# **Tracking the Sun**

Pricing and Design Trends for Distributed Photovoltaic Systems in the United States 2023 Edition

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### **Overview**

Summarizes installed prices and other characteristics of grid-connected, distributed\* solar photovoltaic (PV) and PV+storage systems in the United States

- Current edition focuses on projects installed through 2022
- Describes trends related to:
  - **Project characteristics**, including system size and design, ownership, customer segmentation, and other attributes
  - Median installed price trends, both nationally and by state
  - Variability in pricing according to system size, state, installer, equipment type, and other factors
- Multi-variate regression estimates the effects of key pricing drivers for residential systems installed in 2022

\* For the purpose of this report, distributed systems consist of residential systems, roof-mounted non-residential systems, and ground-mounted systems up to 5  $MW_{AC}$ . Ground-mounted systems larger than 5  $MW_{AC}$  are covered in Berkeley Lab's companion report, <u>Utility-Scale Solar</u>.

Accompanying Data Products available at <u>trackingthesun.lbl.gov</u>

- 1. Summary brief: A short narrative summary of the full slide-deck report
- 2. Data visualization tool: Allows users to create custom figures and explore the full *Tracking the Sun* dataset
- **3.** Public data file: The underlying projectlevel dataset, excluding confidential data
- 4. Summary tables: All figures and underlying summary tables are available in a MS Excel workbook



## **Report Structure**

- Data Sources, Methods, and Market Coverage
- PV System Characteristics
- Paired PV+Storage System Characteristics
- Median Installed Price Trends
- Variability in Installed Prices
- Multi-Variate Regression Analysis of Residential Installed Prices
- <u>Appendix</u>



### Data Sources, Methods, and Market Coverage



## **Data Sources**

### Tracking the Sun relies on project-level data

- Provided by state agencies, utilities, and other organizations, for PV systems participating in incentive programs, renewable energy credit registration systems, and interconnection processes
- Some of these data already exist in the public domain (e.g., California's Currently Interconnected Dataset), though LBNL may receive additional data under non-disclosure agreements
- Supplementary data from building permit records provided by Ohm Analytics, used in trends on storage attachment rates

### 70 entities spanning 30 states contributed data to this year's report (see Appendix)

• Some of these are legacy data sources that no longer contribute incremental data each year; incremental data for 2022 come from 44 organizations in 26 states



# **Key Definitions and Conventions**

### **Customer Segments**

- Residential: Single-family and, depending on the data provider, may also include multi-family
- Small Non-Residential: Non-residential systems ≤100 kW<sub>DC</sub>
- Large Non-Residential: Non-residential systems >100 kW<sub>DC</sub> (and ≤5,000 kW<sub>AC</sub> if ground-mounted)
  - \* Independent of whether connected to the customer- or utility-side of the meter

### Units

- Real 2022 dollars (unless otherwise noted)
- Direct-current Watts (W<sub>DC</sub>), unless otherwise noted

Installed Price: Up-front price (2022\$/W<sub>DC</sub>) paid by the PV system owner

- Prior to incentives (i.e., the gross price)
- Inclusive of any up-front loan-financing fees passed through the installer



## **Sample Frames and Data Cleaning**

### **Full Sample**

Used to describe system characteristics The basis for the public dataset

### **Installed-Price Sample**

Used in analysis of installed prices

- 1. Remove systems with missing size or install date
- 2. Standardize installer, module, inverter names
- 3. Integrate equipment spec sheet data
  - Module efficiency and technology type
  - Inverter power rating
  - Flag microinverters or DC optimizers
- 4. Convert dollar and kW values to appropriate units, and compute other derived fields
- 5. Remove systems if:
  - Missing installed price data
  - Third-party owned (TPO)\*
  - Battery storage co-installed }
  - Self-installed

Pricing data for paired PV+storage systems presented separately



# Sample Size Relative to Total U.S. Market

### **Full Sample**

- **3.2 million** systems through 2022 (81% of U.S. market)
- 500,000 systems installed in 2022 (73% of U.S. market)

### **Installed-Price Sample**

- **1.5 million** systems through 2022
- 250,000 systems installed in 2022



Gap between Full Sample and Total U.S. Market: Associated mostly with smaller and mid-sized state markets either missing or under-represented in the sample; see next slide

Gap between Installed-Price Sample and Full Sample: Primarily TPO systems and systems missing installed price data; several states included in the full sample provided no installed price data



## **State-Level Sample Distribution and Market Coverage**

Sample Distribution: CA dominates the sample, as in the larger U.S. market

### Market coverage:

- Similar overall level of market coverage for both residential and non-residential
- In general, coverage among the larger state markets is fairly strong, the main exception being FL
- The most significant gap in the sample is for the collection of smaller state markets (aggregated in the figures as "Others")





### Notes: Data for the total U.S. market are from Wood Mackenzie's 2022 Year-in-Review "Solar Market Insight" report The figures show the top-10 states in each customer segment, based on cumulative U.S. installations through 2022, and all other states are combined in the "Other" category.

## **PV System Characteristics**



# **System Size Trends**



- Residential system sizes have been rising steadily over the past two decades, driven by declining costs and rising module efficiencies, among other factors
- Median residential system sizes reached 7.2 kW in 2022, with most systems ranging from 5-11 kW in size (the 20<sup>th</sup> to 80<sup>th</sup> percentile band)
- Non-residential system sizes vary widely (ranging from roughly 10-100 kW between the 20<sup>th</sup>-80<sup>th</sup> percentiles),
- Distribution has a long upper tail: median of 25 kW vs. average size of 268 kW in 2022
- Historical trends show an abrupt shift toward larger non-residential systems in 2011-14, followed by a plateau, and in recent years some shift back toward smaller sizes (as indicated by the percentile range)



# System Size Comparisons by State

### Residential System Sizes by State (2022)



- Residential system sizes vary across states, reflecting regional factors such as electricity usage and insolation levels, among other factors
  - System sizes in California (7.1 kW) are near the low end of the spectrum, pulling the U.S. median downward
  - Median sizes in most states are well above 8 kW, and in many states above 9 kW
- State-level differences in non-residential system sizing are most notable at the upper tail of the distributions, which drives large differences in average sizes
  - States on the right-hand side all had a relatively significant share of large systems (e.g., large contingents of community solar projects in MN and ME)
  - In most states, the majority of non-residential systems installed in 2022 were <100 kW</li>



Notes: \*Averages are derived from project level data where available, and in the case of residential systems are calculated from systems <40 kW, in order to exclude erroneous data and remove large agricultural or multi-family housing projects classified as residential. For states not in the Tracking the Sun dataset, averages are derived from state-level statistics published in the annual "Solar Market Insight" report published by Wood Mackenzie and SEIA; medians and percentiles are unavailable for those states. Summary statistics for any given state and customer segment are shown only if at least 20 observations are available.

## **Module Efficiency Trends**



- Higher module efficiencies allow for denser installations and can enable reductions in those soft costs and balance of system costs that scale with square footage
- Module efficiencies have risen steadily over time across all customer segments, with slightly higher efficiencies in the residential segment
- Long-term increase in median module efficiencies partly reflect sharp increase in market share of monocrystalline modules, among other factors
- Module efficiencies vary considerably: most systems installed in 2022 fall within a range of 20% to 21.5%, varying to some extent by manufacturer; several specialize in "premium-efficiency" models (>22%)



17%

18%

19%

20%

21%

22%

23%

24%

## **Inverter Technology Trends**



- Module-level power electronics (MLPEs), which include both microinverters and DC optimizers, have continued to gain share across the sample
- MLPEs are almost universal within the residential and small non-residential sectors (93% and 83% of 2022 installs, respectively); less common for large nonresidential (39%), but optimizer-share growing steadily
- DC optimizers dominate MLPE growth since 2013, but microinverter share has been rising in recent years
- Inverter-loading ratios (or ILRs, the ratio of module-toinverter nameplate ratings) have generally grown over time with declining module costs
- ILRs have historically been higher for non-residential systems, but rising residential ILRs have closed the gap



Notes: DC Optimizer share is based only on systems with SolarEdge inverters, as those are the only records in the dataset for which the presence of DC optimizers can be determined. As a result, the DC optimizer share shown in the figures may understate the actual share of power optimizers in the data sample.

# **Mounting Configuration and Panel Orientation**

#### **Ground-Mounting and Tracking Equipment (2022)**



**Panel Orientation** 



- Ground-mounting (as opposed to roof-mounting) is most prevalent among large non-residential systems, while use of tracking is limited
  - Roughly one-third (34%) of large non-residential systems in 2022 are ground-mounted, while 8% have tracking
  - Ground-mounting much less common among residential and small non-residential systems, and negligible shares have tracking
- Panel orientations became more varied during earlier years, but haven't changed much in recent years
  - 54% of systems installed in 2022 face south, 24% to the west, and most of the remainder to the east
  - Greater share of non-residential systems faces exactly due-south, likely due to greater prevalence of groundmounting and flat rooftops than in residential sector



Notes: Summary statistics for any given year are shown only if at least 20 observations are available. Figures in the bottom panel exclude tracking systems, and in both figures, the orientation is based on the primary array (for systems with multiple arrays facing different directions). For the figure on the lower left, azimuths are grouped according to cardinal compass directions ±45° (e.g., systems within ±45° of due-south are considered south-facing). For the figure on the lower left are grouped in 10-degree bins.

# **Third-Party Ownership Trends**



#### Third-Party Ownership by State (2022)



- Third-party ownership (TPO) in the residential sample has declined over time from its historical high of ~60% in 2012 to 25% in 2022
  - Reflects emergence of residential loan products
- For the non-residential sample, TPO shares have remained comparatively steady and have historically been lower for small vs. large non-residential systems
- TPO shares at the state level vary substantially
  - Generally higher among states with sizeable rebate programs or high solar renewable energy certificate prices (DC, IL, MA, NJ)
  - Some states limit TPO or restrict eligibility for incentive programs to only host-owned systems



Notes: In the bottom figure, data are shown for individual states only if TPO status is available for at least 20 systems and for at least 50% of records for the given state, year, and customer segment. Furthermore, we exclude a number of states from the figure where the underlying data source may not be representative of the state as a whole, in terms of TPO shares.

## **Non-Residential Customer Segmentation**



IL

Other

States

- For-profit commercial customers make up the vast majority of non-residential site hosts, with the remainder consisting of some combination of taxexempt site hosts (schools, government, non-profits)
- Among tax-exempt site hosts, non-profits have been most prevalent within the small non-residential market, while schools and government facilities are more common within the large non-residential segment
- The overall mix of non-residential customer segments is similar across states, though tax-exempt tend to make up a larger share in smaller state markets
- TPO has been more prevalent among tax-exempt site hosts than for commercial hosts (38% vs. 16% in 2022), to monetize tax benefits, but direct-pay option under IRA may reduce this driver



0%

All States

CA

NJ

Notes: The figures are based on a subset of the non-residential records for which data on the specific subsegment are available. In the bottom figure, the four states shown are those with the most available data and are among the largest non-residential markets in 2022.

All Tax-Exempt
Commercial

### **Paired PV+Storage System Characteristics**



## **Storage Attachment Rates**

### Percent of PV systems installed each year with storage



Storage Attachment Rates by State (2022)



- Storage attachment rates have steadily risen over time, reaching 10% of the sample in 2022 for residential systems and 7% for non-residential
- HI has, by far, the highest residential attachment rates of any state (96% in 2022), driven in part by net metering reforms that incentivize self-consumption
- CA, which hosts the vast majority of paired systems, has attachment rates of 11% (res.) and 8% (non-res.), driven by storage rebates and resilience concerns
- Many states seeing ~10% residential attachment rates; most seeing at least 5%
- Non-residential attachment rates are more varied across states: several around 8-12%, but most others <2%; non-res. market more sensitive to economics and policy support



Notes: Attachment rates are based on a merging of Tracking the Sun and permit data from Ohm Analytics, allowing additional states to be covered. State-level attachment rates are shown only if available data cover at least 50% of the state market volume. Note the breaks in the y-axes for Residential and Non-Residential systems, to accommodate data for HI.

### **Storage Retrofits to Existing PV Systems** *Based on a subset of the dataset*





- Attachment rates capture only new systems; storage is also often retrofitted onto existing PV systems
- Storage retrofits represented 23% of new storage installs paired with PV in 2022, in both the residential and non-residential markets
- Within the residential market, retrofits are particularly common in California (26% of new paired storage installs in 2022), driven by resilience concerns and TOU pricing
- For the non-residential market, retrofit rates are similar between California and other states (see Notes)
- In about half of all cases, storage retrofits are also accompanied by additional PV capacity, on top of the existing PV system



Notes: The figures are based on only the subset of states for which storage retrofits can be reliably identified within the dataset, which are listed in the figure on the lower left. For the figure on the lower right, all states with available data other than California are aggregated together, due to small sample sizes.

# **Residential Paired System Sizing**



- Most residential storage systems paired with PV come in increments of 5 kW-storage
- The market has been trending toward systems with larger batteries, driven by backup power demand, though this reversed course slightly in 2022 (35% of paired systems installed in 2022 had 10+ kW of storage)
- Larger amounts of storage tend to accompany larger PV systems: e.g., median PV capacity of 12.5 kW for systems with 15+ kW of storage
- Typical residential storage duration reflects the two products that dominate market share: LG Chem RESU10H (1.9 hrs) and Tesla PowerWall (2.7 hrs)



# **Non-Residential Paired System Sizing**



- Most paired non-residential systems installed in 2022 were relatively small, with PV and storage components both <20 kW; about 1/3<sup>rd</sup> were >100 kW
- Paired applications in the non-residential market have been moving into progressively smaller applications in recent years; no longer the exclusive domain of large users with high demand charges
- Most paired non-residential systems installed in 2022 have battery power ratings below the corresponding PV capacity (median kW ratio of 0.5-0.8, depending on the PV size range)
- As with residential, most non-residential systems installed in 2022 have storage durations ranging from 1.5-3 hours, though longer duration (4+ hours) are more common (mostly Tesla PowerPack)



### **Median Installed Price Trends**



## **A Few Notes on Installed-Price Data**

- Excludes third-party owned (TPO) and self-installed systems
- Data are self-reported by PV installers or customers
- Reported prices may include dealer fees for loan-financed systems (and other ancillary items related to the PV installation)
- Prices are adjusted for inflation, unless otherwise noted



### **Long-Term Trends in Median Prices and Component Costs** *Stand-alone PV systems*



#### **Underlying Trends in Component Costs**



- Over the long-term, median installed prices have fallen (in real terms) by roughly \$0.4/W per year, on average, but price declines tapered off starting in 2013, averaging \$0.1-0.2/W per year since then
- That tapering off is mostly a function of the underlying trajectory of module costs, which fell precipitously from 2008-2013 before leveling into a more gradual rate of decline
- The current installed price trajectory is now primarily driven by changes in the aggregate set of "Residual BoS+soft costs," which comprise the vast majority of overall system prices
- Over the long-term, those residual BoS+soft costs have, in aggregate, fallen at a relatively steady pace of \$0.1-0.2/W per year, on average



Notes: Summary statistics for any given year are shown only if at least 20 observations are available. The Module and Inverter Price Indices are based on data from SPV Market Research and Wood Mackenzie, with adjustments by Berkeley Lab in order to extend those indices back in time and to differentiate among customer segments. The Residual term is calculated as the median installed price for each customer segment minus the corresponding Module and Inverter Price Indices are based on data from SPV Market Research and Wood Mackenzie,

### Recent Trends in Median Installed Prices (2021-2022) Stand-alone PV systems



### Nominal Price Trend Relative to Inflation



- Quarterly values are shown here, to provide more temporal resolution into trends over the last year of the analysis period
- In real (inflation-adjusted) dollars, median installed prices fell over this timeframe, by roughly \$0.2/W for residential and non-residential systems, while remaining flat for small non-residential systems
- This is roughly in line with the average rate of price decline for the past decade
- In contrast, nominal prices—what market participants observe—rose by \$0.1-0.3/W (or 4-13%), depending on the market segment, from Q1 2021 to Q4 2022
- Put differently, while nominal prices rose, that increase was generally slower than general inflation, which rose by 13% over this timeframe, based on the consumer price index (CPI)\*



\*Throughout our analysis, we translate installed PV prices from nominal to real dollars using the Bureau of Labor Statistics' CPI for All Urban Consumers, U.S. city average, All items. The BLS also publishes CPI for only energy-related items, which rose at a much higher rate (35%) over the timeframe shown here. Another common index for inflation adjustments is Bureau of Economic Analysis' Implicit Price Deflators for Gross Domestic Product, which rose by 12% over the period presented here.

## **Comparison to Other PV Cost and Pricing Benchmarks**



Notes: **LBNL** data are the median and 20th and 80th percentile values among projects installed in 2022. Average costs from **SunPower and Sunrun** data are based on the companies' quarterly shareholder reports in 2022 (courtesy of J. Zuboy, NREL) and include reported installation, sales, and general & administrative costs, averaged across quarters. **EnergySage** data are the median price quotes issued in 2022, for either cashpurchased or loan-financed stand-alone PV systems, as calculated by Berkeley Lab from data provided by EnergySage. **NREL** data represent modeled market price in Q1 2022 for a 7.9 kW residential system and a 500 kW ground-mounted commercial system (Ramasamy et al. 2022). **WoodMac** data are from the Solar Market Insight 2022 Year-in-Review, and are based on modeled turnkey prices, averaged across quarters.

- A variety of other PV cost and pricing benchmarks exist, based on differing methods and data sources, and serving different purposes
- On the residential side, national median installed prices from Tracking the Sun (TTS) are similar to average costs reported by Sunrun, but other benchmarks align more closely with 20<sup>th</sup> percentile pricing from TTS
- On the non-residential side, fewer benchmarks are available and are limited to large systems, which also align more closely with 20<sup>th</sup> percentile levels from TTS
- Divergence with other benchmarks can reflect factors such as price vs. cost, quotes vs. actuals, mark-ups, system design, and scope of costs included
- Of particular note: TTS prices likely include dealer fees for loan-financed systems, adding 10-25% to the overall reported price



## Installed Prices for Paired PV+Storage Systems



#### Installed Price Comparison: Paired vs. Stand-alone PV



- Installed prices for paired systems presented here in terms of \$ per watt of PV capacity
- Median prices for paired residential systems have been declining over time, suggestive of a maturing market
- The price decline is notable given the previously noted trend toward larger residential storage sizing over time
- Time trends for paired non-residential systems are less clear, though underlying sample sizes are small
- As to be expected, installed prices for paired systems are consistently higher than for stand-alone PV
- The multi-variate regression analysis presented later estimates a \$1.5/W<sub>PV</sub> premium for residential PV systems with storage (significantly larger than the \$0.7/W difference in median prices shown here)
- Given typical system sizing, implies a cost of about \$900/kWh of storage



Notes: Summary statistics for any given year are shown only if at least 20 observations are available, thus the differing time frames shown in the top figure for each of the three customer segments. Statistics for paired systems exclude retrofits to existing PV systems.

## **Variability in Installed Prices**



## **Installed-Price Variation Across Systems**



### 20<sup>th</sup> to 80<sup>th</sup> Percentile Bands for Systems Installed in 2022

- \$3.2/W \$5.2/W (residential)
- \$2.4/W \$4.5/W (small non-residential)
- \$1.7/W \$3.0/W (large non-residential)

- Wide pricing variability persists within each customer segment
- Reflects underlying differences in:
  - Project characteristics
  - Installer attributes
  - Local market, policy, and regulatory environment
- We explore a subset of pricing drivers in the following slides, through a combination of *descriptive analysis* and a multi-variate *regression model* 
  - A variety of other studies have also investigated pricing drivers, often leveraging TTS data



## **Economies of Scale with PV System Size**



#### **Non-Residential Systems Installed in 2022**

Median Installed Price and 20<sup>th</sup>/80<sup>th</sup> Percentiles (2022\$/W<sub>DC</sub>)



- Economies of scale arise because of the many fixed costs (e.g., permitting, customer acquisition, financing, etc.)
- Among residential systems installed in 2022, median prices were roughly \$1.0/W lower for the largest residential systems compared to the smallest
- This price differential coincides with what the later regression model implies across the same size range
- Among non-residential systems, which span an even wider size range, median prices were \$2.6/W lower for systems >1,000 kW, compared to the smallest non-residential systems ≤10 kW



## **State-Level Differences in Installed Prices**

#### **Residential Systems Installed in 2022**



#### Non-Residential Systems Installed in 2022



- Median prices vary across states within each customer segment, particularly for residential and small nonresidential, where median prices vary by \$2/W or more across states
- Residential pricing in CA, which dominates the sample, is near the middle of the pack
- Cross-state pricing differences can reflect idiosyncratic features of particular states (e.g., a single large installer with anomalous prices) as well as more-fundamental differences in market and policy conditions
- The later regression analysis controls for some of those differences (e.g., market size, population density, income levels), though still shows substantial cross-state differences



# **Installer-Level Pricing Differences**



Notes: Each dot represents the median installed price of an individual installer, ranked from lowest to highest, while the shaded band shows the 20th to 80th percentile range for that installer.

- Ignoring outliers, median prices across the top-100 residential installers in 2022 ranged from \$2.2/W to \$5.7/W
- Various firm-level characteristics may contribute to these differences (e.g., equipment preferences and relationships, business models, loan partners), as well differences in how each installer reports prices
- Firm-level experience is one potential contributor, though the later regression analysis suggests a rather small effect (~\$0.1/W range in prices between firms at the 20<sup>th</sup> and 80<sup>th</sup> percentile levels of experience)
- Apparent firm-level pricing differences also reflect features of the local markets in which they operate; i.e., some installers may simply tend to operate in lower or higher priced markets



## **Installed-Price Differences by Module Efficiency**

#### Installed Prices by Module Efficiency for 2022 Systems



Median Installed Price and 20<sup>th</sup>/80<sup>th</sup> Percentiles (2022\$/W<sub>DC</sub>)

- Higher efficiency modules can sell at a premium, but may allow for savings on BoS costs, potentially offsetting the higher module price
- For residential systems, no obvious trend is apparent when comparing medians, though the later regression result finds that systems with "premium efficiency" (>22%) modules are roughly \$0.1/W higher priced
- Descriptive results presented here do show noticeably higher prices for non-residential systems with premiumefficiency modules, potentially as a result of lower offsetting BoS cost savings



# **Installed-Price Differences by Inverter Technology**



- Installed prices are generally higher for systems with some form of MLPE
- Within the residential segment, median prices are roughly equivalent for systems with microinverters and those with DC optimizers (in both cases about \$0.4/W higher than for systems without any MLPE)
- In contrast, the regression analysis shows a smaller premium of \$0.2/W for systems with microinverters
- This also contrasts with the results for small nonresidential systems, which show significantly higher median prices for systems with microinverters (likely the result of other factors)



## Installed-Price Differences by Non-Residential Customer Type



Notes: Summary statistics are based on a somewhat narrow subset of data providers who provide customer segmentation details for non-residential systems.

- In California, installed prices are higher for tax-exempt site hosts (schools, government, non-profits), compared to prices for commercial site hosts
- Differences are especially pronounced among large non-residential systems
- Differences between commercial and tax-exempt customers are considerably smaller in other states
- In general, higher prices for systems at tax-exempt customer sites could reflect a number of possible characteristics of tax-exempt customers, for example:
  - requirements for domestically manufactured components or prevailing wage/union labor
  - prevalence of shade or parking structures
  - lower borrowing costs



## Multi-Variate Regression Analysis of Residential Installed Prices



## **Econometric Model Overview and Results**

 Multi-variate linear-regression model used to explain variation in residential installed prices in 2022

 $p = \alpha + system\beta_1 + market\beta_2 + installer\beta_3 + S + Q + \varepsilon_i$ 

- Dependent variable (*p*) is installed price (in \$/W); independent variables include system, market, and installer-level factors, as well as state (*S*) and quarterly (*Q*) fixed-effects; many of the system-related variables are binary
- Complements the descriptive analysis by showing the effects of individual pricing drivers while controlling for inter-dependencies among those factors
- Coefficients in the table represent the average change in PV installed price (\$/W) given a unit change in each of the variables listed (or, for binary variables, if that variable is true)
- Not all coefficients are statistically significant; R<sup>2</sup> metric indicates that the model explains 12% of the overall variability in prices

Variable		Coefficient
System	System size (kW)	-0.14*
	System size squared	0.002*
	Premium module (binary)	0.09
	Microinverter (binary)	0.21*
	DC optimizer (binary)	0.43*
	New construction (binary)	-0.60*
	Ground-mounting (binary)	0.28*
	Battery storage (binary)	1.47*
Market	Market size (x1,000)	-0.03
	Population density (x1,000)	0.03
	Median zip-code income (x10,000)	-0.05*
Installer experience (x1,000)		-0.01
	Ν	230,122
	R <sup>2</sup>	0.12



# **Sensitivity of Installed Prices to Modeled Drivers**

This figure provides a sense of scale for the relative contribution of each pricing driver to overall pricing variability

- Of the system-level pricing drivers, battery storage has by far the biggest effect (\$1.5/W), followed by new construction systems (\$0.6/W less expensive than retrofits)
- Effects associated with the various market- and installerrelated drivers are all relatively small (less than \$0.2/W), and mostly not statistically significant
- Of particular note is the wide range across the state fixedeffects variables (\$1.4/W), suggesting the presence of strong state-level pricing drivers beyond those explicitly captured in the model (e.g., cost-of-living, retail rates, incentives, solar insolation, permitting processes)

#### **Effect on Installed Prices**

- Continuous variable: Price change from median to 80th percentile of variable value
- Continuous variable: Price change from median to 20th percentile of variable value
- Binary variable: Price change if True
- Fixed effects variable: Price range from min to max





Notes: For continuous variables, the figure shows the effect on system prices associated with moving from the median to the 20<sup>th</sup> percentile and from the median to the 80<sup>th</sup> percentile values of each variable. For binary variables, the figure shows the effect if that binary variable is true, and for fixed effects variables, the figure shows the range between the minimum and maximum effect of the variables in each set.

## **State Fixed-Effects**

### Residual Pricing Differences After Controlling for Other Factors

### State Fixed Effects Compared to Difference in Median Prices



Pricing Difference Relative to California (2022 $W_{DC}$ )

- State fixed effects represent the difference in average residential price, relative to California, after controlling for other variables
- Fixed effects may be larger or smaller than the simple difference in state median prices, and may even point in different directions
- RI is a dramatic case, where the fixed effects are far smaller than the difference in medians, though this is largely due to a sampling issue (regression is based on a smaller sub-sample with all the requisite variables)
- Across most of the states shown, fixed effects vary within a band of roughly ±\$0.3/W, which reflects additional unexplained differences across states (e.g., due to unobserved variables and/or idiosyncrasies of the data)



## **Additional Insights from Residential Regression Results**

- New Construction: The model suggests that prices are \$0.6/W lower for systems installed during new home construction, consistent with previous research.<sup>a</sup>
- **Ground-Mounting:** Though relatively uncommon in the residential sector, the model indicates that ground-mounting adds about \$0.3/W to the installed price.
- Battery: The coefficient for battery reflects the added costs of installing ~5 kW of battery storage (10-14 kWh, depending on the manufacturer). Regression coefficient implies that a storage system of this size adds around \$2,100 per kW of battery power capacity or around \$900 per kWh of energy storage capacity.

- Market size: The negative coefficient on market size suggests that prices are generally lower in markets with more cumulative PV installations.
- **Population Density:** The positive coefficient on population density suggests that prices are generally higher in more densely-populated areas (e.g., in cities rather than rural areas).
- Median Zip-Code Income: The coefficient on median income is negative, suggesting that prices are lower in higher-income areas; previous studies have found different results.<sup>b</sup>

#### **Additional Resources**

For further reading on analyses of PV prices related to these findings, see: a) "Solar Economies of Scope through the Intersection of Four Industries." 2018. NREL. b) "Deconstructing Solar Photovoltaic Pricing." 2016. The Energy Journal.



## **For more information**

**Download** the report, data, and other related materials: <u>http://trackingthesun.lbl.gov</u>

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# Appendix



# List of Entities Contributing Data

**AR State Energy Office** DE Dept. of Natural Resources and Env. Control\* OR Department of Energy\* FL Energy & Climate Commission AZ Ajo Improvement Company OR PacifiCorp AZ Arizona Public Service\* FL Gainesville Regional Utilities\* PA Dept. of Community and Economic Development FL Orlando Utilities Commission\* PA Department of Environmental Protection AZ Duncan Valley Electric Cooperative **AZ Mohave Electric Cooperative** HI County of Honolulu (via Ohm Analytics)\* PA Sustainable Development Fund **AZ Morenci Water and Electric** IL Dept. of Commerce & Economic Opportunity **RI National Grid\*** AZ Navopache Electric Cooperative IL Illinois Power Agency\* **RI Commerce Corporation\*** AZ Salt River Project\* MA DOER\* TX Austin Energy\* AZ Sulfur Springs Valley Electric Cooperative **TX CenterPoint\*** MA Clean Energy Center **AZ Trico Electric Cooperative MD Energy Administration\* TX CPS Energy\* AZ Tucson Electric Power\*** ME Avangrid\* **TX Frontier Associates** AZ UniSource Energy Services\* **ME Efficiency Maine** TX Oncor\* CA Center for Sustainable Energy (Bear Valley Electric) ME Versant\* UT Office of Energy Development\* CA Center for Sustainable Energy (PacifiCorp) **MN** Department of Commerce VA Dept. of Mines, Minerals and Energy CA City of Palo Alto Utilities MN Xcel Energy/Northern States Power\* VT Energy Investment Corporation NC Sustainable Energy Association\* VT Green Mountain Power\* CA Energy Commission\* CA Grid Alternatives\* NH Public Utilities Commission\* VT Public Service Commission\* **CA Imperial Irrigation District** NJ Board of Public Utilities\* WA Puget Sound Energy\* NM Energy, Minerals & Natural Resources Dept.\* WA Washington State University CA Los Angeles Department of Water & Power CA Public Utilities Commission\* NM Public Service Company of New Mexico\* WI Focus on Energy\* CA Sacramento Municipal Utility District\* NM Xcel Energy\* CO Xcel Energy/Public Service Company of Colorado\* NV NV Energy\* NY State Energy Research and Development Authority\* CT Green Bank\* CT Public Utilities Regulatory Authority\* **OH Public Utilities Commission\* DC Public Service Commission\* OR Energy Trust of Oregon\*** \* denotes active data providers

