#### Employment Impacts of the CHIPS Act

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  - Industrial policy was long "submerged," operating especially through defense procurement.
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- ▶ Motivations:
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  - Creating good, high-paying jobs.
- ▶ We focus on employment.
  - ▶ Has the act created jobs? How many?
  - ▶ Politically salient, in past and probably future.

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  - Counties with semiconductor facility vs. counties with high-tech employment but no semiconductor facility.
  - Counties with semiconductor fabrication facility ("fab") vs. counties with semiconductor facility but no fab.

Background 0000 Data O

Empirical Strategies

Results 00000000

- 1. Anticipation effects (à la Ramey (2011)).
  - ▶ Began with introduction of pre-cursor bill (USICA) in Senate.
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- 2. Robust employment effects in semiconductors.
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- 3. Local spillovers on employment in supplier industries, construction.
  - ▶ Indirect effect: 190-220 jobs per affected county.
- ▶ Back-of-the-envelope calculations of national effects:
  - ▶ Direct effect: 14,900-20,860 jobs.
  - ▶ Indirect effect: 28,310-32,780 jobs.
  - ▶ Not enormous relative to projected spending of \$52.7 billion.
  - ▶ But larger than many expected, given industry capital-intensity.

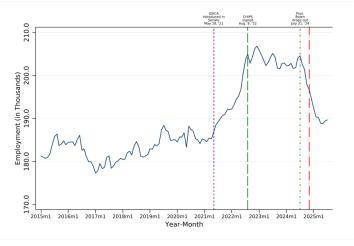
#### Background

- ► Components of CHIPS Act:
  - ▶ \$39 billion: direct subsidies for production of semic<sub>i</sub>+-¿onductors and related equipment and materials.
  - ▶ \$11 billion: R&D funding.
  - 25% investment tax credit.
    - ▶ Increased to 35% in July 2025.

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  - ▶ 25% investment tax credit.
    - Increased to 35% in July 2025.
- ➤ Timing:
  - May-June 2020: Endless Frontiers, CHIPS for Americas Acts introduced.
  - May 18, 2021: US Innovation and Competition Act (USICA) introduced.
  - ▶ June 8, 2021: USICA passed Senate 68-32 (with 19 Rep. votes).
  - ▶ Feb. 4, 2022: America COMPETES Act passed House.
  - ▶ July 27-28, 2022: CHIPS and Science Act passed Senate & House.
  - ▶ Aug. 9, 2022: CHIPS and Science Act signed by Biden.
  - Nov. 15, 2024: First major CHIPS Award finalized.

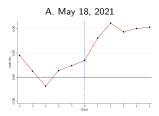
### **Employment in Semiconductors**

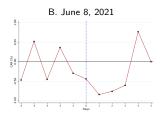


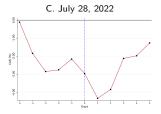
Notes: Figure plots national employment in the semiconductor industry (NAICS 334413) from the Current Employment Statistics (National Series).



#### Stock Market Reaction: Cumulative Abnormal Returns







Notes: Cumulative Average Abnormal Returns (CAARs) for 21 seminconductor firms. Abnormal Returns (ARs) calculated by estimating the regression  $R_{it} = \gamma_i R_{mt} + \alpha_i + \varepsilon_{it}$ , where  $R_{it}$  is firm i's return and  $R_{mt}$  is the  $\mathrm{SkP}$  500's return, over the period 250 days to 30 days before the event, and then defining  $AR_{it} = R_{it} - \hat{\gamma}_i R_{mt} - \hat{\alpha}_i$  for the indicated event window. The ARs are averaged across firms and summed across event window to get CAARs.



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  - CEO Caulfield later told CNBC: "We believe that for economies of scale and the ability to bring capacity online quicker it's better to expand existing facilities."
- ▶ Covid chips shortage evident by Jan. 2021 (King et al., 2021).

#### Data

- ▶ Main datasets:
  - Quarterly Census of Employment and Wages (QCEW)
    - ▶ Draws on administrative records from unemployment systems.
    - ▶ 6-digit industry (e.g. NAICS 334413), county, quarter level.
    - ▶ Extensive suppression/non-disclosure to preserve confidentiality.
    - Main estimates: impute zeros for missings. Robustness: drop missings.

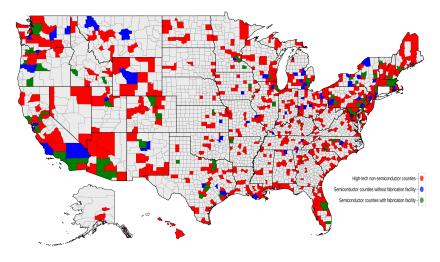
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  - Semiconductor Industry Association (SIA) Ecosystem Map
    - ▶ Indicates locations of facilities of members (99% of industry).
    - ▶ Indicates type of facility (e.g. production, design, R&D).

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- Secondary datasets:
  - Quarterly Workforce Indicators (QWI).
  - Bureau of Economic Analysis (BEA) County GDP series.
  - Current Employment Survey.

### Treatment & Control Groups



Source: Semiconductor Industry Association's (SIA) U.S. Semiconductor Ecosystem Map. Counties with a pre-existing fabrication facility are marked in green. Counties with pre-existing semiconductor facility but no fabrication facility are marked in blue. Counties with employment > 100 in 11 high-tech sectors (defined by Census Bureau) but no pre-existing semiconductor production facility are marked in red.

# **Specifications**

Simple D-in-D:

$$Y_{it} = \mu + \alpha_i + \gamma_t + \beta \cdot \mathsf{Treated}_i \cdot \mathsf{Post}_t + \varepsilon_{it}$$

D-in-D event study:

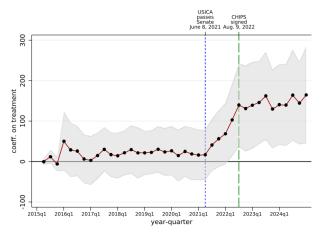
$$Y_{it} = \mu + \alpha_i + \gamma_t + \sum_{\tau=2015q2}^{2024q4} \beta_\tau \cdot D_{i,t}^\tau + \varepsilon_{it}$$

Synthetic D-in-D (Arkhangelsky et al., 2021):

$$\left(\hat{\beta}, \hat{\mu}, \hat{\alpha}, \hat{\gamma}\right) = \underset{\beta, \mu, \alpha, \gamma}{\arg\min} \left\{ \sum_{i=1}^{n} \sum_{t=2015q1}^{2024q4} \left(Y_{it} - \mu - \alpha_i - \gamma_t - W_{it}\beta\right)^2 \hat{\omega}_i \hat{\lambda}_t \right\}$$

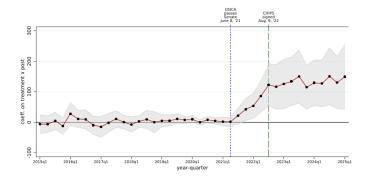
▶ Key assumption: Treatment & control groups (possibly with reweighting) would have been on parallel trends in absence of CHIPS.

#### Employment, Simple D-in-D, Semi vs High-Tech



Notes: Event-study specification. Outcome is the number of workers employed in the semiconductor sector (NAICS industry code 334413). Source is QCEW 6-digit data. Sample includes all counties with at least 100 workers in 11 high-tech sectors, as defined in Census Bureau (2024), as of 2021Q1. Shaded area is 95% confidence interval. Standard errors are clustered at the county level.

#### Employment, Synthetic D-in-D, Semi vs High-Tech



Notes: QCEW 6-digit data. Outcome is the number of workers employed in the semiconductor sector (NAICS industry code 334413). Estimated treatment effects produced by implementing the event-study estimator proposed by Clarke et al. (2024). Shaded area is confidence interval at the 95% level. Standard errors are clustered at the county level.

## Employment, Simple D-in-D, Semi vs High-Tech

|  | Semiconductor production employment (1) | Semiconductor<br>equipment &<br>materials<br>employment<br>(2) | Semiconductor<br>production,<br>equipment &<br>materials<br>employment<br>(3) |  |
|--|---|--|---|--|
| Panel A: Treatment effect post-USICA   |   |  |   |  |
| Treated x Post-USICA   | 106.087***                              | 34.810**   | 140.898***  |  |
|  | (39.905)                                | (16.819)   | (50.166)  |  |
| Observations Pre-USICA outcome mean (treated counties) County FE Year-Quarter FE | 36941                                   | 36941  | 36941   |  |
|  | 868.8                                   | 164.5  | 1033.3  |  |
|  | Y                                       | Y  | Y   |  |
|  | Y                                       | Y  | Y   |  |
| Panel B: Treatment effect post-CHIPS, omitting 2021Q2-2022Q3                     |   |  |   |  |
| Treated x Post-CHIPS   | 127.543***                              | 36.088**   | 163.631***  |  |
|  | (46.912)                                | (18.252)   | (57.996)  |  |
| Observations Pre-USICA outcome mean (treated counties) County FE Year-Quarter FE | 31535                                   | 31535  | 31535   |  |
|  | 868.8                                   | 164.5  | 1033.3  |  |
|  | Y                                       | Y  | Y   |  |
|  | Y                                       | Y  | Y   |  |

Notes: QCEW 6-digit data 2015Q1-2025Q1. In Panel A, the "Post" indicator identifies quarters after USICA passed in the U.S. Senate. In Panel B, the "Post" indicator identifies quarters after the CHIPP SA ct was signed into low. Panel B omits the time period from USICA until CHIPP SA Ct was dispended and the period from USICA until CHIPP SA Ct was dispended so that to those prior to the precursor of CHIPS, the USICA. Outcome in Column 1 is the number of workers employed in the manufacturing of equipment (NAICS 333242) or material injunts (NAICS 310423) or material injunts (NAICS 333242) or material injunts (NAICS 333280) or material injunts (NAICS 333242) or material injunts (NAICS 333282) or material injunt

#### Employment, Synthetic D-in-D, Semi vs High-Tech

|  | Semiconductor production employment (1) | Semiconductor<br>equipment &<br>materials<br>employment<br>(2) | Semiconductor production, equipment & materials employment  (3) |
|--|---|--|---|
| Panel A: Treatment effect post-USICA           |   |  |   |
| Treated x Post-USICA                           | 110.411***                              | 15.755   | 124.082***  |
|  | (35.189)                                | (11.996)   | (38.533)  |
| Observations                                   | 36941                                   | 36941  | 36941   |
| Pre-USICA outcome mean (treated counties)      | 868.8                                   | 164.5  | 1033.3  |
| Panel B: Treatment effect post-CHIPS, omitting | 2021Q2-2022Q3                           |  |   |
| Treated x Post-CHIPS                           | 133.055***                              | 13.836   | 142.392***  |
|  | (43.520)                                | (15.049)   | (48.336)  |
| Observations                                   | 31535                                   | 31535  | 31535   |
| Pre-USICA outcome mean (treated counties)      | 868.8                                   | 164.5  | 1033.3  |

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roduction Background Data Empirical Strategies Results Discussion

## Spillovers, Synthetic D-in-D, Semi vs High-Tech

|  | Semiconductor inputs employment (1) | Non-residential construction employment (2) | Total county employment (3) | County GDP<br>(00,000s USD<br>(4) |
|--|-------------------------------------|---|-----------------------------|-----------------------------------|
| Panel A: Treatment effect post-USICA                   |                                     |   |                             |                                   |
| Treated x Post-USICA                                   | 53.807**                            | 135.779**                                   | -2246.017                   | -4.590                            |
|  | (25.688)                            | (56.641)                                    | (2643.470)                  | (5.061)                           |
| Observations   | 36941                               | 36941                                       | 36941                       | 7920                              |
| Pre-USICA outcome mean (treated counties)              | 1069.256                            | 1800.271                                    | 307456.376                  | 590.851                           |
| Panel B: Treatment effect post-CHIPS, omittin          | g 2021Q2-2022Q3                     |   |                             |                                   |
| Treated x Post-CHIPS                                   | 59.478*                             | 159.816**                                   | -3238.834                   | -5.378                            |
|  | (34.654)                            | (78.206)                                    | (3155.699)                  | (5.947)                           |
| Observations Pre-USICA outcome mean (treated counties) | 31535                               | 31535                                       | 31535                       | 7040                              |
|  | 1069.256                            | 1800.271                                    | 307456.376                  | 590.851                           |

Notes: Outcome in Column 1 is the aggregate number of workers employed in the input sectors for semiconductors (NAICS codes 331410, 334418, 334412, 334418, 334417, 334418, 334417, 334418, 334612, 34418, 334418, 334518, 34518 and 34518 a

#### **Additional Results**

- Robustness:
  - ▶ Not imputing zeros for missings. No imputation
  - Doing analysis at 4-digit level, using QWI to supplement QCEW.
     4-digit (4-digit no imp.)
- Wages:
  - Generally find positive effects, but less robust than employment effects.
     Wages No imp.

#### Employment, Simple D-in-D, Fab vs Fabless

Introduction

|  | Semiconductor production employment (1) | Semiconductor<br>equipment &<br>materials<br>employment<br>(2) | Semiconductor production, equipment & materials employment |
|--|---|--|--|
| Panel A: Treatment effect post-USICA   |   |  |  |
| Treated × Post-USICA   | 191.345***<br>(70.800)                  | 78.533**<br>(31.212)   | 269.878***<br>(88.806)                                     |
| Observations Pre-USICA outcome mean (treated counties) County FE Year-Quarter FE | 6109<br>1523.5<br>Y<br>Y                | 6109<br>238.1<br>Y<br>Y  | 6109<br>1761.6<br>Y<br>Y                                   |
| Panel B: Treatment effect post-CHIPS, omitting                                   | 2021Q2-2022Q3                           |  |  |
| Treated × Post-CHIPS   | 229.122***<br>(83.147)                  | 82.931**<br>(34.247)   | 312.053***<br>(102.710)                                    |
| Observations Pre-USICA outcome mean (treated counties) County FE Year-Quarter FE | 5215<br>1523.5<br>Y<br>Y                | 5215<br>238.1<br>Y<br>Y  | 5215<br>1761.6<br>Y  |

Notes: Treated counties are ones that have a semiconductor production facility; control counties are ones that have a semiconductor facility but not a production facility (e.g. are fabless). Under this definition, treatment group is 125 counties, control group is 24 counties.

## Employment, Synthetic D-in-D, Fab vs Fabless

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|--|---|--|---|--|
| Panel A: Treatment effect post-USICA           |   |  |   |  |
| Treated x Post-USICA                           | 180.131***<br>(52.476)                  | 27.269<br>(18.312)   | 210.942***<br>(64.336)  |  |
| Observations                                   | 6109                                    | 6109   | 6109  |  |
| Pre-USICA outcome mean (treated counties)      | 1523.5                                  | 238.1  | 1761.6  |  |
| Panel B: Treatment effect post-CHIPS, omitting | 2021Q2-2022Q3                           |  |   |  |
| Treated x Post-CHIPS                           | 217.933***<br>(62.164)                  | 28.452<br>(20.637)   | 252.678***<br>(76.549)  |  |
| Observations                                   | 5215                                    | 5215   | 5215  |  |
| Pre-USICA outcome mean (treated counties)      | 1523.5                                  | 238.1  | 1761.6  |  |

Notes: Treated counties are ones that have a semiconductor production facility; control counties are ones that have a semiconductor facility but not a production facility (e.g. are fabless). Under this definition, treatment group is 125 counties, control group is 24 counties.

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- ► Following Chodorow-Reich (2020), we argue that scaled-up D-in-D is reasonable estimate of aggregate effect in our setting.
  - ▶ Counties are small relative to macro-economy.
  - Labor mobility between treated and control counties within semiconductors is likely small.
  - ▶ CHIPS funding is modest relative to macro-economy.

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  - ▶ Counties are small relative to macro-economy.
  - Labor mobility between treated and control counties within semiconductors is likely small.
  - ▶ CHIPS funding is modest relative to macro-economy.
- Scaling up D-in-D estimate gives roughly the increase observable in raw time-series data.
  - ▶ Estimate from raw time series: 18.000.
  - Estimate from scaling up D-in<sub>1</sub>+-¿-D estimate (semi vs. high-tech): 14,900-20,860.

- ► Main findings:
  - 1. Strong anticipation effects.
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  - ... on longer-term impacts.

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- ▶ CHIPS Act raises important issues about design of industrial policy:
  - ➤ Targeted subsidies vs. tax credits?
  - ▶ How can government claim part of upside?
  - ▶ Should social policy be embedded in industrial policy?

#### References I

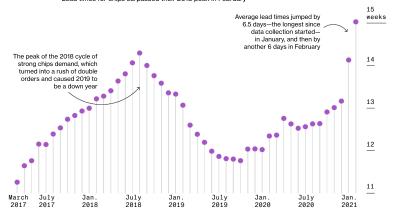
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## Chips Shortage Evident in Jan. 2021

#### **Patiently Waiting**

Lead times for chips surpassed their 2018 peak in February



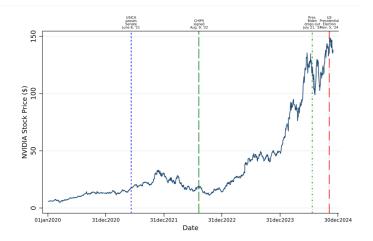
Note: Averages calculated on data from four different distributors. Source: SFG Research

Source: King et al., Bloomberg News, March 29, 2021.



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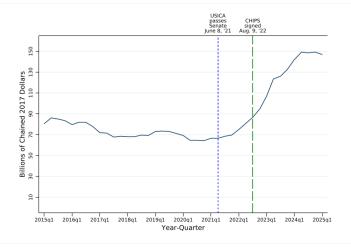
#### Nvidia



### Design Issues

- ▶ Targeted subsidies vs. tax credits
  - Pros for targeted subsidies:
    - Less fiscal uncertainty.
    - ▶ Greater transparency about which firms benefit.
    - More flexible when there are multiple market failures, and/or redistribution is a social goal.
  - Cons for targeted subsidies:
    - Gov't may bear a larger share of cost of mistakes.
    - lackbox Discretion ightarrow possibility of political capture.
- ▶ How can government claim upside potential?
  - Ownership stakes can generate benefits to taxpayers and restrain rent-seeking.
  - lackbox But again, discretion ightarrow possibility of political capture.
  - ▶ Loans combined with warrants (purchase options) may be preferable.
- Should social policy be embedded in industrial policy?
  - ▶ Admittedly poses problems for intellectual consistency.
    - ▶ If childcare is desirable, why not require it of all sectors?
  - Political compromise is pragmatic and necessary.

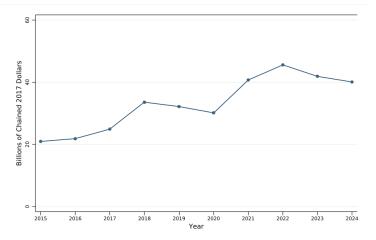
#### Investment in Structures in Manufacturing



Source: U.S. Bureau of Economic Analysis, Gross Private Domestic Investment and Capital Transfers: Private Fixed Investment in Structures by Type, Chained dollars: Manufacturing. Data are seasonally adjusted and annualized (by BEA). Dotted blue line indicates Q2 of 2022, when the USICA was passed and the dotted green line indicates Q3 of 2022 when the CHIPS Act and Inflation Reduction Act (IRA) were passed. Y-axis is investment per quarter.

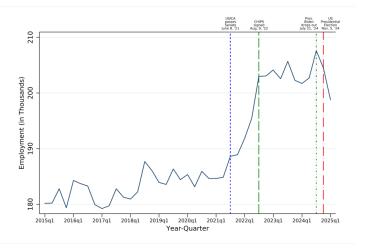
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### Plant/Property/Equipment Spending, Semi. Firms



Source: Security and Exchange Commission Form 10-K filings by semiconductor firms. Following the Semiconductor Industry Association, the following firms are included: Akoustis, AMD. Analog Devices, Broadcom, Cirrus Logic, Global Foundaries, Intel, Lattice Semiconductor, Littelfuse, Luminar, Marvell, Microchip, Micron, Nvidia, ONSEMI, Qorvo, Qualcomm, Silicon Labs, Skywater, SkyWorks, Texas Instruments, Western Digital, and Wolfspeed. The y-axis variable is total purchases of property, plant and equipment for the above firms in billions of 2017 dollars. The 10-K forms report purchases for entire calendar year, 2021 thus includes more than six months following the Senate assage of USIGA on June 8, 2021.

### Semiconductor Employment, using QCEW



Notes: Y-axis is the total number of workers in the semiconductor industry (NAICS 334413) across the United States, as reported in the BLS Quarterly Census of Employment and Wages.



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## Employment, Simple D-in-D, No Imputation

|   | Semiconductor production employment (1) | Semiconductor<br>equipment &<br>materials<br>employment<br>(2) | Semiconductor production, equipment & materials employment  (3) |
|---|---|--|---|
| Panel A: Treatment effect post-USICA  |   |  |   |
| Treated x Post-USICA  | 176.681**<br>(75.985)                   | 68.035**<br>(33.372)   | 244.716**<br>(97.154)   |
| Observations<br>Pre-USICA outcome mean (treated counties)<br>County FE<br>Year-Quarter FE | 27157<br>1593.5<br>Y<br>Y               | 27157<br>285.9<br>Y<br>Y                                       | 27157<br>1879.3<br>Y<br>Y                                       |
| Panel B: Treatment effect post-CHIPS, omitting  | 2021Q2-2022Q3                           |  |   |
| Treated x Post-CHIPS  | 219.107**<br>(92.304)                   | 72.493*<br>(37.127)  | 291.600**<br>(115.628)  |
| Observations Pre-USICA outcome mean (treated counties) County FE Year-Quarter FE          | 23218<br>1593.5<br>Y                    | 23218<br>285.9<br>Y  | 23218<br>1879.3<br>Y<br>Y                                       |



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## Employment: Simple D-in-D, 4-digit

|  | Semiconductor production employment (1) | Semiconductor<br>equipment &<br>materials<br>employment<br>(2) | Semiconductor<br>production,<br>equipment &<br>materials<br>employment<br>(3) |
|--|---|--|---|
| Panel A: Treatment effect post-USICA   |   |  |   |
| Treated x Post-USICA   | 76.195*                                 | 83.415***  | 159.609***  |
|  | (44.515)                                | (25.525)   | (61.753)  |
| Observations Pre-USICA outcome mean (treated counties) County FE Year-Quarter FE | 43747                                   | 43747  | 43747   |
|  | 1716.142                                | 552.479  | 2268.621  |
|  | Y                                       | Y  | Y   |
|  | Y                                       | Y  | Y   |
| Panel B: Treatment effect post-CHIPS, omitting                                   | 2021Q2-2022Q3                           |  |   |
| Treated x Post-CHIPS   | 92.916*                                 | 94.609***  | 187.525**   |
|  | (52.904)                                | (29.166)   | (72.915)  |
| Observations   | 37345                                   | 37345  | 37345   |
| Pre-USICA outcome mean (treated counties)  | 1716.142                                | 552.479  | 2268.621  |
| County FE  | Y                                       | Y  | Y   |
| Year-Quarter FE  | Y                                       | Y  | Y   |



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## Employment, Simple D-in-D, No Imputation, 4-digit

|  | Semiconductor production employment (1) | Semiconductor<br>equipment &<br>materials<br>employment<br>(2) | Semiconductor<br>production,<br>equipment &<br>materials<br>employment<br>(3) |
|--|---|--|---|
| Panel A: Treatment effect post-USICA   |   |  |   |
| Treated × Post-USICA   | 83.703*<br>(50.370)                     | 94.465***<br>(28.642)  | 178.168**<br>(69.657)   |
| Observations Pre-USICA outcome mean (treated counties) County FE Year-Quarter FE | 33273<br>1929.851<br>Y<br>Y             | 33273<br>606.507<br>Y<br>Y                                     | 33273<br>2536.358<br>Y<br>Y   |
| Panel B: Treatment effect post-CHIPS, omitting                                   | 2021Q2-2022Q3                           |  |   |
| Treated × Post-CHIPS   | 102.111*<br>(59.689)                    | 107.044***<br>(32.666)   | 209.155**<br>(82.041)   |
| Observations Pre-USICA outcome mean (treated counties) County FE Year-Quarter FE | 28433<br>1929.851<br>Y<br>Y             | 28433<br>606.507<br>Y  | 28433<br>2536.358<br>Y<br>Y   |



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# Wages, Simple D-in-D, Semi vs. High-Tech

|  | Semiconductor<br>wages<br>(1) | Semiconductor<br>equipment &<br>materials wages<br>(2) | Semiconductor production, equipment & materials wages  (3) |  |
|--|-------------------------------|--|--|--|
| Panel A: Treatment effect post-USICA           |                               |  |  |  |
| Treated × Post-USICA                           | 254.233**<br>(99.656)         | 95.027**<br>(38.288)                                   | 268.961***<br>(99.652)                                     |  |
| Observations                                   | 36941                         | 36941  | 36941  |  |
| Pre-USICA outcome mean (treated counties)      | 822.8                         | 409.2  | 923.5  |  |
| Panel B: Treatment effect post-CHIPS, omitting | 2021Q2-2022Q3                 |  |  |  |
| Treated x Post-CHIPS                           | 261.672**                     | 107.926**  | 273.105***   |  |
|  | (101.537)                     | (45.983)   | (100.863)  |  |
| Observations                                   | 31535                         | 31535  | 31535  |  |
| Pre-USICA outcome mean (treated counties)      | 822.8                         | 409.2  | 923.5  |  |



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## Wages, Simple D-in-D, No Imputation

|  | Semiconductor<br>wages<br>(1) | Semiconductor<br>equipment &<br>materials wages<br>(2) | Semiconductor<br>production,<br>equipment &<br>materials wages<br>(3) |  |
|--|-------------------------------|--|---|--|
| Panel A: Treatment effect post-USICA                   |                               |  |   |  |
| Treated x Post-USICA                                   | 328.889**                     | 123.085**  | 294.889**   |  |
|  | (149.634)                     | (52.739)   | (147.968)   |  |
| Observations   | 27157                         | 27157  | 27157   |  |
| Pre-USICA outcome mean (treated counties)              | 1412                          | 593.8  | 1452.8  |  |
| Panel B: Treatment effect post-CHIPS, omitting         | 2021Q2-2022Q3                 |  |   |  |
| Treated x Post-CHIPS                                   | 305.651**                     | 141.957**  | 270.644*  |  |
|  | (145.188)                     | (65.103)   | (142.802)   |  |
| Observations Pre-USICA outcome mean (treated counties) | 23218                         | 23218  | 23218   |  |
|  | 1412                          | 593.8  | 1452.8  |  |



#### Cumulative Abnormal Returns

|   |            |            | Eve         | nt Window |        |           |        |        |
|---|------------|------------|-------------|-----------|--------|-----------|--------|--------|
|   | (-1,1)     |            |             | (-3,3)    |        |           | (-5,5) |        |
| CAAR  | SE         | p-val      | CAAR        | SE        | p-val  | CAAR      | SE     | p-val  |
| Panel A: USICA                                | Introducti | on (May 1  | 8, 2021)    |           |        |           |        |        |
| 0.0273***                                     | 0.4848     | 0.0000     | 0.0338***   | 0.4002    | 0.0000 | 0.0430*** | 0.4698 | 0.0000 |
| Panel B: USICA                                | Senate Pa  | ssage (Jur | ne 8, 2021) |           |        |           |        |        |
| -0.0117***                                    | 0.5856     | 0.0070     | -0.0105     | 0.6266    | 0.1440 | 0.0014    | 0.6169 | 0.5490 |
| Panel C: CHIPS Senate Passage (July 28, 2022) |            |            |             |           |        |           |        |        |
| -0.0152                                       | 1.5295     | 0.1580     | -0.0016     | 0.9623    | 0.6600 | -0.0107   | 0.9821 | 0.3940 |

Notes: Cumulative Average Abnormal Returns (CAARs) around major semiconductor policy events are calculated as follows (using the Stata estudy command). We first calculate Abnormal Returns (ARs) by estimating the regression  $R_{it} = \gamma_i R_{mt} + \alpha_i + \varepsilon_{it}$ , where  $R_{it}$  is firm i's return and  $R_{mt}$  is the S&P 500's return, over the period 250 days to 30 days before the event, and then defining  $AR_{it} = R_{it} - \widehat{\gamma}_i R_{mt} - \widehat{\alpha}_i$  for the indicated event window. The ARs are averaged across firms and then summed across the event window to get CAARs. Inference is based on the Boehmer–Musumeci–Poulsen (BMP) test. Windows are indicated in days. The sample excludes Global Foundries and Skywater, who began trading on October 28, 2021 and April 21, 2021, respectively. \*p <0.10; \*\*p <0.05; \*\*\*p <0.01.

