NBER WORKING PAPER SERIES

TAXING BILLIONAIRES: ESTATE TAXES AND THE GEOGRAPHICAL LOCATION OF THE ULTRA-WEALTHY

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Working Paper 26387 http://www.nber.org/papers/w26387

NATIONAL BUREAU OF ECONOMIC RESEARCH 1050 Massachusetts Avenue Cambridge, MA 02138 October 2019

We thank Alan Auerbach, Sebastien Bradley, Isabel Martinez, Emmanuel Saez, Gabriel Zucman, and seminar participants at the University of California, Berkeley; the Federal Reserve Bank of San Francisco; the University of Nevada; the 2019 NBER Taxation conference; the 2019 Utah Tax Invitational; and the 2019 IIPF annual meetings for useful suggestions. We are grateful to Annemarie Schweinert and Amber Flaharty for excellent research assistance. The views expressed in this paper are solely those of the authors and do not necessarily reflect the views of the Federal Reserve Bank of San Francisco, the Board of Governors of the Federal Reserve System, or the National Bureau of Economic Research.

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Taxing Billionaires: Estate Taxes and the Geographical Location of the Ultra-Wealthy Enrico Moretti and Daniel J. Wilson NBER Working Paper No. 26387 October 2019 JEL No. H0,J01,R1

ABSTRACT

We study the effect of state-level estate taxes on the geographical location of the Forbes 400 richest Americans and its implications for tax policy. We use a change in federal tax law to identify the tax sensitivity of the ultra-wealthy's locational choices. Before 2001, some states had an estate tax and others didn't, but the tax liability for the ultra-wealthy was independent of their domicile state due to a federal credit. In 2001, the credit was phased out and the estate tax liability for the ultra-wealthy suddenly became highly dependent on domicile state. We find the number of Forbes 400 individuals in estate tax states fell by 35% after 2001 compared to nonestate tax states. We also find that billionaire's sensitivity to the estate tax increases significantly with age. Overall, billionaires' geographical location appears to be highly sensitive to state estate taxes. We then estimate the effect of billionaire deaths on state tax revenues. We find a sharp increase in tax revenues in the three years after a Forbes billionaire death, totaling \$165 million for the average billionaire. In the last part of the paper, we study the implications of our findings for state tax policy. We estimate the revenue costs and benefits for each state of having an estate tax. The benefit is the one-time tax revenue gain when a wealthy resident dies, while the cost is the foregone income tax revenues over the remaining lifetime of those who relocate. Surprisingly, despite the high estimated tax mobility, we find that the benefit exceeds the cost for the vast majority of states.

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1 Introduction

The United States exhibits vast geographical differences in the degree to which personal income, corporate income and wealth are taxed. There has been much debate in recent years on the costs and benefits of state and local governments imposing high taxes on their richest residents and most profitable firms, especially in light of the potential for tax flight (Kleven et al., 2019; Slattery and Zidar, 2019). But despite the strong interest of policymakers and voters, the effect of state and local taxes on the geographical location of wealthy individuals and businesses is not fully understood. Although there have been some important recent advances, there is still too "little empirical work on the effect of taxation on the spatial mobility of individuals," especially among high income individuals (Kleven et al., 2013a).

In this paper, we study the effects of state-level estate taxes on the geographical location of the Forbes 400 richest Americans between 1981 and 2017 and the implications for tax policy. The estate tax is essentially a wealth tax imposed on the very wealthy at the time of death (Kopczuk, 2009). We use the 2001 federal tax reform to identify the tax sensitivity of the ultra-wealthy's locational choices. We then use the estimated tax mobility elasticity to quantify the revenue costs and benefits for each state of having an estate tax. We find that billionaires' geographical location is highly sensitive to state estate taxes. Billionaires tend to leave states with an estate tax, especially as they get old. But despite the high tax mobility, we find that the revenue benefit of an estate tax exceeds the cost for the vast majority of states.

Estate taxes on the ultra-wealthy have potentially important consequences both for taxpayer families and for state governments. Given the rise of wealth owned by those at the top of the distribution, taxes on large estates have a growing potential to significantly impact budgets of entire states. Consider, for example, David Koch who died in August 2019 with an estimated net worth of \$50.5 billion. He was a resident of New York state, which has an estate tax. Given our estimate of the effective state estate tax rate on Forbes-reported wealth (which accounts for typical charitable deductions and sheltering), New York should eventually expect to receive revenues of around \$4.17 billion.¹ For the richest of the Forbes 400, the effect is even larger. Jeff Bezos is currently the richest person in the U.S., according to Forbes, with an estimated net worth of \$114 billion. He resides in Washington state, which has an estate tax. If he died today, his estate could expect to incur a state tax bill of around \$11.97 billion, raising Washington state's total 2017 Forbes 400 has estimated net

 $^{^{1}}$ In practice, the *timing* of estate tax payment depends on marital status and the time of the death of the spouse.

worth of "only" \$3.7 billion, and the typical impact of a Forbes 400 death on state revenues is of course smaller.

We begin the empirical analysis by investigating the quality of the Forbes 400 data. While prior research has found that individual net worth reported by Forbes is consistent with IRS confidential tax return data (Saez and Zucman, 2016), there has been no previous assessment of Forbes data on state of residence. We conduct an audit using published obituaries of deceased Forbes 400 individuals. State of death is likely to be highly correlated with the true state of residence, as people are more likely to die in their true primary residence state than in any other state.² We find that the state of residence listed by Forbes matches the state listed in obituaries in 90% of cases.

Furthermore, for each billionaire death, we estimate the effect on estate tax revenues of the state that Forbes identifies as the one of residence. We find a sharp and economically large increase in estate tax revenues in the three years after a Forbes billionaire death. We estimate that, on average, a Forbes billionaire death results in an increase in state estate revenues of \$165 million. Our estimate implies an effective tax rate of 8.25% after allowing for charitable and spousal deductions, and tax avoidance—a rate that is about half of the statutory rate. This rate is consistent with IRS estimates of federal estate tax liability for this group of taxpayers.

Having validated the Forbes data, we then turn to the core of our empirical analysis, namely the sensitivity of the ultra-wealthy's locational choice to estate taxes. We exploit the sudden change created by the 2001 EGTRRA federal tax reform. Before 2001, some states had an estate tax and others didn't. However, there was also a federal credit against state estate taxes. For the ultra-wealthy, the credit amounted to a full offset. In practice, this meant that the estate tax liability for the ultra-wealthy was independent of their state of residence.³ As part of the Bush tax cuts of 2001, the credit was eliminated. The estate tax liability for the ultra-wealthy suddenly became highly dependent on state of residence.

We first use a double-difference estimator to estimate the differential effect of having an estate tax before versus after 2001 on the number of Forbes 400 individuals in a state, allowing for state and year fixed effects. We find that before 2001, there is a slight *positive* correlation between estate tax status and the number of Forbes 400 individuals in the state,

²For estate tax purposes, what matters is the primary domicile state; the physical location of death is irrelevant and thus individuals have no incentive to strategically die in a state other than their residence state for tax purposes.

 $^{^{3}}$ As explained below, the rate schedule of the credit was such that for the ultra-wealthy (but not for those further down the wealth distribution) the credit fully offset their state estate tax liability. Put differently, state estate taxes in practice did *not* exceed the credit for, and only for, the ultra-wealthy because every state's top marginal tax rate equaled the top marginal credit rate. In addition, all states had a separate so-called "pick-up" tax that was structured to exactly equal the federal credit.

after conditioning on state fixed effects. After 2001, the opposite becomes true: the number of Forbes 400 individuals in estate tax states becomes significantly lower. On average, estate tax states lose 2.35 Forbes 400 individuals relative to non-estate tax states. Given the pre-2001 average baseline Forbes 400 population in estate tax states, which is near 8, the implied semi-elasticity is -0.33. Instrumenting contemporaneous estate tax status with estate tax status as of 2001 yields very similar results, confirming that the OLS result is not due to endogenous estate tax adoption or repeal after the 2001 reform.

We then turn to a triple-difference estimator based on the notion that a billionaire's sensitivity to the estate tax should increase as they age. In terms of identification, the triple-differenced models allow us to control for the interaction of estate tax state X post-2001. Any correlation between changes in the unobserved determinants of Forbes' 400 geographical locations and changes in estate status after 2001 is accounted for. We find that the number of old Forbes billionaires in estate tax states drops after 2001 relative to the number of younger Forbes billionaires. The elasticity of location with respect to estate taxes of the old billionaires is significantly higher than the elasticity of the young billionaires.⁴

As an alternative way to quantify the effect of estate taxes on Forbes billionaires locational choices, we study the probability that individuals who are observed residing in estate tax states before the reform move to a non-estate tax states after the reform; and, inversely, the probability that individuals who are observed living in non-estate tax states before the reform move to an estate tax states afterwards. Among billionaires observed in 2001, we find a high probability of moving from estate tax states to non-estate tax states after 2001 and a low probability moving from non-estate tax states to estate tax states. By year 2010—namely 9 years after the reform—21.4% of individuals who originally were in a estate tax state have moved to a non-estate tax state; while only 1.2% of individuals who originally were in a pronounced for individuals 65 or older, consistent with the triple-difference models.

Overall, we conclude that billionaires' geographical location is sensitive to state estate taxes. The 2001 EGTRRA Federal Reform introduced large differences in billionaires' estate tax burdens among states where there had been none. These ultra-wealthy individuals appear to have responded by leaving states with estate taxes in favor of states without estate taxes. One implication of this tax-induced mobility is a large reduction in the aggregate tax base subject to subnational estate taxation. We estimate that tax-induced mobility resulted in 23.6 fewer Forbes 400 billionaires and \$80.7 billion less in Forbes 400 wealth exposed to state

⁴This is consistent with Kopczuk (2007), who finds that the onset of a terminal illness leads to a large reduction in the value of estates reported on tax returns and that this reduction reflects "deathbed" estate planning. He interprets this as evidence that wealthy individuals care about disposition of their estates, but that this preference is dominated by the desire to maintain control of their wealth while young and healthy.

estate taxes.

In the final part of the paper, we study the implications of our estimates for state tax policy. States face a trade-off in terms of tax revenues. On the one hand, adoption of an estate tax on billionaires implies a one-time estate tax revenue gain upon the death of a billionaire in the state. On the other hand, our estimates indicate that the adoption of an estate tax lowers the number of billionaires residing in the state. In terms of state tax revenue, the main cost is the foregone income tax revenues over the remaining lifetime of each billionaire who leaves the state due to the estate tax (as well as any potential new billionaires that might have moved to the state in the absence of an estate tax). The cost of foregone income tax revenues is, of course, higher the higher is the state's top (average) income tax rate. We estimate the revenue costs and benefits for each state of having an estate tax, either just on billionaires or the broader population of all wealthy taxpayers.⁵

To quantify costs and benefits of an estate tax on billionaires, we use our estimates of the elasticity of mobility with respect to estate taxes and data on expected life expectancies and the number and wealth of billionaires by age in each state. Surprisingly, despite the high tax mobility elasticity, we find that for most states the benefit of additional revenues from adopting an estate tax significantly exceeds the cost of foregone income tax revenue due to tax-induced mobility.

The cost-benefit ratio of 0.69 for the average state, indicating that the the additional revenues from an estate tax exceed the loss of revenues from foregone income taxes by 31%. The ratio varies across states as a function of the state income tax rate and, to a lesser extent, the ages of the state's billionaires. In California, the cost-benefit ratio is 1.45, indicating that if California adopted the estate tax on billionaires, the state would lose revenues by a significant margin. (Currently, California does not have an estate tax.) The high cost reflects the very high personal income top tax rate in the California, which implies that each billionaire leaving the state has a high opportunity cost in terms of forgone personal income tax revenue. By contrast, in Texas or Washington state the ratio is 0, since there is no income tax. The adoption of an estate tax in these states increases tax revenues unambiguously. We estimate that state revenues in Florida and Texas would increase by \$7.67 billion and \$7.06 billion, respectively, if the states adopted an estate tax. Overall, we estimate that 28 of 29 states that currently do not have an estate tax and have at least one billionaire would

⁵This is not the usual Laffer-curve style trade-off, where states with high tax rates are compared to states with low tax rates. There is little empirical variation in estate tax rates—with virtually all states at either zero or 16%. While states are free to set different rates, in practice they generally have stuck with 16%, which is a historical carryover from the 16% maximum rate in the federal credit. Thus, in our calculations we compare tax revenues in the case where a state adopts a 16% estate tax with the case where a state does not adopt an estate tax.

experience revenue gains if they adopted an estate tax on billionaires, with California the lone exception.

We caution that in our cost-benefit analysis, our measure of costs only includes the *direct* effects on state revenues of losing resident billionaires, namely the foregone taxable income. It does not include potential *indirect* effects on states if billionaire relocation causes relocation of firms and investments as well as a reduction of donations to local charities. A comprehensive analysis of these indirect effects is beyond the scope of this paper.⁶

Finally, we extend the analysis to consider the costs and benefits of adopting a broader estate tax, modeled on the federal estate tax. The federal estate tax applies not just the top 400 but all wealthy taxpayers with estate values above an exemption threshold, which in 2017 was \$5.5 million for individuals and \$11 million for couples. For each state, we compute the costs and benefits of an estate tax on this broader group of wealthy taxpayers under alternative assumptions on the elasticity of mobility. Our findings suggest that that the policy implications for states that we draw based on a billionaire estate tax generally extend to a broad estate tax: for most states, the benefits of adopting an estate tax exceed the costs, whether the tax is imposed on the ultra-wealthy or the merely wealthy.

Our paper is not the first to study the geographic sensitivity of individuals to subnational estate taxes. Bakija and Slemrod (2004) also looked at state estate taxes, but their analysis pertained to the pre-2001 time period, before the elimination of the federal credit, and focused on taxpayers with wealth far below that of the Forbes 400, finding mixed results on tax-induced mobility.⁷ Brülhart and Parchet (2014) look at the effect of bequest tax differences across Swiss cantons and, in contrast to our findings, estimate that high-income retirees are relatively inelastic with respect to tax rates, while Brülhart et al. (2017) study differences across Swiss cantons in wealth taxes.⁸

More generally, our paper relates growing body of work on the sensitivity of high income individuals locational choices to subnational taxes. Kleven et al. (2019) have a recent survey of the literature. Most of the literature has focused on personal income taxes. Moretti and Wilson (2017) and Akcigit et al. (2016) find evidence that top patenters, which have very

⁶There could also be an additional effect on those who do not leave the state, in the form of increased tax avoidance and reduced saving (beyond what has already occurred in response to the nationwide federal estate tax). Increased tax avoidance is already incorporated in our estimates of the effective estate tax rate, but some of the response may show up as reduced capital income.

⁷Bakija and Slemrod use the fact that the combined federal and state estate ATRs varied across states even prior to 2001 due to state differences in exemption levels and marginal rate schedules. The pre-2001 federal credit effectively offset any cross-state ATR differences for estates far above \$10 million.

⁸See Kopczuk (2009) for a review of the literature on national estate taxes and Slemrod and Gale (2001) for a discussion of the equity and efficiency of national estate taxes. More recently, Jakobsen et al. (2018) study the effect of wealth taxation on wealth accumulation using individual level data from Denmark, finding a sizable response for the ultra-wealthy.

high income, are quite sensitive to income taxes in their choice of location. On the other hand, Young et al. (2016) and Young and Varner (2011) find limited evidence of tax-induced mobility of millionaires. There is also a related literature on taxes and international mobility. Akcigit et al. (2016) find modest elasticities of the number of domestic and foreign inventors with respect to the personal income tax rate. Kleven et al. (2013b) study a specific tax change in Denmark while Kleven et al. (2013a) focus on European soccer players. Both find substantial tax elasticities.

2 Background on State Estate Taxes

2.1 History and Structure

State level estate taxes in the United States date back to the early nineteenth century, pre-dating the 1916 adoption of the federal estate tax. In 1924, a federal estate tax credit was enacted for state estate tax payments, up to a limit. This credit remained in place for the rest of the twentieth century.⁹ This limit was determined by a progressive credit rate schedule. The credit rate schedule prevailing from 1954 to 2001 is shown in Appendix Table A1 (based on Table 1 of Bakija and Slemrod (2004)). The top marginal credit rate of 16% applied to all estate values above \$10,040,000. Thus, for estates far above this value – and note that the minimum wealth in the Forbes 400 in 2001 was \$830 million – both the marginal and average credit rate was 16%.

During the era of the federal credit, there were two types of state taxes on estates. First, many states took advantage of the existence of the federal credit and enacted statutes that imposed so-called "pick-up" taxes that were structured such that the tax liability for a given taxpayer would exactly equal their maximum federal credit amount. In effect, the federal government picked up the tab for taxpayers facing these state pick-up taxes. Thus, state pick-up taxes effected no variation across states in tax liability for any taxpayer and thus should have had no effect on locational decisions of wealthy households. Second, many states imposed estate taxes above and beyond the pick-up taxes. These estate taxes had progressive rate schedules, with a top marginal tax rate of 16% or less and applying to estate values near or below \$10 million (as of 2001).¹⁰ Thus, for estate values far above \$10 million, the average tax rate (ATR) for any state estate tax was never above 16%. For very high net worth estates, such as those of the Forbes 400, the average credit rate of the federal credit

⁹The credit was for "estate, inheritance, legacy, or succession taxes paid as the result of the decedent's death to any state or the District of Columbia" (IRS Form i706 (July 1998)).

 $^{^{10}}$ See Bakija and Slemrod (2004) for a comprehensive description of these pre-2001 state estate taxes.

always equaled or exceeded the average tax rate imposed by state estate taxes.¹¹

For our purposes, the key point is that, prior to 2001, the combined federal and state ATR on estates of the ultra-wealthy was independent of their state of residence. Thus, state estate taxes should have had no effect on locational decisions of ultra-wealthy households.

This situation changed completely with the 2001 Economic Growth Tax Relief and Reconciliation Act (EGTRRA). The EGTRRA phased out the credit over 2001 to 2004 and eliminated it completely after 2004. It was replaced with a much less generous deduction. For our purposes, the main effect of the reform was that combined federal and state ATR on estates of the ultra-wealthy became highly dependent on their state of residence. Thus, after the reform, state estate taxes could potentially affect the locational decisions of ultrawealthy households. The exact magnitude of effect is one of the questions that we investigate empirically in this paper.

The estate tax provisions of the 2001 reform were largely unexpected. In our empirical analysis we will investigate empirically the exact timing of the estimated effects. In the years since 2001, some of the states that had estate taxes repealed them, while other states chose to enact new estate taxes or convert expiring pick-up taxes into regular estate taxes (see Michael (2018)).

2.2 Estate Tax Planning and Avoidance

State estate taxes are primarily owed to single domicile state, which is the one determined to be the decedent's primary state of residence. Specifically, *intangible* assets – financial and business assets – are taxed solely by the primary domicile state (if the state has an estate or inheritance tax). The tax base for *tangible* property, which is primarily real estate, is apportioned to states in proportion to property value. Tangible property is generally a small share of the net worth of Forbes 400 individuals. Raub et al. (2010)'s study of federal estate tax returns of Forbes 400 decedents reported that real estate accounted for less than 10% of total assets on average, while financial assets accounted for 85%. (The other 5% was "other assets," which could be tangible or intangible.)

States consider a long list of both quantitative and qualitative indicators in order to determine the primary domicile state of a decedent. According to Bakija and Slemrod (2004), relevant criteria include "physical location in the state for more than six months of the year, how many years the taxpayer had lived in the state, strength of ties to the local community, and where the taxpayer was registered to vote and maintained bank accounts, among many other factors. Disputes sometimes arise over which state can claim the decedent as a resident

¹¹Cooper (2006) notes that this convergence between the federal estate average credit rate and state estate ATR for the highest value estates dates back to at least 1935.

for state tax purposes. Most states subscribe to an interstate agreement that provides for third-party arbitration in such situations." Note that location of death is irrelevant for tax purposes.

In practice, not all estate wealth is taxed (either by federal or state authorities). First, wealth bequeathed to a spouse generally is not subject to estate taxation *until the spouse dies* (assuming the spouse's wealth at time of death is above the estate tax threshold). Second, charitable bequests are not taxed. IRS Statistics on Income data (SOI 2017) show that estates worth \$20 million or more deducted 24% of their taxable wealth due to charitable bequests. Third, estate taxpayers have some latitude to make valuation discounts on assets that do not have transparent market prices. For example, artwork and the value of privately-held companies can be difficult to appraise. Note that assets in trusts *are* subject to estate taxation as long as the decedent was the trustee (that is, if she controls where assets were invested and who were the beneficiaries).¹²

A recent study (Raub et al., 2010), utilizing confidential estate tax returns for deceased individuals that had been in the Forbes 400, found that the average ratio of net worth reported on tax returns to that reported by Forbes was 50%. Accounting for spousal wealth, which is excluded from the estate tax base but is often included in the Forbes wealth estimate, brings the ratio up to 53%. The authors attributed the remaining gap primarily to valuation discounts.

In our empirical analysis, we estimate the elasticity of the number of billionaires in a state with respect to state estate taxes. The elasticity that we quantify is to be interpreted as inclusive of any sheltering and evasion. This is the reduced-form parameter relevant for policy. In the post-EGTRRA world, without the federal credit to offset state estate tax liabilities, an ultra-wealthy individual's potential combined estate tax liability became hugely dependent on their domicile state. For instance, Washington state enacted an estate tax in 2005 with a top rate of 20%, the highest in the nation. Thus, an individual with a \$1 billion estate could potentially save up to \$200 million in their eventual estate tax liability simply by moving from Washington to Oregon, or any other of the over 30 states without an estate tax. In other words, one's state estate average tax rate (ATR) could vary across states for personal income, sales, or property. Moreover, the estate tax applies not to a single year of income or sales, but to a lifetime of accumulated wealth. Moving to avoid a high personal income tax will lower one's tax liability resulting from the flow of income in that year and each subsequent year they remain in the state. But moving to escape an estate tax

 $^{^{12}}$ Slemrod and Kopczuk (2003) investigate the temporal pattern of deaths around the time of changes in the estate tax system and uncover some evidence that there is a small death elasticity.

effectively avoids estate taxation on a lifetime of income flows net of consumption. Hence, it is quite conceivable that state estate taxes would factor into the tax and estate planning of ultra-wealthy individuals and could potentially affect decisions of the ultra-wealthy regarding where to live, especially as they get older.

3 Data and Stylized Facts

3.1 Forbes 400

Forbes magazine has published a list of the 400 wealthiest Americans every year since 1982. Forbes defines Americans as "U.S. citizens who own assets in the U.S.". They construct these lists as follows: Forbes reporters begin with a larger list of potential candidates. They first interview individuals with potential knowledge of the person's assets, such as attorneys and employees, as well as the candidates themselves whenever possible. They then research asset values using SEC documents, court records, probate records and news articles. Assets include "stakes in public and private companies, real estate, art, yachts, planes, ranches, vineyards, jewelry, car collections and more." Forbes also attempts to estimate and net out individuals' debt, though they admit that debt figures can be difficult to obtain, especially for individuals associated with privately-held businesses. For more details on their methodology, see: www.forbes.com/forbes-400.

We collected the published Forbes 400 tables from 1982 to 2017. Data for the years 1982 to 1994 were originally in paper format and were digitized by us; the reminder was in electronic format. These tables include each individual's name, net worth, age, source of wealth, and residence location.¹³ The listed residence location is typically a single city and state, though there are many instances of multiple listed locations. We record all listed locations, though in our empirical analyses we assume the first listed state is the primary residence. Our results are robust to dropping observations with multiple states of residence. Because the name string for a given individual often has slight variations in the Forbes list from year to year (e.g., William vs. Bill or including vs. omitting a middle initial), we performed extensively cleaning of the name variable in order to track individuals longitudinally.

As has been noted elsewhere (e.g., Saez and Zucman (2016) and Smith et al. (2019)), there has been a stark increase over time in the wealth of the super rich in the US in general, and Forbes 400 in particular. Figure 1 plots average wealth over time, in both real and nominal dollars. (Throughout the remainder of the paper, dollars values are in constant

¹³The Forbes 400 data we obtained for 2002 did not include state of residence and hence 2002 data are not used in our analyses. Also, data for some years (1995-1998 and 2001) did not include age, though we were able to calculate it using age information for the same individuals from other years.

2017 dollars.) The Figure shows that in real terms, the wealth of the average Forbes 400 billionaire has increased tenfold since 1982.¹⁴

Panel A of Appendix Table A2 shows summary statistics. We have 13,432 individualyear observations, covering 1,755 unique individuals. Over the 1982-2017 sample period, the median age of a Forbes billionaire was 65 and their median real wealth (in 2017 dollars) was \$1.6 billion. Mean wealth, however, was much higher, at \$3.02 billion, reflecting the highly skewed wealth distribution among the Forbes 400. For example, Panel B shows selected percentiles of the wealth distribution in 2017. Wealth increases gradually as one goes from the 1st percentile to the 10th, 25th, 50th, and 75th. It more than doubles going from the 75th to the 90th and increases another sixfold from the 90th to the 99th. Lastly, in Panel C, we provide summary statistics at the state-year level given that most of our analysis is done at that level. The average state in this period was home to 7.68 Forbes billionaires and statewide wealth of \$22.63 billion.

3.1.1 Location of Forbes 400 Billionaires

The Forbes 400 live throughout the United States. However, they tend to be concentrated in some states, such as California, Texas, New York, and Florida. The geographic distribution is not fixed over time. Figure 2 shows a map of the number of Forbes billionaires in 1982 and 2017.

Table 1 shows in more detail the number of Forbes billionaires by state in 2017 (column 1), their mean wealth in 2017 (column 2) and the change in the number between 1982 and 2017 (column 3). The maps and the table point to some significant shifts in the population of Forbes billionaires. Between 1982 and 2017, California has become home to an increasing share of the Forbes 400 while Texas has comprised a smaller share. By 2017, the former has added 37 Forbes billionaires, while the latter has lost 30. This shift likely reflects the shift in wealth generated from the technology sector relative to the oil industry boom of the early 1980's. Within California, the San Francisco MSA has gained 37 Forbes billionaires, confirming the role that new wealth generated in the high tech sector plays, while Los Angeles added only 3. A relative decline in fortunes in the Rust Belt states of Pennsylvania (-12) and Ohio (-7) is apparent. On the other hand, Florida has gained 14 new Forbes billionaires, most of them in Miami, while Wyoming has added 3 in Jackson Hole.

While the geographical unit of analysis in the paper is the state, in order to provide further geographical detail Table 2 reports the 2017 levels in number and mean wealth and the 1982-2017 change in number for the 40 cities (consolidated metro areas (CMAs)) with

 $^{^{14}}$ The wealth tax base of the Forbes 400 is a non-trivial share of total wealth in the U.S. Saez and Zucman (2016) estimate that as of 2013 the Forbes 400 owned about 3% of total wealth.

the largest 2017 number of Forbes billionaires. The Table indicates that, despite its losses, New York city remains the metro area with the largest number of billionaires in 2017 (80), followed by the San Francisco Bay Area (54), Los Angeles (31), Miami (25), and Dallas (18). Chicago, Houston and Washington, D.C. are the other metro areas with 10 or more Forbes billionaires.

3.1.2 Quality of the Forbes 400 Data

Forbes data on billionaires net worth and their residence are estimates produced by Forbes' researchers. As such they are likely to contain measurement error. Forbes' estimate of the total net worth of individuals in our sample were found by Saez and Zucman (2016) to be consistent with IRS data. Using a capitalization method to estimate wealth from income reported on tax returns they conclude that "the top 400 wealthiest taxpayers based on our capitalized income method have a wealth level comparable to the Forbes 400 in recent years" (p.573).

Data on location have not been previously validated. Section 4 below provides two pieces of evidence on the quality of the Forbes 400 location data. First, we conduct an audit of obituaries of deceased Forbes 400 individuals, and compare state of residence reported by Forbes with state of death. State of death is likely to be highly correlated with the true state of residence, as people are more likely to die in their true primary residence state than in any other state. We find that the state of residence reported by Forbes generally matches the state of death listed in obituaries.

Second, for each death, we estimate what happens to estate tax revenues in the state of residence listed in Forbes, in the years following the death. If state of residence reported by Forbes is the same as the true state of residence for tax purposes, we should see an increase in estate tax revenues in the state that Forbes identifies as state of residence. We find that, following a Forbes billionaire's death, there is a significant spike in estate tax revenues in the state that Forbes identified as the state of residence of the deceased.

Overall, the amount of measurement error in state of residence reported by Forbes appears to be limited.¹⁵

¹⁵Since our models relate the number of Forbes billionaires in a state to its estate tax status, random measurement error in the number of billionaires in each state would result in increased standard errors but would not affect the consistency of the point estimates. It is in principle possible that the error in billionaire location in Forbes is not just random noise but is systematically correlated with changes in state estate taxes. This might happen, for example, if following an estate tax adoption by a given state, the existing resident billionaires tend to report to Forbes researchers that they have changed their residence to a non-estate tax state (and the Forbes researchers take them at their word), even if their actual residence has not changed.

3.2 State Estate Taxes

Data on adoption and repeal dates of state estate taxes came from Michael (2018), Walczak (2017), Conway and Rork (2004) and Bakija and Slemrod (2004), augmented as needed with information from individual state tax departments.

For the billionaires in the Forbes 400, the primary geographic variation in the combined federal and state estate tax burden after the 2001 EGTRRA elimination of the federal credit is due simply to which states have an estate tax and which do not. The top marginal estate tax rate – which approximates the average tax rate for the ultra-wealthy – is nearly uniform across states that have an estate tax. Of the 13 states (including D.C.) with an estate tax in 2018, 8 had a top credit rate of exactly 16%, 2 had a top rate between 15 and 16%, two had 12%, and one (Washington) had 20%.

Given this uniformity in the estate ATR for billionaires across estate tax states, we simply construct a state-by-year indicator variable for whether or not the state has an estate tax in that year. For pre-2001 years, this indicator is 1 if the state had a stand-alone estate tax beyond the pick-up tax that all states had and 0 otherwise.¹⁶

The maps in Figure 3 show which states had a (stand-alone) estate tax, and for how many years, both before and after the elimination of the federal credit. Though there is within-state variation over time, it is clear that most states with an estate tax after 2001 already had a stand-alone estate tax prior to then. In other words, the estate tax indicator in the post-2001 sample is highly correlated with the estate tax indicator in the post-2001, likely due to historical precedence and policy inertia.

Note that states with estate taxes are not necessarily the states with high personal income taxes. California, for example, has the highest top personal income tax rate in the nation, but has no estate tax, while Washington state has no income tax but the highest estate tax rate in the nation. Appendix Figure A1 shows the distribution of top personal income tax rates across all states by state estate tax status in 2001 (top) and in 2017 (bottom). In both years, estate tax states and non-estate tax states have wide dispersion in top income tax rates, indicating a less than perfect correlation between estate status and income tax rates on high income tax states in 2001 is slightly above that of non-estate tax states. However, the mean rates in the two groups of states are almost unchanged between 2001 and 2017. Overall, Figure A1 suggests that while there is some correlation between estate

¹⁶We do not include state inheritance taxes, which a handful of states have had during our sample period, in this indicator variable because they typically have a zero or very low tax rate on inheritances by lineal heirs (parents, children, grandchildren, etc.). As we show in Section 5, our results are not sensitive to this choice.

status and personal income tax rates, it is not very strong and, more importantly, it has not changed much over the years.

4 Location of Forbes Billionaires Deaths and Effect on Estate Tax Revenues

Before studying the effect of estate taxes on the location of Forbes billionaires, in this section we present the findings of an audit using obituaries of deceased Forbes 400 individuals in which we assess how close state of residence reported by Forbes matches the state listed in obituaries. We then use the same data to quantify the impact of billionaires' deaths on state estate tax revenues. The objectives are to assess the quality of the location information provided by Forbes and to empirically estimate what fraction of wealth at the time of death ends up being actually taxed. We use this effective tax rate in our cost-benefit analyses in Section 6.

4.1 Location of Billionaire Deaths

For estate tax purposes, what matters is the primary domicile state. The physical location of death is irrelevant and thus individuals have no incentive to strategically die in a state other than their residence state for tax purposes.¹⁷ Yet, state of death is likely to be highly correlated with the true state of residence, as people are more likely to die in their true primary residence state than in any other state. The correlation between state of death and true residence state need not be one, as individuals in our sample who die may die in a different state due to travels, vacations or other idiosyncratic reasons.

To identify potential deaths, we first identified individuals in our sample who were in the Forbes 400 for at least 4 consecutive years before permanently exiting and that, as of their last observation, were older than 50 and in the top 300 of wealth. The top 300 requirement is useful because some less wealthy individuals may disappear from the sample due to their wealth falling below the top 400 threshold rather than due to death. For this subsample of 152 individuals, we searched online for obituaries. Forbes 400 individuals are often known to the general public, and their obituaries are typically published in major newspapers such as the New York Times and the Los Angeles Times. 128 of these 152 individuals were found to have died; the other 24 had dropped out of the Forbes 400 for other reasons.

 $^{^{17}}$ As noted above, intangible assets comprise the vast majority of Forbes 400 estates and a decedent's intangible assets are taxable by a single domicile state.

The resulting 128 deceased individuals are listed in Appendix Table A3.¹⁸ From the obituaries, we recorded both the state in which the death physically occurred as well as the state of primary residence mentioned in the obituary. We find that for 103 of the 128 cases (80%) the state where death physically occurred was the same as the primary residence state listed in Forbes. Moreover, the mismatches were frequently due to deaths occurring at out-of-state specialized hospitals such as the Mayo Clinic or while on vacation, as indicated in the obituaries and reported in the last column of Appendix Table A3. After accounting for these factors, the state indicated by the obituary was the same as the primary residence state listed in Forbes in 115 deaths, or 90%. Overall, it appears that in the vast majority of cases, the primary residence of the individuals in our sample matched that listed by Forbes.¹⁹

We have done a similar analysis comparing the state of residence (as opposed to state of death) reported in the obituaries to the Forbes state of residence. It seems unlikely that newspaper obituaries, when listing one's primary state of residence, would take into account which potential state of residence would imply the lowest estate tax. However, it is possible that Forbes magazine could influence what gets reported in the obituary, making the two sources of information not completely independent. With this caveat in mind, we find that the state of primary residence listed in the obituaries matched that listed in Forbes for 107 (84%) of the 128 deaths.

4.2 Effect of Billionaire Deaths on State Estate Tax Revenues

For each death, we estimate what happens to estate tax revenues in the state of residence, as listed in Forbes, in the years following the death.²⁰ If Forbes location is accurate, and Forbes 400 billionaires pay estate taxes, we should see an increase in estate tax revenues in the state that Forbes identify as state of residence. If Forbes location is inaccurate, or Forbes billionaires are able to shelter most of their wealth from estate taxation, we should see limited effect on state estate tax revenues in the state that Forbes location is accurate, and Forbes billionaires are able to shelter most of their wealth from estate taxation, we should see limited effect on state estate tax revenues in the state that Forbes identify as state of residence. If Forbes location is accurate, and Forbes billionaires are able to shelter part of their wealth from estate taxation, the estimated effect will be informative of the effective tax rate for this group.

Since we are using the time of death to empirically estimate its effect on state estate tax

 $^{^{18}}$ It is worth noting that 123 out of the 128 (96%) individuals had at least one child according to the obituaries, underscoring the likelihood of strong bequest motives for the Forbes 400 population.

¹⁹Forbes publishes its list in April of each year. If a death occurs between January and April, it is conceivable that Forbes reported state of death is a function of location of death. Our results do not change if we correlate state of death with a one-year lag in Forbes location.

²⁰The data on estate tax revenues comes from the Census Bureau's Annual Survey of State Tax Collections, item T50 ("Death and Gift Taxes"). We deflate to 2017 dollars using the national CPI-U price index.

revenues, we focus our analysis on the subset of deaths of unmarried individuals. The reason is that if the deceased is married at the time of death, estate taxes are not due until the time of death of the spouse. To be clear, estate taxes will ultimately need to be paid, irrespective of the marital status of the deceased. However, in the case of married taxpayers, the timing of the payment is a function of the time of death of the spouse, which we don't observe. In our sample of deaths, there are 41 decedents who were unmarried at the time of death.

Figure 4 shows two case studies. The top panel shows estate tax revenues in Arkansas leading up to and after the death of James ("Bud") L. Walton, co-founder of Walmart along with his brother Sam Walton. Bud Walton died in 1995 and was unmarried at the time. The dashed vertical line in the figure indicates the year of death. As can be clearly seen in the figure, estate tax revenues in Arkansas were generally stable in the years leading up to his death, averaging around \$16 million in inflation-adjusted 2017 dollars between 1982 and 1994. In the year after Walton's death, Arkansas estate tax revenues increased 425%, from \$34.8 million to \$183.2 million – an increase of \$148.3 million.²¹

Forbes estimated Bud Walton's net worth in 1994 to be \$1 billion, or \$1.65 billion in 2017 dollars. Thus, assuming the \$148 million jump in Arkansas estate tax revenues in 1996 was due solely to Walton's death, this implies that the effective average tax rate on the Walton estate was approximately 9.0%.

The fact that this effective ATR is below Arkansas' top statutory tax rate of 16% is to be expected. Recall from Section 2.2 that in practice estate taxpayers are able to reduce their effective tax rates by reducing their estate tax base through a combination of charitable bequests, asset valuation discounts, and other tax sheltering measures. In fact, the 9% effective tax rate on the Walton estate is close to what we would expect from IRS data for this population. Specifically, Raub et al. (2010) found that the estate values of Forbes 400 decedents reported on federal estate tax returns is about 50% of the net worth estimated by Forbes, and IRS Statistics on Income data indicate that for estates with wealth above \$20 million, on average 24% is deducted for charitable bequests. This implies an effective average tax rate in practice of around 38% ($50\% \times (1 - .24)$) times the statutory tax rate of 16%, which is 6.1%.²²

The bottom panel of Figure 4 shows estate tax revenues in Oklahoma before and after the 2003 death of Edward Gaylord, a media and entertainment mogul. In the years leading up to and including his death, state estate tax revenues were declining. They jumped in the

 $^{^{21}}$ Arkansas had a "pick-up" tax of the type described earlier, not a separate stand-alone estate tax. The Arkansas pick-up tax expired in 2005 when the federal credit to which it was tied was eliminated. This explains the near-zero estate tax revenues in Arkansas after 2004 shown in the figure.

 $^{^{22}}$ According to IRS rules, federal estate taxes are not subtracted from the base before state taxes are calculated.

year after Gaylord's death by approximately \$44 million (in 2017 dollars). The last estimate by Forbes (in 2001) of Gaylord's net worth was \$1.8 billion, equivalent to \$2.49 billion in 2017 dollars. This implies an effective tax rate of just 2%. The low effective rate can be attributed to some combination of Forbes' estimate being too high, an usually high share of Gaylord's estate going to charity, and/or an usually high degree of tax sheltering.

Of course, these are just two selected cases. We now turn to our full sample of deaths to estimate the average response of state estate tax revenues to a Forbes 400 death. Figure 5 shows the average across all 41 deaths of unmarried individuals in our sample. The figure plots state estate tax revenue from 5 years before a death to 5 years after a death. State revenues are demeaned by national yearly means to account for aggregate year-to-year variation (e.g., due to business cycle and other aggregate movements in asset values).

The figures shows that in the five years leading up to a death there is no obvious pretrend. The horizontal line marks the average revenue between t - 5 and t - 1 for a death occurring in year t. In the years after a death, we uncover an economically large increase in estate tax revenues. In the year of the death, state estate tax revenues exceed the pre-death average by around \$45 million 2017 dollars. The peak is in the year following the death, year t + 1, when state estate tax revenues exceed the pre-death average by around \$65 million. The corresponding estimates for t + 2 and t + 3 are \$30 and \$25 million, respectively.

The average effect does not all occur in a single year (relative to the death year). The timing of estate tax payments can vary from decedent to decedent based on the particular situation. Some payments may occur in the year of the death if the death occurred early in the year and asset valuation was relatively straightforward. In other cases, especially if estate asset valuation is particularly complicated or there are legal disputes, payment may occur a few years after the death. Figure 5 depicts the average response over cases.

By summing the difference between the pre-death mean and the tax revenues in the 5 years after death, we estimate that, on average, a Forbes billionaire death results in an increase in state estate revenues of \$165 million. This estimate, combined with the fact the average net worth of the deceased individuals that we included in Figure 5 is \$2.01 billion, implies that this group of individuals paid an effective estate tax rate of 8.25%. This rate is about half of the typical 16% statutory average tax rate, suggesting that about half of their Forbes estimated wealth ends up taxed. This effective rate is close to the 6.1% back-of-the-envelope effective rate we calculated above based on IRS federal estate tax data (Raub et al., 2010).²³

 $^{^{23}}$ In the cost-benefit analysis in Section 6, we will use the 8.25% to compute the benefit in terms of tax revenue that states can expect from adoption estate taxes. The qualitative results are similar using the 6.1% rate instead.

We draw two main conclusions. First, following a death of a Forbes billionaire, we see a measurable increase in estate tax revenues in the "right" state, i.e. the state that Forbes identifies as the state of residence. Second, the magnitude of the increase is similar to what we would expect based on IRS data. Having validated the Forbes data, we turn to the core of our empirical analysis, estimating the sensitivity of the ultra-wealthy's locational choice to estate taxes.

5 Effect of Estate Tax on Location of Forbes 400

We use the elimination of the federal credit for state estate taxes in 2001 for assessing the locational sensitivity of the ultra-rich to estate taxes. Prior to the elimination, all states had essentially the same average estate tax rate for billionaires, combining federal and state liabilities. After the elimination, there was stark geographical variation in estate tax liability depending on whether a state has estate taxes or not.

We start with a difference-in-difference estimator that compares the change in the number of billionaires (or their wealth) prior to the 2001 credit elimination and after the elimination in estate tax states and non-estate tax states. We expect to observe no systematic correlation between estate taxes and where billionaires live prior to the 2001 credit elimination. If the ultra-rich locational choices are sensitive to estate taxes, we expect to observe a negative correlation after the elimination.

Our main empirical specification is based on a triple-difference estimator, where we add a third difference (across age) to the differences across states and before/after 2001. Because estate taxes only apply at death and are only based on the domicile state at that time, billionaires should become more locationally sensitive to estate taxes as they age. Kopczuk (2007), for example, finds evidence that wealthy individuals care about disposition of their estates significantly more when they are closer to death.

We also look at the probability that individuals switch state of residence ET status, namely the probability that individuals observed in an ET state in 2001 are observed in a non-ET state after the reform; and the probability that individuals observed in a non-ET state in 2001 are observed in an ET state after the reform.

Finally, we quantify the aggregate losses for the state tax base caused by geographical mobility of Forbes billionaires from estate tax states to non estate tax states.

5.1 Difference-in-Difference Estimates

Table 3 shows the double-difference estimates. The level of observation is a state-year pair, and the sample includes a balanced sample of 50 states observed for 35 years for a total of 1,750 state-year observations. The dependent variables are the number of Forbes 400 individuals in that state in that year or the total wealth of Forbes 400 individuals in that state in that year or the total wealth of Forbes 400 individuals in that state total across states is approximately a constant 400 every year, the estimates based on number of billionaires would be proportional if we used the share of the Forbes 400 in a state in that year.²⁴

In column 1, we regress the number of Forbes 400 individuals in the state-year on only an indicator for whether or not the state has an estate tax, an indicator for whether or not the year is post-2001, and an interaction of the two. In the second column we include year fixed effects and in the third column—which is our preferred specification—we include both year and state fixed effects.

In column 3, the coefficient on the estate tax state indicator is positive, indicating that before 2001 more Forbes 400 individuals live in estate tax states than in non-estate tax states. By contrast, the coefficient on the interaction term is negative, indicating that the average estate tax state saw a drop of billionaires after 2001 compared with the average non-estate tax state. The coefficient on the interaction term in column 3 is -2.358 (with a standard error of 0.683), suggesting that after 2001 the average estate tax state lost 2.36 billionaires relative to non-estate tax states. Since the average number of billionaires in an estate tax state in 2001 was 7.2 (7.01 over the full sample), a drop of 2.36 billionaires represents a 32.8% decline, as reported at the bottom of the Table.²⁵

In column 4 we control for the top marginal personal income tax (PIT) rate, by stateyear, by including both the rate and its interaction with the post-2001 indicator. We find that the negative post-2001 effect of the estate tax is robust to controlling for the PIT. This likely reflects the limited correlation between estate taxes and PIT taxes across states over time that we discussed in the data section above. We also find that the coefficient on the interaction between PIT and the indicator for after 2001 is insignificant, lending credibility to the notion that it is changes in estate taxes that affect the changes in the number of billionaires in estate tax states, not other changes in fiscal policies.

The 2001 EGTRRA reform was federal and exogenous from the point of view of states. However, in the years following the EGTRRA reform, states were free to adopt new estate

²⁴Some years have slightly less than 400 individuals due to missing values for state or age.

²⁵Since there is a fixed number of Forbes billionaires, treatment of one state comes at the expense of the control group (the other 49 states). Thus models where the dependent variable is the number of billionaires in a state suffer from a small source of bias. The bias, however, is likely to be negligible since for a treated state there are 49 potential destination states.

taxes or repeal existing ones, and some did. One possible concern is that changes in estate tax status after 2001 may be correlated with unobserved determinants of location choices of billionaires. In column 5, we instrument estate tax status after 2001 with estate tax status in 2001. The first-stage coefficient is 0.653 (0.097) and the first-stage F statistic is 45.7, indicating a high degree of persistence in estate tax status. The point estimate in column 5 is -3.019 (1.635). One cannot reject the null hypothesis that the IV estimate is equal to the corresponding OLS estimate in column 3, although the IV estimate is not very precise.

In column 6, the dependent variable is the per capita number of Forbes billionaires in a state. The difference-in-difference coefficient is -0.662 (0.333). In column 7, the dependent variables is Forbes reported wealth (in billions of 2017 dollars). The coefficient on the interaction term is -16.52 (2.442), suggesting that after 2001 the average estate tax state lost \$16.5 billion relative to non-estate tax states. The implied elasticity is -39.7%.²⁶

In columns 8 to 10 we probe the robustness of the estimates. In column 8, the indicator for estate tax status is expanded to include states that have a inheritance tax. In column 9 we drop New York state, which is the state with the most Forbes billionaires. In column 10 we drop the years 2002 to 2004, which is the period where the federal credit for estate taxes was being phased out. Our estimates are robust to these changes.

One concern is that some of the variation over time in the geography of the Forbes 400 individuals reflects changes in the sample. Every year, there is entry and exit from the sample, as some of less wealthy individuals in the sample are replaced by wealthier individuals and some individuals die. To assess the sensitivity of our estimates to different definitions of the sample, Panel A in Appendix Table A4 shows estimates based only on the wealthiest 100 individuals (column 1); the wealthiest 200 individuals (column 2); the wealthiest 300 individuals (column 3); and those who are in the sample for at least 10 years. Models in this Panel correspond to the model in column 3 of the previous table. For the wealthiest 300 individuals and those who are in the sample for at least 10 years, the coefficient on the estate tax status interacted with the post-2001 indicator appears similar to that for the full sample, and larger than estimates for the wealthiest 100 and 200 individuals. However,

²⁶Note that, as we discussed above, if a decedent owned tangible property (eg, real estate) in multiple states, they actually pay estate taxes to each of those states in proportion to the property value in each. By contrast, intangible property (eg, financial assets) get taxed solely by the primary domicile state. The Forbes wealth estimates are for total wealth of an individual and do not distinguish between tangible and intangible assets. A separate issue is the fact that there is a very strong increase in the wealth of the average Forbes billionaire in our sample period: As shown in Figure 1, after adjusting for inflation, the mean Forbes billionaire is 10 times wealthier in 2017 than in 1982. This complicates the calculation of the elasticity, as the baseline average computed in the the years before 2001 is significantly lower than the average in the later years. To compute the elasticity entry in column 7, we conservately deflate mean real wealth to be constant over the sample period (by dividing pre-2001 wealth by 2017 mean wealth). The estimated elasticity obtained using non-adjusted wealth (in 2017 dollars) is larger.

because the baseline pre-reform number of billionaires in the latter two samples are much smaller, the implied elasticities (shown at the bottom of the table) are not very different from those estimated in the full sample. If anything, the elasticity for the top 100 group and for those who are in the sample for at least 10 years appear larger than the corresponding elasticity for the full sample.

5.2 Triple-Difference Estimates

If billionaires are sensitive to the estate tax, we expect the probability of a billionaire to live in an estate tax state to be independent of the billionaire's age prior to 2001, but to decrease with age in 2001 onward.

In Figure 6, each point represents a 1-year age group. Its y-axis value is the fraction of billionaires of that age that live in an estate tax state. This fraction can be interpreted as the probability that a billionaire in the Forbes 400 sample of that age was living in an estate tax state at that time. Hence, this is equivalent to estimating a linear probability model as a function of age. Panel A shows the relationship with age over the pre-reform (2001) sample, while Panel B shows the relationship over the post-2004 sample (after the federal credit was fully phased out). The solid red line in each figure shows the estimated linear relationship between the probability of a billionaire living in an estate tax state and age.

The figure suggests that the probability of a billionaire to live in an estate tax state increases slightly with billionaire's age prior to credit phase-out, and decreases with age after the credit phase-out. Appendix Figure A2 shows the same exercise using personal income taxes instead of estate taxes. In that case one observes a positive age gradient both in the early period and in the later period, suggesting that the effect uncovered in Figure 6 is specific of estate taxes.

Figure 7 shows the estimated age gradient separately for every year of our sample. For any given year the confidence interval is fairly large, but it is clear that the slope coefficients before 2001 tend to be near zero or slightly positive, while the slope coefficients after 2001 are consistently negative.

Table 4 shows estimates of triple-differenced models that include the difference between young and old. We split the Forbes 400 into young and old, with the latter defined by age greater than or equal to 65, the median age of the Forbes 400 in our sample. We regress the number of billionaires by state, year, and age group on indicators for post-2001, "old," estate tax state, the interactions estate tax state X post-2001, estate tax state X old, old X post 2001 and estate tax state X post-2001 X old. The coefficient on that last interaction tests whether older billionaires (relative to younger) are more sensitive to state estate taxes

after 2001 than before.

In terms of identification, the main advantage of triple-differenced models over the difference-in-difference models is that the former allow us to control for the interaction of estate tax (ET) status X post-2001. Thus, threats to validity stemming from the correlation between unobserved differences across states in the determinants of Forbes' 400 geographical locations and estate status after 2001 are accounted for. For example, if non-estate tax states become more attractive to wealthy taxpayers after 2001 because of policy changes correlated to estate status—whether personal income taxes, corporate taxes, or any other factor that may affect attractiveness of a state to the ultra-wealthy—the interaction of ET status X post-2001 would absorb such differences.²⁷

We find that older billionaires, compared with younger billionaires, are less likely to live in an estate tax state after 2001. The coefficient on the triple interaction in column (1) is -0.991 (0.330), indicating that the negative effect of estate taxes after 2001 is greater for older billionaires than younger billionaires. This remains true when we condition on PIT (column 2); when we instrument current estate tax status with 2001 status (column 3); when the dependent variable is the per capita number of Forbes billionaires in a state (column 4) or wealth (col 5). Estimates appear robust to variants of the specification in columns (6) to (8).

As we did for the difference-in-difference models, we assess the sensitivity of our estimates to different definitions of the sample. Panel B in Appendix Table A4 shows estimates based only on the wealthiest 100 individuals (column 1); the wealthiest 200 individuals (column 2); the wealthiest 300 individuals (column 3); and those who are in the sample for at least 10 years. Models in this Panel correspond to the model in column 3 of the previous table. Estimates for the wealthiest 300 individuals and those who are in the sample for at least 10 years appear larger than estimates for the wealthiest 100 and 200 individuals. In terms of elasticities, however, the elasticity for the top 100 group is by far the largest.

The level of observation in Table 4 is a state*year*age-group and the dependent variable is the number of Forbes billionaires. As an alternative way to look at the same question is use individual-level data and estimate how the probability of living in an estate tax state varies with age before versus after 2001. In particular, Table 5 reports estimates from a linear probability model where the dependent variable is the probability of living in an estate tax

²⁷Moreover, the triple difference model allays concerns about systematic measurement error. Consider the case where state of residence as reported in Forbes is systematically biased, and more so after 2001 because Forbes 400 individuals become more likely to mis-report their state of residence to Forbes reporters after 2001 in order to minimize the chance that state tax authorities perceive them as resident of estate tax states. This may introduce bias in the difference in difference models. The triple difference estimates are unbiased if the difference in the measurement error that exists in Forbes estimated location of old billionaires and young billionaires is uncorrelated with changes over time in state estate taxes.

state and the level of observation is an individual-year. Unlike Table 4, where we split individuals into just two age groups, here age enters linearly. The standard errors are based on two-way clustering by state-year and by individual.

Consistent with Table 4 and Figure 6, the coefficients from the linear fit regressions in column (1) indicate that there was no systematic relationship between estate taxes and age prior to 2001. After 2001, however, the estimates in column (2) reveal a strong negative relationship.²⁸ Column (3) estimates the difference in the age gradient from before 2001 to after 2001. It is strongly negative and significant. The estimated slope coefficients in column (4), which control for state fixed effects, indicate that over 2001 to 2017, with each additional year of age, the probability of living in an estate tax state falls by -0.26 percentage point. Given the unconditional probability of a 40-year old billionaire in our sample living in an estate tax state after 2001 is about 22%, this age gradient implies that, for example, a 50-year old, 70-year old and 90-year billionaire would be expected to have only a 19.4%, 14.2% and 9.0% probability of living in an estate tax state after 2001, respectively.

Overall, columns (1) to (4) confirm the findings from the triple-differenced models: older billionaires tend to shift from estate tax states and to non-estate tax states, relative to younger billionaires.²⁹ In the last column, we perform a falsification test by assessing whether there is any similar before- vs. after-2001 difference in age-dependence for the personal income tax. We divide states into a "high income tax" group and "low/zero income tax" group according to whether or not the state has a top marginal tax rate above 3%, which is close to the median. We repeat the prior age-dependence regressions but now using the fraction of each age group in a high income tax state as the dependent variable. We find no difference in age-dependence before versus after 2001. In other words, the negative differential age-dependence after 2001, compared to before 2001, appears to be specific of the estate tax.

5.3 Probability of Moving from an Estate Tax State to a Non-Estate Tax State and Vice-Versa

An additional way to test whether estate taxes affect Forbes billionaires' locational choices is to look explicitly at individual-level mobility. Here, we focus on the probability that individuals who are observed residing in ET states before the reform physically move to a non-ET state after the reform; and, inversely, the probability that individuals who are

 $^{^{28}}$ The coefficients from the linear fit regressions in Figure 7 are provided in columns (1) and (2) of Table 5, Panel A.

²⁹We tried models that include individual fixed effects. The sample size appears too small to allow for such a demanding specification.

observed living in non-ET states before the reform move to an ET state afterwards. If Forbes billionaires were indeed induced to move away from ET states after the 2001 reform, we expect to observe a high probability of moving from ET states to non-ET states after 2001 and a low probability switching from non-ET states to ET states. We also expect this to be particularly true for older individuals.

For this analysis, we focus specifically on the 376 individuals in the Forbes 400 in 2001 for which there is non-missing data on age and state of residence. For those in an estate tax (ET) state in 2001 and also observed in a given later year, we ask what share of them moved by that year to a non-estate tax (non-ET) state. For those in a non-ET state in 2001 and also observed in a given later year, we ask what share of them moved by that year to an ET state. The results are shown in Panel A of Table 6 for each year from 2003 to 2010. (Recall that data on state of residence is missing in the Forbes 400 for 2002.)³⁰

Entries in the first column indicate that of all of the Forbes billionaires living in ET states in 2001 (and who had not exited the sample by 2003), 6.67% were living in a non-ET state 2 years later; and of all the Forbes billionaires living in non-ET states in 2001, 0.73% are observed living in an ET state 2 years later. The difference, 5.94%, is the net migration toward non-ET states. This difference tends to grow over time, as individuals have more time to contemplate and initiate moving, although the increase is not monotonic. By year 2010—namely 9 years after the reform—21.43% of individuals who originally were in a ET state were in a non-ET state; while only 1.2% of individuals who originally were in a non-ET state.³¹

Panels B and C, respectively, report similar percentages for 2001 Forbes billionaires who were 65 and older and who were younger than 65. Consistent with the triple-differenced models in table 4, these two panels show that most of the switching away from ET to non-ET states is among older individuals. Entries in the first column indicate that among all the old Forbes billionaires in ET states in 2001, 11.43% are observed living in a non-ET state 2 years later, while among all of the old Forbes billionaires living in non-ET states in 2001, 0.76% are observed in a non-ET state 2 years later. The difference grows over time. By year 2010, 42.86% of old individuals who originally were in a ET state are in a non-ET state are in an eT state by 2010. The probability of patterns for young individuals is much lower, and not systematically correlated with ET status.

Overall, the findings in Table 6 confirm the findings from our difference-in-difference and

³⁰Note that focus here is on geographical mobility. If a state switches ET status after 2001, and a billionaire does not move, we are not counting that as a move.

³¹Since the sample for each column consists of Forbes 400 billionaires observed in both 2001 and year t, sample size shrinks over time from 335 in 2003 to 195 in 2010.

triple-difference models above.

5.4 Effect of Tax-Induced Mobility on State Aggregate Tax Base

The 2001 EGTRRA Federal Reform introduced potential tax competition among states where there was none and induced some billionaires to relocate from estate tax states to nonestate tax states. One first-order effect of such mobility was that it reduced the aggregate tax base for states. Here we use our estimates of the effect of estate taxes on the number of billionaires in a state to quantify the magnitude of the decline in the aggregate tax base caused by mobility.

Table 7 shows the effect of the tax induced mobility on the total number of Forbes billionaires subject to state estate taxes (row 1) and their aggregate wealth (row 2). In particular, Column (1) shows the total number of Forbes billionaires subject to state estate taxes in 2001 and their total wealth. Column (2) shows the estimated changes due to mobility, obtained by multiplying the baseline number of Forbes billionaires in 2001 and their 2001 wealth by -0.328 and -0.397, respectively—the estimated elasticities from columns (3) and (7) of Table 3.

Entries indicate that there were 72 Forbes billionaires subject to state estate taxes in 2001, and that tax induced mobility after 2001 resulted in 23.1 fewer Forbes billionaires subject to state estate taxes. Moreover, \$203.3 billion of Forbes billionaires' wealth was subject to state estate taxes in 2001, and that tax induced mobility resulted in a drop of \$80.7 billion in wealth subject to state estate taxes. This appears to be a large aggregate loss in the estate tax base of states. The way to interpret these numbers is that they represent the long-run effect of mobility stemming from state tax differences on the stock of billionaires and the stock of wealth subject to state estate taxes, rather the annual flow of tax revenues. If we assume an effective estate tax rate of 8.25% as estimated in Section 4 above, the loss of \$80.7 billion implies an aggregate long term loss of tax revenues of \$6.66 billion. Since 10 states had an estate tax in 2001, this amounts to a mean loss per state equal to \$666 million.³²

 $^{^{32}}$ Again, this is not the change in the annual tax revenue flow. Rather it is the overall change in (undiscounted) revenues over all future years from the pool of Forbes 400 billionaires observed in 2001.

6 Costs and Benefits for States of Enacting an Estate Tax

In section 5, we found a high elasticity of Forbes billionaires' state of residence with respect to state estate taxes, especially for older individuals. In this section, we study what that estimated elasticity implies for state tax policies. Should estate tax states repeal estate taxes? Should non-estate tax states adopt estate taxes?

States face a trade-off. On the one hand, adoption of the estate tax implies a one-time estate tax revenue gain for the state when a resident billionaire dies. As discussed in the introduction, the magnitude of this revenue can be substantial, and in some cases it can amount to a significant fraction of a state's overall annual revenue. On the other hand, our estimates indicate that the adoption of an estate tax reduces the number of billionaires residing in the state. In terms of state tax revenue, the main cost is the foregone income tax revenues over the remaining lifetime of each billionaire who leaves the state due to the estate tax, as well as any potential new billionaires that might have moved to the state in the absence of an estate tax. The cost of foregone income tax revenue from a given billionaire is different for different states: it is higher the higher is the state's income tax rate on billionaires, which is approximately equal to the state's top marginal rate.

This trade-off is not the usual Laffer-curve style trade-off that the literature typically focuses on, where states with high tax rates are compared to states with low tax rates. There is little empirical variation in estate tax rates—with virtually all states at either zero or 16%. While states are free to set different rates, in practice they generally have stuck with 16%, which is a historical holdover from the 16% maximum rate in the federal credit that existed until 2001. Thus, in our calculations we compare tax revenues in the case where a state has a 16% estate tax with tax revenues in the case where the state has no estate tax at all. This is consistent both with the binary nature of state estate tax choices in practice, and with the variation that is used to identify our empirical estimates of the effect of estate taxes on billionaires' geographical location.

We seek to compare the magnitude of the costs and the benefits for different states of adopting estate taxes in 2017. We use estimates of the elasticity of location with respect to estate taxes from the previous section. We consider two types of estate tax in turn. First, we provide an analysis of the costs and benefits for states of an estate tax that specifically targets billionaires. Second, we generalize our findings and provide costs and benefits of an estate tax on the full population of wealthy taxpayers, defined as taxpayers with wealth above the 2017 federal estate tax exemption. This latter analysis is more speculative, as it inevitably depends on an assumption of how the elasticity that we have estimated for the ultra-wealthy maps to the analogous elasticity for the broader population of the "merely" wealthy.

6.1 An Expression for Costs and Benefits

To fix ideas, consider the simplest possible case of a representative Forbes billionaire in a representative state. For state *s* that does not have an estate tax in 2017 and adopts it in 2017, we can write the benefit as the present discounted value of additional tax revenues due to the estate tax at the time of death of billionaires who remain in the state after the tax adoption. We can write the cost as the present discounted value of the stream of personal income tax revenues that the state would have received, in absence of the estate tax, from billionaires that were deterred from residing there.

$$Benefit_s = \left(\frac{1}{1+r}\right)^T \cdot N_s W \cdot (1-\eta) \cdot \tau_s^W \tag{1}$$

$$Cost_s = \sum_{i=1}^{T} (\frac{1}{1+r})^i \cdot N_s Y \cdot \eta \cdot \tau_s^Y$$
(2)

where N_s is the initial number of billionaires in state s before adoption of an estate tax; Y and W are the taxable income and taxable wealth of the average billionaire; and η is our estimate of the elasticity of the Forbes 400 population in a state with respect to the estate indicator. Thus, $(1 - \eta)N_s$ in equation (1) is the number of billionaires left in the state after adoption and ηN_s in equation 2 is the number of billionaires who leave the state because of adoption. τ_s^W and τ_s^Y are the state estate tax rate and the personal income tax rate that applies to Forbes billionaires, respectively; T is remaining lifetime for a billionaire or his spouse, whichever is longer (recall that estate taxes are paid when the surviving spouse of a couple dies.); r is the real discount rate for states.

In practice, the benefits and costs are more complicated because the effect of estate tax adoption on the number of billionaires was found to vary significantly depending on age. Thus, we use a more general expression of costs and benefits that allows for the elasticity η to vary by age and for states to differ in the the age structure of their billionaire population:

$$Benefit_{s} = \sum_{a=0}^{100} \left[(\frac{1}{1+r})^{T_{a}} \cdot N_{a,s} W \cdot (1-\eta_{a}) \cdot \tau_{s}^{W} \right]$$
(3)

$$Cost_{s} = \sum_{a=0}^{100} \left[\sum_{i=1}^{T_{a}} (\frac{1}{1+r})^{i} \cdot N_{a,s} Y \cdot \eta_{a} \cdot \tau_{s}^{Y} \right]$$
(4)

where a indexes age; η_a is the estimated elasticity at age a; $N_{a,s}$ is the initial number of billionaires of age a in the state in the before adoption of the estate tax; and T_a is remaining life expectancy of a billionaire at age a or his spouse, whichever is longer.

We use our estimates from the previous section to set η_a . In particular, based on Table 5, column 3, we set $\eta_a = 0.0016 - 0.00394 * a$, where 0.0016 is the estimated intercept and -0.00394 is the estimated elasticity age gradient. $N_{a,s}$ is measured as the number of billionaires of age a observed in the state in 2017 in our data. We set W equal to 51.6%of the mean wealth of the Forbes 400 in 2017 (66.69 billion). 51.6% is the average fraction of Forbes wealth ultimately subject to estate tax according to our earlier estimation of the effective estate tax rate (8.25/16 = 51.6) in section 4. This ratio accounts for Forbes mismeasurement, tax sheltering, and charitable bequest deductions. We set Y equal to 10.3%of taxable wealth, which is 365 million. 10.3% is the ratio of taxable income to taxable estate value for federal estate taxpayers under 70 (given that the median age of the Forbes 400 is 65), according to IRS statistics on income data for 2008.³³ State personal income tax rates τ_s^Y are from the National Bureau of Economic Research's TAXSIM. In particular, we use the top marginal income tax rate in each state in 2017. Recall that for this high-wealth, high-income population the average tax rate will be approximately equal to the top marginal tax rate. Empirically, the top rate in 2017 varies from 0 to 14%. We set $\tau_s^W = 16\%$. For T_a , we use 2017 age-specific life expectancy tables from the IRS (Publication 590-B, Appendix B). These tables are for use by IRA owners and take account of the life expectancy of the last survivor for couples within 10 years of age. Of course, it is possible that many spouses of the Forbes 400 are more than 10 years younger.³⁴ We consider how this would affect our cost-benefit ratios below and in Appendix Table A5. We adjust age-specific life expectancy to account for evidence from Chetty, et al. (2016) that life expectancy increases with wealth. Specifically, they find that in 2014 (their latest year of data) male life expectancy was 8.7% higher at the top of the income distribution than at the median.³⁵ Lastly, for r, we use 0.02 because it is close to the real interest rate on state and local municipal bonds in 2017.

Costs and benefits are measured in dollars, and their ratio tells us whether a state that does not have an estate tax in 2017 would experience an increase or a decrease in the net

 $^{^{33}}$ In Appendix Table A5, we provide results based on an alternative assumption whereby, following Saez and Zucman (2019), Y is set equal to the 50% of the mean taxable income of the top 400 *income* taxpayers from IRS Statistics on Income data.

³⁴IRS Publication 590-B, Appendix B, contains three separate life expectancy tables. Table III is the uniform life expectancy table for IRA owners that are either unmarried or have a spouse within 10 years of age. However, it only provides life expectancies for ages 70 and above. Table II provides life expectancies by age of IRA owner and age of spouse. Table III's life expectancies for age 70 matches that of Table II for an IRA owner of age 70 with a spouse of age 60. Thus, for ages between 30 and 70, we assume a spousal age of 10 years younger. For ages below 30, we use Table I, which applies to single IRA owners.

³⁵Data obtained at https://healthinequality.org/

present value of tax revenues if it adopted an estate tax in 2017. For states that do have an estate tax in 2017, we use the same expression to estimate whether the state would experience an increase or a decrease in tax revenues if it repealed the tax. For both groups, we present costs and benefits defined as costs and benefits of having an estate tax relative to not having one.³⁶

We stress that in interpreting our estimates, an important caveat should be recognized. Our measures of costs only include the *direct* costs to state revenues, namely the foregone taxable income of the billionaires who relocate due to the estate tax. The relocation of billionaires may have additional, *indirect* costs for states. This may happens, for example, if a billionaire's change of residence causes relocation of firms and investments or reduces local charitable giving. In addition, adoption of an estate tax could cause intensive-margin adjustments, such as increased tax avoidance and/or reduced savings. However, it should be kept in mind that billionaires in all states are subject to the federal estate tax and so they likely already have taken advantage of most feasible tax avoidance measures. Any additional tax avoidance only affects the estate tax and arguably is already incorporated in our estimates of effective estate tax rate, while reduced savings may result in lower capital income. An analysis of these indirect effects is a paper in itself, and outside the scope of the current analysis. A separate caveat is that our measure of revenue costs exclude sales tax and property tax revenues, which are mostly local (city and county).

6.2 Estimates of Costs and Benefits of an Estate Tax on Billionaires

Based on these assumptions, we estimate that the cost-benefit ratio of having a billionaire estate tax in 2017 is 0.47 for the average state (with at least one billionaire), indicating that the the additional revenues from the estate tax exceeds the cost of foregone income tax revenues by a significant margin. Remarkably, despite the high elasticity of billionaires to state estate taxes, the gain for the average state from taxing the estates of the remaining billionaire population exceeds the loss of income tax flows from those billionaires that flee.

The cost-benefit ratio varies greatly across states due to the variation in state income tax rates. Table 8 shows estimates of costs and benefits for each state. Panel A includes states that had an estate tax as of 2017. The first row indicates that Connecticut had 7 Forbes billionaires in 2017, with an aggregate wealth of \$47.2 billion. Based on the state personal income tax rate, we estimate the revenue benefit of having an estate tax to be 26% larger

³⁶For states that do not have ET in 2017, $\eta_a N_{a,s}$ is the estimated long-run loss in the number of billionaires caused by adoption. For states that do have ET in 2017, $\eta_a N_{a,s}$ is the estimated long-run gain in the number of billionaires caused by repeal. Similarly for $(1 - \eta_a)N_{a,s}$.

than the revenue cost, with a cost-benefit ratio equal to 0.74. In the last column we show that net expected present value (EPV) of having an estate tax is \$376 million. We stress that entries in column 5 are not annual figures, but the expected present value computed over the expected remaining lifetimes of the 2017 Forbes 400.

By contrast, for Hawaii the benefit of having an estate tax is 43% larger than the cost, with a cost-benefit ratio equal to 1.43. The expected present value of having an estate tax is -\$73 million. The difference between Connecticut and Hawaii is largely due to the difference in their personal income tax (PIT) rate. Hawaii's PIT is higher than Connecticut's. The higher PIT rate in Hawaii means a higher opportunity cost of foregoing billionaires' income tax streams.

In general, we find that states with high personal income tax rates tend to have higher cost-benefit ratios, while states with low personal income tax rates tend to have low cost-benefit ratios. Indeed, for the state of Washington, which has no PIT, the cost-benefit ratio is 0. We estimate that for this state expected present value of having an estate tax is \$2.005 billion, the largest in this group. Maryland, Massachusetts and Pennsylvania are other examples of states with benefits much larger than costs, with cost-benefit ratios equal to 0.56, 0.50 and 0.35, respectively. New York has a cost-benefit ratio of 0.66, and an EPV of having an estate tax equal to \$5.18 billion.

Overall, of the 10 states that currently have an estate tax and have at least one billionaire, 9 states have a cost-benefit ratio below one and only Hawaii has a ratio above one. The last row in panel A indicates that for the average state in this group, the benefit of having an estate tax is 39% larger than the cost.

Panel B shows results for states that did not have an estate tax in 2017. In this group, California has by far the largest cost-benefit ratio—1.45—because it has the highest PIT rate. We estimate that if California adopted the estate tax, it would lose \$8.26 billion in EPV of revenue. However, California is more the exception than the rule. For most other states in this panel, we estimate that the cost-benefit ratio is well below 1, indicating that estate tax adoption would increase their tax revenues. For example, Florida and Texas have no personal income tax and therefore the cost-benefit ratio for them is 0. We estimate that they would gain \$7.68 and \$7.06 billion, respectively, in EPV of revenues if they adopted estate tax. The two other states with the largest absolute estimated gains from adoption in this group are Nevada and Tennessee.

The last row indicates that on average, the cost-benefit ratio for this group is 0.42, indicating that for the average non-adopting state the tax revenue benefit of having an estate tax on billionaires would significantly exceed the cost from foregone income tax revenues. Overall, of the 28 states that currently do not have estate tax and have at least one billionaire,

27 states would increase their revenues if they adopted estate taxes. However, the relative magnitude of costs and benefits varies widely, and depends strongly on the personal income tax rate, as the cost of adoption tends to be much higher in states with high income tax rates.

In Panel A of Appendix Table A5 we probe the sensitivity of our results to alternative parameterizations. First, we allow for wealth and income to grow over time. Recall that the baseline estimates are based on wealth and income set at their 2017 levels. But historically, wealth and income of Forbes billionaires have grown significantly, as we saw in Figure 1. Alternative 1 in the table assumes that real wealth and income grow beyond 2017 at 7.0%per year, which is the average annual growth rate of Forbes 400 real wealth from 1982–2017. Next, we increase the assumed longevity of the surviving spouse. In the baseline we used IRS life expectancy tables that implicitly assume that one's spouse is within 10 years of age. Alternative 2 uses IRS surviving spouse life expectancies, by age of older spouse, for a couple 20 years apart in age. Alternative 3 assumes states discount future revenues using a real interest rate of 1% (vs. 2% in the baseline). Alternative 4 assumes states discount using a real interest rate of 3%. Alternative 5, following Saez and Zucman (2019), assumes that the Forbes 400 have income equal to half of the gross adjusted income reported by the top 400 income taxpayers according to IRS SOI data (vs. the baseline where we assume it is 10.3% of Forbes 400 taxable wealth). All other parameter assumptions are the same as in the baseline scenario. The finding that benefits exceed costs for most states is found to be robust to these alternative assumptions.

6.3 Estimates of Costs and Benefits of a Broad Estate Tax

Above we calculated costs and benefits for states of adopting an estate tax on billionaires' estates. Here, we extend the analysis to consider the costs and benefits of adopting a broader estate tax, one modeled on the current federal estate tax. That tax applies to taxpayers with estate values an exemption threshold that in 2017 equaled \$5.5 million for individuals and \$11 million for couples. Many estate-tax states follow this federal exemption level in 2017.³⁷

For each state, we compute the costs and benefits of an estate tax on this broader group of wealthy taxpayers using the same approach that we used above for billionaires. In particular, we use the same formula for costs and benefits—equations (3) and (4)—with different parameters and data.

The key parameter that we need is the elasticity of mobility with respect to the estate tax. It is not clear how the elasticity that applies on average to all wealthy taxpayers—those

³⁷The lowest is \$1 million in Massachusetts and Oregon (see Michael (2018)).

with wealth above \$5.5-\$11 million—compares to the elasticity that we have estimated for the ultra-wealthy—the Forbes 400 billionaires. We present estimates of costs and benefits under two alternative assumptions about the elasticity: (a) the elasticity for taxpayers with wealth above \$5.5-\$11 million is the same as the elasticity that we estimated for Forbes billionaires or (b) it is half of what we estimated for billionaires. We note that within the sample of Forbes billionaires, we did not find major differences for those in the top 100 group, top 200 or top 300.

To quantify the cost-benefit analysis for the broad group of wealthy taxpayers, we also need state-by-state data on (1) the estate tax base $((W_{as}N_{as}) - i.e.)$, the total wealth of all state residents with wealth above the exemption level, (2) the income tax base for potential estate taxpayers $((Y_{as}N_{as}) - i.e.)$, the total income of all state residents with wealth above the exemption level; and (3) the average tax rates (ATRs) on estate wealth (τ_s^W) and income (τ_s^Y) for potential estate taxpayers. We discuss the data sources for each of these variables in Appendix A.

One important aspect to note here is that the estate ATR (τ_s^W) is lower than that for the billionaire estate tax considered above because of a progressive rate schedule. Unlike for billionaires, for the population of federal estate taxpayers progressivity leads to a lower average ATR than the top MTR. We assume the same degree of progressivity as that of the federal estate tax.³⁸

Table 9 shows estimates of costs and benefits under each of the two alternative assumptions on the elasticity of tax mobility. Starting with estimates based on the baseline elasticity, Panel A shows that among the 14 states that had an estate tax as of 2017, the benefits of having it exceed the costs in all but four high PIT states: Hawaii. Minnesota, Oregon and Vermont. Mane is close to the indifference. The last row in panel A indicates that for the average state that in 2017 had an estate tax, the benefit of having the estate tax are 9% larger than the costs.

Panel B shows results for states that did not have an estate tax in 2017. California remains the state with the largest cost-benefit ratio by far: 1.94. However, the estimated cost-benefit ratio is below 1 for most other states. In particular, of the 36 states that in 2017 did not have estate tax, the benefit of the tax exceeds the cost in 32 states. The last row indicates that on average, the cost-benefit ratio for this group is 0.60 indicating that the average non-adopting state would benefit from adoption.

A comparison of Panels A and B with the Panels A and B in the previous Table indicates

³⁸Specifically, we set the effective equal to 16% times 0.625 (=10%), which is the ratio of the effective average tax rate (25%) to the top statutory rate (40%) for the federal estate tax according to IRS Statistics on Income data for 2017.

that the general pictures that emerges is qualitatively similar—with benefits higher than costs in most cases—but the cost-benefit ratios found for an estate tax on the wealthy are slightly higher than those found for a billionaire estate tax. The reason stems primarily from the fact that the assumed estate tax ATR is lower due to progressivity.³⁹

Entries in the last two columns of the Table report estimated costs and benefits when we use an elasticity of mobility with respect to an estate tax for the population of wealthy taxpayers that is equal to half of the elasticity estimated for Forbes billionaires. The costbenefit ratios are much lower. This is to be expected: lower elasticity means that the adoption of the tax causes a smaller loss in the number of wealthy taxpayers, and therefore a smaller decline in personal tax revenues. In this scenario, the cost-benefit ratio is below one for every state, including California. In Panel B of Appendix Table A5 we show estimates under alternative assumptions on the parameters. As with the billionaire-only estate tax, our baseline finding of a cost-benefit ratio below one for most states is generally robust. Not surprisingly, the two alternatives (2 and 4) in which the cost-benefit ratio averages above one correspond to increasing the life expectancy of surviving spouses (hence allowing for more years of income taxes and further discounting the future estate tax revenue) or assuming a higher discount rate (hence discounting more the future one-time estate tax revenue relative to the annual stream of income tax revenues).

Overall, we conclude that the implications that states can draw from our estimates of the costs and benefits of a broad estate tax are not qualitatively very different from the implications that states can draw from our estimates of costs and benefits of an estate tax only on billionaires. In most cases, benefits exceed costs, although the exact magnitude of benefits and costs varies widely across states. For the broad estate tax, we can't be certain of the exact benefits and costs since the true elasticity of mobility with respect to estate taxes is unknown. But we found that if wealthy taxpayers in general are less mobile in response to taxes than billionaires, the case for a broad state estate tax is stronger.

7 Conclusion

Estate taxes are a form of wealth taxation that takes place at death. The 2001 federal tax reform introduced stark cross-state variation in estate tax liabilities for wealthy taxpayers. Our findings indicate that the ultra-wealthy are keenly sensitive to this variation. Specifically, we find that billionaires responded strongly to geographical differences in estate taxes by increasingly moving to states without estate taxes, especially as they grew older.

 $^{^{39}}$ If we instead assume the same ATR as we did for the billionaire estate tax – that is, 16% instead of 10% – the resulting cost-benefit ratios are very similar to those found in Table 9.

Our estimated elasticity implies that \$80.7 billion of 2001 Forbes 400 wealth escaped estate taxation in the subsequent years due to billionaires moving away from estate tax states.

Yet, despite the high elasticity of geographical location with respect to the estate tax, we find that for most states the benefit of additional revenue from the estate tax exceeds the cost of foregone income tax revenue by a significant margin. Adoption of an estate tax implies a one-time tax revenue gain for the state when a resident billionaire dies, but it also reduces its billionaire population and thus their flow of income tax revenue over remaining lifetimes. For the average state the benefit of additional revenue from the estate tax exceeds the cost of foregone income tax revenue by 31%. While the cost-benefit ratio varies substantially across states, most states that currently do not have estate taxes would experience revenue gains if they adopted estate taxes. California, which has the highest personal income top tax rate, is the main exception.

References

- Akcigit, U., Baslandze, S., and Stantcheva, S. (2016). Taxation and the international mobility of inventors. American Economic Review, 106(10):2930–81.
- Bakija, J. and Slemrod, J. (2004). Do the rich flee from high state taxes? evidence from federal estate tax returns. Working Paper 10645, National Bureau of Economic Research.
- Brülhart, M., Gruber, J., Krapf, M., and Schmidheiny, K. (2017). The elasticity of taxable wealth: Evidence from switzerland. *NBER Working Paper*, (22376).
- Brülhart, M. and Parchet, R. (2014). Alleged tax competition: The mysterious death of bequest taxes in switzerland. *Journal of Public Economics*, 111:63–78.
- Conway, K. S. and Rork, J. C. (2004). Diagnosis murder: The death of state death taxes. *Economic Inquiry*, 42(4):537–559.
- Cooper, J. A. (2006). Interstate competition and state death taxes: A modern crisis in historical perspective. *Pepp. L. Rev.*, 33:835.
- Jakobsen, K., Jakobsen, K., Kleven, H., and Zucman, G. (2018). Wealth taxation and wealth accumulation: Theory and evidence from denmark. Technical report, National Bureau of Economic Research.
- Kleven, H. J., Landais, C., Muñoz, M., and Stantcheva, S. (2019). Taxation and migration: Evidence and policy implications. *Journal of Economic Perspectives*, 33(4).
- Kleven, H. J., Landais, C., and Saez, E. (2013a). Taxation and international migration of superstars: Evidence from the european football market. *American economic review*, 103(5):1892–1924.
- Kleven, H. J., Landais, C., Saez, E., and Schultz, E. (2013b). Migration and wage effects of taxing top earners: Evidence from the foreigners' tax scheme in denmark. *The Quarterly Journal of Economics*, 129(1):333–378.
- Kopczuk, W. (2007). Bequest and tax planning: Evidence from estate tax returns. *Quarterly Journal of Economics*, 122(4).

- Kopczuk, W. (2009). Economics of estate taxation: A brief review of theory and evidence. Tax Law Review, 63(1).
- Kopczuk, W. and Saez, E. (2004). Top wealth shares in the united states, 1916–2000: Evidence from estate tax returns. *National Tax Journal*, 57(2).
- Michael, J. (2018). Survey of state estate, inheritance, and gift taxes. Technical report, Research Department, Minnesota House of Representatives.
- Moretti, E. and Wilson, D. J. (2017). The effect of state taxes on the geographical location of top earners: Evidence from star scientists. *American Economic Review*, 107(7):1858–1903.
- Raub, B., Johnson, B., and Newcomb, J. (2010). A comparison of wealth estimates for america's wealthiest decedents using tax data and data from the forbes 400. In National Tax Association Proceedings, 103rd Annual Conference on Taxation, pages 128–135.
- Saez, E. and Zucman, G. (2016). Wealth inequality in the united states since 1913: Evidence from capitalized income tax data. *The Quarterly Journal of Economics*, 131(2):519–578.
- Saez, E. and Zucman, G. (2019). Progressive wealth taxation. *Brookings Papers on Economic* Activity.
- Slattery, C. and Zidar, O. (2019). Evaluating state and local business tax incentives. Journal of Economic Perspectives, 85(4).
- Slemrod, J. and Gale, W. G. (2001). Rethinking the estate and gift tax. *Brookings*.
- Slemrod, J. and Kopczuk, W. (2003). Dying to save taxes: Evidence from estate tax returns on the death elasticity. *Review of Economics and Statistics*, 85(2).
- Smith, M., Zidar, O., and Zwick, E. (2019). Top wealth in the united states: New estimates and implications for taxing the rich. *Working Paper*.
- Walczak, J. (2017). State inheritance and estate taxes. Technical report, Tax Foundation.
- Young, C. and Varner, C. (2011). Millionaire migration and state taxation of top incomes: Evidence from a natural experiment. *National Tax Journal*, 64(2):255.
- Young, C., Varner, C., Lurie, I. Z., and Prisinzano, R. (2016). Millionaire migration and taxation of the elite: Evidence from administrative data. *American Sociological Review*, 81(3):421–446.

Appendix A

In this appendix, we discuss the data that we use in section 6.3 to compute the costs and benefits of a broad-based estate tax on wealthy taxpayers.

We use equations (3) and (4). We need state-by-state data or estimates on (1) the estate tax base $((W_{as}N_{as}) - i.e.)$, the total wealth of all state residents with wealth above the exemption level, (2) the income tax base for potential estate taxpayers $((Y_{as}N_{as}) - i.e.)$, the total income of all state residents with wealth above the exemption level, (3) the average effective tax rates on estate wealth (τ_s^W) and income (τ_s^Y) for potential estate taxpayers.

Estate tax base. In 2017, the federal estate tax applies to estate values above \$5.5 million for individuals and \$11 million for couples. Most current estate-tax states follow this federal exemption level, while some had lower exemptions. (The lowest is \$1 million in Massachusetts and Oregon (see Michael (2018)). In our calculations, we use for simplicity the same exemption threshold that applies U.S. federal estate tax and same degree of progressivity – except with a 16% top marginal rate, which is the top rate nearly all estate-tax states have currently.

To estimate the potential estate tax base in each state, we start with IRS Statistics on Income (SOI) data on total estate values reported on federal estate tax returns by state of residence.⁴⁰ Because the wealth by state on federal estate tax returns can be volatile from year to year, especially for small states, we use the average over 2015-2017 rather than just 2017. To fully utilize age-specific IRS data on income to wealth ratios discussed below, we apportion the statewide estate values to three broad age group (under 70, 70-79, and over 79) using national shares of estate tax returns by age group. Following the estate multiplier technique of Kopczuk and Saez (2004) and others, we estimate the underlying living population of wealthy taxpayers in each state by dividing the total estate values by the mortality rate for each age group from the Social Security Administration.⁴¹ Given that mortality rates have been found to be considerably lower for the wealthy than for the general population, we adjust the mortality rates based on the mortality differentials provided in Saez and Zucman (2019).

Income tax base. The income tax base for the population of potential estate taxpayers, by state and age group, can be estimated by multiplying the state-specific taxable estate tax values $(W_{as}N_{as})$ obtained above by the aggregate ratio of taxable income (Y_aN_a) to taxable estate value (W_aN_a) over all federal estate taxpayers: $Y_{as}N_{as} = W_{as}N_{as}\left(\frac{Y_aN_a}{W_aN_a}\right)$. The national aggregates of Y_aN_a and W_aN_a , by age group, are provided by the IRS Statistics on Income. Specifically, for 2008, the IRS matched all federal estate tax returns to the Form 1040 income

⁴⁰https://www.irs.gov/statistics/soi-tax-stats-estate-tax-statistics-filing-year-table-2.
⁴¹https://www.ssa.gov/oact/STATS/table4c6.html#ss.

tax returns filed by the decedent in the year prior to death. They report both taxable estate value and prior-year taxable income across taxpayers within each broad age group.⁴² In aggregate, these taxpayers had taxable estate values of \$117.1 billion and prior-year taxable incomes of \$7.9 billion – an income/wealth ratio of 0.074. The ratio falls with age (due primarily to labor income falling sharply over these three age groups): It is 0.103 for those under 70, 0.071 for ages 70 to 79, and 0.058 for those over 79.

Average tax rates. For the average income tax rate, we use the top marginal tax rate, as we did in the previous section. Top income tax brackets among states generally start at incomes well below the income levels of individuals with wealth above the federal estate tax exemption (\$11 million for couples). Given that we seek to estimate the costs and benefits of states adopting an estate tax with the same degree of progressivity as the federal estate tax, albeit with a lower top rate (16%), we need to take account of this progressivity when estimating the average effective estate tax rate. To estimate this average rate, we multiply the top marginal rate in state estate taxes, 16%, by the ratio of the average tax rate to the top marginal tax rate in the federal estate tax. The federal top marginal rate in 2017 was 40%. The average effective tax rate, based on 2017 IRS SOI data on total estate tax payments as a percentage of taxable estate values (adjusted for spousal deductions), was 25%. Hence, we estimate the state average estate tax rate would be $16\%^*(25/40) = 10\%$.

 $^{^{42}}$ We add back spousal bequest deductions to taxable estate value because our cost estimates are based on revenues collected when the surviving spouse dies.

State	Forbes Population in 2017	Mean Wealth in 2017 (mil)	1982-2017 Change in Forbes Population
Alabama	0		0
Alaska	0		0
Arizona	5	2780	4
Arkansas	5	16800	3
California	92	6715	37
Colorado	5	8540	0
Connecticut	7	6743	3
Delaware	0	0110	-14
Florida	35	4229	14
Georgia	9	4767	1
Hawaii	3 1	9600	$1 \\ 0$
Idaho	1	2700	-2
	1 14		-2
Illinois		3443	
Indiana	3	4300	1
Iowa	1	3900	1
Kansas	2	25800	0
Kentucky	1	2700	-1
Louisiana	1	2800	0
Maine	0		-1
Maryland	7	3371	3
Massachusetts	8	5988	0
Michigan	6	4417	-1
Minnesota	3	3500	-5
Mississippi	0		0
Missouri	5	5700	2
Montana	3	4700	3
Nebraska	2	41100	1
Nevada	8	7475	5
New Hampshire	0		-1
New Jersey	6	5083	0
New Mexico	0		-1
New York	71	6256	-10
North Carolina	3	5800	3
North Dakota	0		0
Ohio	3	3467	-7
Oklahoma	5	6860	-2
Oregon	1	25200	-2
Pennsylvania	5	3500	-12
Rhode Island	0	0000	-1
South Carolina	1	3500	0
South Dakota	1	2200	1
Tennessee	8		5
Texas	8 34	3813	-30
Utah		5600	
	0		0
Vermont	0	0777	-2
Virginia	4	8775	-2
Washington	10	24590	9
West Virginia	0		-1
Wisconsin	9	5122	8
Wyoming	4	11700	3
Average	8	7988	0

Table 1: Forbes 400 by State, 2017

City	Forbes Population in 2017	Mean Wealth in 2017 (mil)	1982-2017 Change in Forbes Population
Atlanta-Sandy Springs-Gainesville, GA-AL	9	4767	2
Austin-Round Rock-Marble Falls, TX	4	8025	4
Boston-Worcester-Manchester, MA-RI-NH	8	5988	-2
Charleston-North Charleston-Summerville, SC	1	3500	1
Chattanooga-Cleveland-Athens, TN-GA	1	2400	0
Chicago-Naperville-Michigan City, IL-IN-WI	14	3443	-2
Columbia, MO	2	6800	2
Dallas-Fort Worth, TX	18	5950	-9
Denver-Aurora-Boulder, CO	4	9900	-1
Detroit-Warren-Flint, MI	3	4400	-1
Fayetteville-Springdale-Rogers, AR-MO	4	20375	3
Houston-Baytown-Huntsville, TX	11	4464	-10
Indianapolis-Anderson-Columbus, IN	2	2700	0
Jackson, WY	4	11700	4
Kalamazoo-Portage, MI	2	3950	0
Knoxville-Sevierville-La Follette, TN	2	3050	2
Las Vegas-Paradise-Pahrump, NV	7	7471	4
Livingston	1	4200	1
Los Angeles-Long Beach-Riverside, CA	31	4806	3
Miami-Fort Lauderdale-Pompano Beach, FL	25	4416	13
Milwaukee-Racine-Waukesha, WI	4	3800	3
Minneapolis-St. Paul-St. Cloud, MN-WI	2	4100	-5
Naples-Marco Island, FL	3	5033	2
Nashville-Davidson–Murfreesboro–Columbia, TN	4	4275	3
New York-Newark-Bridgeport, NY-NJ-CT-PA	80	6368	-9
Oklahoma City-Shawnee, OK	3	7867	-2
Omaha-Council Bluffs-Fremont, NE-IA	2	41100	1
Philadelphia-Camden-Vineland, PA-NJ-DE-MD	5	3500	-16
Phoenix-Mesa-Glendale, AZ	5	2780	5
Portland-Vancouver-Hillsboro, OR-WA	2	14450	0
Raleigh-Durham-Cary, NC	2	6700	2
Rochester-Batavia-Seneca Falls, NY	2	2850	2
San Diego-Carlsbad-San Marcos, CA	2	3750	-2
San Jose-San Francisco-Oakland, CA	54	8154	37
Santa Barbara-Santa Maria-Goleta, CA	2	4250	2
Seattle-Tacoma-Olympia, WA	8	29775	7
St. Louis-St. Charles-Farmington, MO-IL	2	5450	1
Tampa-St. Petersburg-Clearwater, FL	4	2375	3
Tulsa-Bartlesville, OK	2	5350	0
$Washington-Baltimore-Northern\ Virginia,\ DC-MD-VA-WV$	10	5490	4
Average	9	7243	1

Table 2: Forbes 400 by Consolidated Metro Area (Top 40), 2017

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
					IV	Per Capita	Wealth	Incl. inher. tax	Drop NY	Drop 2002-04
ET-State X post-2001	-4.016***	-4.126^{***}	-2.358^{***}	-2.387***	-3.019^{*}	-0.662**	-16.52^{***}	-2.269***	-2.339***	-2.558***
	(0.745)	(0.747)	(0.683)	(0.810)	(1.635)	(0.333)	(2.442)	(0.657)	(0.718)	(0.700)
ET-State	1.639***	1.748***	1.345***	1.243**	-0.466	0.346***	11.67^{*}	1.156***	1.028***	1.215**
	(0.383)	(0.388)	(0.512)	(0.513)	(0.395)	(0.106)	(6.596)	(0.417)	(0.372)	(0.528)
post-2001	1.018***									
-	(0.203)									
PIT X post-2001				0.0000430						
*				(0.00101)						
PIT				0.00320***						
				(0.000940)						
Observations	1750	1750	1750	1750	1750	1750	1750	1750	1715	1650
Semi-elasticity	558	573	328	331	419	541	397	315	325	355
Std. Error	.103	.104	.095	.112	.227	.272	.059	.091	.1	.097
State Fixed Effects	No	No	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Year Fixed Effects	No	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes

Table 3: Difference-in-Difference Dependent Variable: Population of Forbes 400

Driscoll-Kraay (with 10-year bandwidth) standard errors in parentheses. IV regression instruments for ET-States, t and its interactions using a variable

(and its corresponding interactions) equal to ET-State_{s,t} for t<2001 and to ET-State_{s,2001} for t \geq 2001.

* p < 0.10, ** p < 0.05, *** p < 0.01

	(1)	(2)	(3)	(4) D G H	(5)	(6)	(7)	(8)
			IV	Per Capita	Wealth	Incl. inher. tax		Drop 2002-04
ET-state X post-2001 X old	-0.991***	-0.798***	-1.907***	-0.659***	-22.65***	-1.056***	-1.179***	-1.161***
	(0.330)	(0.282)	(0.549)	(0.214)	(4.611)	(0.360)	(0.416)	(0.269)
ET-state X old	0.335^{*}	0.159	3.073***	0.476^{***}	6.643***	0.399**	0.560***	0.335^{*}
	(0.185)	(0.225)	(0.459)	(0.158)	(2.427)	(0.169)	(0.180)	(0.185)
ET-State X post-2001	-1.567***	-0.794*	-0.556	-0.00184	3.065	-0.631**	-0.580**	-0.699**
	(0.416)	(0.445)	(1.001)	(0.0802)	(2.777)	(0.284)	(0.252)	(0.349)
old X post-2001	1.717***	2.953***	2.066***	0.330***	18.59***	1.738***	1.472***	1.782***
	(0.271)	(0.571)	(0.464)	(0.0741)	(3.084)	(0.294)	(0.271)	(0.265)
ET-State	0.707***	0.542	-1.769***	-0.0653	2.513	0.421*	0.234	0.440
	(0.248)	(0.336)	(0.0853)	(0.0787)	(4.189)	(0.228)	(0.248)	(0.323)
old	-0.616***	-1.803***	-1.473***	-0.0886*	-7.344***	-0.636***	-0.625***	-0.616***
	(0.214)	(0.0922)	(0.459)	(0.0495)	(1.479)	(0.232)	(0.217)	(0.214)
PIT X post-2001 X old		-0.273***						
-		(0.0918)						
PIT X old		0.262***						
		(0.0201)						
PIT X post-2001		0.138**						
*		(0.0631)						
PIT		0.0289						
		(0.0457)						
Observations	3500	3500	3500	3500	3500	3500	3430	3300
Semi-elasticity, Young	560	284	199	004	.246	225	207	25
Std. Error	.149	.159	.358	.175	.223	.101	.09	.125
Semi-elasticity, Old	582	362	560	862	672	383	4	423
Std. Error	.091	.094	.158	.35	.083	.1	.121	.091

Table 4: Triple-DifferenceDependent Variable: Population of Forbes 400

Driscoll-Kraay (with 10-year bandwidth) standard errors in parentheses. All regressions include year fixed effects. Note state fixed effects are absorbed by old-young differencing. IV regression instruments for ET-State_{s,t} and its interactions using a variable (and its corresponding interactions) equal to ET-State_{s,t} for t<2001 and to ET-State_{s,2001} for t \geq 2001.

* p < 0.10,** p < 0.05,*** p < 0.01

Table 5: Linear Probability Model

	(1)	(2)	(3)	(4)	(5)
	1982 - 2001	2002 - 2017	1982 - 2017	1982 - 2017	High MTR
Age	0.00160	-0.00233*	0.00160	0.000457	0.0000501
	(0.00129)	(0.00128)	(0.00129)	(0.000605)	(0.000257)
Age X post-2001			-0.00394^{**}	-0.00257^{**}	-0.000628
			(0.00178)	(0.00107)	(0.000552)
Observations	7386	5525	12911	12911	12910
Year Fixed Effects	Yes	Yes	Yes	Yes	Yes
State Fixed Effects	No	No	No	Yes	Yes

Probability of Living in Estate Tax State

Standard errors (in parentheses) two-way clustered by individual and by state. * p<0.10, ** p<0.05, *** p<0.01

Table 6: Probability of Moving Away from ET States and to Non-ET States

	2003	2004	2005	2006	2007	2008	2009	2010
% from ET to non-ET	6.67	7.84	10.42	8.89	8.82	8.57	12.90	21.43
% from non-ET to ET	0.73	0.40	0.88	0.48	0.00	0.56	0.54	1.20
Difference	5.94	7.44	9.53	8.41	8.82	8.02	12.36	20.23

Panel A: All Forbes 400 Individuals Observed in 2001

Panel B: Forbes 400 Individuals Observed in 2001 – 65 and Over

	2003	2004	2005	2006	2007	2008	2009	2010
% from ET to non-ET	11.43	12.50	13.79	14.81	15.00	15.00	26.67	42.86
% from non-ET to ET	0.76	0.00	0.99	1.12	0.00	0.00	0.00	0.00
Difference	10.67	12.50	12.80	13.69	15.00	15.00	26.67	42.86

Panel C: Forbes 400 Individuals Observed in 2001 – Under 65

	2003	2004	2005	2006	2007	2008	2009	2010
% from ET to non-ET	0.00	0.00	5.26	0.00	0.00	0.00	0.00	0.00
% from non-ET to ET	0.69	0.75	0.80	0.00	0.00	0.90	0.88	1.92
Difference	-0.69	-0.75	4.46	0.00	0.00	-0.90	-0.88	-1.92

Notes: "ET" denotes status of living in estate tax state; "Non-ET" denotes status of living in non-estate tax state. Sample for each column consists of Forbes 400 billionaires observed in both 2001 and year t. Second row of each panel shows the percentage of individuals observed in 2001 who, by year t, have physical moved from an ET state to a non-ET state. Third row of each panel shows the percentage of individuals observed in 2001 who, by year t, have physical moved from a non-ET state to an ET state. Age is measured in 2001.

	2001 Level	Estimated
	in Estate Tax States	2001 - 2017
		Change Due
		to Mobility
	(1)	(2)
Number of Billionaires	72	-23.6
Total Wealth (Billions)	203.3	-80.7

Table 7: Effect of Tax Induced Mobility on State Aggregate Tax Base

Notes: Column (2) is based on the estimated semi-elasticities from columns 3 and 7 of Table 3. Dollars figures are in 2017 Dollars.

Table 8: Cost-Benefit Calculations for Billionaire Estate Tax

State	Forbes Population	Forbes Wealth (mil)	Personal Income Tax Rate	Cost/Benefit	EPV Net Revenues from Adopting (mil)
Connecticut	7	47,200	6.99	0.74	376
Delaware	0	0	6.80		0
Hawaii	1	9,600	11.20	1.43	-73
Illinois	14	48,200	4.35	0.48	1,403
Maine	0	0	7.15		0
Maryland	7	23,600	5.83	0.56	649
Massachusetts	8	47,900	5.10	0.50	865
Minnesota	3	10,500	10.15	0.68	249
New York	71	444,200	6.89	0.66	5,184
Oregon	1	25,200	9.99	0.73	68
Pennsylvania	5	17,500	3.07	0.35	627
Rhode Island	0	0	5.99		0
Vermont	0	0	8.80		0
Washington	10	245,900	0.00	0.00	2,005
Average	9	65,700	6.59	0.61	811
	Б		• • • • • •		

Panel A. States with Estate Tax

Panel B. States without Estate Tax

State	Forbes Population	Forbes Wealth (mil)	Personal Income Tax Rate	Cost/Benefit	EPV Net Revenues from Adopting (mil)
Alabama	0	0	3.42		0
Alaska	0	0	0.00		0
Arizona	5	13,900	4.47	0.46	586
Arkansas	5	84,000	5.33	0.52	532
California	92	617,800	14.10	1.45	-8,259
Colorado	5	42,700	4.77	0.42	665
Florida	35	148,000	0.00	0.00	7,678
Georgia	9	42,900	6.18	0.55	917
Idaho	1	2,700	7.49	0.83	35
Indiana	3	12,900	3.23	0.33	421
Iowa	1	3,900	6.38	0.54	111
Kansas	2	$51,\!600$	5.28	0.47	249
Kentucky	1	2,700	6.18	0.40	160
Louisiana	1	2,800	4.17	0.20	222
Michigan	6	26,500	4.25	0.34	948
Mississippi	0	0	5.07		0
Missouri	5	28,500	6.08	0.58	473
Montana	3	14,100	6.11	0.58	279
Nebraska	2	82,200	7.71	0.45	299
Nevada	8	59,800	0.00	0.00	1,792
New Hampshire	0	0	0.00		0
New Jersey	6	30,500	8.97	0.88	150
New Mexico	0	0	3.83		0
North Carolina	3	17,400	5.50	0.46	382
North Dakota	0	0	2.34		0
Ohio	3	10,400	5.00	0.43	403
Oklahoma	5	34,300	2.59	0.21	953
South Carolina	1	3,500	5.55	0.58	89
South Dakota	1	2,200	0.00	0.00	258
Tennessee	8	30,500	0.00	0.00	1,704
Texas	34	190,400	0.00	0.00	7,062
Utah	0	0	5.00		0
Virginia	4	35,100	5.83	0.60	348
West Virginia	0	0	6.50		0
Wisconsin	9	46,100	6.51	0.61	776
Wyoming	4	46,800	0.00	0.00	829
Average	7	46,783	4.38	0.42	557

Table 9: Cost-Benefit Calculations for Broad Estate Tax

	Panel	А.	States	with	Estate	Tax
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	Personal Income	Basel	ine Elasticity EPV Net Revenues	Lower Elasticity EPV Net Revenues		
State	Tax Rate	$\operatorname{Cost}/\operatorname{Benefit}$	from Adopting (mil)	Cost/Benefit	from Adopting (mil)	
Connecticut	6.99	0.96	500	0.41	9,556	
Delaware	6.80	0.94	86	0.40	977	
Hawaii	11.20	1.54	-1,346	0.65	1,009	
Illinois	4.35	0.60	11,101	0.25	24,389	
Maine	7.15	0.99	29	0.42	1,401	
Maryland	5.83	0.80	2,157	0.34	8,541	
Massachusetts	5.10	0.70	4,794	0.30	13,363	
Minnesota	10.15	1.40	-4,247	0.59	5,107	
New York	6.89	0.95	3,977	0.40	55,753	
Oregon	9.99	1.38	-2,170	0.58	2,825	
Pennsylvania	3.07	0.42	14,110	0.18	23,676	
Rhode Island	5.99	0.83	615	0.35	2,705	
Vermont	8.80	1.21	-233	0.51	628	
Washington	0.00	0.00	10,969	0.00	12,938	
Average	6.59	0.91	2,882	0.39	11,633	

Panel B. States Without Estate Tax

		Basel	line Elasticity	Low	er Elasticity
State	Personal Income Tax Rate	Cost/Benefit	EPV Net Revenues from Adopting (mil)	Cost/Benefit	EPV Net Revenues from Adopting (mil)
		,	,	,	
Alabama	3.42	0.47	2,773	0.20	4,955
Alaska	0.00	0.00	970	0.00	1,144
Arizona	4.47	0.62	3,460	0.26	7,855
Arkansas	5.33	0.73	1,311	0.31	4,012
California	14.10	1.94	-141,167	0.82	31,066
Colorado	4.77	0.66	3,424	0.28	8,506
Florida	0.00	0.00	95,195	0.00	112,277
Georgia	6.18	0.85	1,901	0.36	9,670
Idaho	7.49	1.03	-42	0.44	861
Indiana	3.23	0.45	4,552	0.19	7,851
Iowa	6.38	0.88	612	0.37	3,753
Kansas	5.28	0.73	1,460	0.31	4,373
Kentucky	6.18	0.85	635	0.36	3,232
Louisiana	4.17	0.57	2,006	0.24	4,209
Michigan	4.25	0.59	6,675	0.25	14,289
Mississippi	5.07	0.70	771	0.30	2,125
Missouri	6.08	0.84	2,558	0.36	12,012
Montana	6.11	0.84	364	0.36	1,752
Nebraska	7.71	1.06	-295	0.45	3,047
Nevada	0.00	0.00	12,080	0.00	14,247
New Hampshire	0.00	0.00	3,150	0.00	3,715
New Jersey	8.97	1.24	-5,241	0.52	12,440
New Mexico	3.83	0.53	800	0.22	1,549
North Carolina	5.50	0.76	2,817	0.32	9,324
North Dakota	2.34	0.32	952	0.14	1,430
Ohio	5.00	0.69	3,974	0.29	10,674
Oklahoma	2.59	0.36	4,216	0.15	6.558
South Carolina	5.55	0.77	1,363	0.32	4,622
South Dakota	0.00	0.00	1,859	0.00	2,193
Tennessee	0.00	0.00	7,049	0.00	8,314
Texas	0.00	0.00	41,481	0.00	48,925
Utah	5.00	0.69	865	0.29	2,324
Virginia	5.83	0.80	2,774	0.34	10,985
West Virginia	6.50	0.90	140	0.34	983
Wisconsin	6.51	0.90	826	0.38	5,847
Wyoming	0.00	0.90	3,349	0.38	3,950
Average	4.38	0.60	3,349 1,934	0.00	5,950 10,696
Average	4.00	0.00	1,394	0.20	10,090

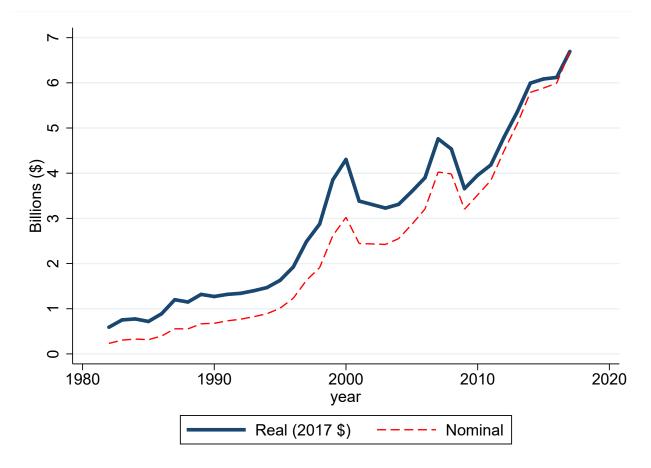
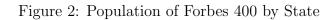
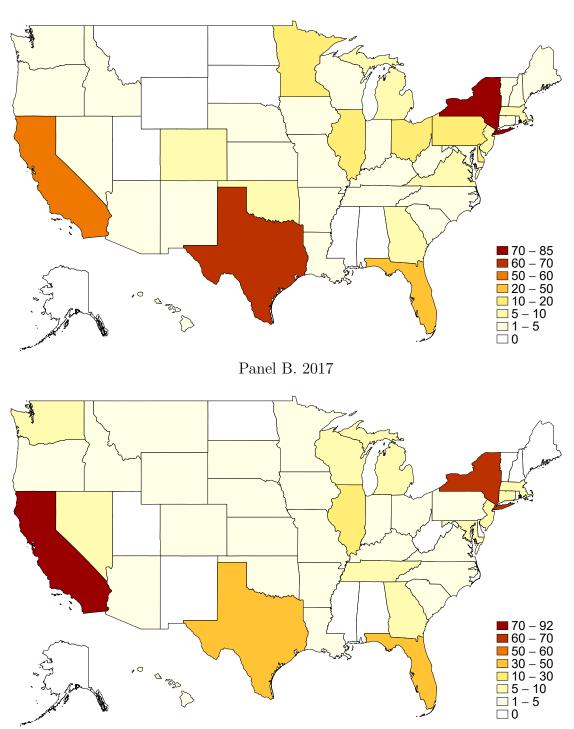


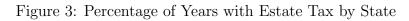
Figure 1: Average Wealth of Forbes 400 Sample (1982 to 2017)

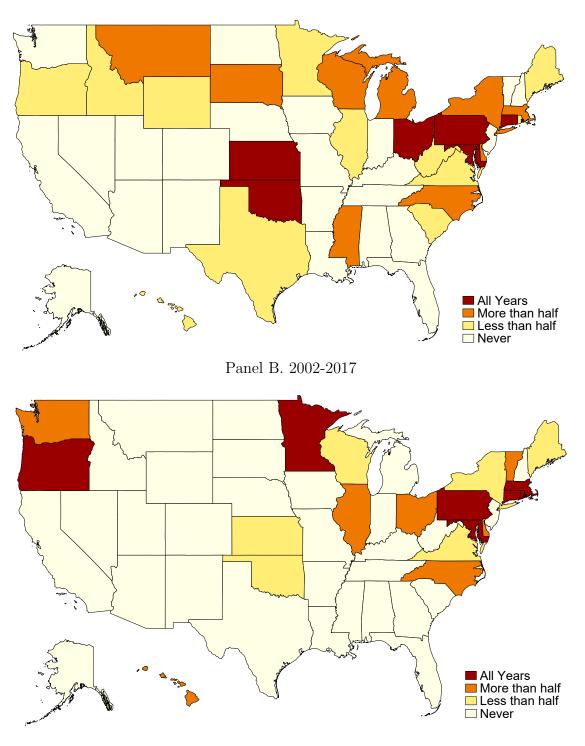
*Based on our sample of Forbes 400 individual-year observations, which excludes those with no data on age or state of residence.





Panel A. 1982

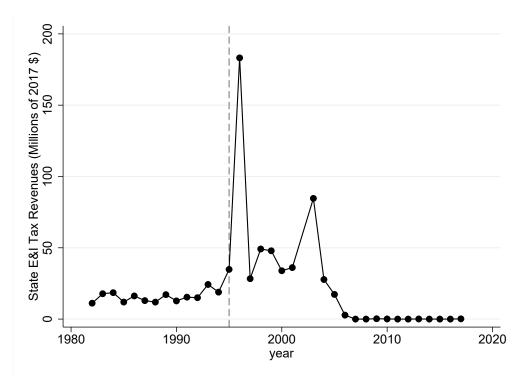




Panel A. 1982-2001*

*Excluding "pick-up" taxes. See text for details.

Figure 4: Impact of Billionaire Death on State Estate Tax Revenues Two Case Studies



Bud Walton of Arkansas, Died in 1995

Edward Gaylord of Oklahoma, Died in 2003

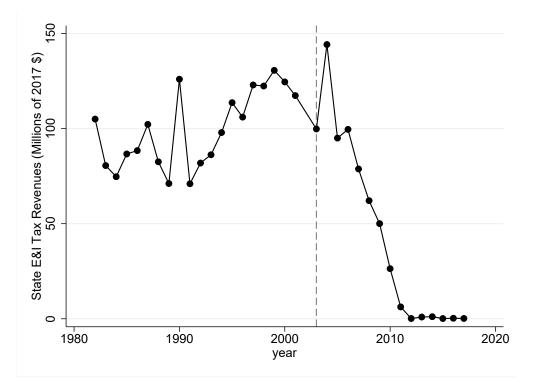
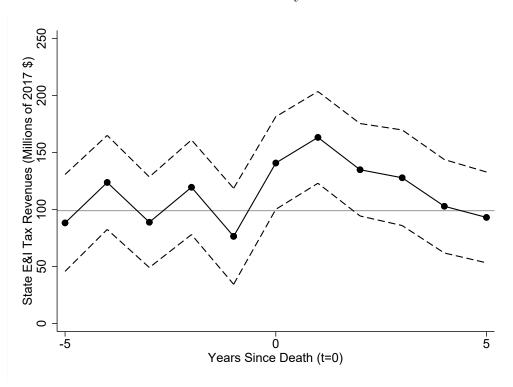
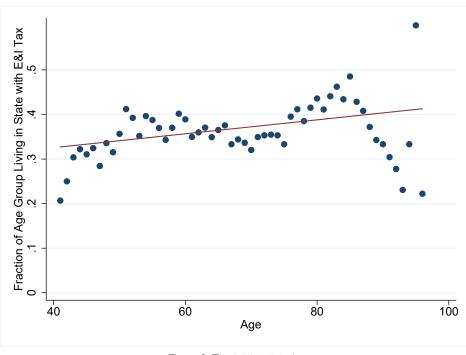


Figure 5: Impact of Billionaire Death on State Estate Tax Revenues Event Study

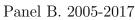


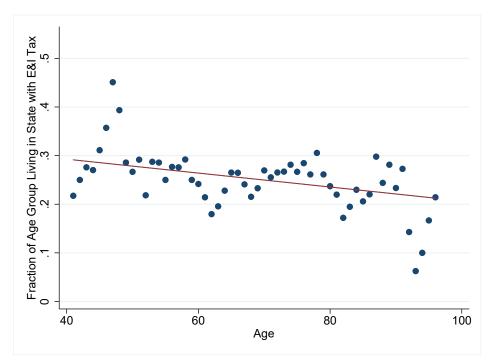
Notes: Horizontal line equals average coefficient over pre-death periods (-5 to -1). Dashed lines indicate 90% confidence interval.

Figure 6: Probability of living in Estate Tax State By Age



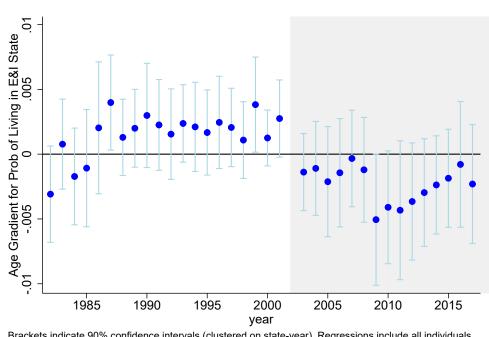
Panel A. 1982-2001





Notes: Age Groups below 40 are excluded. Individuals above 95 are pooled and displayed at Age 96.

Figure 7: Estimated Age Gradient for Probability of Living in Estate Tax State



Year-by-Year Regressions

Brackets indicate 90% confidence intervals (clustered on state-year). Regressions include all individuals over 39 years old.

Taxable Estate (\$)	Base Amount of Credit (\$)	Credit Rate on Excess $(\%)$
100,000	0	0.8
150,000	400	1.6
200,000	1,200	2.4
300,000	$3,\!600$	3.2
500,000	10,000	4.0
700,000	18,000	4.8
900,000	27,600	5.6
1,100,000	38,800	6.4
$1,\!600,\!000$	$70,\!800$	7.2
2,100,000	$106,\!800$	8.0
$2,\!600,\!000$	$146,\!800$	8.8
$3,\!100,\!000$	190,800	9.6
$3,\!600,\!000$	$238,\!800$	10.4
4,100,000	$290,\!800$	11.2
5,100,000	402,800	12.0
6,100,000	$522,\!800$	12.8
$7,\!100,\!000$	$650,\!800$	13.6
8,100,000	786,800	14.4
9,100,000	930,800	15.2
10,100,000	1,082,800	16.0

Table A1: Maximum Federal Credit Schedule for State Estate Taxes 1954-2001

Source: Bakija and Slemrod (2004), Table 1

Table A2: Summary Statistics

Panel A. Individual-by-Year Obs	ervations. $1982 - 2017$
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	Mean	Median	Standard Deviation	Minimum	Maximum
Age	64.31	65.00	13.11	23.00	96.00
Net Worth (billions, 2017 dollars)	3.02	1.60	5.73	0.19	125.06
Observations	13432				

Panel B. Distribution of Net Worth – 2017

	1st	10th	25th	50th	75th	90th	99th
Net Worth (Billions, 2017 Dollars)	2.0	2.2	2.7	3.7	5.5	12.0	71.0

Panel C. State-by-Year Observations. 1982-2017

	Mean	Median	Standard Deviation	Minimum	Maximum
Population of Forbes 400	7.68	3.00	15.07	0.00	98.00
Net Worth (billions 2017 dollars)	22.63	5.86	53.36	0.00	617.80
Estate Tax Indicator	0.30	0.00	0.46	0.00	1.00
Top PIT Rate	4.86	5.40	2.96	0.00	14.10
Observations	1750				

Name	Death Year	Death State	Obituary Res. State	Forbes Res. State	Notes
Liliore Green Rains	1985	CA	CA	CA	
Mary Belin Du Pont Faulkner	1985	MA	MA	MA	
Abram Nicholas Pritzker	1986	IL		IL	
David Whitmire Hearst	1986	CA	CA	CA	
Gordon Barton Mclendon	1986	TX	TX	TX	
Howard Vollum	1986	OR	OR	OR	
Arnold Bernhard	1987	NY	NY/CT	CT	
Burton Green Bettingen	1987	CA	CA	CA	
Henry Ford II	1987	MI	MI	FL	
Henry John Heinz II	1987	FL	PA	PA	Died at winter home
Paul Kalmanovitz	1987	CA	CA	CA	
Ruth Chandler Von Platen	1987	CA	CA	CA	
Sol Goldman	1987	NY	NY	NY	
John Wilmer Galbreath	1988	OH	OH	OH	
Lawrence Arthur Wien	1988	CT	CT/NY/FL	NY	
Pierre Samuel Du Pont	1988	DE	DE	DE	
Henry Crown	1990	IL	IL	IL	
Mark Goodson	1992	NY	NY	NY	
Edward John Debartolo					
Milton Jack Petrie	1994	OH NY	OH	OH	
	1994		NY	NY	
Albert B Alkek	1995	TX	TX	TX	
Alpheus Lee Ellis	1995	FL	FL	FL	
Erskine Bronson Ingram	1995	TN	TN	TN	
James Lawrence Walton	1995	AR	FL	AR	Died on fishing trip
John Jeffry Louis	1995	IL	IL	IL	
Joseph R Coulter	1995	FL	FL	FL	
Walter A Haas	1995	CA	CA	CA	
Bob John Magness	1996	CO	VA		UVA hospital.
Daniel James Terra	1996	WA	IL/WA/France	IL	-
David Packard	1996	CA	CA	CA	
Louis Larrick Ward	1996	MO	MO	MO	
Claude Bernard Pennington	1997	LA	LA		
Herbert Allen	1997	NY	NY	NY	
Jack Kent Cooke	1997	DC	DC	VA	
Roberto Crispulo Goizueta	1997	GA	GA	GA	
Betsey Cushing Roosevelt Whitney	1998	NY	NY	NY	
Dwight Lyman Stuart	1998	CA	CA	CA	
John William Berry	1998	OH	OH	OH	
William Michael Cafaro	1998	OH	OH	OH	
Curtis Leroy Carlson	1999	MN	MN	MN	
Forrest Edward Mars Sr	1999	FL	FL	NV	
Henry Earl Singleton	1999	CA	CA	CA	
Jay Arthur Pritzker	1999	IL	IL	IL	
Leon Hess	1999	NY	NY	NJ	
Paul Mellon	1999	VA	VA	VA	
Ruth Ray Hunt	1999	TX	TX	TX	
Ted Arison	1999	Tel Aviv	Tel Aviv	FL	
Bill Daniels	2000	CA	CA	CO	Died in hospital.
Marshall Naify	2000	CA	CA	CA	-
Randolph Apperson Hearst	2000	NY	NY	NY	
Edmund Wattis Littlefield	2000	CA	CA	CA	
Larry Fisher				NY	
-	2001	FL	FL/ NY		
Malcom Purcell Mclean	2001	NY	NY	NY	
Michel Fribourg	2001	NY	NY	NY	
Reese Mcintosh Rowling	2001	TX	TX	TX	
William Redington Hewlett	2001	CA	CA	CA	
Alfred Lerner	2002	OH	OH	OH	
Kathryn Mccurry Albertson	2002	ID	ID	ID	
Millicent V Boudjakdji	2002	LA	LA	CA	
Robert Henry Dedman	2002	TX	TX	TX	
Victor Posner	2002	FL	FL	FL	
Walter Hubert Annenberg	2002	PA	PA/CA	PA	
Edward Lewis Gaylord	2003	OK	OK	OK	
Joan Beverly Kroc	2003	CA	CA	CA	
Laurence Alan Tisch	2003	NY	NY	NY	
Samuel Jayson LeFrak	2003	NY	NY	NY	
Charles B Benenson	2004	FL	NY	NY	Died suddenly.
	2004	MI		MI	5
Jay Van Andel	2004	11/11	MI		

Table A3: State of Deaths and State of Residence Reported by Forbes

Marvin Harold Davis Samuel Curtis Johnson	$2004 \\ 2004$	CA WI	CA WI	CA WI	
Susan Thompson Buffett	2004 2004	CA	WY	CA	Died on vacation.
Franklin Parsons Perdue	2004 2005	MD	MD	MD	Died on vacation.
Jackson Thomas Stephens	2005	AR	AR	AR	
Peter E Haas	2005	CA	CA	CA	
Preston Robert Tisch	2005	NY	NY	NY	
James R Cargill	2006	MN	MN	MN	
Lamar Hunt	2006	TX	TX	TX	
Margaret Anne Cargill	2006	CA	CA	CA	
Raymond J Noorda	2006	UT	UT	UT	
Robert Edward Rich	2006	FL	FL	FL	
Barbara Cox Anthony	2007	HI	GA/HI	HI	
Helen Walton	2007	AR	AR	AR	
James Martin Moran	2007	FL	FL	FL	
Margaret Hunt Hill	2007	TX	TX	ΤX	
James LeVoy Sorenson	2008	UT	UT	UT	
John Hugh Macmillan	2008	FL	FL	FL	
John Richard Simplot	2008	ID	ID	ID	
Carl Ray Pohlad	2009	MN	MN	MN	
Frank Batten	2009	VA	VA	VA	
Melvin Simon	2009	IN	IN	IN	
Samuel J Heyman	2009	NY	NY, FL, CN	NY	Died after surgery.
Trammell Crow	2009	TX	TX	TX	
William Morse Davidson	2009	MI	MI	MI	
Dolph Briscoe	2010	TX	TX	TX	
John Werner Kluge	2010	VA	VA	FL	
Paul Milstein	2010	NY	NY	NY	
Richard N Goldman	2010	CA	CA	CA	
Cargill Macmillan	2011	CA	CA	CA	
Carl Henry Lindner	2011	OH	ОН	OH	
Jack N Mandel	2011	OH	ОН	OH	
Jean Ellen Du Pont Sheehan	2011	DE	DE	\mathbf{FL}	
John Charles Haas	2011	PA	PA	PA	
John Edward Anderson	2011	CA	CA	CA	
Malcolm Green Chace	2011	MA	MA	RI	
Robert Alan Pritzker	2011	IL	IL	IL	
William Alfred Cook	2011	IN	IN	IN	
Albert Lee Ueltschi	2012	\mathbf{FL}	FL	FL	
Donald J Schneider	2012	WI	WI	WI	
Barbara Piasecka Johnson	2013	Poland	Italy, Poland, Monaco	NJ	
Edgar Miles Bronfman	2013	NY	NY	NY	
Harold Clark Simmons	2013	TX	TX	TX	
Leonard Samuel Skaggs	2013	UT	UT	UT	
Robert Earl Holding	2013	\mathbf{UT}		ID	Res. state unclear.
James Edwards Stowers	2014	MO	MO	MO	
Malcolm Glazer	2014	FL	\mathbf{FL}	FL	
Nelson Bunker Hunt	2014	TX	TX	TХ	
Patrick Joseph Mcgovern	2014	NH	CA	NH	
Kirk Kerkorian	2015	CA	CA	CA	
Michael Birck	2015	IL	IL	IL	
Ralph J Roberts	2015	PA	PA	PA	
Forrest Edward Mars Jr	2016	WY	WA	WY	
Jack Crawford Taylor	2016	MO	MO	MO	
Joseph C Mandel	2016	FL	OH	OH	Died at winter hom
Leandro Rizzuto	2017	\mathbf{FL}	\mathbf{FL}	WY	
Michael Ilitch	2017	MI	MI	MI	
Samuel Irving Newhouse	2017	NY	NY	NY	
Charles B Wang	2018	NY	NY	NY	

Table A4: Robustness

	(1)	(0)	(9)	(4)
	(1)	(2)	(3)	(4)
	Top 100	Top200	Top300	10 + Obs
ET-State X post-2001	-0.625***	-1.367^{***}	-1.936^{***}	-2.100***
	(0.116)	(0.208)	(0.401)	(0.521)
ET-State	0.0915	0.522	0.922**	0.861**
	(0.210)	(0.322)	(0.469)	(0.352)
Observations	1575	1610	1680	1575
Semi-elasticity	391	325	365	389
Std. Error	.073	.049	.076	.096

Panel A. Difference-in-Difference

Driscoll-Kraay (with 10-year bandwidth) standard errors in parentheses.

All regressions include state and year fixed effects.

* p < 0.10,** p < 0.05,*** p < 0.01

	(1)	(2)	(3)	(4)
	Top 100	Top200	Top300	10+ Obs
ET-state X post-2001 X old	-0.887***	-0.987***	-1.261***	-1.251***
	(0.152)	(0.280)	(0.383)	(0.484)
ET-state X old	0.302^{***}	0.353^{***}	0.538^{***}	0.588^{***}
	(0.0554)	(0.0637)	(0.106)	(0.219)
	0 101	0.100	0.005**	0.404
ET-State X post-2001	0.131	-0.190	-0.337**	-0.424
	(0.0833)	(0.143)	(0.167)	(0.265)
old X post-2001	0.914***	1.217***	1.623***	2.145***
I the II	(0.111)	(0.238)	(0.305)	(0.525)
	· /	· /		()
ET-State	-0.105	0.0844	0.192	0.137
	(0.102)	(0.160)	(0.239)	(0.218)
old	-0.219^{***}	-0.373***	-0.531^{***}	-0.487**
	(0.0500)	(0.0773)	(0.145)	(0.225)
Observations	3150	3220	3360	3150
Semi-elasticity, Young	.047	068	121	152
Std. Error	.03	.051	.06	.095
Semi-elasticity, Old	687	49	484	479
Std. Error	.097	.083	.108	.122

Panel B. Triple-Difference

Driscoll-Kraay (with 10-year bandwidth) standard errors in parentheses. All regressions include year fixed effects. State fixed effects are absorbed by old-young differencing. * p < 0.10, ** p < 0.05, *** p < 0.01

Table A5: Cost-Benefit Results Under Alternative Assumptions

	Baseline	Alt 1	Alt 2	Alt 3	Alt 4	Alt 5
ET States (10)						
Average CB ratio	0.61	0.22	0.92	0.52	0.73	0.28
Number with CB ≥ 1	1	0	4	1	1	0
Non-ET States (28)						
Average CB ratio	0.42	0.18	0.66	0.37	0.49	0.20
Number with $CB \ge 1$	1	0	3	1	2	0
All States (38)						
Average CB ratio	0.47	0.19	0.72	0.41	0.55	0.22
Number with $CB \ge 1$	2	0	7	2	3	0

Panel A: Billionaires Estate Tax

Panel B: Broad Estate Tax

	Baseline	Alt 1	Alt 2	Alt 3	Alt 4	Alt 5
ET States (14)						
Average CB ratio	0.91	0.36	1.34	0.78	1.07	0.91
Number with CB ≥ 1	4	0	11	4	8	4
Non-ET States (36)						
Average CB ratio	0.60	0.24	0.89	0.52	0.71	0.60
Number with $CB \ge 1$	4	0	19	2	7	4
All States (50)						
Average CB ratio	0.69	0.27	1.02	0.59	0.81	0.69
Number with $CB \ge 1$	8	0	30	6	15	8

Notes: Cost-benefit ratios in Panel A exclude states that had no Forbes 400 billionaires in 2017. Baseline assumptions are described in the text. Alternative 1 assumes that wealth and income grow at 7.0% (vs. 0% in baseline) per year beyond 2017; 7.0% is the average annual growth rate of Forbes 400 real wealth from 1982–2017. Alternative 2 assumes surviving spouse is 20 (vs. 10) years younger than decedent. Alternative 3 assumes states discount using a real interest rate of 1% (vs. 2%). Alternative 4 assumes income of Forbes 400 is half of income reported by top 400 income taxpayers according to IRS SOI data (vs. assuming it is 10.3% of Forbes 400 taxable wealth). All other parameter assumptions are the same as in the baseline scenario.

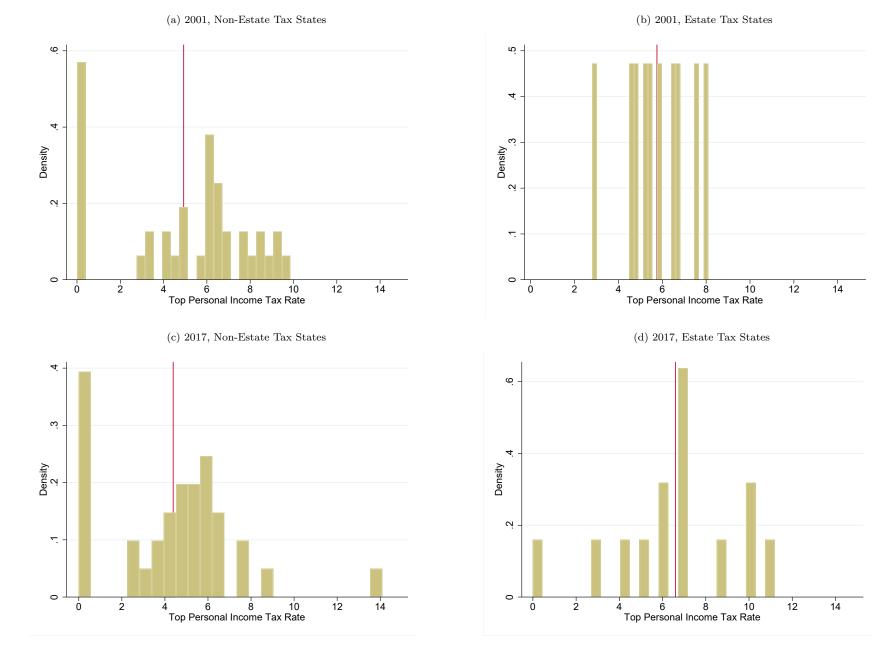
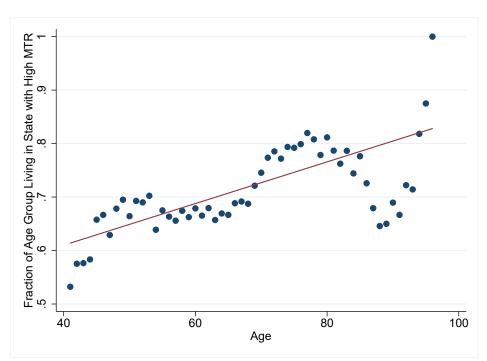
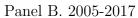


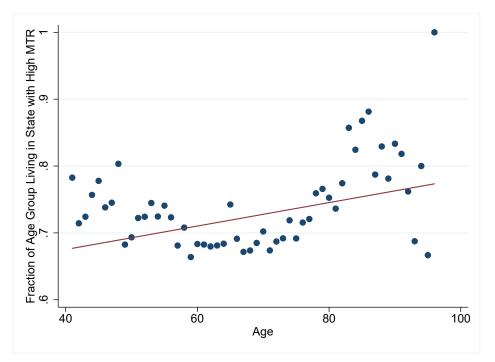
Figure A1: Distribution of Top Personal Income Tax Rates by State Estate Tax Status

Note: red lines indicate means.



Panel A. 1982-2004





Notes: Age Groups below 40 are excluded. Individuals above 95 are pooled and displayed at Age 96.