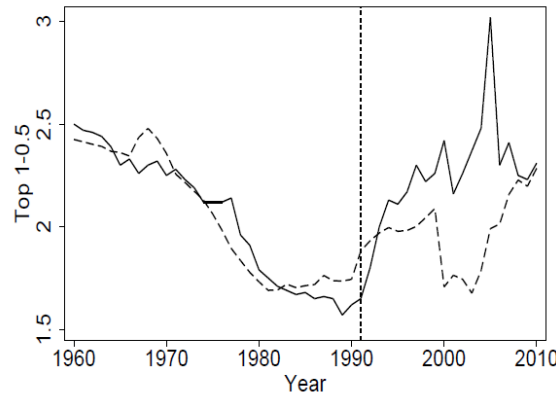
— Norway    - - - synthetic Norway

Top 10-5 (zero/neg)



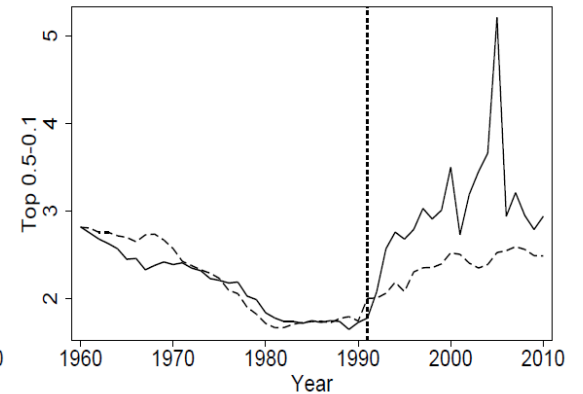
— Norway    - - - synthetic Norway

Top 1-0.5



— Norway    - - - synthetic Norway

Top 0.5-0.1



— Norway    - - - synthetic Norway

# Inference: Pseudo $p$ -values (from in-space placebo tests)

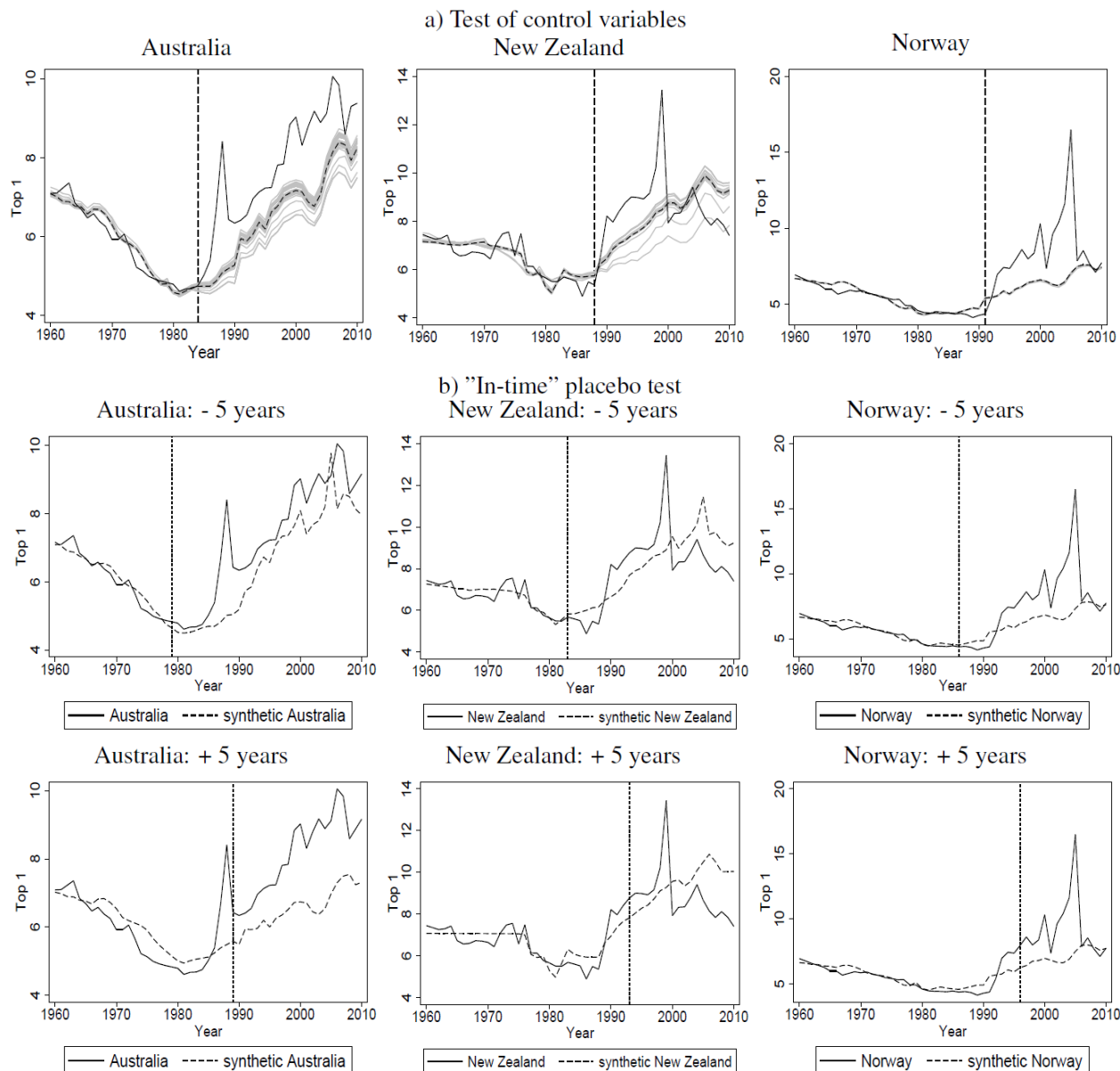
Year	a) Australia			b) New Zealand			c) Norway		
	Top 5-1	Top 1-0.5	Top 0.1	Top 10-5	Top 1-0.5	Top 0.5	Top 10-5	Top 1-0.5	Top 0.1
1985	0.4	0.27	0.11						
1986	0.3	0.09	0.11						
1987	0.1	0.09	< 0.01						
1988	0.2	< 0.01	< 0.01						
1989	0.3	0.09	< 0.01	0.8	0.2	0.1			
1990	0.3	0.09	< 0.01	0.9	< 0.01	< 0.01			
1991	0.3	0.09	< 0.01	0.5	< 0.01	< 0.01			
1992	0.3	0.18	< 0.01	0.1	0.1	< 0.01	0.91	0.45	< 0.01
1993	0.1	< 0.01	< 0.01	0.4	< 0.01	< 0.01	0.91	0.27	< 0.01
1994	0.3	0.18	< 0.01	0.5	< 0.01	< 0.01	0.91	0.18	< 0.01
1995	0.3	0.09	< 0.01	0.6	< 0.01	< 0.01	0.91	0.18	< 0.01
1996	0.3	0.18	< 0.01	0.7	0.1	< 0.01	0.91	0.18	< 0.01
1997	0.3	< 0.01	< 0.01	0.5	0.1	< 0.01	0.91	0.18	< 0.01
1998	0.3	< 0.01	< 0.01	0.4	0.1	< 0.01	0.91	0.18	< 0.01
1999	0.3	< 0.01	< 0.01	0.6	< 0.01	< 0.01	0.91	0.18	< 0.01
2000	0.3	< 0.01	< 0.01	0.4	0.2	0.3	0.82	< 0.01	< 0.01
2001	0.3	< 0.01	< 0.01	0.3	0.2	0.3	0.82	0.09	< 0.01
2002	0.3	< 0.01	< 0.01	0.3	0.3	0.2	0.82	< 0.01	< 0.01
2003	0.3	< 0.01	< 0.01	0.4	0.3	0.1	0.82	< 0.01	< 0.01
2004	0.4	< 0.01	< 0.01	0.4	0.3	< 0.01	0.82	< 0.01	< 0.01
2005	0.5	< 0.01	< 0.01	0.5	0.3	0.1	0.82	< 0.01	< 0.01
2006	0.5	< 0.01	< 0.01	0.5	0.5	0.2	0.82	0.27	0.22
2007	0.5	0.27	< 0.01	0.6	0.6	0.3	0.82	0.27	< 0.01
2008	0.6	0.36	< 0.01	0.7	0.7	0.2	0.82	0.36	0.22
2009	0.6	0.36	< 0.01	0.7	0.6	0.2	0.82	0.36	0.33
2010	0.6	0.36	< 0.01	0.7	0.7	0.3	0.82	0.36	< 0.01

# Main effects: Summary

- **We find significant positive effects on top income shares**
- **Effects are larger for the highest top groups**
  - Approx. +20% in top 1 percentile
  - Approx. +30% in top 0.1 percentile
  - Virtually zero effect in lower half of top income decile
- **Role of tax avoidance as mechanism?**
  - Income shifting responses to tax reforms are documented (e.g., Slemrod, 1996; Auerbach, 1988)
  - Capital income dominates also in AUS, NZL, NOR top 0.1 percentile
  - Potential mechanism for reform effect: Tax avoidance (?)



# SCM robustness: Different controls; In-time Placebo



# Diff-in-Diff regression: Average effect on top shares

## i) Top 10-1

	a) Panel data		b) Time-series		
	All reforms	Only "significant" reforms	AUS 1987	NWZ 1989	NOR 1992
Reform	0.027* (0.015)	0.047** (0.024)	0.016* (0.009)	0.107*** (0.011)	0.041 (0.051)
Obs.	713	713	51	50	51

## ii) Top 1-0.1

	a) Panel data		b) Time-series		
	All reforms	Only "significant" reforms	AUS 1987	NWZ 1989	NOR 1992
Reform	0.132*** (0.03)	0.259*** (0.042)	0.148*** (0.037)	0.286*** (0.042)	0.298 (0.179)
Obs.	713	713	51	49	51

## iii) Top 0.1

	a) Panel data		b) Time-series		
	All reforms	Only "significant" reforms	AUS 1987	NWZ 1989	NOR 1992
Reform	0.286*** (0.071)	0.689*** (0.108)	0.505*** (0.072)	0.462*** (0.072)	0.862** (0.42)
Obs.	598	598	51	49	51

# Other *drivers* (than prog/mtr): Tax brackets or Tax base

i) Tax brackets and top incomes						
	Top 10-1		Top 1-0.1		Top 0.1	
Tax Brackets	0.005 (0.006)	0.008 (0.009)	-0.062*** (0.017)	0.013 (0.021)	-0.151*** (0.038)	-0.002 (0.058)
1 – <i>MTR</i> <sup>s</sup>		0.004 (0.026)		0.247*** (0.08)		0.9*** (0.261)
Obs.	430	347	430	317	337	304
ii) Tax base and top incomes						
	Top 10-1		Top 1-0.1		Top 0.1	
Tax Base	-0.032 (0.037)	-0.041 (0.043)	0.069 (0.109)	0.049 (0.086)	-0.269 (0.331)	-0.195 (0.265)
1 – <i>MTR</i> <sup>s</sup>		-0.004 (0.023)		0.236*** (0.062)		0.929*** (0.168)
Obs.	376	339	376	309	298	296

- Result: When controlling for top tax rate, no direct effect from other tax reform-related outcomes

# Other *drivers* (than tax reform): Other policy reforms

- Two checks:

1. Diff-in-diff controlling for other reforms (in Giuliano et al, AEJ Macro)

	(1)	(2)	(3)	(4)	(5)	(6)	(7)
Tax reform	0.10*** (0.034)	0.09*** (0.036)	0.10*** (0.035)	0.10*** (0.034)	0.10*** (0.033)	0.09*** (0.034)	0.08*** (0.036)
Sig. tax reform	0.28*** (0.052)	0.27*** (0.053)	0.29*** (0.052)	0.28*** (0.051)	0.26*** (0.052)	0.28*** (0.049)	0.27*** (0.049)
Observations	472	472	472	472	472	472	472
Other reform	-	Product market	Trade	Capital Acc.	Current Acc.	Finance	All
Controls	YES	YES	YES	YES	YES	YES	YES
FE	YES	YES	YES	YES	YES	YES	YES
TE and t	YES	YES	YES	YES	YES	YES	YES

2. SCM estimation including all other policy reforms

- Highly similar as main results



## 5. Mechanism analysis: What accounts for the effects?

- Above: indications on a role of **tax avoidance** (non-real response)
- But what in the tax reform spurs such response?
  - Overall progressivity (ARP) or the top marginal tax rates (MTR)?
  - We run panel regression on each fractile:

$$y_{it}^S = \epsilon_1^S \pi_{it} + \epsilon_2^S \tau_{it} + \beta_1 Ref_{it} + \beta_2 Z_{it} + \gamma_t^S + \mu_t^S + \mu_i^S t + u_t^S$$

# Mechanism: Average progressivity or Top tax rates?

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iii) Top 0.1

Reform	0.313*** (0.077)		0.251** (0.103)		0.22*** (0.075)	
Sig. Reform		0.703*** (0.112)		0.473*** (0.117)	0.507*** (0.08)	
Rate Prog.			-0.336*** (0.091)	-0.161* (0.097)	-0.185* (0.102)	
1 - MTR				0.909*** (0.172)	0.731*** (0.166)	0.654*** (0.165)

- Result: Reform effect works through *marginal taxation*.

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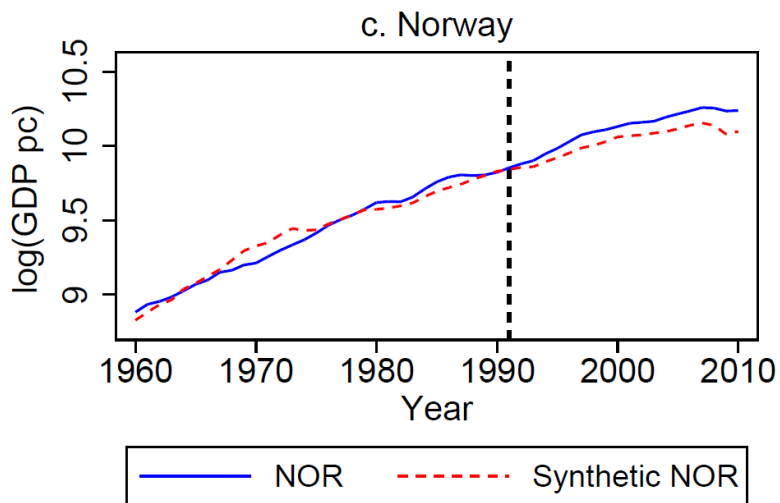
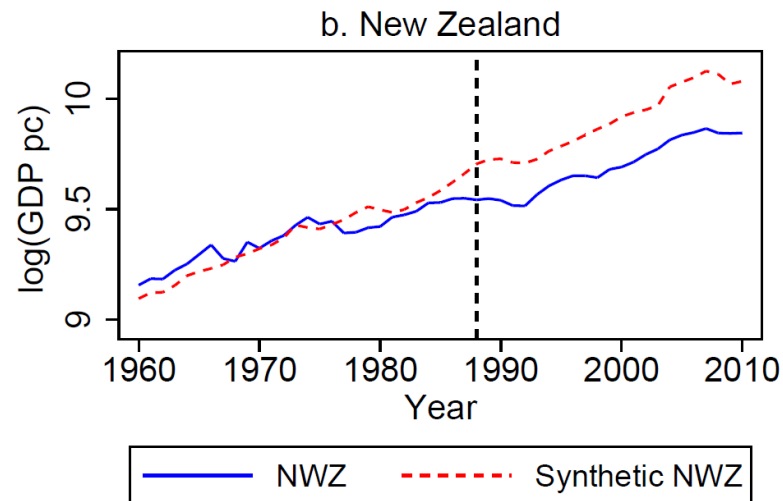
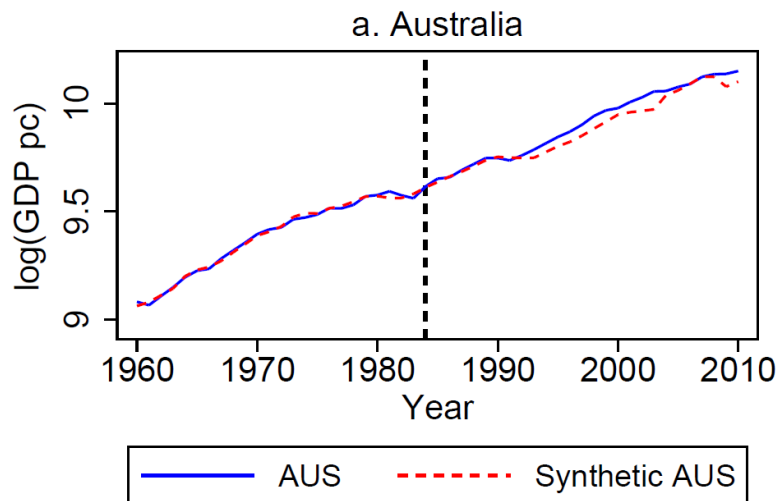
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# Efficiency effects: Larger share or size of the cake?

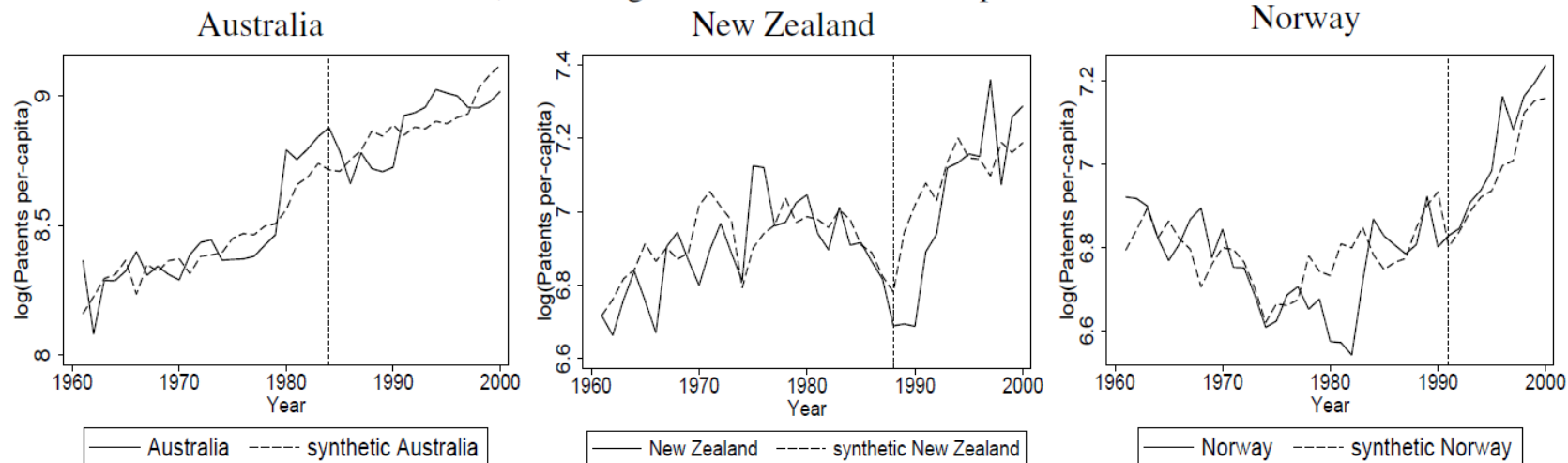
- Is the boost in top income shares caused by increased economic efficiency?
  - Tax reforms may unleash productive capacity (e.g., increased effort)
  - Supply-side motivations for tax reforms
- A simple test: SCM on efficiency-related outcomes
- Three efficiency outcomes:
  - GDP per capita
  - Number of patents
  - Tax revenues as share of GDP

# Efficiency effect: SCM on *GDP per capita*

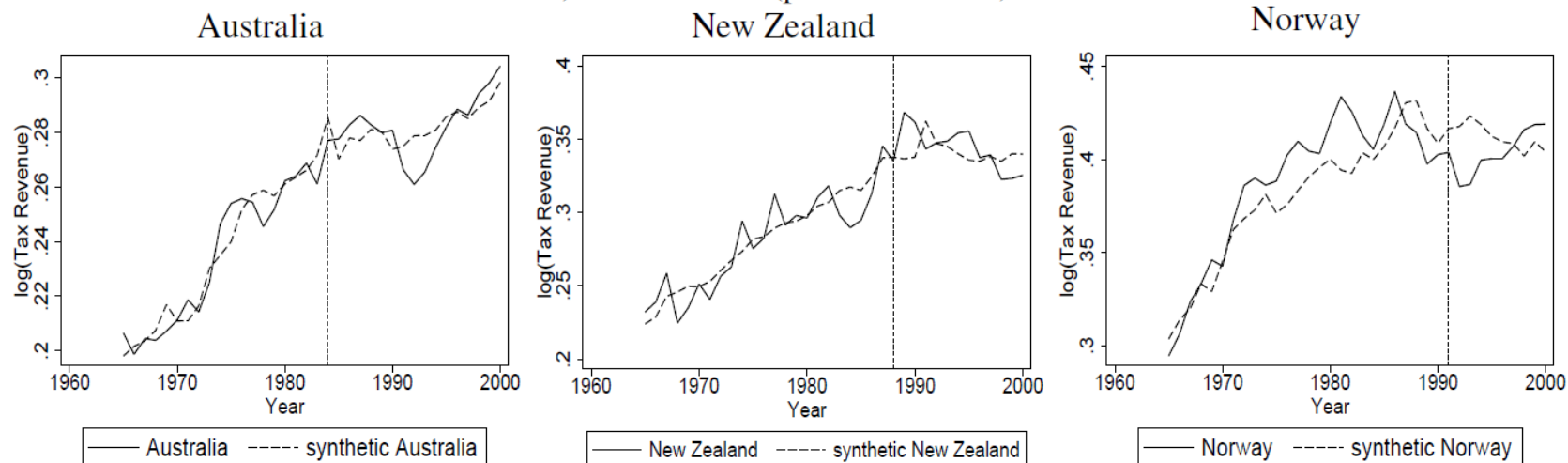


# Efficiency effect: SCM on *Patents, Tax revenues*

b) Annual growth rate in number of patents



c) Tax revenues (percent of GDP)



## 6. Conclusions

- New approach to study tax progressivity effects:
  - **Tax reforms** in the 1980s and 1990s that lowered progressivity a lot
  - **Top income shares** observed annually in treated, non-treated countries
  - **Synthetic control methodology** offering causal estimation framework
- Main finding: Lower progressivity boosts top income shares
  - Size of effect: increases of 10-30%
  - Largest effect in highest top (top 0.1 percentile)
  - Patterns robust in several dimensions
- Mechanisms: Not entirely clear from our analysis
  - Tax avoidance (shifting income across tax bases) a likely mechanism
  - "Real responses" less probable