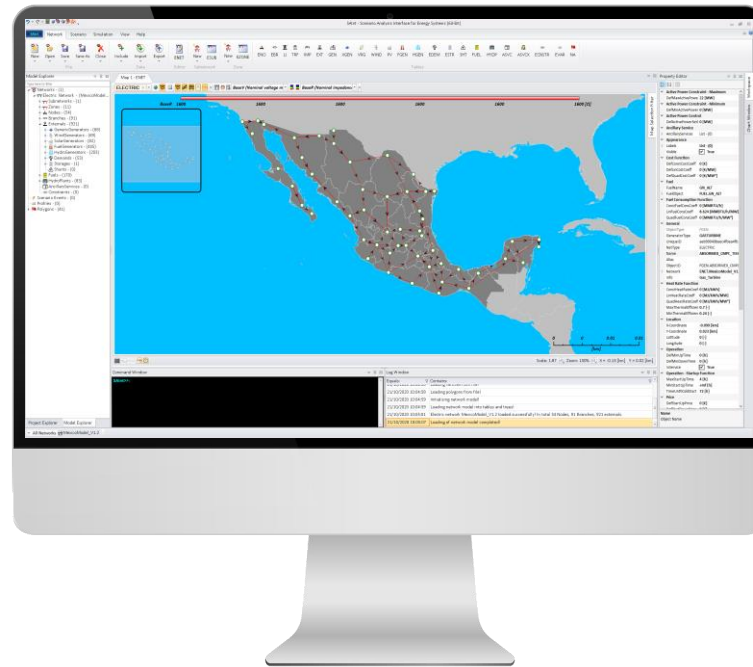


# Power System Production Cost Modeling to Inform Electricity Planning & Regulation



Presentation to EgyptERA

Dr. Carlo Brancucci

February 10<sup>th</sup>, 2021

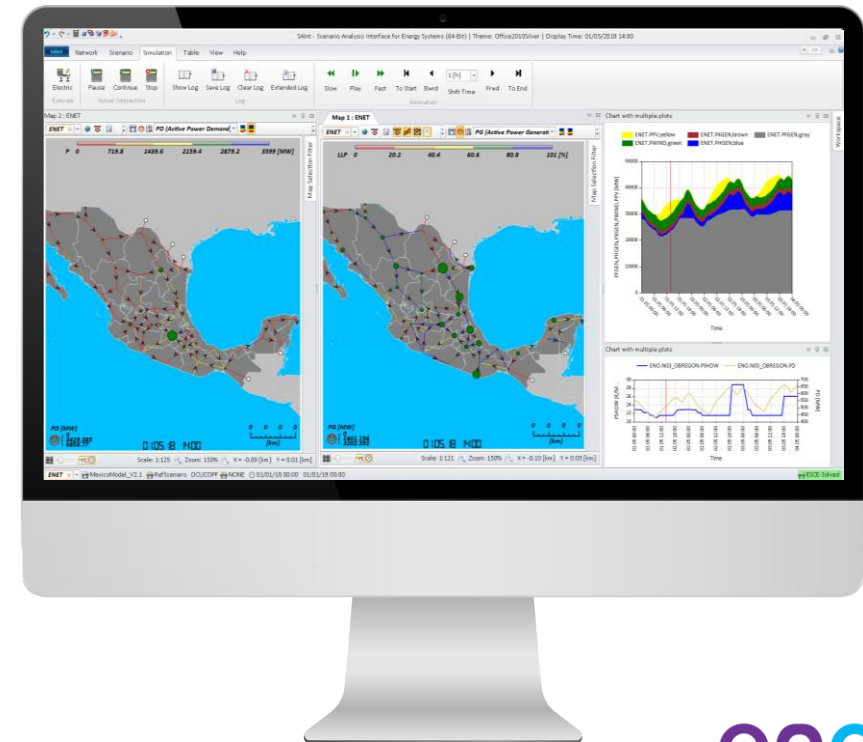
# About encoord

encoord is a software company based in Denver, CO, [USA](#), and Essen, [Germany](#).

Our core technology is the Scenario Analysis Interface for Energy Systems (SAInt), a [software platform](#) to model and plan [energy networks & markets](#).

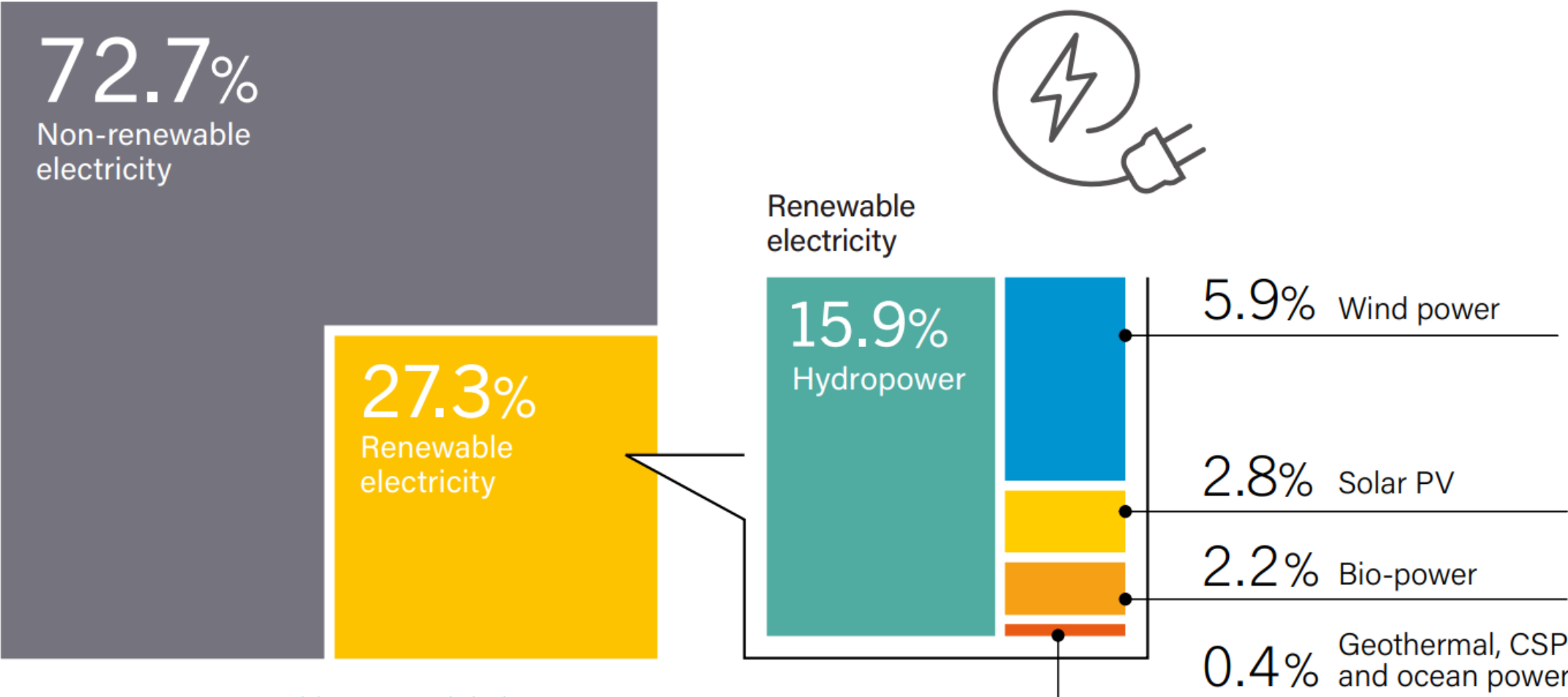
## Applications

- Modeling of gas pipeline networks
- Modeling of coupled electricity and gas networks
- Modeling of electricity markets and of optimal power system operations



# Global Electricity Generation

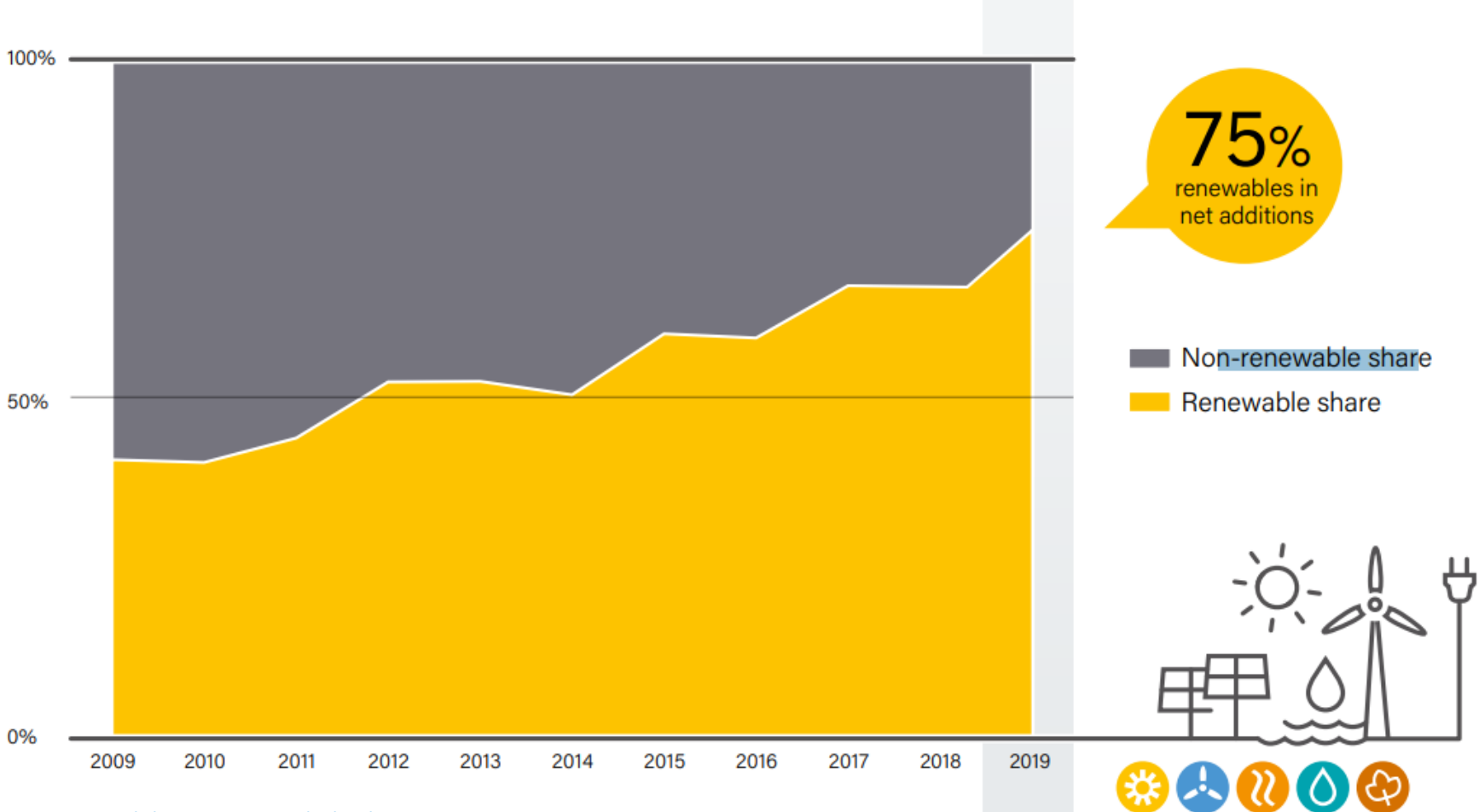
Estimated Renewable Energy Share of Global Electricity Production, End-2019



Source: REN21, [Renewables 2020 Global Status Report](#)

# New Generation Capacity

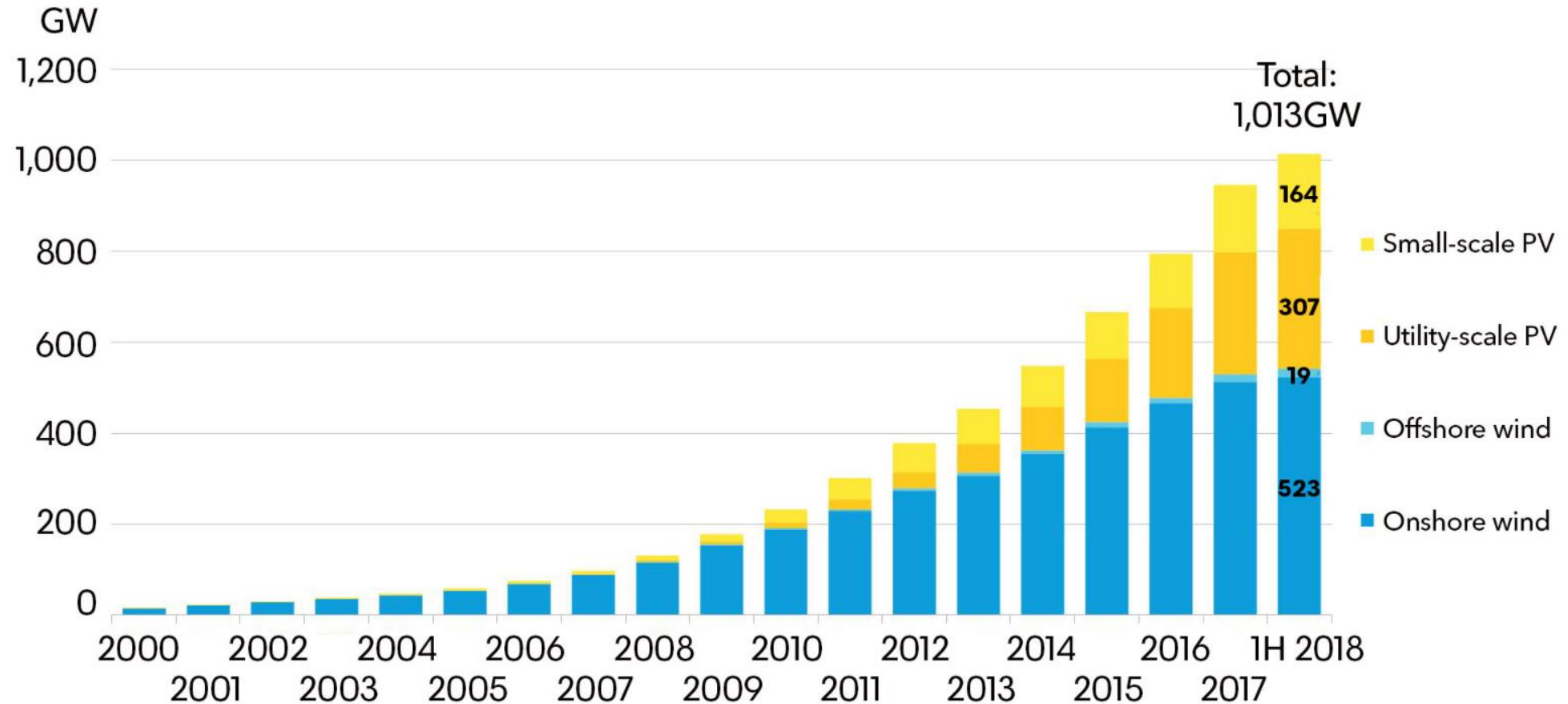
Renewable and Non-renewable Shares of Net Annual Additions in Power Generating Capacity



Source: REN21, [Renewables 2020 Global Status Report](#)

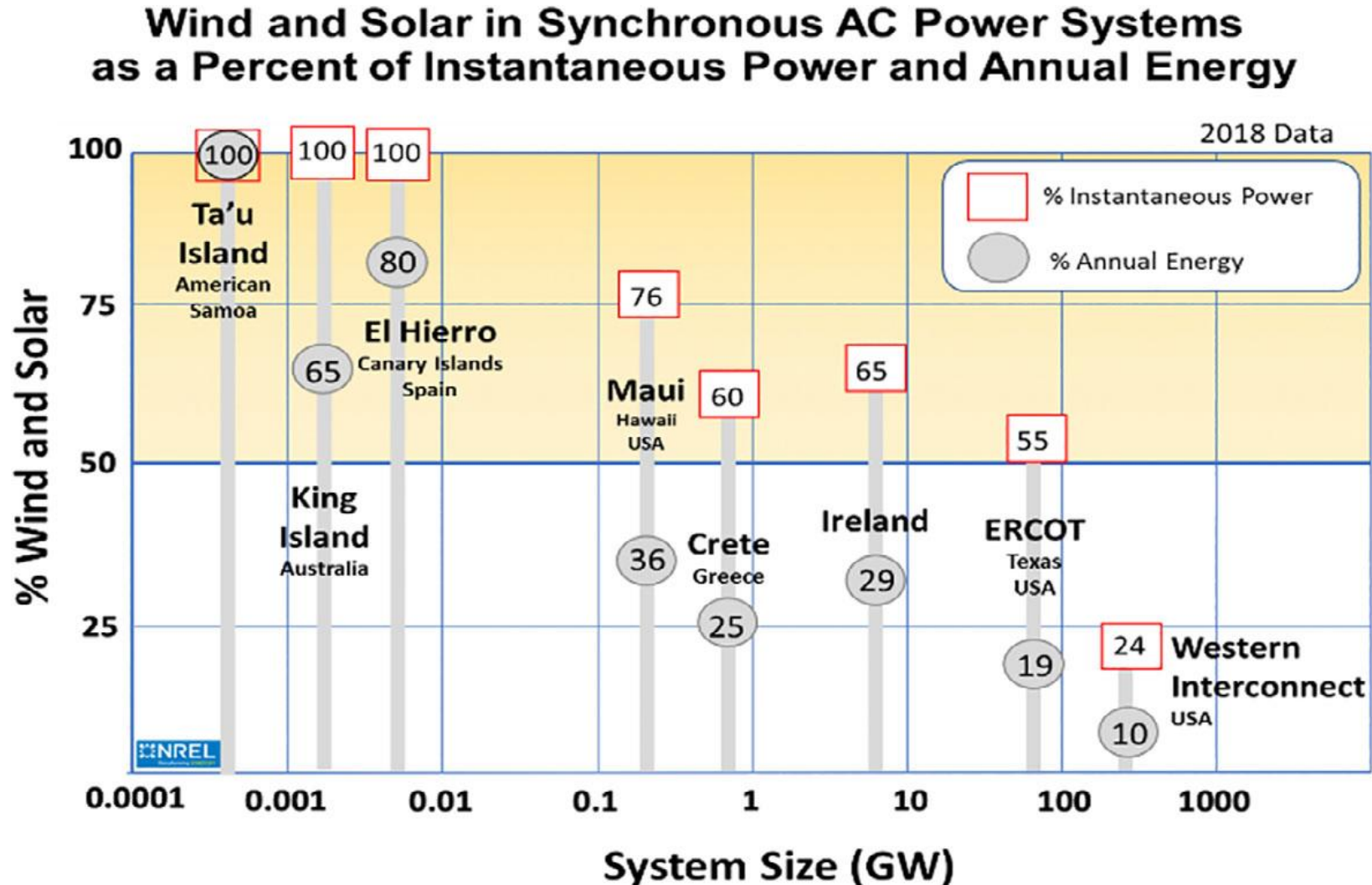
# Solar PV and Wind Installations

Global wind and solar installations, cumulative to June 30, 2018



Source: Bloomberg NEF. Note: 1H 2018 figures for onshore wind are based on a conservative estimate; the true figure will be higher. BNEF typically does not publish mid-year installation numbers.

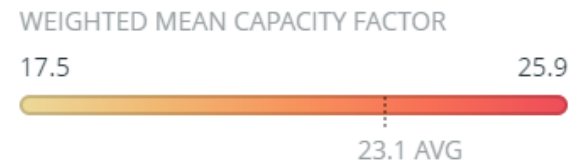
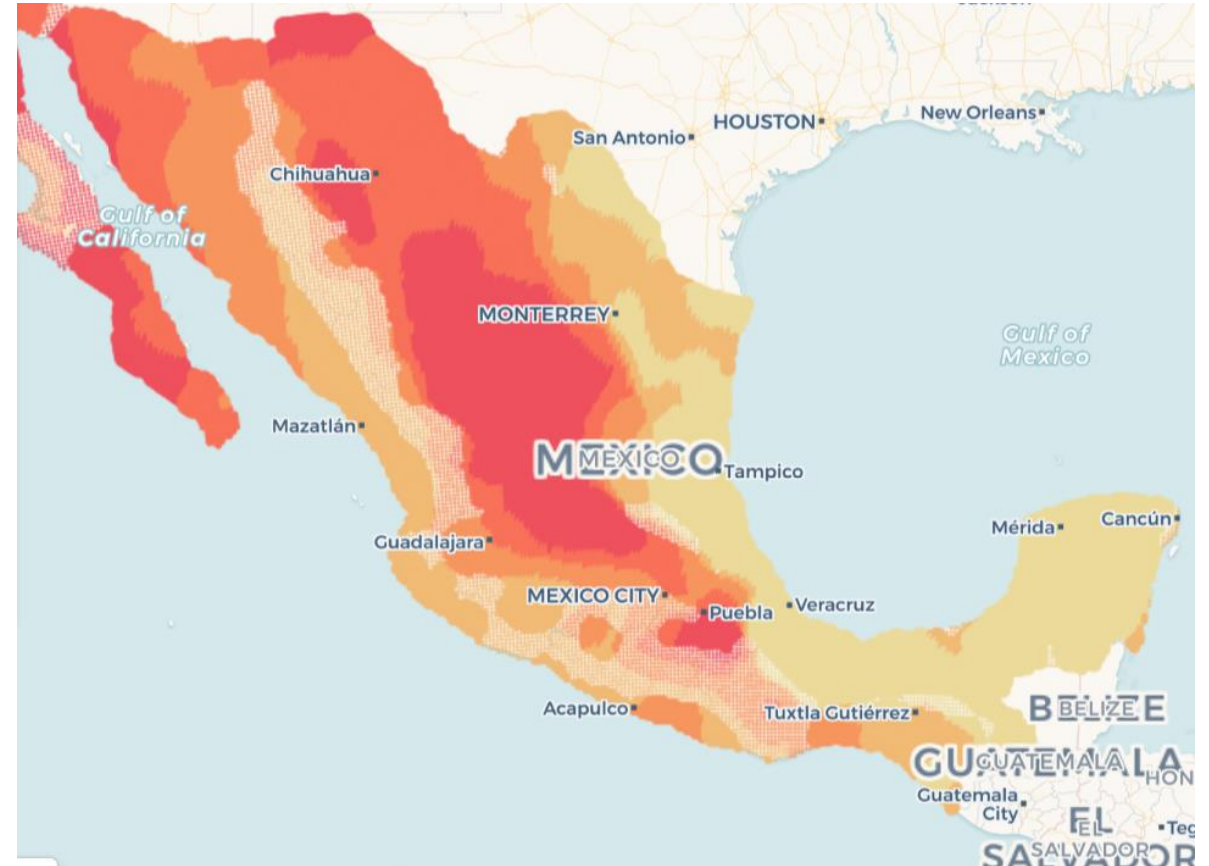
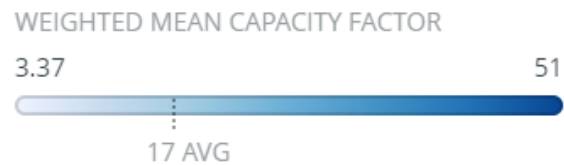
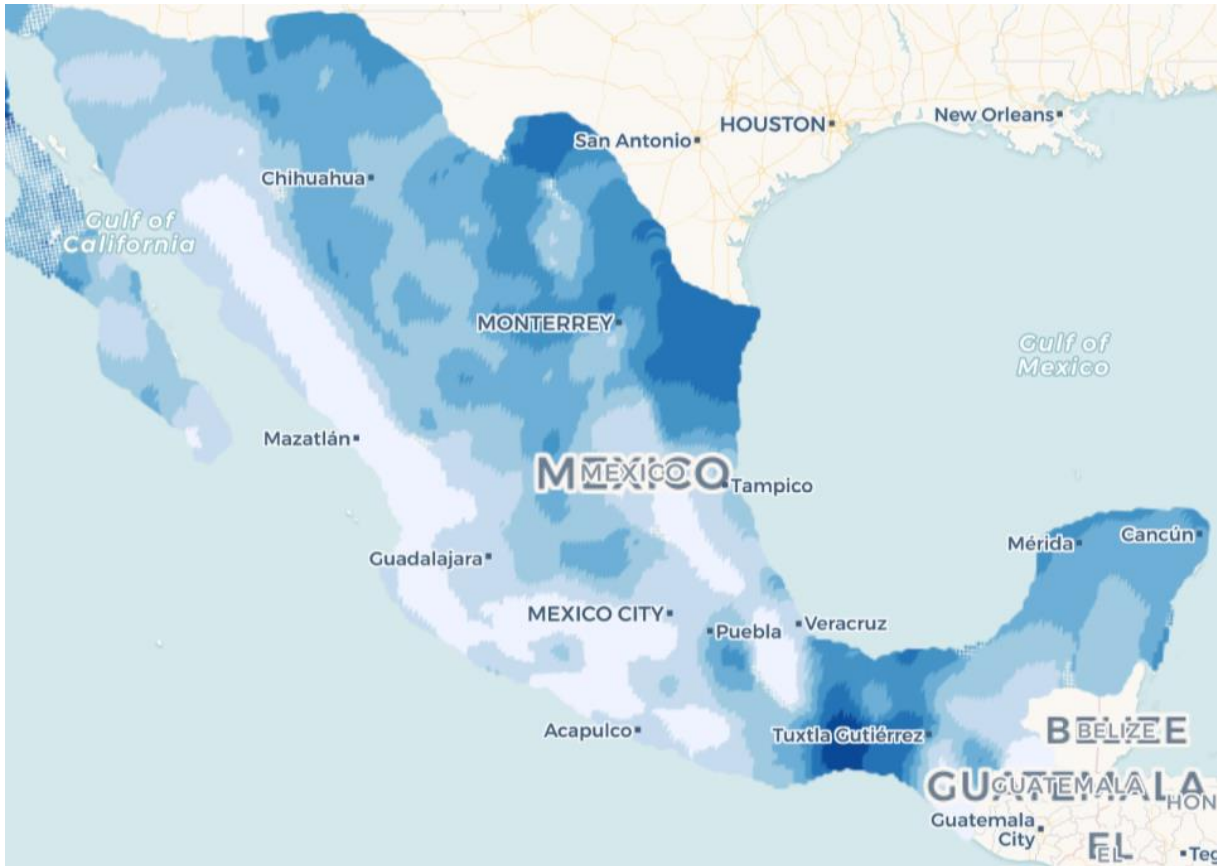
# Solar PV and Wind Penetrations



Source: Hodge et al., [Addressing technical challenges in 100% variable inverter-based renewable energy power systems](#), WIRES Energy and Environment, 2020.

Which are the major **challenges** of integrating higher penetrations of wind and solar energy in a power system?

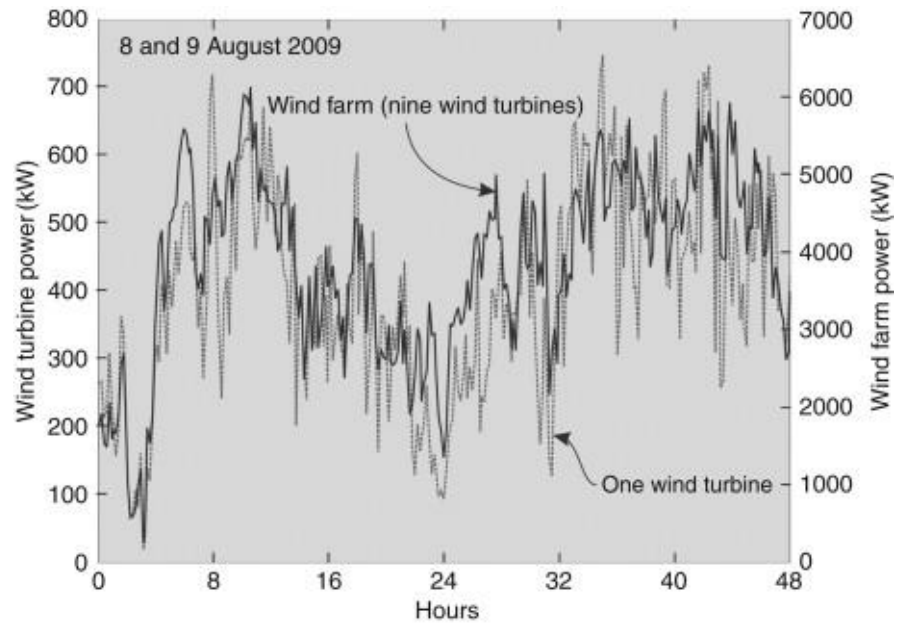
# Spatial Variability



Source: NREL, <https://tinyurl.com/y86eeh3t>

# Temporal Variability

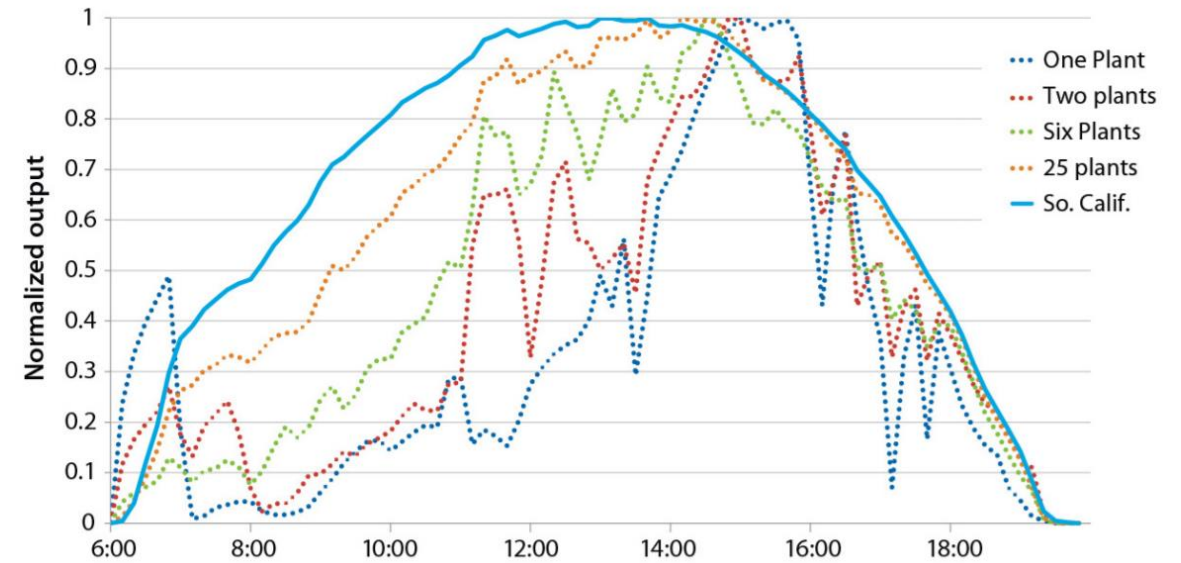
## Wind



Source:

<https://www.sciencedirect.com/book/9780128045671/renewable-energy>

## Solar

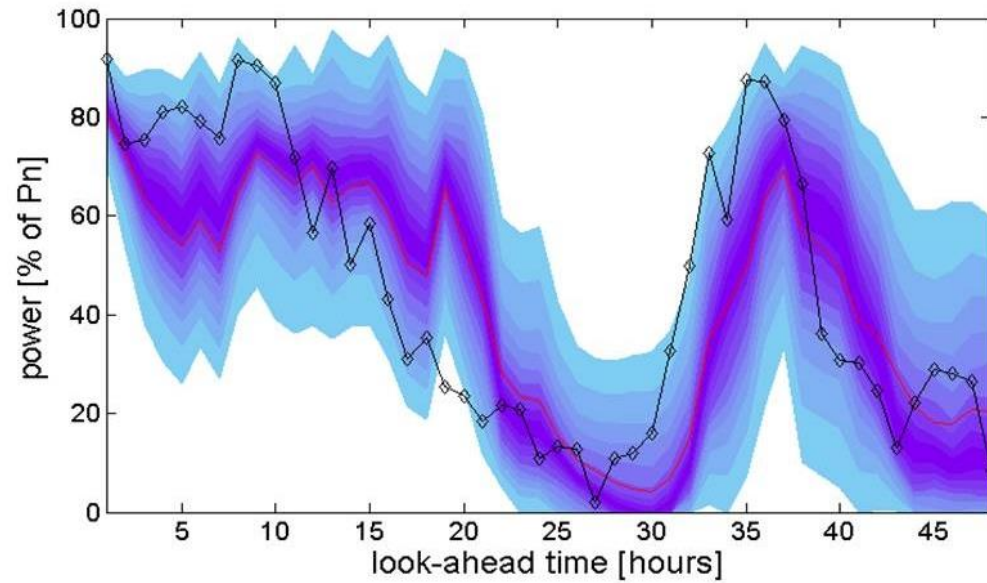


Source:

<https://www.nrel.gov/docs/fy13osti/60451.pdf>

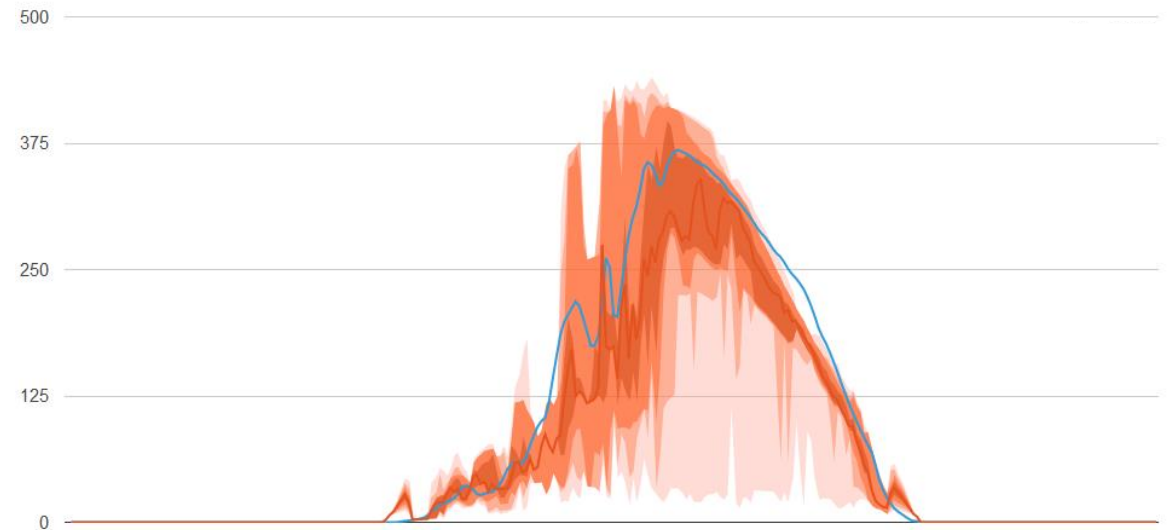
# Uncertainty

## Wind



Source: <https://www.ewea.org/>

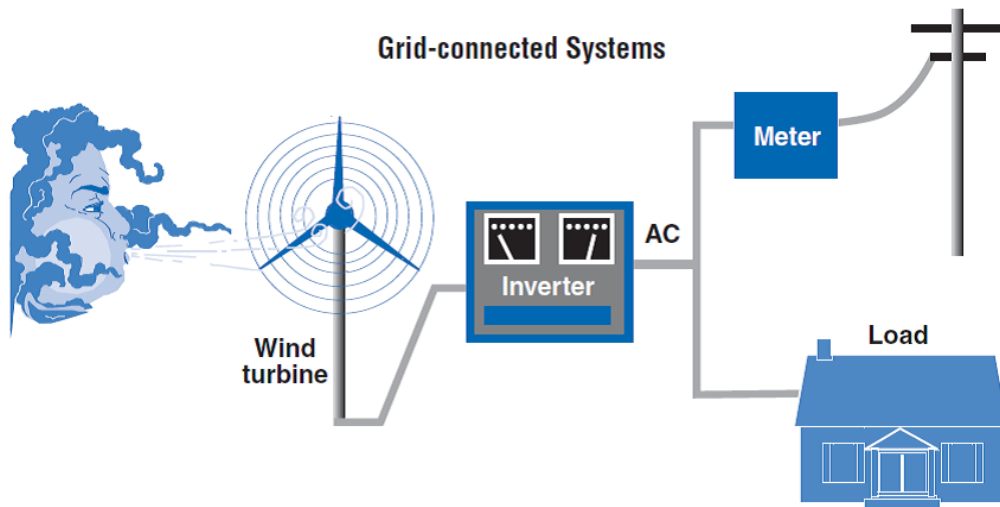
## Solar



Source: <https://steady-sun.com>

# Asynchronous Generation

## Wind



Source: <https://windexchange.energy.gov/>

## Solar



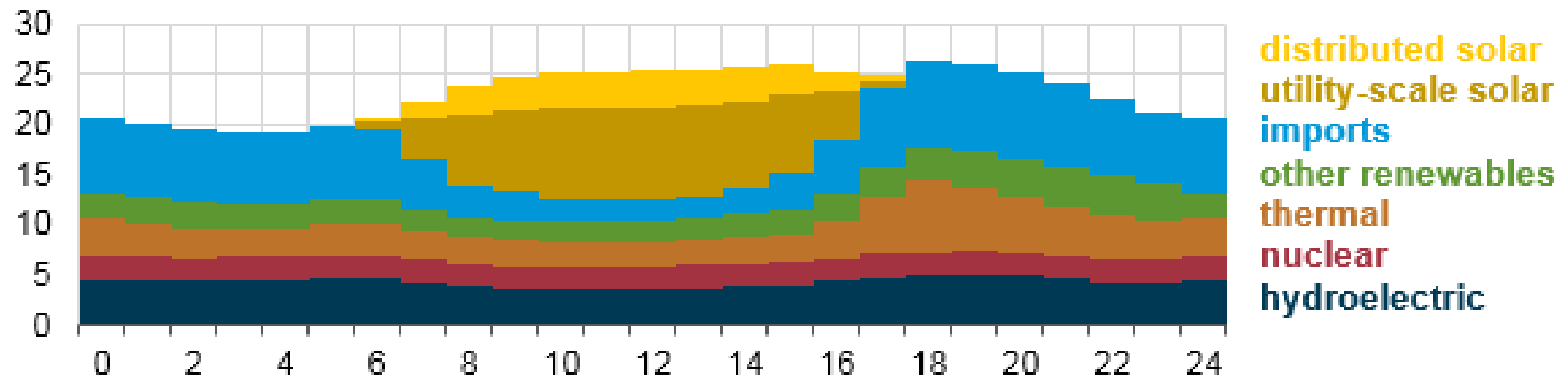
Source: <https://www.cleanenergyreviews.info>

# Impact on Electricity Prices

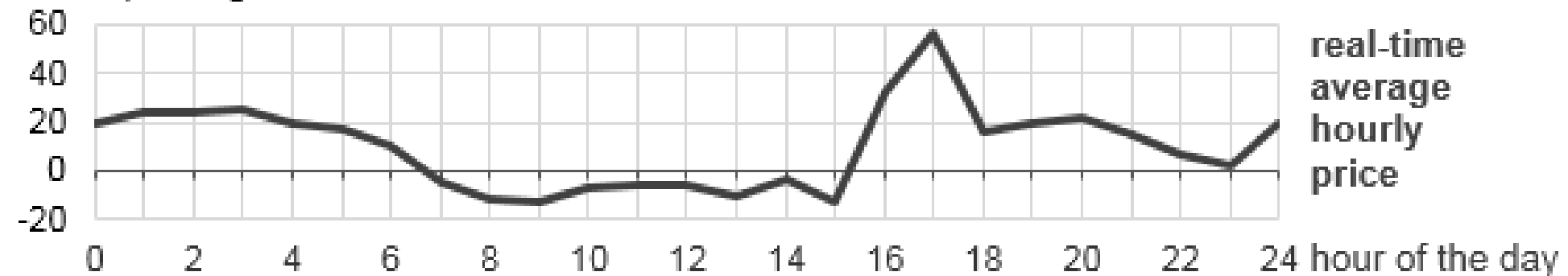
California Independent System Operator net generation, March 11, 2017



gigawatthours



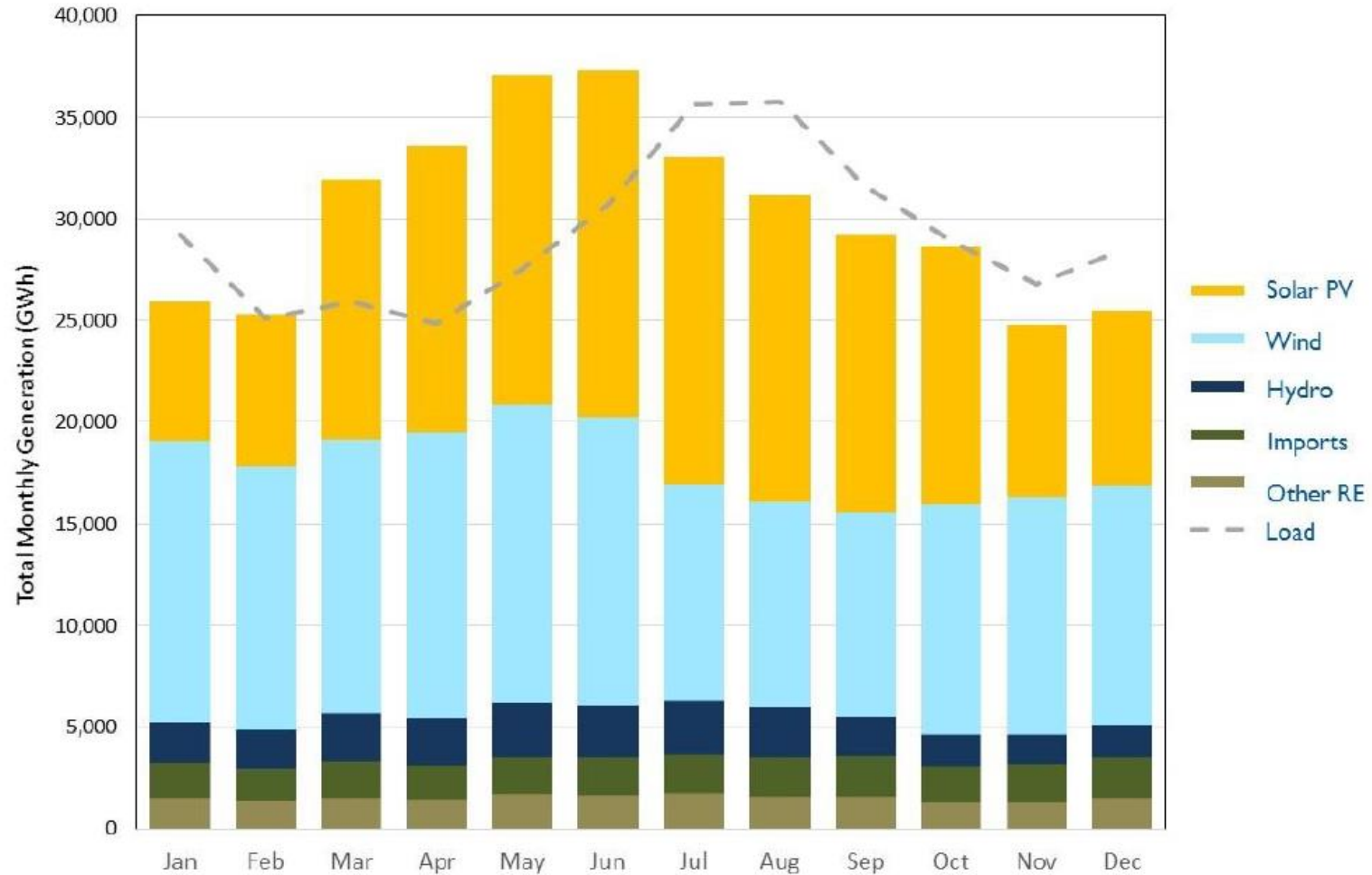
dollars per megawatthour



Source: U.S. Energy Information Administration

# Seasonality

## Projected Renewable Generation vs. Electric Load in California

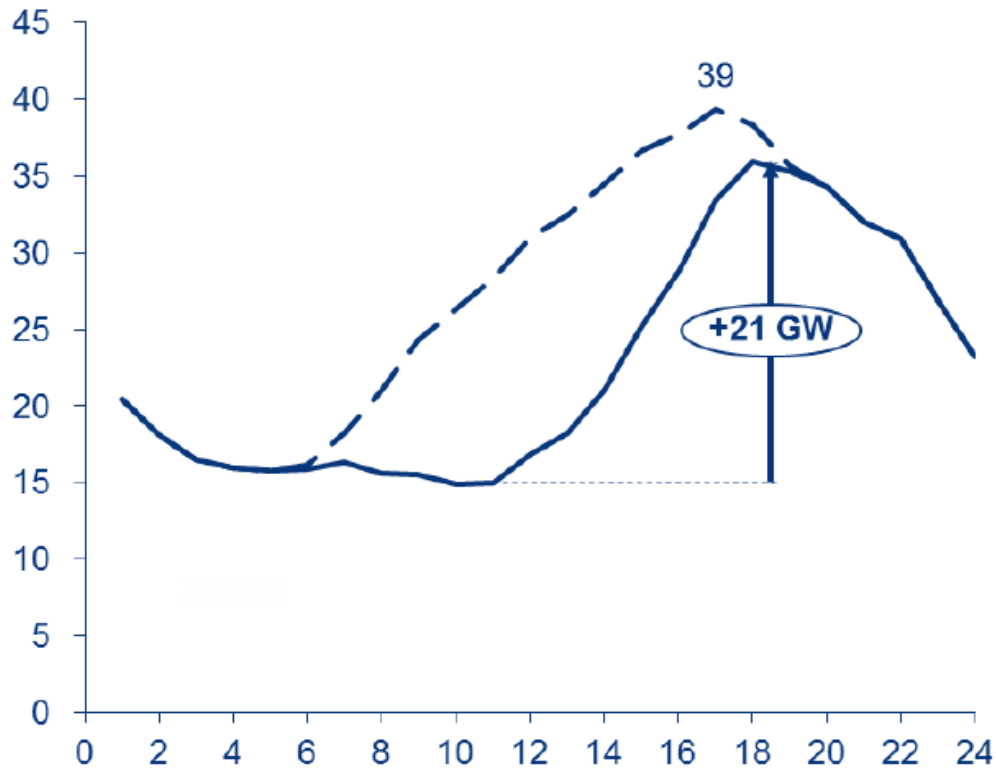


Source: The INGAA Foundation, Inc., The Role of Natural Gas in the Transition to a Lower-Carbon Economy

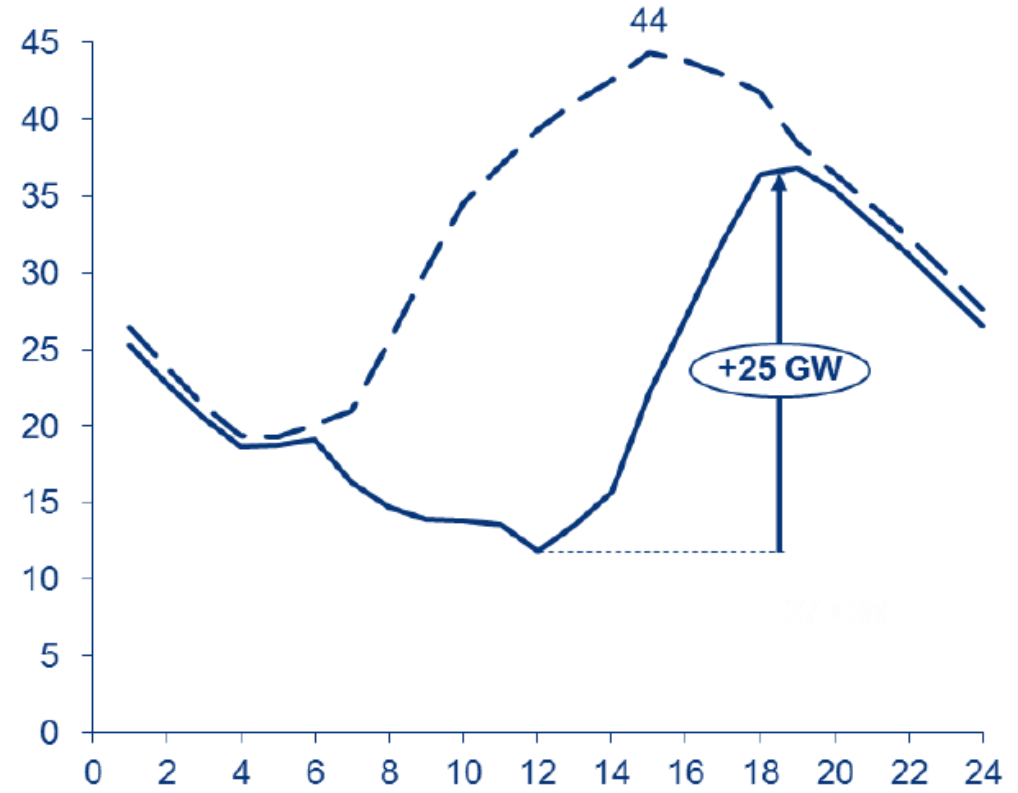
# Diurnal Pattern

Hourly Electric Load in California

**2017 hourly electric load – Aug 21 (GW)**



**2026 hourly electric load - Aug 21 (GW)**



— — Load — Net load

Source: Wood Mackenzie, Western Interconnection Gas – Electric Interface Study

How can we study the potential **impacts** of higher penetrations of wind and solar energy on power system **planning** and **operations**?

# Power System Models

## Capacity Expansion Model

Optimization of the expansion of the power system generation and transmission to meet future goals and forecasts, while considering system constraints.

## Production Cost Model

Optimization of the variable electricity generation costs, while considering system constraints.

## Reliability Model

Power flow simulations and dynamic simulations of the power system to evaluate its stability and response to a contingency.

# What is a Production Cost Model

It is an **optimization** mathematical model that simulates the operation of a power system by defining the **commitment** and **dispatch** of generators, storage, and flexible demand, while considering system constraints and minimizing variable operational costs

$$\min \sum_{t=1}^{t=T} \sum_{g=1}^{g=G} (P_{g,t} * C_g)$$

subject to:

$$\sum_{g=1}^{g=G} P_{g,t} = D_t \quad \forall t \in T$$

$t$ : time period

$g$ : generator

$P_{g,t}$ : electricity generation of generator  $g$  during period  $t$  (MWh)

$C_g$ : variable generation costs of generator  $g$  (\$/MWh), these include variable operation & maintenance costs, fuel costs, as well as startup and shutdown costs

$D_t$ : electricity demand during period  $t$  (MWh)

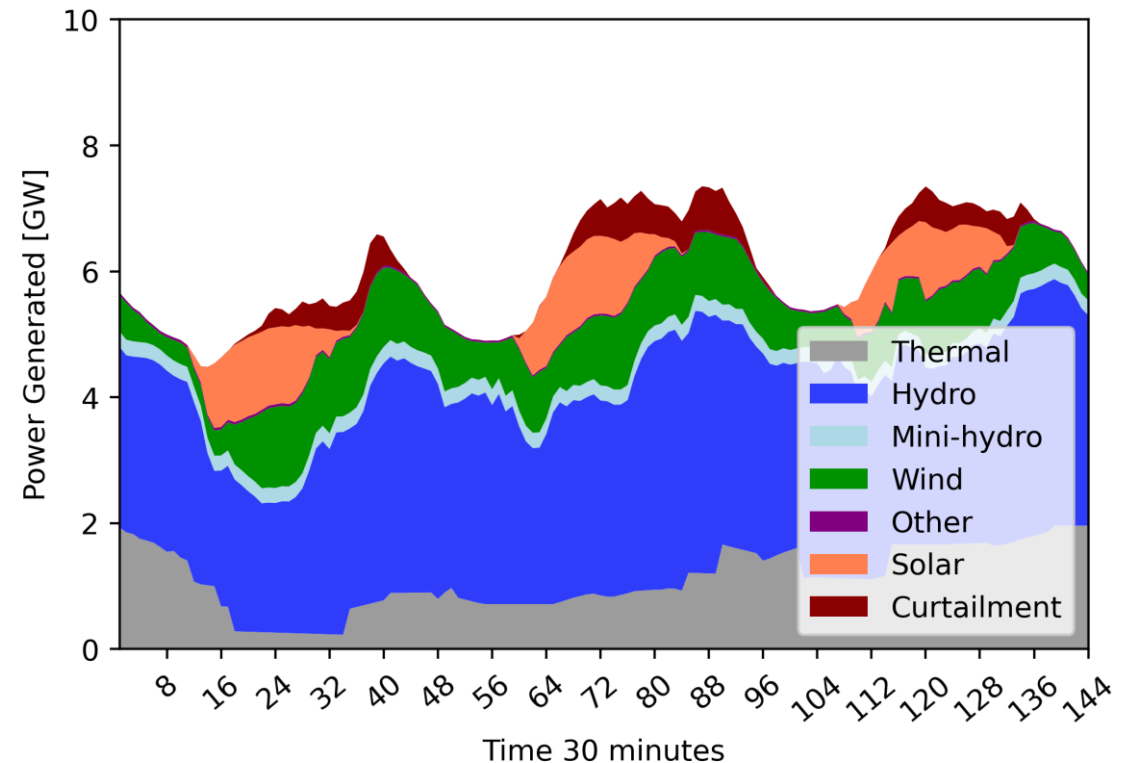
and many other generation, transmission, storage, demand, and operational reserve constraints

# Inputs of a Production Cost Model

- Transmission network topology (substations, lines, transformers)
- Thermal capacity, resistance, and reactance of transmission elements
- Technical constraints, availability, and efficiency of generators
- Variable operation & maintenance, fuel, and startup & shutdown costs of generators
- Operational reserve requirements & ability of generators to contribute to them
- Electricity demand time series
- Hydro, wind, and solar resource time series
- Generation & transmission operational limits to maintain system reliability & stability

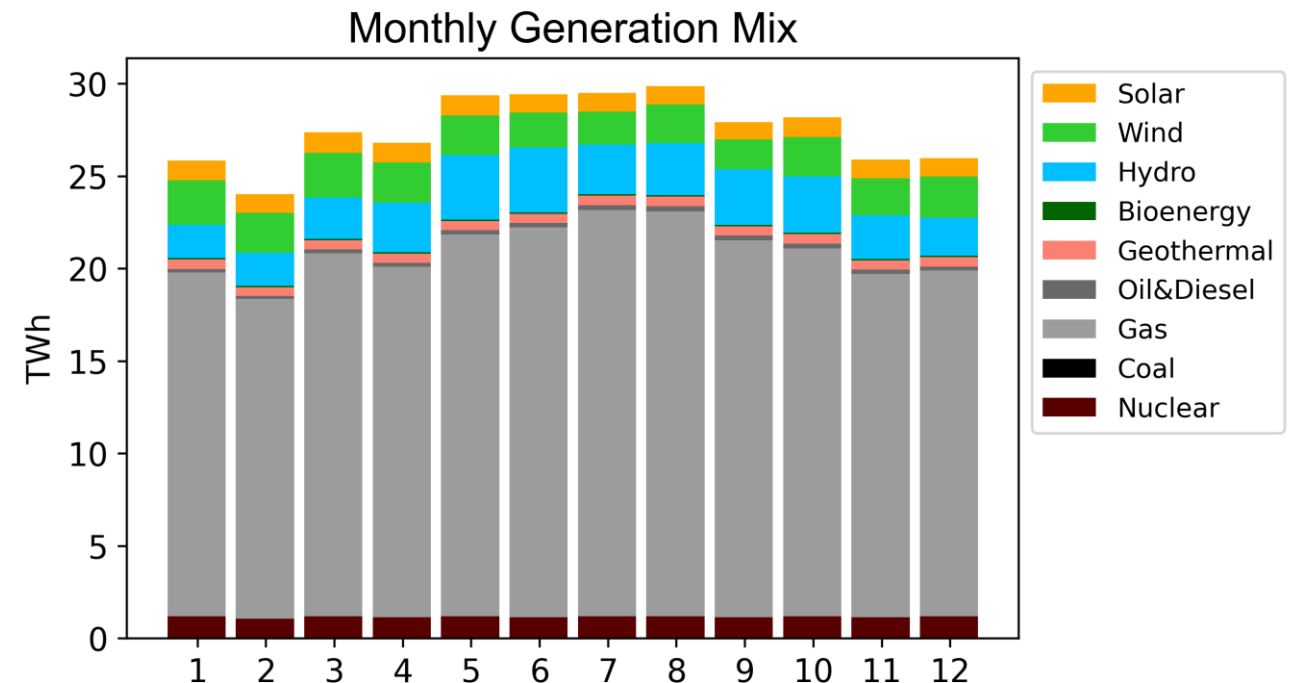
# Outputs of a Production Cost Model

- Ability of the system to meet demand and operational reserve requirements
- Commitment and dispatch of generators
- Transmission flows & congestion
- Renewable curtailment
- Energy storage utilization
- Flexible demand behavior
- Fuel consumption
- Greenhouse gas emission
- Electricity Prices



# Applications of a Production Cost Model

- Simulation of power system operations under potential future scenarios and conditions
- Analysis of potential power system operational challenges
- Analysis of the impact of different investments:
  - Energy storage
  - Flexible demand
  - Transmission capacity
  - Flexible generation
  - Etc.
- Analysis of electric sector regulations



Thank you for your attention!

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[www.encoord.com](http://www.encoord.com)

