

Does State Fiscal Relief During Recessions Increase Employment?
Evidence from the American Recovery and Reinvestment Act¹

Abstract: The American Recovery and Reinvestment Act (ARRA) of 2009 included \$88 billion of aid to state governments administered through the Medicaid reimbursement process. We examine the effect of these transfers on states' employment. Because state fiscal relief outlays are endogenous to a state's economic environment, OLS results are biased downward. We address this problem by using a state's pre-recession Medicaid spending level to instrument for ARRA state fiscal relief. In our preferred specification, a state's receipt of a marginal \$100,000 in Medicaid outlays results in an additional 3.8 job-years, 3.2 of which are outside the government, health, and education sectors.

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I. Introduction

The federal government enacted the \$787 billion American Recovery and Reinvestment Act (ARRA) in February 2009 to provide a countercyclical impulse during the worst economic downturn in the United States in at least sixty years.² At the same time, state governments, almost all of which have balanced budget requirements that restrict borrowing across fiscal years, had already begun to lay off employees, cut spending and transfer programs, and raise taxes. Rather than concentrate the stimulus in direct federal government purchases of output, the ARRA's authors chose to mitigate this sub-national contractionary fiscal impulse by routing roughly a third of the total through state and local governments. The largest of these programs was the increase in the federal match component of state Medicaid expenditures.

Countercyclical intergovernmental transfers to support sub-national budgets have occurred previously in the U.S. and in other countries around the world. Yet, this form of stimulus has received little attention in the academic literature, compared with the large number of studies of direct government purchases or tax reductions.³ A priori, transfers could have a small or zero immediate impact on economic outcomes if states simply use them to bolster their rainy day funds, effectively shifting money between government accounts without affecting the overall stance of the general government sector. On the other hand, states may use the money to reduce tax increases or avert budget cuts, allowing the money to enter the economy more quickly than direct federal purchases that require project selection and approval. Reflecting this theoretical uncertainty, views on the effectiveness of state aid prior to the ARRA's passage ranged from then-House Minority Leader John Boehner, who predicted that "direct aid to the states is not

² The Congressional Budget Office estimated the net effect on the deficit to be \$787 billion in February 2009. Subsequent Congressional Budget Office analyses have put the cost slightly higher (see e.g. the January 2011 Budget and Economic Outlook which estimated the direct cost at \$821 billion).

³ There is a large literature on the extent to which federal grants crowd out local government spending which was spearheaded and summarized by Gramlich (1977).

going to do anything to stimulate our economy,” to the Obama Administration, which predicted that the state relief would save or create more than 800,000 jobs in the fourth quarter of 2010.⁴ Even well after the ARRA’s passage, disagreement continued, with many Republicans and some economists claiming that no jobs had been created, while the White House continued claiming large job gains.⁵

This paper aims to fill the gap in our understanding of intergovernmental transfers by empirically assessing the impact of the ARRA’s Medicaid match program. The program has a number of features that make it attractive for study. First, the total amount of money distributed through this program is large enough to plausibly generate a detectable effect on employment. Out of a total of \$88 billion dedicated to an increase in the Medicaid matching funds, states had received \$61.2 billion by June 30, 2010, the end of our period of study. Second, because state Medicaid programs operate on a mandatory basis, increasing the federal share of costs effectively transfers money into state budgets that states can then use for any purpose they choose – the money is fungible. Indeed, many states reported that they had allocated the money quickly to areas that otherwise would have undergone deeper budget cuts (Government Accountability Office 2009; National Association of State Budget Officers 2009b). Third, the level of additional money received by states as of June 2010 per person aged 16 or older (16+) varied greatly, from a low of \$103 in Utah to a high of \$507 in DC, with an interquartile range of \$114. This variation makes possible a cross-sectional econometric strategy. We focus our analysis on the effect on employment because the public debate on the effectiveness of the ARRA has centered largely on

⁴ See http://www.msnbc.msn.com/id/28841300/ns/meet_the_press/t/meet-press-transcript-jan/ and Romer-Bernstein (2009).

⁵ See <http://www.factcheck.org/2010/09/did-the-stimulus-create-jobs/> for a list of quotes from Republicans claiming that the ARRA created no jobs. Also, a survey by the National Association for Business Economics showed that 69% of business economists they surveyed reported that the ARRA had no impact on employment (<http://www.jsonline.com/business/82657582.html>).

this outcome. Furthermore, high-quality monthly state level employment data makes it possible to obtain more precise estimates of fiscal multipliers than what is possible with the existing state-level income data.

The primary challenge to a cross-sectional study is that the amount of aid a state receives is endogenous to the state's economic conditions. Because states that were in worse economic shape received more aid, the OLS relationship between the level of state fiscal transfers and changes in employment understates the true effect of state fiscal relief. We address this concern by using an instrument that isolates the component of the Medicaid transfers unrelated to changes in economic circumstances. The ARRA increased the percentage of Medicaid expenditures that the federal government pays for all states by 6.2 percentage points and increased the match rate by more for states that experienced especially large increases in unemployment. Thus, the level of ARRA Medicaid transfers to each state is the result of four factors: the amount of Medicaid spending in the state prior to the recession; the change in the number of beneficiaries during the recession; the change in the average spending per beneficiary; and whether the state qualified for an additional match increase based on the change in the state's unemployment rate. The heart of our identification strategy lies in exploiting only the cross-sectional variation from the first of these factors, that is, the variation in ARRA Medicaid transfers that results from variation in Medicaid programs from *before* the recession.

Another set of reasons why a state may have both received more Medicaid funding and had different employment outcomes—omitted factors related to both state Medicaid program rules and economic changes—is not solved by the instrument. For example, more liberal coastal and Midwestern states both had larger downturns and have more generous Medicaid programs. We present several pieces of evidence that suggest that our results are not driven by underlying

differences between high and low spending Medicaid states. First, to ensure that time-invariant differences between high and low Medicaid spending states are not driving our relationship, our empirical strategy considers changes, rather than levels, of employment. Second, in our baseline specification we exploit only differences in Medicaid spending within census divisions rather than between them, and include a number of variables that help predict how a state's employment would have changed absent the ARRA. Finally, we present falsification tests by running our baseline specification on pre-ARRA data and show that in the decade before the ARRA passed, states with high and low Medicaid spending experienced similar employment outcomes.

An important caveat to our analysis is that a cross-state approach forces us to ignore general equilibrium effects, which could alter our interpretation of the overall effect of stimulus spending on jobs. For example, spending in one state may increase demand in other states, which would lead us to under-state overall job increases.⁶ On the other hand, investment could decrease across the country in response to increased government borrowing, though this effect is likely to have been especially muted during the low policy interest rate environment of 2009-10. Likewise, to the extent that people believe that their taxes will be raised in the future due to the increased government borrowing, spending may decrease throughout the country.

With this caveat in mind, we find that the ARRA transfers to states had an economically large and statistically robust positive effect on employment. Assuming that employment does not persist beyond the time during which it is funded, our preferred specification suggests that a marginal \$100,000 in Medicaid transfers resulted in 3.8 net job-years of total employment

⁶ Moretti (2010) notes that, through labor mobility, cross-state spillovers can also be negative. However, labor mobility is likely small over a period of time as short as that considered here.

through June 2010, of which 3.2 are outside the government, health, and education sectors.⁷ The effect is precisely estimated, and we can reject the null hypothesis that the spending had no effect on employment with a high degree of confidence. For this result to be economically plausible, states must have used the funds to avoid spending cuts or tax increases. Hence we also provide evidence that the transfers do not appear to have increased the states' end of year balances. In connecting our estimates to the implicit changes in government spending or taxes, our paper also adds to the recent literature on the employment effects of state spending (e.g., Shoag 2010; Wilson 2011; Suarez-Serrato and Wingender 2011; Clemens and Miran 2011), as well as the fiscal effects of government spending generally (e.g., Nakamura and Steinsson 2011).

The paper proceeds as follows. In Section II, we describe the institutional details of Medicaid grants and the ARRA stimulus package. Section III contains our econometric methodology and describes our baseline specification. In Section IV, we describe our data. Sections V and VI present our main results and robustness checks, respectively. Section VII provides an interpretation of our results and relates them to the existing literature. Section VIII discusses evidence of a budgetary transmission mechanism, and Section IX concludes.

II. Institutional Details of the ARRA and Medicaid Grants

The ARRA became law in February 2009 at an estimated 10-year cost of \$787 billion. Through December 2010, it had distributed \$609 billion.⁸ As Cogan and Taylor (2010) point out, only \$30 billion of this total got recorded in the national income accounts as federal government consumption or investment. A little more than half (\$350 billion) went to individuals or business in the form of tax reductions or transfer payments. The rest, more than \$200 billion in total

⁷ A job-year corresponds to one job that lasts one year.

⁸ Data in this paragraph come from the Bureau of Economic Analysis Recovery Act data program at www.bea.gov/recovery.

through the end of 2010, went through state and local governments, including \$87 billion through the Medicaid match program designed especially to alleviate the strain on state budgets.^{9,10} State fiscal relief had the added advantage of getting out the door quickly: in the first quarter of 2009, more than three-fourths of total ARRA outlays and tax expenditures took the form of Medicaid outlays.

Medicaid is a state-run program that provides health insurance for certain individuals and families with low incomes and resources. Both the eligibility requirements and the scope of the insurance coverage vary across states.¹¹ The federal government reimburses states for between 50 and 83 percent of their Medicaid expenditures, as determined by the Federal Medical Assistance Percentages (FMAP). Many states require that local governments share in financing the non-federal portion of the program. Each federal fiscal year, states' FMAPs are recalculated based on the three-year average of each state's per capita personal income relative to the national average, with poorer states receiving higher reimbursement rates. Thus, states that have lower average incomes, more recipients of Medicaid per capita, or more generous benefits receive larger per capita matching funds from the federal government.

⁹ Elsewhere in the paper, we report that "\$88 billion of aid to state governments administered through the Medicaid reimbursement process." Here, we report \$87 billion as the amount of money given to state and local governments "through the end of 2010" because, a small amount of the reimbursement to states (about \$1 billion) was not recorded until 2011.

¹⁰ Another \$38 billion went through the State Fiscal Stabilization Fund (SFSF), part of a \$48.6 billion appropriation that apportioned the money according to a mix of population of persons aged 5-24 (61%) and total population (39%). Like the FMAP increase, the SFSF was designed to provide relief to state budgets. However, unlike Medicaid spending, there is very little cross-state variation in schooling-age population, making the program less suitable for a cross-state empirical design.

¹¹ There have been many studies examining the determinants of state Medicaid benefits and eligibility criteria. These studies show that Medicaid levels depend on an array of social, political, and economic factors in a state, including income, federal matching rates, and the degree of democratic control, with no one factor explaining the majority of the difference (Baughman and Milyo 2009; Kousser 2002).

The ARRA made three changes to the baseline FMAP calculation for October 2008 through December 2010.¹² First, the baseline FMAP could not decrease. Second, the FMAP was increased by 6.2 percentage points above the baseline for every state.¹³ The additional match applied retroactively from passage in mid-February back to October 2008, making part of the transfer purely lump-sum. Finally, through December 2010, each state received a further increase in its FMAP based on the largest increase in its unemployment rate experienced between the trough three-month average since January 2006 and the most recently available 3-month average.¹⁴ To qualify for the ARRA changes, states had to, at a minimum, maintain the eligibility standards, methodologies, and procedures of their Medicaid programs that existed on July 1, 2008. Program benefits could, however, change. The law also forbade states from increasing the share of the non-federally financed portion of Medicaid spending borne by local governments, in effect extending the fiscal relief to local governments as well.

There appear to have been two main rationales for the FMAP increases. First, unlike direct federal spending, state fiscal relief through changes to the FMAP could be implemented almost immediately; the first ARRA Medicaid reimbursements recorded by the Department of Health and Human Services occurred during the week ending on March 13, 2009, only a few weeks

¹² In August 2010 Congress passed and President Obama signed an extension of the increased FMAP through June 2011. The extension increased the FMAP from the baseline by 3.2 percentage points from January to March 2011, and by 1.2 percentage points from April to June, with additional provisions for states with especially high unemployment rates.

¹³ Under the ARRA, the 0.83 cap on FMAP was also removed.

¹⁴ In the fourth quarter of 2008 and the first quarter of 2009, the extra amount was actually based on the largest increase between the trough 3-month average unemployment rate since January 2006 and the average unemployment rate from October 2008 to December 2008. In the third and fourth quarters of 2010, the calculation was based on the difference between the same trough average rate and the larger average of the two 3-consecutive month periods beginning with December 2009 and January 2010, respectively. Furthermore, there was a maintenance of status clause which legislated that any increase in FMAP made for a quarter on or after January 1, 2009, would be maintained through the second quarter of 2010.

after the ARRA was signed into law.¹⁵ Second, the changes to FMAP were intended to boost the level of discretionary funds available to states, and not only to relieve Medicaid burdens. Because an increase in the FMAP reduces the state portion of mandatory payments, the additional funds are completely fungible – states can use them however they wish. Congress recognized the fungibility of the funds during the legislative debate. Indeed, the legislative text of the ARRA says that the first purpose of the section containing the FMAP increases is to “provide fiscal relief to States in a period of economic downturn.” Section VIII discusses the empirical evidence on how states used the extra FMAP funds.

Congress began discussions with state governors on a stimulus bill that would include significant aid to state governments as early as December 2008.¹⁶ The House appropriation committee draft released on January 15, 2009 included an increase in the FMAP of 4.8 percentage points, and both the original House and Senate versions, passed on January 28 and February 10, respectively, had the same \$88 billion allocated to Medicaid as the final bill. Hence our analysis should begin no later than December 2008 if state governments incorporated the likelihood of additional federal relief into their budget plans.

III. Econometric Methodology and Baseline Specification

Instrumental Variables Motivation

We begin with a simple framework that relates state fiscal relief to total employment. The change in the ratio of employment to potential workers in a state, s , depends on the state fiscal

¹⁵ States draw down the ARRA Medicaid funds the same way that they receive regular Medicaid matching funds, as they submit receipts.

¹⁶ For example, House Speaker Nancy Pelosi met with a group of governors on December 1st to discuss the contours of a stimulus bill that would include state aid. See Cowan (2008).

relief that the state receives, a series of controls that capture differential trends, and a state-specific shock:

$$(1) \quad \frac{E_1^s - E_0^s}{N^s} = \beta_0 + \beta_1 \frac{Aid^s}{N^s} + \beta_2 Controls^s + \varepsilon^s$$

where E_1^s is the seasonally-adjusted employment in state s in period i , N^s is the 16+ population in state s , β_0 is a national-level shock, Aid^s is the state fiscal relief received by state s , $Controls^s$ are state level controls in state s , and ε^s is a state-level mean-zero shock.¹⁷

If the state fiscal relief per potential worker, $\frac{Aid^s}{N^s}$, were uncorrelated with the error term, ε^s , then (1) could be estimated with bivariate OLS. However, this assumption is almost certainly not valid. The ARRA Medicaid transfers to each state reflect four factors: the amount of Medicaid spending in the state prior to the recession; the change in the number of beneficiaries during the recession; the change in the average spending per beneficiary; and whether the state qualified for the additional match increase based on the change in the state's unemployment rate. These last three factors, and especially the fourth, share the concern of reverse causality with respect to the outcome variable. Hence we use an instrument that restricts the cross-state variation to only that part of Medicaid transfers related to pre-recession Medicaid spending. Specifically, we implement a two-stage least squares estimation strategy, using 2007 Medicaid spending as an instrument for the FMAP transfers. We normalize all relevant variables by the number of individuals age 16+ in a state in 2008.¹⁸

¹⁷ Because seasonal adjustment differs significantly across states, our baseline specification focuses on seasonally adjusted data. However, in Table 5, we present year-over-year changes in employment using non-seasonally adjusted employment changes from the QCEW.

¹⁸ Other normalizations (such as the state's entire population) lead to almost identical results. Specifically, in our baseline specification with total nonfarm employment changes from December 2008 to July 2009, the coefficient on total FMAP outlays moves from 2.83 (p-value<0.01) with the population 16+ normalization to 2.78 (p-value<0.01)

We also include a number of state-level controls that are potentially correlated with both 2007 Medicaid spending and changes in employment. These controls are detailed in Section IV and include the lagged change in employment to capture pre-existing trends between high and low Medicaid spending states.

Other Aspects of the Baseline Specification

We focus on two primary outcome variables: change in seasonally adjusted total nonfarm employment and change in seasonally adjusted employment in the state and local government, health, and education sectors. We focus on total nonfarm employment because it is the most comprehensive measure of employment available in our primary data. We also consider government, health, and education workers since the direct effects of state spending are likely to be in these sectors, which contain state government employees, employees of local governments which may have received direct fiscal relief from lower required Medicaid payments and which depend heavily on state transfers for revenue, and employees of many of the private establishments that receive transfers or grants from state and local governments.¹⁹

Although we show how our estimates evolve over time in Section V, we focus on employment changes from December 2008 to July 2009 for our robustness checks and our summary statistics. We begin our period in December 2008 because, as described above, it is the last month before which the details of the ARRA, including the FMAP extension, became clear to the public. We end in July 2009 for three reasons. First, almost all states have fiscal years that run from July 1

with total population normalization. For employment in the government, health, and education sectors, the coefficient changes from 1.17 (p-value<0.01) with 16+ normalization to 1.18 (p-value<0.01) with the total population normalization.

¹⁹ To ensure that changes in federal employment are not driving our results, we exclude federal workers from this measure.

to June 30.²⁰ Thus, employment through the middle of July reflects any changes to government employment that occurred at the beginning of the first full fiscal year after the ARRA was passed. Second, employees in education tend to remain on the payroll through the end of the school year, so July is the first month that would fully reflect changes in the number of jobs in education. This is important because of the large fraction of state and local government spending that goes to education.

Historic aggregate time series confirm that employment changes are especially large in July. In unreported regressions, we compared the historical mean of the absolute value and square of state and local government employment changes for each month. For both measures, the average July change was larger than that of every other month, and the difference was statistically significant for every month but September and October. An ARCH specification with months entering the conditional variance term as multiplicative heteroskedasticity yielded similar results.

The third reason to end in July 2009 stems from efficiency considerations. If the component of state employment orthogonal to our regressors is i.i.d. with variance σ^2 at a monthly frequency, then the residual variance in a regression with employment change taken over k months will equal $k\sigma^2$. That is, standard errors should increase with the duration of the employment change. This is confirmed in Section V where we explore how the effect evolves over time. To generate precise estimates for the baseline specification, it is therefore preferable to restrict the time-window to be as short as possible.

²⁰ All states other than Alabama, Michigan, New York, and Texas have fiscal years that begin on July 1. Alabama and Michigan's start on October 1 (as does the federal fiscal year), New York's fiscal year begins on April 1, and Texas's fiscal year begins on September 1. See National Association of State Budget Officers (2008a).

The endogenous variable in our baseline specification is total FMAP outlays to a state through June 30, 2010, normalized by a state's 16+ population. This choice of endogenous variable is crucial to the interpretation of our results. If the state distribution of non-FMAP ARRA spending were correlated with the instrument, we would misestimate the true value of the coefficient on spending if we did not include the correlated component of spending in the endogenous variable. However, a regression of all non-FMAP ARRA outlays to states against the instrument (both normalized by 16+ population) and our baseline controls cannot reject the null that the instrument is uncorrelated with other spending (p-value = 0.413). As a further check, when we change our endogenous variable from FMAP outlays to total ARRA state outlays, our estimated coefficient on the endogenous variable remains positive, significant, and similar in magnitude to our baseline specification.²¹

Our final decision concerns the time covered by the endogenous variable. Since states tend to budget in yearly cycles, Medicaid transfers from the federal government received during a fiscal year could have an effect on employment at any point within that year. Borrowing restrictions make transferring funds across fiscal years difficult. With these facts in mind, we set the endogenous variable equal to the total FMAP transfers through June 2010, which corresponds to the end of fiscal year 2010 for nearly all states. We use this endogenous variable in all of our timing regressions which cover employment changes between December 2008 and each month through June 2010. Because the amount of Medicaid spending in a state exhibits a high degree of serial correlation, the precise end date barely affects the statistical significance of our results.

²¹ The ARRA state outlays are from Recovery.gov and exclude tax reductions.

IV. Data and Summary Statistics

Outcome variables. Our primary outcome variables are derived from the seasonally adjusted state-level employment series available at a monthly frequency from the Current Employment Statistics (CES). For each state for which the CES has data, we obtained monthly data from January 2000 to June 2010 on employment in total nonfarm, government, health, education, and education and health (a series that is reported separately and is available for a wider group of states than either the health or education series). The latest available vintage of CES data contains benchmarks to unemployment insurance (UI) records through September 2010, meaning that employment for each month is based on data from the UI program (adjusted for coverage using other CES sources) and therefore contains minimal sampling error. We normalize employment by a state's 16+ civilian non-institutional population as estimated by the Bureau of Labor Statistics from Census data.

Endogenous variables. Our primary endogenous variable is a state's total ARRA FMAP outlays as of June 30, 2010, normalized by a state's 16+ population. These data are available on Recovery.gov.²²

Instrument. The instrument is a state's Medicaid spending in fiscal year 2007, normalized by the 16+ population.^{23,24} Figure 1 demonstrates the considerable cross-state variation in the

²² The agency Financial and Activity Reports available on Recovery.gov report outlays at the Treasury Account Financing Symbol (TAFS) level. The TAFS for FMAP is 750518. A payment to a state is recorded as an outlay when money is transferred from the U.S. Treasury to the state as reimbursement for a Medicaid payment the state has already made. Our data exclude about \$3 billion provided through application of the ARRA FMAP increase to state contributions for prescription drug costs for full-benefit dual eligible individuals enrolled in Medicare Part D because the Financial and Activity Reports do not show a state-by-state breakdown of this spending during our period of study.

²³ Data on 2007 Medicaid spending by state are available from the Centers for Medicare and Medicaid Services 2008 Data Compendium.

instrument. To ease interpretation, the figure shows the instrument scaled by 6.2% because ARRA increased the FMAP by 6.2 percentage points, and inflated by 21/12 because from October 2008 (the month after which the FMAP increase was retroactively increased) through the end of June 2010 (the end of our sample), states received a cumulative 21 months of Medicaid reimbursements. Note that some states that are similar across many other dimensions have very different values; Medicaid spending is roughly twice as high in New York as in California, in Vermont as in New Hampshire, and in New Mexico as in Colorado.

Control variables. Our choice of control variables is motivated primarily by the threat to identification that states that received different amounts of Medicaid funding in 2007 were on different employment trends during the time period studied. Figure 2 shows on a map the value of the instrument, scaled as described above; states are grouped into six groups of spending per capita. One potential concern is there is substantial regional variation in Medicaid spending. For example, the map shows that New England has high Medicaid spending. Because the employment effects of the recession were distributed unevenly across regions,²⁵ differences in employment between high and low Medicaid spending states could reflect regional differences in underlying economic conditions rather than the effect of state fiscal relief. To address this concern, in our preferred specification, we include categorical variables for the nine census divisions, isolating the variation in the instrument that comes from within regions rather than between them.

²⁴ To address the concern that 2007 levels of Medicaid spending may be correlated to factors related to the size of the pre-recession boom, we experimented by using 2001 Medicaid spending as the instrument in unreported results. We obtained results similar to, and in some cases larger than, those reported below.

²⁵ A regression of the change in total employment from December 2008 to July 2009, normalized by a states 16+ population, on a set of 9 region dummies rejects the null that the region coefficients are jointly equal to 0 ($p=0.01$).

In our preferred specification, we also control for pre-existing economic conditions using lagged employment change (from May to December 2008, the 7 months prior to the beginning of our sample period). Adding this control is potentially important because empirically, employment changes are highly persistent.²⁶ Moreover, while we cannot reject the null that our instrument is uncorrelated with employment changes from May to December 2008, the point estimate for this correlation is non-trivial in magnitude, raising the possibility that high and low Medicaid spending states might have been on different employment trends prior to the ARRA.²⁷ In Section VI, we explore the robustness of our results to controlling for alternative measures of past economic conditions. In our baseline regression, we also control for GDP per potential worker and the employment manufacturing share.

To help address concerns about differential cyclicity of state spending related to the instrument through common political factors, we control for the 2007 share of workers in a union and the vote share for Senator Kerry in the 2004 presidential election. If cyclicity differs between states with different amounts of Medicaid spending (in ways not captured by a lag) because more liberal or unionized states have more Medicaid spending, as well as stronger safety nets and weaker balanced budget requirements, these controls would alleviate that concern. Finally, we control for the 2008 state population. Further details are in the appendix.²⁸

²⁶ A panel regression using the sample period 1990-2011 of the change in each state's total employment during a 7 month period on its lagged value and time fixed effects yields a coefficient of 0.52 on the lagged value.

²⁷ The correlation between the change in per capita total nonfarm employment between May and December 2008 and the instrument is 0.235 (p-value 0.097). The correlation between the change in per capita government, health, and education employment between May and December 2008 and the instrument is -0.195 (p-value 0.170). By comparison, during the main period of interest (December 2008 to July 2009), the correlation between the instrument and the change in employment is 0.5451 for total nonfarm and is 0.3982 for government, health, and education. In both cases, the associated p-values for these correlations are significant ($p < 0.05$).

²⁸ In results not reported here, we experimented with other possible control variables that might capture channels similar to those discussed in the text. These include the generosity of states' unemployment insurance systems and the presence of a Democratic governor in February 2009 as proxies for political factors, an index of budget restrictiveness from the Advisory Committee on Intergovernmental Relations to address the concern that the 2007

Table 1 presents summary statistics for the main variables used in the paper. All relevant variables are normalized by a state's 16+ population. The average total ARRA outlay through June 2010 was approximately \$1,000 per person age 16+ (excluding tax benefits and spending not tracked at the state level). Of this, approximately one-quarter came through FMAP outlays, and more than one-third came through FMAP outlays plus the other large state fiscal relief program, the State Fiscal Stabilization Fund. There is considerable variation in both total ARRA and FMAP outlays across states, with the coefficients of variation at 0.32 and 0.36 respectively. During the period considered, average total nonfarm employment changes were sharply negative. However, there is also considerable cross-state variation in this pattern. For example, normalized employment changes were more than 5 times more negative for the state at the fifth percentile of the total employment change distribution (Indiana) than the state at the 95th percentile (Alaska). There is broadly similar variation in the change in employment in the government, health, and education sectors.

V. Baseline Results

First Stage

In Table 2, we present results from several first-stage regressions. The outcome variable is total FMAP outlays as of June 30, 2010, normalized by a states' 16+ population and measured in \$100,000 increments.

To interpret Table 2, it is useful to divide the instrument coefficient by 0.062 to reflect the ARRA FMAP increase of 6.2 percentage points, and to further divide by 21/12 to adjust for the

Medicaid spending levels might be correlated with state budget rules, and the degree of house price appreciation during the mid-2000s as a proxy for economic conditions. The results reported in tables 4 and 5 are robust to the inclusion of these additional controls.

cumulative 21 months of Medicaid reimbursements through the end of June 2010 (the end of our sample), yielding a cumulative multiplicative scaling factor of 9.2. This scaled first stage coefficient would be 1 if the FMAP outlays simply represented 6.2% of Medicaid spending at 2007 rates. However, there are two reasons why we would expect the scaled coefficient to be larger than 1. First, FMAP ARRA outlays are based on current Medicaid spending, not 2007 spending. Due to the rapid growth in nominal Medicaid expenditures since 2007, if all states' Medicaid expenditures simply increased at the nominal national rate, we would expect a scaled coefficient substantially above 1.²⁹ Second, as described above, FMAP outlays also include FMAP increases for states that experienced sufficiently large changes in their unemployment rate. If high and low Medicaid spending states experienced identical changes in their unemployment rates, these FMAP expansions would mean that a larger number of dollars would flow to high Medicaid spending states, as a given FMAP increase translates into more dollars for these states. As a consequence, the average difference in Medicaid matching outlay for a high and low Medicaid spending state would be larger.

Model (1) presents a simple bivariate regression. The coefficient on our instrument is 0.18, and it is precisely estimated, with an F-statistic above 260. The instrument alone explains more than 80% of the variation in FMAP outlays. In Model (1), we can strongly reject the hypothesis that the scaled coefficient (0.18 divided by 0.062 and $21/12 = 1.68$) is 1. Specifications (2) – (4) show that this positive and precisely estimated relationship between the instrument and our main endogenous variable is robust to including a large number of covariates. Model (2) includes our basic set of controls, including region fixed effects. Model (3) adds a control for lagged total

²⁹ The Centers for Medicare and Medicaid Services (CMS) reports that in 2008, Medicaid spending increased 4.7%. CMS projected that Medicaid spending would increase 9.9% in 2009. See http://www.cms.gov/NationalHealthExpendData/25_NHE_Fact_Sheet.asp.

employment change from May – December 2008, while Model (4) augments (2) with lagged change in government, health, and education employment over the same period. Overall, the first stage is very strong.

Baseline Results through July 2009

In this section, we present baseline results where the outcome variable is change in employment in a sector from December 2008 to July 2009. Table 3 presents baseline results for total employment. Models (1) – (3) report OLS regressions. The OLS regressions with controls (Models (2) and (3)) indicate a small positive correlation between a state's FMAP outlays and its change in total employment, although the effect is not statistically significant.

Models (4) – (6) present the baseline IV results. There is a precisely estimated positive relationship between instrumented FMAP outlays and a state's change in total employment. In the bivariate IV regression [Model (4)], the coefficient on total FMAP outlays per person 16+ is 4.72. While the large difference between the IV and OLS estimates may appear surprising given the strength of the first stage, recall that the first-stage residual should be strongly negatively correlated with employment growth due to the unemployment triggers in the FMAP increase, biasing the OLS results downward.

Adding a wide variety of control variables [Model (5)] changes the estimate little. Including the lagged employment control [Model (6)] reduces the point estimate by approximately 40% but has little effect on the statistical significance of the result, as the standard error also shrinks. The fact that adding a control for lagged employment influences the point estimate suggests that high and low Medicaid spending states were on different employment trends prior to the ARRA, a hypothesis that we explore in the robustness section.

The coefficient in (6), the preferred specification, suggests that for every \$100,000 in FMAP outlays per individual 16+ that a state received by June 30, 2010, that states' total employment increased by 2.83 per individual 16+ from December 2008 to July 2009. Section VII provides further discussion of how to interpret this magnitude.

Table 4 replicates the results from Table 3, using the change in government, health, and education employment as the outcome variable. The results are broadly similar. The OLS coefficients [Models (1) – (3)] are positive, relatively small in magnitude, and not statistically significant. The IV results [Models (4) – (6)], in contrast, suggest a positive relationship between FMAP transfers and change in employment in these sectors. For the IV specifications, the control variables have very little influence on the point estimates, but they do substantially reduce the standard errors. The coefficient on (6) suggests that for every \$100,000 in FMAP outlays per individual 16+ that a state received by June 30, 2010, that states' employment in the government, health, and education sectors increased by 1.17 per individual 16+ over the period considered.

The coefficients in Table 4 are less than half of the magnitude of those in Table 3, suggesting that the “indirect” employment gains in the non-government-related sectors were substantial. To see this more explicitly, we re-estimate our preferred specification, changing the dependent variable to be the change in total employment excluding the change in employment in the government, health, and education sectors. This regression yields a coefficient of 1.86 (95% CI: 0.32, 3.41).

Timing Results

The previous section presented results where the outcome variable was the change in employment from December 2008 until July 2009. This section explores how our estimates evolve as we change the month that marks the end of our sample. Specifically, we re-run the cross-sectional regression for changes in employment from December 2008 until every month from January 2009 to June 2010 and report the second stage coefficients on total FMAP outlays from our preferred specification with the full set of control variables. That is, we re-run the estimate from December 2008 to January 2009, December 2008 to February 2009, December 2008 to March 2009, etc. and report each of these 18 coefficients.

Figure 3 presents these results for total nonfarm employment. The solid line represents the point estimate, and the dashed lines indicate the 95% confidence interval. These timing results suggest three main patterns. First, while there appears to be a positive relationship between FMAP outlays and change in employment before July 2009, the relationship is small and not precisely measured. Second, starting in July 2009, the coefficient jumps in magnitude, varying from a low of 2.16 (September 2009) to a high of 4.44 (February 2010). Finally, as expected, the standard errors tend to widen over time, although all of the coefficients remain statistically significant at the 95% level.³⁰

Figure 4 replicates the results from Figure 3, using employment in the government, health, and education sectors. The broad patterns present in Figure 3 are also present in Figure 4. Again, the

³⁰ In unreported results we find that the coefficient remains similar in magnitude through December 2010 and significant at the 95% level in every month but August. We do not emphasize these results here because (1) the state employment data for October-December 2010 have not yet been benchmarked and may undergo substantial revision and (2) the expiration of the original FMAP increase halfway through FY11 and the ambiguity surrounding possible extension (eventually passed in August 2010) complicate interpretation of the results, given the difficulty in knowing states' expectations over how much the extension would be or even whether there would be an extension.

coefficient increases for July 2009, and the standard errors increase over time. However, the ratio of the standard errors to the point estimate is larger than for total employment. Comparing the magnitudes between the two timing figures shows that in all months, the estimates for total employment are larger than those for government employment, with the gap increasing through 2009 and peaking in early 2010. This pattern is consistent with the government employment results reflecting the relatively immediate direct effect of states and state-funded establishments not having to lay off workers, while the total employment results include the lagging induced effects of households responding to higher disposable income.

VI. Robustness Checks and Extensions

Falsification Tests

Our identifying assumption is that, conditional on our control variables, states that had higher pre-recession Medicaid spending would not have experienced different employment outcomes from states that were lower spenders in the absence of the increase in FMAP. One way of assessing this assumption is to consider if the effects we estimate are larger than the relationship between Medicaid spending and employment growth that existed prior to the period of interest.

Figure 5 reports the second stage coefficients for placebo tests using data that begin in January 2000 and end in December 2008. To parallel our baseline specification, we consider seven-month changes in both total nonfarm employment and employment in government, health, and education. We then run our IV estimates on each overlapping seven-month period, for a total of 101 regressions. We rank the coefficients based on their magnitude and report the empirical CDF. For comparison, we also show the second stage estimate run on the baseline period, December 2008 to July 2009, with a vertical line.

The results show two key patterns. First, the estimates are centered around 0; the empirical median of the estimate is 0.00 for total nonfarm and 0.11 for government, health and education. That is, in the years before the ARRA was passed, there is little evidence to suggest that high and low Medicaid spending states experienced systematically different employment trends. Second, our baseline estimates of both total nonfarm and government, health, and education employment are large relative to the coefficients in the period before the ARRA. For total employment, our result is larger than all but seven of the 101 pre-ARRA estimates. For government, health, and education, our estimate is larger than all but three of the pre-ARRA estimates. Both pieces of evidence increase our confidence that the estimates reported above are capturing the effect of the ARRA rather than underlying differences between high and low Medicaid spending states.

Other Robustness Checks

Our baseline specification allows for the possibility that high and low Medicaid spending states were on different pre-existing employment trends by controlling for a linear lag of the change in employment. This subsection addresses the concern that a linear lag may not be a sufficient statistic for pre-existing employment trends. Specifically, we report results allowing for a more flexible pre-existing trend and using a state's pre-treatment industry composition and the change in employment by industry in other states to impute employment change during the treatment period, following Bartik (1991) and Blanchard and Katz (1992). The latter require detailed industry data from the QCEW, a dataset that is not available on a seasonally adjusted basis and that does not have representative coverage of the government sector.^{31,32} We therefore present

³¹ According to the Bureau of Labor Statistics *Employment and Wages, Annual Averages 2008*, 5% of total state and local government workers are not covered by the QCEW. See <http://www.bls.gov/cew/cewbultn08.htm#Coverage>.

³² In practice, we perform the imputed employment calculation at the four-digit level because of disclosure limitations that eliminate observations at higher levels of detail. The results are similar when we use six-digit industries.

results for the change in total nonfarm employment, and for December 2008 to December 2009 in the specifications that use the imputed employment predictor.

Model (1) of Table 5 shows the second stage coefficient when we re-run our baseline specification, replacing the linear lag of employment change with an autoregressive model estimated using 18 years of data prior to the sample period to forecast a state's employment change from December 2008 to July 2009.³³ The second stage coefficient is 2.89, essentially unchanged from the value of 2.83 in the specification with the linear lag presented in table 3. Models (2)-(3) add a quadratic and cube of the lagged employment change to account for the fact that the serial correlation in changes in per capita employment may be non-linear, again with essentially no effect on the coefficient of interest. The next three columns shift the end-month to December 2009 in order to accommodate our measure of imputed QCEW employment change based on pre-ARRA industrial composition. The appendix contains further details of this variable's construction. As a benchmark, column (4) gives the baseline result that appears in Figure 3. Column (5) adds the imputed employment change, with very little effect on the FMAP coefficient. Column (6) replaces the outcome variable with QCEW data and again finds essentially the same result.³⁴ In sum, the relationship between FMAP transfers and employment growth appears very robust to our alternative methods of generating an employment change counterfactual.

³³ Specifically, the logarithm of total employment was regressed against a time variable and 9 monthly lags of itself. The coefficients were then used on data through December 2008 to forecast employment from January 2009 through July 2009. Note that this control variable is helpful if the patterns of employment changes over the 18 year prior to our sample period remained unchanged during our sample period. Because our period involves the most severe recession since World War II, it is possible that this assumption is not valid.

³⁴ The closeness of the coefficients in columns (5) and (6) reflects the benchmarking of the CES to the QCEW.

VII. Discussion

Job-years

Our results indicate a positive and robust relationship between receiving FMAP transfers and relative employment outcomes. To interpret the magnitude of the estimates, we can translate the regression coefficients into the increase in job-years from \$100,000 of marginal state fiscal relief. This requires two assumptions. First, we assume that FMAP outlays received through June 2010 have no employment effects beyond June 2010. If instead the employment effects linger beyond June 2010, then our estimate of job-years is a lower bound. Second, we assume that transfers to states after June 2010 do not influence employment changes before June 2010. This assumption is likely to be valid (at least for state employment) if states are unable to shift money across fiscal years.

Under these assumptions, the increase in job-years from \$100,000 of FMAP outlays can be calculated by taking the integral under the timing charts (Figures 3 and 4) and dividing by 12 to convert job-months to job-years. Our point estimates suggest that \$100,000 of marginal state fiscal relief increases state employment by 3.8 job-years, 3.2 of which are outside the government, health, and education sectors. The associated p-value for this calculation is 0.018 for total employment, while the p-value for total employment excluding the government, health, and education sectors is 0.010.³⁵ Dividing \$100,000 by 3.8 job-years yields a cost per job of \$26,000.

³⁵ To obtain standard errors, we re-estimate the baseline model using the *sum* of the monthly employment changes for each state as the outcome variable. That is, the outcome variable for a given state is the sum of employment in January 2009 through June 2010 minus 18 times the employment in December 2008. We then re-estimate our baseline IV regression with robust standard errors. By construction, in both the total and government, health, and

When considering the generalizability of the results, it is important to consider both the intended and apparently realized fungibility of the funds. As noted above, the text of the bill made clear that the funds were for general obligations, and states reported using them for this purpose. Indeed, results disaggregating the government, health, and education employment results suggest that only about a quarter of the increase in employment was in the health sector, with another quarter in education and the other half in state and local government.³⁶

In the context of our broader understanding of the costs and benefits of fiscal stimulus, state fiscal relief, in particular, may be a particularly low-cost means of supporting employment during a recession. Furthermore, the jobs increases were rapid, perhaps because “shovel-ready” projects were often not necessary; in many cases, state and local governments only needed to avoid cuts.

Comparison to the literature

This paper contributes to a literature which uses cross-state variation to estimate fiscal multipliers. We do this using the most recently-available evidence in a context in which the parameter being estimated has direct relevance to a policy question: how much is employment increased by state fiscal relief during a recession? Although estimated in quite different settings, Suarez-Serrato and Wingender (2011) and Shoag (2011) find estimates which are remarkably similar to our estimate of cost per job, at \$30,000 and \$35,000 per year respectively.³⁷

education regressions, the point estimate on FMAP outlays is identical to the estimate obtained above from summing across the 18 separate regressions.

³⁶ When using the change from December 2008 to July 2009 in state and local government employment as the dependent variable in our baseline regression we estimate a coefficient of 0.65 (SE = 0.26) on the FMAP transfers, while changes in health and education employment yield coefficients of 0.21 (SE = 0.10) and 0.29 (SE = 0.11) respectively.

³⁷ See also Neumann et al. (2010) and Fishback and Kachanovskaya (2010) for studies using cross-sectional variation during the Great Depression.

While the political debate has focused on the effect of fiscal stimulus on employment, the academic literature more commonly estimates the government purchases multiplier for output. Also using cross-state variation, Nakamura and Steinsson (2011) find an open-economy government purchases multiplier of 1.5, and Shoag (2011) finds an output multiplier of 2.1. Our findings are consistent with this range. We roughly map our results to an output multiplier as follows: in 2008 average compensation in both the total economy and state and local government was \$56,000 per employee. If total compensation equals the marginal product of labor and workers affected by state fiscal relief have this same average compensation, this result would imply an output multiplier for a dollar of transfers of about 2.³⁸ Given that the results from this cross-state approach does not incorporate general equilibrium effects, cross-state multipliers, or the response of a monetary authority, we interpret this multiplier as only suggestive of the national multiplier of policy interest.³⁹

A few other papers have also studied parts of the ARRA. Wilson (2011) and Feyrer and Sacerdote (2011) report costs per job of \$114,312 and \$170,000, respectively, but their numbers are not directly comparable to the 3.8 jobs per \$100,000 reported above because they do not account for the timing of job creation and they cover other portions of the stimulus.⁴⁰ Sahm et al. (2010) find a relatively modest impact from the Making Work Pay tax cut. Mian and Sufi (2010) find that the relatively small (\$3 billion) “Cash for Clunkers” program (which was

³⁸ This calculation assumes that capital stays fixed. Data on average compensation per employee come from the Bureau of Economic Analysis GDP-by-Industry accounts. The output multiplier equals the jobs multiplier multiplied by value-added per job (equivalent to a worker’s marginal product), or $(3.8/\$100,000)*\$56,000=2.13$.

³⁹ Nakamura and Steinsson (2011) and Shoag (2011) explore the theoretical mapping from these estimates of local fiscal multipliers to the national multiplier in an open economy setting.

⁴⁰ Wilson’s results for total job creation are closest to ours. This is not surprising, since his paper adopts our instrument, along with using simulated instruments for highway and education spending. The Feyrer-Sacerdote number corresponds only to “direct jobs” funded by the ARRA. Conley and Dupor (2011) find a positive effect of ARRA transfers on government employment, but no positive effect on employment outside of government.

separate from the ARRA but implemented concurrently during the summer of 2009) had little net effect on purchases.⁴¹

VIII. Mechanism

The ARRA transfers reached states in dire fiscal condition. During the 2009 fiscal year, 43 states faced budget gaps totaling more than \$60 billion (National Conference of State Legislatures 2009). Almost all states have balanced budget requirements; thus, the large budget gaps necessitated that they take action by cutting expenditures, raising revenues, or drawing from their “rainy day” funds or end of year balances, which are used to smooth revenue across years.

^{42, 43} Indeed, by December 2008, 22 states had made or announced cuts to their expenditures totaling \$12 billion.⁴⁴ By July 2009, 42 states had made cuts to their expenditures totaling more than \$30 billion, and 30 states had increased taxes or fees to boost their revenues.⁴⁵

There are essentially only three ways in which states could use the ARRA state fiscal relief funds: to alleviate program cuts, to prevent or lower tax and fee increases, or to contribute to their end of year balances (which include their rainy day funds). As long as the states did not respond to the federal transfers by completely siphoning them to their end of year balances, the observed employment responses could come from multipliers on the states’ spending or tax

⁴¹ The Obama Administration (Council of Economic Advisers 2010), Congressional Budget Office (2010b) and private forecasters and academics (Blinder and Zandi 2010) have all evaluated the ARRA using a multiplier model based on historical relationships between government spending, output and employment. These studies tend to find effects similar to or slightly smaller in magnitude than those in the current study for state fiscal relief. However, they are all calibrated models, whereas the current study uses empirical estimation. Council of Economic Advisers (2009) reported preliminary results to those in the current paper.

⁴² All states, except for Vermont, have some version of balanced budget requirements as reported by the National Association of State Budget Officers (2008a). Poterba (1994) gives an overview of the varying requirements.

⁴³ From National Association of State Budget Officers (2008a). Kansas and Montana do not have budget stabilization (or “rainy day”) funds. However, they, like other states, may use surpluses from the prior fiscal year to cushion any fiscal difficulty in the next.

⁴⁴ From National Association of State Budget Officers (2008b).

⁴⁵ Budget cuts from the National Association of State Budget Officers (2009a). The \$32 billion figure refers to the expenditure cuts in fiscal year 2009 alone. Tax increases from Johnson, Nicholas, and Pennington (2009).

actions.⁴⁶ The results in Section V suggest that the ARRA funds were at least partially used to avoid program cuts, since a concentration of the employment effects appears to have occurred in sectors (government, health, and education) which are reliant on state funds. That total employment beyond those sectors is also affected positively by the federal fiscal relief suggests that there is a source of spillovers, arising from higher disposable income due to either the wages of the direct hires or lower net taxes because of fewer tax or fee increases.

We can directly test the necessary condition that FMAP outlays affected spending or tax actions by regressing the change in end of year balances from 2008 to 2009 on instrumented FMAP outlays and controls. Models (1) – (3) of Table 6 summarize the results of these regressions. All else equal, if states that received more FMAP money decreased their balances less, we would expect a positive and significant coefficient on FMAP outlays, with the extreme case that if all of the money were saved we would expect a coefficient of 1. Instead, the estimates in (1) – (3) are small in magnitude, negative in all three of the specifications, and never significantly different from 0.⁴⁷ Furthermore, the models allow us to reject the null that half of transfers were saved by states at the 99% confidence level for two regressions and at the 95% confidence level for the third, confirming that at least some of the funds were used to slow either budget cuts or tax increases. Models (4) – (6) of Table 6 repeat the same exercise, using the change in end of the

⁴⁶ Several recent empirical studies have found a positive effect of lower taxes or higher transfers on economic outcomes (Johnson, Parker and Souleles 2006; Sahm, Shapiro and Slemrod 2009; Romer and Romer 2010). Empirical evidence on the effect of spending changes is more mixed (Blanchard and Perotti 2002; Hall 2009; Ramey 2009; Barro and Redlick 2010). Theoretical results in Woodford (2011) and Christiano, Eichenbaum and Rebelo (2011) and empirical work by Auerbach and Gorodnichenko (2011) emphasize that the spending multiplier may differ depending on the state of the business cycle and the stance of monetary policy, with the punch-line that the depressed demand and zero interest rate policy that prevailed during our period of study should produce maximal spending multipliers.

⁴⁷ Throughout these regressions, we exclude Alaska, a state that experienced a per 16+ population decline in its end of year funds that was more than ten times larger than that of the next largest states, Wyoming (from 2008 to 2009) and Texas (from 2009 to 2010). When we include Alaska, we also cannot reject the null that the coefficient on total FMAP outlays per person is equal to 0 (p-value for the bivariate IV regression is 0.435 for changes from 2008 to 2009 and is 0.311 for changes from 2009 to 2010). In addition, because the National Association of State Budget Officers does not provide data on DC, we exclude it from our regressions.

year balances from 2009 to 2010 as the dependent variable, and yield similar results. In summary, although the regressions have wide standard errors, the point estimates provide no evidence to suggest that states are retaining the transferred money in the form of end of year balances or rainy day funds.^{48, 49}

To determine if states that received more transfers cut their budgets less, we ran specifications that parallel those in Table 6 where the outcome variable was the change in expenditure (normalized by a state's 16+ population) between 2008 and 2009 and between 2009 and 2010. Unfortunately, the results from this regression are quite noisy, and we can neither reject the null that all of the money was spent on reducing budget cuts (which would imply a coefficient of one) nor the null that none of the money was spent on reducing budget cuts (which would yield a coefficient of zero).⁵⁰ Results using changes in a state's revenue are similarly noisy, and thus do not provide conclusive evidence about the use of funds to reduce tax or fee increases. Further research into how states optimize over the margins of tax and spending when faced with an altered budget constraint would be a worthwhile area of future study.

⁴⁸ Papers by Poterba (1994) and Alt and Lowry (1994) examine how the states' balanced budget rules affect their responses to deficits and find that in response to a positive deficit shock, states cut expenditures or raise taxes within either the current or the following fiscal year. This is consistent with the findings that a federal transfer (a negative deficit shock) would impact expenditures or taxes.

⁴⁹ These results contradict those of Cogan and Taylor (2010), who find using aggregate time-series data that ARRA Medicaid spending increased aggregate state net lending as measured in the National Income and Product Accounts. Given the unusual nature and length of the 2007-09 recession and its effect on state budgets, it is possible that aggregate time-series regressions misattribute the effect of the worsening recession and the eventual binding of state balanced budget requirements on net lending to the introduction of the FMAP expansion. Alternatively, it is possible that all states increased their saving in response to the FMAP transfers by the same dollar amount per capita, regardless of the amount of FMAP transfers actually received.

⁵⁰ Fiscal year 2008 expenditure data and the enacted tax and fee data are from the National Association of State Budget Officers (2009b). Fiscal year 2009 and 2010 expenditure data are from the National Association of State Budget Officers (2010).

IX. Conclusion

This paper estimates the employment effects of a relatively unstudied form of government macroeconomic intervention that took center stage in the recent ARRA: fiscal relief to states during a downturn. We exploit cross-state variation in transfer receipts that comes from pre-recession differences in Medicaid spending. All else equal, states that spent more money on Medicaid before the recession received more money from the federal government. We confront the major threat to identification—that states that spent more money on Medicaid may be on differential employment trends from states that spent less—in several ways, including adding regional fixed effects and other control variables as well as conducting placebo tests. Our baseline specifications suggest that \$100,000 of marginal spending increased employment by 3.8 job-years, 3.2 of which are outside the government, health, and education sectors.

The fact that state fiscal relief may be an effective tool to cushion employment losses in recessions raises two questions. First, if the employment effects of state fiscal relief are substantial, should the federal government play a larger role in providing revenue to states during recessions? When designing state fiscal relief, federal planners face a tradeoff between providing relief to states experiencing critical budget situations and minimizing perverse incentives for state policy makers. If states expect to receive federal aid during recessions, they may not save sufficiently during boom times. This moral hazard is compounded if federal aid targets states with larger budget shortfalls, which might be desirable because aid distributed using a non-need-based formula would likely produce smaller employment effects. An important area of future research is to determine the extent to which these tradeoffs limit the potential for state fiscal relief to be an effective tool for cushioning job losses during recessions.

Second, why are states unable to save money during economic booms and use this savings during recessions? Because most states have adopted balanced budget legislation, states cannot borrow money during recessions to smooth fluctuations. As a substitute, most states have a “rainy day” fund that allows them to avoid the requirement of literally balancing their budget every fiscal year. However, political economy considerations make saving difficult for democratic governments (Alesina and Tabellini 1990; Amador 2003), and most states have essentially no restrictions on when they must contribute to their rainy day fund.⁵¹ For example, during the 1990s economic boom, states increased spending and cut taxes rather than contributing to their rainy day funds.⁵²

To help solve these political economy problems, some states have considered adopting rules that would require the state to contribute to their rainy day fund during healthy economic times. For example, a state could be required to contribute to its fund when the unemployment rate in the state falls below a given threshold, and be permitted to tap into its fund when the unemployment rate rises to a sufficiently high level. These regulations have the advantage of constraining politicians, while helping to alleviate some of the fiscal strain induced by a recession. The evidence presented in this paper, though it concerns funding from the federal government, also informs the impact of additional state resources on state-level employment, and suggests that these and other rules may help states boost employment during recessions. Future research could focus on additional benefits, as well as costs, from state fiscal relief and state budgetary rules.

⁵¹ The majority of states have requirements that they contribute to their rainy day funds only if the budget has a surplus. However, because states determine when they have a surplus by setting the level of taxes and spending, in practice such requirements impose few restrictions on states’ contributions to their rainy day funds.

⁵² See Zahradnik and Ribeiro (2003) and the National Conference of State Legislatures (2004).

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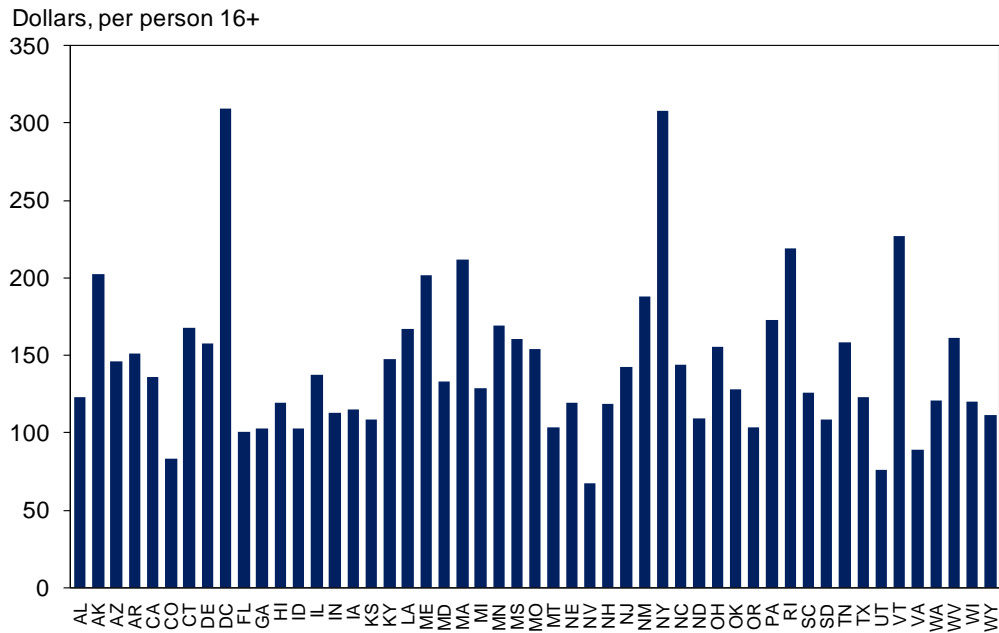
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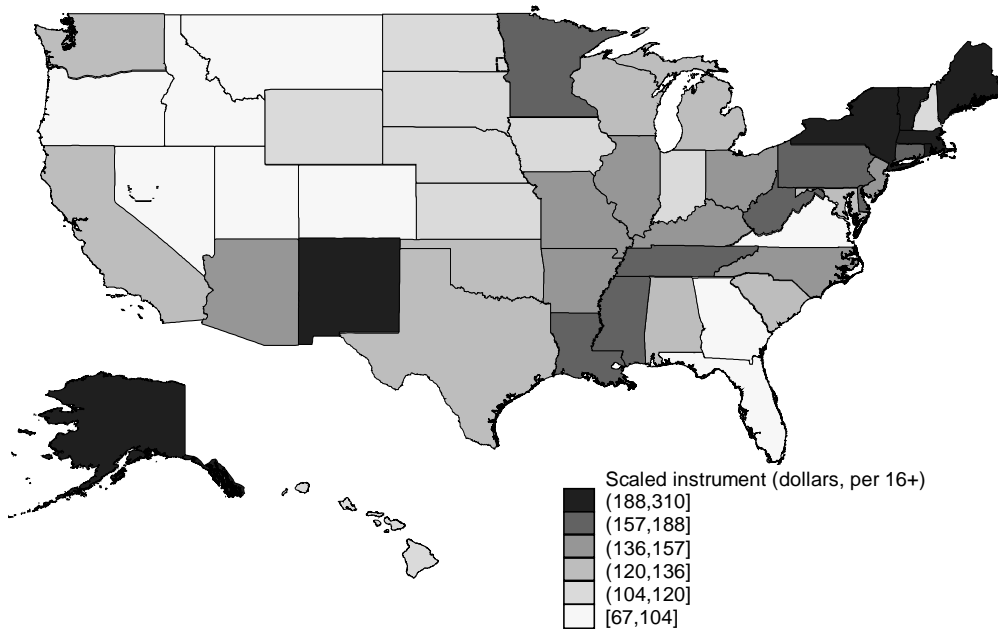
FIGURES

Figure 1: Value of Scaled Instrument/Simulated FMAP Payouts



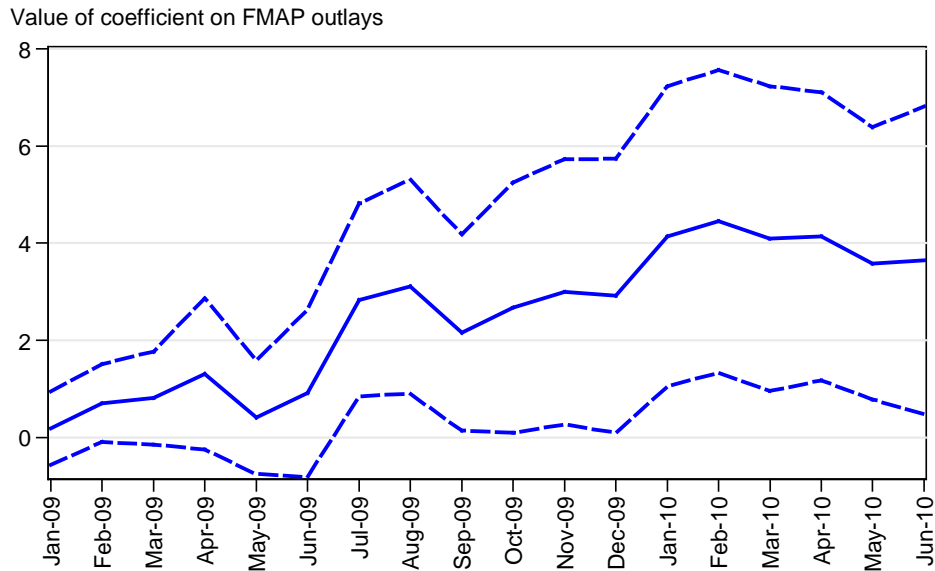
Note: The value of the scaled instrument is 0.062 * state's fiscal year 2007 Medicaid spending * 21/12. See text for full details. Data are from the Center for Medicaid Services, Data Compendium, Table VII.1.

Figure 2: Value of Scaled Instrument/Simulated FMAP Payouts



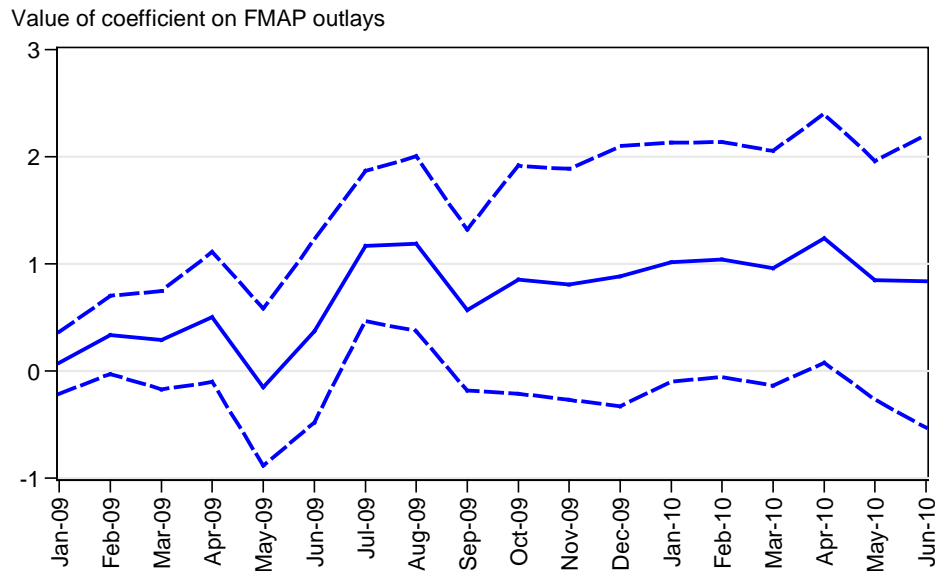
Note: The value of the scaled instrument is 0.062 * state's fiscal year 2007 Medicaid spending (per person 16+) * 21/12. See full text for details. Data are from the Center for Medicaid Services, Data Compendium, Table VII.1.

Figure 3: Total Nonfarm Second Stage Coefficients



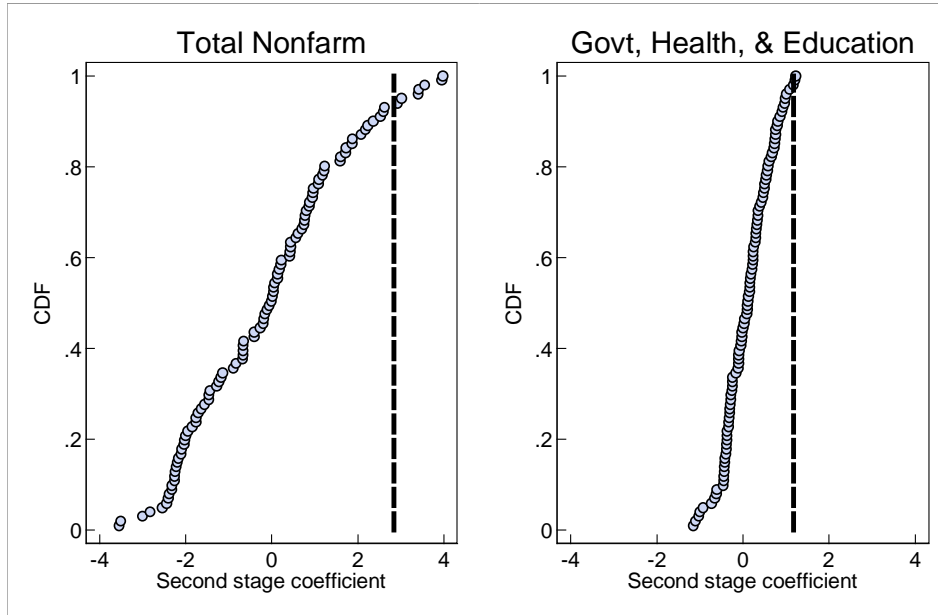
Note: This chart displays the second stage coefficient for regressions where the outcome variable is the change in seasonally adjusted employment between December 2008 and the month indicated on the x-axis. The variable of interest is total FMAP outlays. Regressions include the full set of controls. The 95% confidence interval, derived from robust standard errors, is plotted in dashed lines.

Figure 4: Government, Health and Education Second Stage Coefficients



Note: This chart displays the second stage coefficient for regressions where the outcome variable is the change in seasonally adjusted employment between December 2008 and the month indicated on the x-axis. The variable of interest is total FMAP outlays. Regressions include the full set of controls. The 95% confidence interval, derived from robust standard errors, is plotted in dashed lines.

Figure 5: Placebo Results



Note: Plots results of second stage regressions, where the outcome variable is seasonally adjusted change in employment for each overlapping 7 month period, starting in Jan 2000 and ending in Dec 2008. All regressions include the full set of control variables. Coefficient from Dec 2008 to July 2009 is indicated with the vertical line. Note that government excludes federal government employment.

Does State Fiscal Relief During Recessions Increase Employment?

TABLES

Table 1: Summary Statistics

	Mean	Std. Dev.	Minimum	Median	Max
<i>Outcome Variables, Per 1,000 Person 16+</i>					
SA Δ govt, health, & education, Dec. 2008 \rightarrow July 2009	0.97	2.06	-2.13	0.53	9.11
SA Δ total nonfarm employment, Dec. 2008 \rightarrow July 2009	-18.76	7.15	-38.84	-18.23	3.11
<i>Payout Variables and Instrument, Per Person 16+</i>					
Total ARRA outlays through June 2010	\$1,002	\$323	\$586	\$960	\$2,940
Total FMAP outlays through June 2010	\$250	\$90	\$103	\$235	\$507
Total FMAP and SFSF outlays through June 2010	\$373	\$88	\$176	\$358	\$583
2007 Medicaid spending (instrument)	\$1,328	\$454	\$624	\$1,227	\$2,854
<i>Control Variables</i>					
Employment in manufacturing, percent	11.03	4.28	1.40	11.00	20.30
Vote share Kerry (2004), percent	46.52	10.38	26.00	47.02	89.18
Union share, percent	11.16	5.49	3.00	10.40	25.20
GDP per person 16+ (\$1,000)	49.20	17.20	31.91	46.28	154.89
Population 16 and older (millions)	4.60	5.13	0.41	3.32	27.85
SA Δ govt, health, & education, May 2008 \rightarrow Dec. 2008	1.73	1.27	-1.44	1.75	6.30
SA Δ total nonfarm employment, May 2008 \rightarrow Dec. 2008	-11.04	6.91	-33.42	-11.25	2.60

Notes: See text and data appendix for sources. Note that "government" excludes federal government employees. "SA" means seasonally adjusted.

Table 2: First Stage Regressions

	(1)	(2)	(3)	(4)
2007 Medicaid spending (instrument)	0.18*** (0.01)	0.15*** (0.01)	0.16*** (0.01)	0.15*** (0.01)
Region fixed effects?		X	X	X
Vote share Kerry		X	X	X
Union share		X	X	X
GDP per person 16+		X	X	X
Employment in manufacturing		X	X	X
State population		X	X	X
Lagged total employment change May 2008 to Dec 2008			X	
Lagged government, health, and education employment change May 2008 to Dec 2008				X
Observations	51	51	51	51
R-squared	0.84	0.93	0.93	0.93
Mean of dependent variable	250.23	250.23	250.23	250.23

Notes: The outcome variable for each regression is total FMAP outlays per individual 16+ in a state, through June 30, 2010. The variable is measured in \$100,000 per person 16+. See text and data appendix for sources. Note that "government" excludes federal government employees. Robust standard errors are in parentheses.

* significant at the 10% level. ** significant at the 5% level. *** significant at the 1% level.

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Table 3: Total Employment Baseline Results

	OLS			IV		
	(1)	(2)	(3)	(4)	(5)	(6)
Total FMAP payout per person 16+ (\$100,000)	2.94** (1.35)	1.88 (1.83)	0.82 (1.06)	4.72*** (1.31)	4.61*** (1.57)	2.83*** (1.01)
Vote share Kerry (2004), percent/10,000		0.28 (2.02)	2.1 (1.57)		-0.79 (1.59)	1.14 (1.14)
Union share, percent/10,000		-4.26 (3.60)	-2.93 (2.17)		-6.00** (2.91)	-4.29** (2.01)
GDP per person 16+ (\$1,000,000)		0.01 (0.07)	-0.03 (0.06)		-0.01 (0.06)	-0.04 (0.05)
Employment in manufacturing, percent/10,000		-10.05*** (3.05)	-6.61*** (2.39)		-9.75*** (2.82)	-6.83*** (2.12)
State population 16+, billions		-0.43*** (0.12)	-0.33*** (0.08)		-0.46*** (0.10)	-0.36*** (0.08)
Lagged total employment change May 2008 to Dec 2008			0.42* (0.21)			0.37** (0.17)
Region fixed effects?		X	X		X	X
Observations	51	51	51	51	51	51
Mean of dependent variable * 1,000	-18.76	-18.76	-18.76	-18.76	-18.76	-18.76

Note: The outcome variable for each regression is the seasonally adjusted change in total non-farm employment per individual 16+ in a state, from December 2008 to July 2009. The main variable of interest is total ARRA FMAP payouts through June 30, 2010. Specifications (4) - (6) instrument total ARRA FMAP payouts with pre-recession Medicaid spending as described in the text. See text and data appendix for sources. Robust standard errors are in parentheses.

* significant at the 10% level. ** significant at the 5% level. *** significant at the 1% level.

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Table 4: State and Local Government, Health, and Education

	OLS			IV		
	(1)	(2)	(3)	(4)	(5)	(6)
Total FMAP payout per person 16+ (\$100,000)	0.43 (0.53)	0.34 (0.44)	0.30 (0.40)	0.99* (0.54)	1.19*** (0.37)	1.17*** (0.36)
Vote share Kerry (2004), percent/10,000		-0.76* (0.39)	-0.64 (0.39)		-1.10*** (0.30)	-1.01*** (0.32)
Union share, percent/10,000		0.16 (0.95)	0.33 (0.96)		-0.38 0.76	-0.26 0.8
GDP per person 16+ (\$1,000,000)		0.07*** (0.02)	0.07*** (0.02)		0.06*** (0.02)	0.06*** (0.02)
Employment in manufacturing, percent/10,000		-1.93** (0.89)	-1.84* (0.96)		-1.84** (0.84)	-1.77** (0.88)
State population 16+, billions		-0.11*** (0.03)	-0.10** (0.04)		-0.12*** (0.03)	-0.11*** (0.03)
Lagged government, health, and education employment change May 2008 to Dec 2008			0.18 (0.18)			0.14 (0.17)
Region fixed effects?		X	X		X	X
Observations	51	51	51	51	51	51
Mean of dependent variable * 1,000	0.97	0.97	0.97	0.97	0.97	0.97

Note: The outcome variable for each regression is the seasonally adjusted change in total employment in state and local government, health, and education per individual 16+ in a state, from December 2008 to July 2009. The main variable of interest is total ARRA FMAP payouts through June 30, 2010. Specifications (4) - (6) instrument total ARRA FMAP payouts with pre-recession Medicaid spending as described in the text. See text and data appendix for sources. Note that "government" excludes federal government employees. Robust standard errors are in parentheses. * significant at the 10% level. ** significant at the 5% level. *** significant at the 1% level.

Table 5: Total Employment Robustness Checks

	Dec 2008 to July 2009			Dec 2008 to Dec 2009		
	CES			CES		QCEW
	(1)	(2)	(3)	(4)	(5)	(6)
Total FMAP payout per person 16+ (\$100,000)	2.89** (1.23)	2.80*** (0.95)	2.79** (1.29)	2.92** (1.44)	2.74** (1.34)	2.81** (1.27)
Baseline controls	X	X	X	X	X	X
Forecasted emp ch, Dec 2008 to July 2009, CES	X					
Lagged total emp ch, July 2008 to Dec 2008, CES		X	X	X	X	X
Lagged total emp ch squared, July 2008 to Dec 2008, CES		X	X			
Lagged total emp ch cubed, July 2008 to Dec 2008, CES			X			
Imputed emp ch, Dec 2008 to Dec 2009, QCEW					X	X
Observations	51	51	51	51	51	51
Mean of dependent variable * 1,000	-18.76	-18.76	-18.76	-21.81	-21.81	-22.17

Note: In (1) - (3), the outcome variable is the change in total employment from December 2008 to July 2009 from the CES. In (4) and (5), the outcome variable is the change in total employment from December 2008 to December 2009 from the CES. For (6), the outcome variable is the change in total employment from December 2008 to December 2009 from the QCEW. The main variable of interest is total ARRA FMAP payouts through June 30, 2010. The construction of the instrument is described in the text. "Baseline controls" are vote share Kerry, union share, GDP per person 16+, employment in manufacturing, state population, and region fixed effects. Sources of control variables are detailed in the data appendix. See the text for the construction of forecasted and imputed employment change. Robust standard errors are in parentheses.

* significant at the 10% level. ** significant at the 5% level. *** significant at the 1% level.

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Table 6: Transmission Mechanism

	Rainy Day Fund, change 2008 to 2009			Rainy Day Fund, change 2009 to 2010		
	(1)	(2)	(3)	(4)	(5)	(6)
Total FMAP payout per person 16+ (\$100,000)	-0.26 (0.18)	0.01 (0.23)	-0.14 (0.21)	-0.04 (0.09)	0.08 (0.18)	0.04 (0.17)
Region fixed effects?		X	X		X	X
Includes lagged employment?			X			X
Excludes Alaska?	X	X	X	X	X	X
Missing DC?	X	X	X	X	X	X
Observations	49	49	49	49	49	-17.84
Mean of dependent variable (*100,000)	-29.22	-29.22	-29.22	-17.84	-17.84	-17.84

Note: The outcome variable for (1) - (3) is change in a state's rainy day fund, in \$100,000, per person 16+, from fiscal year 2008 to fiscal year 2009. The outcome variable for (4) - (6) is the change in a state's rainy day fund, in \$100,000, per person 16+, from fiscal year 2009 to fiscal year 2010. Data are from the National Association of State Budget Officers (NASBO) Fiscal Survey of the States. The fiscal 2008 rainy day fund data come from the Fall 2009 Fiscal Survey, and the fiscal 2009 and 2010 rainy day fund data come from the Spring 2010 Fiscal Survey. All specifications exclude DC due to missing data. They also drop Alaska, an outlier in terms of the change in the state rainy day fund. Robust standard errors are in parentheses.

* significant at the 10% level. ** significant at the 5% level. *** significant at the 1% level.

APPENDIX

Sources and Descriptions of Baseline Control Variables

- Region effects: We include dummy variables for each of the 9 census defined divisions. Definitions are given at http://www.census.gov/geo/www/us_regdiv.pdf.
- Lagged change in employment: We control for the lagged value of the outcome variable. Specifically, if the outcome variable is change in total (government, health, and education) employment from month m to month m' , the lagged change in employment will be the change in total (government, health, and education) employment from month $m-7$ to month m . In our baseline specification where the outcome variable is change in employment from December 2008 to July 2009, the lagged change in employment is the change in employment from May 2008 to December 2008. This 7 month lag was chosen to follow the 7 month period used for the outcome variable in our baseline specification.
- GDP per potential worker: We use a state's 2008 GDP, normalized by a state's 16+ population, from the Bureau of Economic Analysis.⁵³
- Employment manufacturing share: From the Census Bureau, we also control for the share of the civilian employed population 16 years and older that is in the manufacturing sector. Data are from the American Community Survey and are averaged over 2005 – 2007 to reduce measurement error.
- State 2008 population and 2008 16+ population. Data are from the US Census.

⁵³ See http://www.bea.gov/newsreleases/regional/gdp_state/2009/pdf/gsp0609.pdf.

- 2004 Kerry share. The state's share of voters who cast ballots for Senator Kerry in the 2004 United States presidential election.
- Union share. Share of workers in a union, from the Bureau of Labor Statistics.⁵⁴

Description of Imputed Employment

As a robustness check, we control for a measure of imputed employment that uses information on the change in employment in each industry in the rest of the country and the initial industry distribution in each state to impute an expected employment change. Specifically, for state j and industry k define the percent change in employment in industry k in all other states as:

$$(A1) \quad \% \Delta E^{-j,k} = \frac{\sum_{s \neq j} E_t^{s,k}}{\sum_{s \neq j} E_{t-1}^{s,k}} - 1$$

The imputed employment change for industry k in state j is then:

$$(A2) \quad \Delta \hat{E}^{j,k} = E_{t-1}^{j,k} \cdot \% \Delta E^{-j,k}$$

The total imputed employment change for state j is the sum over all industries:

$$(A3) \quad \Delta \hat{E}^j = \sum_k \Delta \hat{E}^{j,k}$$

We implement (A1)-(A3) using the QCEW December 2008 and December 2009 state-level flat files.⁵⁵ The QCEW provides employment by NAICS code and ownership status (private, federal government, state government, and local government). The QCEW suppresses output for state-industry-ownership rows where the number or concentration of firms does not surpass a

⁵⁴ From <http://www.bls.gov/news.release/pdf/union2.pdf>.

⁵⁵ The files can be downloaded from <ftp://ftp.bls.gov/pub/special.requests/cew/yyyy/state> for yyyy={2008,2009}.

minimum disclosure threshold. Letting $o \in \{private, federal, state, local\}$ define ownership status, we set $E_{t-1}^{j,k,o} = 0$ for any state-industry-ownership row with suppressed output. In practice, missing the disclosure threshold correlates well with small size, so this assumption is quite mild. Nonetheless, we define industries using four digit rather than six digit NAICS codes in order to minimize disclosure limitations. Using six digit industries yields very similar results. Since we are interested in industry variation, we collapse the QCEW data on ownership status before implementing (A1)-(A3).