

#### Evaluation of Rooftop Solar Potential in Chernihiv and Lviv, Ukraine, and Efficacy of High-Resolution 3D Data Digital Twins

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# **Summary**

This analysis evaluates rooftop solar photovoltaic (PV) siting opportunities in the cities of Chernihiv and Lviv, Ukraine, leveraging very-high-resolution 3D elevation data to calculate technical potential. The study assessed total rooftop solar capacity and annual energy production. The study also assessed the feasibility of adapting this methodology on a national scale using either simulated digital surface models (DSMs) or a digital twin approach.

#### **Rooftop Solar Technical Potential**

The total estimated rooftop solar capacity and annual energy production for both cities is presented in direct current (DC) and alternating current (AC). This accounting provides a clear estimate of the potential rooftop solar installations that could be realized under optimal conditions, considering both technical constraints and the geographic distribution of available rooftop space.

#### •**Chernihiv**:

- **DC Capacity**: 332 MW | **AC Capacity**: 259 MW
- **Annual Energy Production: 376,197 MWh<sub>DC</sub>/year**

#### •**Lviv**:

- **DC Capacity**: 873 MW | **AC Capacity**: 682 MW
- **Annual Energy Production: 995,530 MWh<sub>nc</sub>/year**

#### **Building Count and Descriptions**

In Chernihiv and Lviv, 116,503 buildings were analyzed for their rooftop solar potential. The buildings in the study areas include a mixture of residential, commercial, and industrial buildings, characterized by diverse roof shapes and sizes.





# Summary *(continued)*

#### **Building Count and Descriptions** *(continued)*

In Lviv, the study area covers a combination of historic and modern architecture, while Chernihiv presents a more complex set of challenges in evaluating roof suitability due to damage from the war.

#### **Feasibility of a Digital Twin for Nationwide Analysis**

The study explored the differences between using high-resolution DSMs and a simulated DSM, or digital twin, as a cost-effective alternative for scaling the workflow nationwide. While the very-high-resolution DSM provided more precise results, the simulated DSM demonstrated reasonable accuracy for broader applications in modeling aggregated distributed solar supply. The feasibility of using a digital twin for Ukraine's national rooftop solar potential is considered promising, with certain limitations in areas with highly variable building stock and heavy war damage.

#### **Impact of the Russia's Full-Scale Invasion**

Russia's invasion of Ukraine has resulted in significant destruction of buildings throughout Ukraine. This destruction directly impacts the technical potential for rooftop solar in the region. NREL estimates a loss of 2,754 buildings, 20.15 MW<sub>DC</sub> of capacity, and 22,869 MWh<sub>DC</sub> of annual energy production lost to the war in Chernihiv as well as a loss of 1,316 buildings, 34.49 MW<sub>DC</sub> of capacity, and 39,369 MWh<sub>DC</sub> of annual energy production lost to the war in Lviv.

#### **Value of the Data and Applications**

This analysis highlights the critical value of high-resolution siting data in assessing rooftop solar siting opportunities. The findings may be instrumental for municipal planners, solar developers, and policymakers as they assess Ukraine's renewable energy potential. The study also provides a foundation for expanding technical potential analyses to the national level, supporting Ukraine's transition toward a more resilient and sustainable energy future.







### **DATA INPUTS**

- ❖ Buildings and Damage
- ❖ Surface Models
- ❖ Solar Resource

# **Buildings: Chernihiv**

#### **OpenStreetMap Buildings**

- OpenStreetMap (OSM) building footprints are polygon vector data depicting the planimetric envelope of a building. They do not indicate building area but encapsulate potential PV-developable roof surfaces.
- OSM building footprints are created through crowdsourced mapping and automated imports from public sources.
	- OSM data can be inconsistent in coverage and accuracy, as it relies on community contributions. Urban areas are often well-mapped, but rural or remote regions may have incomplete or outdated data. Quality can vary based on the availability of high-resolution imagery and the activity of local contributors. Zoning used throughout this analysis, as such, is only partially available.



OpenStreetMap. "OpenStreetMap Building Footprints." OpenStreetMap, 2024. [https://www.openstreetmap.org.](https://www.openstreetmap.org/)





# **Buildings: Lviv**

#### **OSM Buildings**

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OpenStreetMap. "OpenStreetMap Building Footprints." OpenStreetMap, 2024. [https://www.openstreetmap.org.](https://www.openstreetmap.org/)





### **Areas Damaged by War**

#### **Center for Information Resilience**

- The Center for Information Resilience (CIR) documents and analyzes areas damaged by war through geospatial data, satellite imagery, and open-source intelligence. Their work focuses on identifying and verifying damage to infrastructure, buildings, and civilian areas in conflict zones. CIR tracks destruction in near-real time.
- CIR events from bombing or explosions, civilian infrastructure damage, ground battles, and military infrastructure damage were included in this analysis.
	- Areas within 100 meters of events are considered to have severe damage, while areas within 200 meters of events are considered to have moderate damage based on damage extents reported with ordnance used during the 2022 invasion of Ukraine.



Center for Information Resilience. "Areas Damaged by War – Conflict Mapping and Geolocation." CIR, 2023. [https://www.info-res.org.](https://www.info-res.org/)







### **Built Environment: DSMs**

#### **Maxar Precision 3D DSM Data**

- Photogrammetric DSM provided by Maxar's Precision 3D (previously known as Vricon).
- Precision 3D uses high-resolution satellite image composites through stereophotogrammetry to create submeter surface models. The fully automated technology is sensor-agnostic and does not require ground control points.





Google Earth Satellite Precision 3D DSM





Lviv 49.825°, 23.972°

### **Built Environment: Simulated DSMs**

#### **Open and Licensed Data Products Composite**

A 2-meter resolution DSM was simulated by combining available common surface features geospatial data and adding to existing digital elevation models. These data represent a cost-effective option for simulated veryhigh-resolution 3D data-derived surface models. Some interpolation to smooth non-break edges was required.

Compiled datasets include:

- Buildings with heights ([ONEGEO](https://onegeo.co/))
- 30-meter digital elevation model (Copernicus)
- Tree canopy cover (Landsat).



Precision 3D DSM Simulated DSM

Red Square, Chernihiv 49.825°E 23.972°N



#### **Terrain: Digital Elevation Model**



<sup>3</sup> Copernicus Global Land Service. "Copernicus Global Digital Elevation Model (GLO-DEM)." European Union, 2021. Data available from: Copernicus Land Monitoring Service.

#### **Copernicus Global Digital Elevation Model (GLO-DEM):**

- The Copernicus GLO-DEM offers two primary resolutions:
	- **30 meters (GLO-30)**: Provides detailed elevation data for global coverage.
	- **90 meters (GLO-90)**: A coarser version for users needing less detail.
- The model is derived from multiple sources, including radar data from the TanDEM-X mission, offering consistent global coverage.
- While the 30-meter product provides high resolution, it is not a very-high-resolution product comparable to photogrammetric data products, like Precision 3D. This model does not capture fine topographical details in highly dynamic areas like waterways or regions with heavy vegetation.





### **Tree Canopy Cover**



<sup>1</sup> Hansen, M. C., P. V. Potapov, R. Moore, M. Hancher, S. A. Turubanova, A. Tyukavina, D. Thau, S. V. Stehman, S. J. Goetz, T. R. Loveland, A. Kommareddy, A. Egorov, L. Chini, C. O. Justice, and J. R. G. Townshend. "High-Resolution Global Maps of 21st-Century Forest Cover Change." *Science*, vol. 342, no. 6160, 2013, pp. 850-853.

#### **Global Forest Watch Tree Cover:**

- Tree cover is defined as all vegetation taller than 5 meters in height as of 2015. The tree cover data was sourced from Global Forest Watch at 30-meter resolution.<sup>1</sup>
	- In this case, tree cover is the biophysical presence of trees and may take the form of natural forests or plantations existing over a range of canopy densities.

#### **Copernicus Global Land Cover—Forest Type:**

- Forest-type values were sourced from the Copernicus Global Land Cover project, which provides a harmonized and high-resolution classification and mapping of land cover types across the globe.2
	- Scots pine (*Pinus sylvestris*), English oak (*Quercus robur*), silver birch (*Betula pendula*), and aspen (*Populus tremula*) vary in height from 20-40 meters.
	- High tree cover correlates with 1x tree height, while gradient was applied on tree cover margins.

<sup>2</sup> Copernicus Global Land Service. "Land Cover 100m: Collection 3: Epoch 2015: Globe." European Union, 2017. Data available from: Copernicus Land Monitoring Service.





# **Solar Resource Data**

#### **Meteosat Second Generation**

- The dataset is a serially complete collection of solar radiation and meteorological variables on a 4-km grid at 15-minute intervals spanning 2005–2022.
- The data was produced with the Physical Solar Model V4 (PSM-v4) developed by NREL with support from USAID and National Oceanic and Atmospheric Administration.
- The data is available through the [RE Explorer.](https://www.re-explorer.org/)
- Includes global horizontal, direct normal, and diffuse horizontal irradiance, as well as other meteorological variables (e.g., surface temperature, wind speed, and albedo).









### **TOOLS**

- ❖ Renewable Energy Potential Model
- PV Rooftop Model



letail area

Detailed view of wind sites (red)



Detailed view of exclusion analysis; areas around roads, structures and streams



#### **A Best-in-Class Model for Estimating Renewable Energy Supply**

*Technologies Modeled*





### **reV Modular Workflow**







### **Study Workflow**







#### *Capabilities and Limits:*

- Identifies obstructions to array placement and shading at submeter scale
- Handles customized array configurations per plane or building
- Does not assess roof condition, roof material, or code compliance.



### **PV Rooftop Model** PV Rooftop Database

LiDAR or photogrammetric DSMs are used to delineate **roof planes suitable for PV array installation**. Suitable planes are combined with outputs from [NREL's Renewable Energy Potential \(reV\)](https://www.nrel.gov/gis/renewable-energy-potential.html) model to create rooftop PV data products.





# **Shading Assessment**

PV Rooftop computes illumination and converts it to a binary shading classification based on seasonal thresholds.

• A pixel is considered excessively shaded if its cumulative time in shade exceeds 20% of overall daylight time throughout a year.

#### *Parameters:*

- Dynamic search distance based on maximum feature height in raster
- Temporal resolution, sample dates.





### **Shading Method**



Horizon profiles are constructed using a DSM.



31.27479°E, 51.50646°N





### **Shading Method**



Horizon profile is compared to solar position throughout the year.



31.27479°E, 51.50646°N





### **Shading Method**



High values in the horizon profile indicate large objects causing frequent shading. Prospective panel locations that are shaded 20% of daylight time steps or more are considered excessively shaded.



31.2817°E, 51.5035°N: Myru Ave, 68, 1511 Chernihiv [Google Street View](https://www.google.com/maps/@51.5038076,31.2807651,3a,90y,70.85h,49.57t/data=!3m7!1e1!3m5!1s9WJZ4DwFhie7-zvM5hjSHg!2e0!6shttps:%2F%2Fstreetviewpixels-pa.googleapis.com%2Fv1%2Fthumbnail%3Fpanoid%3D9WJZ4DwFhie7-zvM5hjSHg%26cb_client%3Dsearch.gws-prod.gps%26w%3D360%26h%3D120%26yaw%3D52.547775%26pitch%3D0%26thumbfov%3D100!7i13312!8i6656?entry=ttu&g_ep=EgoyMDI0MDkwOS4wIKXMDSoASAFQAw%3D%3D): Ihorya Samostrova St, 7







### **RESULTS**

#### Lviv

**❖ Chernihiv** 

Simulated DSM

#### Renewable Energy Technical **Potential**

Figure source: Brown, Austin, Philipp Beiter, Donna Heimiller, Carolyn Davidson, Paul Denholm, Jennifer Melius, Anthony Lopez, Dylan Hettinger, David Mulcahy, and Gian Porro. 2016. *Estimating Renewable Energy Economic Potential in the United States: Methodology and Initial Results*. Golden, CO: National Renewable Energy Laboratory. NREL/TP 6A20-64503.



Technical potential establishes a theoretical maximum for renewable energy potential considering available resources and siting constraints, often including regulatory constraints and interconnection.

Technical potential does not consider project economics, market factors, or grid integration constraints.





### **PV System Info and Performance Overview**



Average solar resource, time in light, and mean annual PV performance for flat roof planes in Chernihiv and Ukraine calculated in reV using Meteosat SG (2005–2022).

#### **PV System Configurations for [System Advisor Model](https://nrel-pysam.readthedocs.io/en/main/modules/Pvwattsv8.html)**



Where zoning data was absent, buildings greater than 464 m<sup>2</sup> were modeled using commercial system configuration, while buildings less than 464 m<sup>2</sup> were modeled using residential system configuration.



### Lviv Siting Results: PV Rooftop



- 15.5% of buildings do not have suitable areas for rooftop PV (*n*=7,764).
- Lviv, despite having fewer buildings modeled, has more technical potential for rooftop PV than Chernihiv.
	- Significantly higher capacity densities and sloped roofs mean Lviv can pack more panels into smaller spaces and still yield more energy with slightly poorer solar resource than Chernihiv.



### Lviv Siting Results: Commercial



- Only 20% of sampled Lviv buildings have an associated zoning classification.
- This subset includes 513 buildings that are classified as zoned commercial and constitutes 1.0% of the total Lviv building sample.
- While identified commercial buildings are few, they serve as a representative sample for commercial building technical potential in Lviv.



### Lviv Siting Results: Industrial



- Only 20% of sampled Lviv buildings have an associated zoning classification.
- This subset includes 417 buildings that are classified as zoned industrial and constitutes 0.8% of the total Lviv building sample.
- While identified industrial buildings are few, they serve as a representative sample for industrial building technical potential in Lviv.



### Lviv Siting Results: Residential



- Only 20% of sampled Lviv buildings have an associated zoning classification.
- This subset includes 9,359 buildings that are classified as zoned residential and constitutes 18.4% of the total Lviv building sample.
- Residential buildings at every size in Lviv rely on many smaller arrays to maximize capacity. This likely will require more complex PV panel stringing, potentially increasing losses.



#### Percentage of Developable Planes Area by Orientation



In Lviv, PV-suitable roof areas are more often found on sloped roof planes. Sloped planes, comprising planes with slopes greater than 12°, assume that PV arrays are tilted flush to the roof plane.

The proportion of developable flat roof planes is atypical and unusually low to architecture previously modeled in PVRDB. This distribution illustrates the importance of utilizing very-highresolution data; Gothic, Renaissance, Baroque architecture strongly influence





### Lviv Siting Results

Small buildings hold high percentage of developable area per building, high capacity density, and low shading percentage.

Medium and large buildings may offer comparable system sizes and performance. Clustering of large buildings increases module shading.

The skew toward sloped developable planes increases mean capacity density vis - à -vis reducing interrow spacing.









#### Chernihiv Siting Results: PV Rooftop



- 11.1% of buildings do not have suitable areas for rooftop PV (*n*=8,209).
- Chernihiv has unusually high proportion of small buildings (87%) with approximately one-quarter of the quantity of large buildings in Lviv. The combination of the very high proportion of small buildings and dominance of flat roof planes leads to lower density of PV arrays and thus lower capacity per unit of roof area.



### Chernihiv Siting Results: Commercial



- Only 24% of sampled Chernihiv buildings have an associated zoning classification.
- This subset includes 274 buildings that are classified as zoned commercial and constitutes 0.4% of the total Chernihiv building sample.
- While identified commercial buildings are few, they serve as a representative sample for commercial building technical potential in Chernihiv.



### Chernihiv Siting Results: Industrial



- Only 24% of sampled Chernihiv buildings have an associated zoning classification.
- This subset includes 202 buildings that are classified as zoned industrial and constitutes 0.3% of the total Chernihiv building sample.
- While identified industrial buildings are few, they serve as a representative sample for commercial building technical potential in Chernihiv.



#### Chernihiv Siting Results: Residential



- Only 24% of sampled Chernihiv buildings have an associated zoning classification.
- This subset includes 16,582 buildings that are classified as zoned industrial and constitutes 25.6% of the total Chernihiv building sample.
- Residential buildings in Chernihiv are predominantly small, which may indicate a bias in the zoning identification that omits large multifamily buildings.
- Large residential buildings are more competitive than small residential buildings regarding developable area and capacity density.





#### Percentage of Developable Planes Area by Orientation



In Chernihiv, PV-suitable roof areas are more often found on flat roof planes. Flat planes require panels face south and are tilted equal to latitude with dynamically calculated row spacing, averaging a 1.4-meter row spacing\*.

Sloped suitable roof areas are assumed to be flush-mounted with 20-cm panel spacing.

The distribution of suitable roof planes' orientation is important for determining capacity density and system performance in time.





### Chernihiv Siting Results

Small building siting statistics are consistent with other mid latitude locations (e.g., moderate percentage developable area and capacity density).

Medium buildings hold high percentage of developable area per building, high capacity density, and low shading percentage.

Large buildings offer larger system sizes despite lower developable area percentage and lower capacity density.













#### Building Height Comparison: Simulated DSM and Precision 3D DSM







The simulated DSM systematically overestimates building height compared to the elevations identified by Precision 3D. In the case of the simulated DSM, Precision 3D data is considered a standard to match.

Representing building height higher than reality can increase the influence of shading on modeled PV systems as well as increase open sky exposure.

Additional work needs to be done on non-building objects, such as trees, as well as in Lviv to evaluate biases and assumptions used to create the simulated DSM.









The technical potential results from the simulated DSM yields 45 MWdc more capacity and 51,977 MWh more annual energy production (87.3M UAH, 2.6M USD)3.

Individual building and aggregate calculated capacity estimates are systemically higher using the simulated DSM. The mean difference in capacity per building is 3.6 kWdc, which can range from 25–30 square meters of developable area.







#### Comparison of Simulated DSM and Precision 3D DSM: Capacity

Difference in capacity outliers are clustered in two types of locations:

- **Dense** subdivisions with only small buildings
- Areas with very low density of buildings.











 $0.3 - 100$  $100 - 200$  $200 - 300$  $300 - 400$  $400 - 500$  $500 - 600$  $• 600 - 700$  $• 700 - 800$ 

 $• 800 - 900$ 

 $• 900 - 922$ 



Roof plane tilt and orientation are not detectable via the simulated DSM.

The difference (5.8%) between the distribution of developable planes via Maxar's Precision 3D and the simulated DSM likely results from commission assuming suitable tilts, azimuths, and plane sizes.

### **Comparing** Shading Results

Using the simulated DSM, 5.3% of buildings in Chernihiv were identified as excessively shaded and not suitable sites for rooftop PV. This is less than the 11.1% of buildings in Chernihiv that were identified as not having any suitable rooftop PV-hosting spaces.





- **Future Work** Building on the high-resolution 3D elevation models used to assess resolution of the high-resolution in Chamibited and Luis we will good our rooftop solar opportunities in Chernihiv and Lviv, we will scale our analysis in future work to evaluate the national technical potential for rooftop solar across Ukraine. This expansion includes refining the methods used to create the simulated DSMs, or digital twins, and inputting these models to assess rooftop siting opportunities nationwide.
	- We will compile additional training data on architectural styles across Ukraine and develop a machine learning model to identify likely architectural types for each building. This approach aims to reduce the inclusion of buildings that lack suitable rooftop areas for solar PV installation.
	- Additionally, we will expand our PV system performance simulations across Ukraine, calculating exceedance probabilities for all tilt and aspect combinations, ensuring optimized performance modeling for diverse building characteristics.





#### **Thank you!** Corresponding author: Katy Schneider, katy.schneider@nrel.gov



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- This analysis relies on elevation data provided to NREL that have not been independently validated by NREL.
- The analysis results are not intended to be the sole basis of investment, policy, or regulatory decisions.
- This analysis was conducted using the NREL PV Rooftop and Renewable Energy Potential [\(https://github.com/NREL/reV\)](https://github.com/NREL/reV) models. PV Rooftop is a rooftop PV siting suitability model while the Renewable Energy Potential (reV) model is an open-source geospatial techno-economic tool that estimates renewable energy technical potential (capacity and generation), system cost, and supply curves for solar photovoltaics (PV), concentrating solar power (CSP), geothermal, and wind energy.
- The data, results, conclusions, and interpretations presented in this document have not been reviewed by technical experts outside NREL.

