

LESSONS LEARNED FROM OPERATIONAL ENERGY DATA TO INFORM PRE-CONSTRUCTION ESTIMATES



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FORECAST PROVIDER for 60+ GW

of renewable energy projects



Investor/Owner's Engineer on **450+** wind & solar projects*

*since 2012





• Key Locations

INTRODUCTION

- Review of operational projects
- Evaluation of:
 - Availability
 - Performance Ratio
 - Net Capacity Factor
 - Degradation
- Key Takeaways to inform preconstruction assumptions





ENERGY PRODUCTION ESTIMATES

- Loss factors inputs calibrated to plant design and site-specific conditions.
- PVSYST used for simulation.
- Results post-processed to address operational and long term loss factors.





DATA STATISTICS

- Projects from multiple data sources:
 - Supervisory Control and Data Acquisition (SCADA)
 - U.S. Energy Information Administration (EIA)
 - Operational energy production reviews (OEPR) based on Monthly Operational Reports (MORs)
- Detailed project information was not always available.
- AWST removed data from startup periods or that appeared erroneous or unrealistic.
- Primary data set: SCADA
- EIA and OEPR data used to inform understanding from SCADA results



DATA STATISTICS

Parameter	SCADA	EIA
Number of Projects	55	41
Average Nameplate Capacity (MW _{AC})	34	29
Average Period-of-Record (years)	2.4	4.2
Total Number of Years Represented	100	172
Tracking - Fixed Tilt	91% - 9%	49% - 51% [‡]
Crystalline - Thin Film - Mixed	65% - 29% - 5%	67% - 33% - 0% [‡]
DC-AC Ratio Average	1.31	-
Availability Average	98.6%	-
AC Capacity Factor Average	29.5%	24.2%
Performance Ratio Average	76.4%	-
[‡] Calculated from projects where data were available.		



AVAILABILITY OF INVERTERS

- Average of 98.6% (pre-construction estimate is usually ~99%)
- 31% of projects below 98% availability, non-normal distribution with low tail
- Standard deviation (annual): 1.2% (100 years)
- Standard deviation (monthly): 5.6% (1000+ months)
- Tracking vs. fixed-tilt: within 0.1% of each other





PERFORMANCE RATIO

- PR = Net Energy / Gross Energy = 1 combined loss
- Gross Energy calculated from plane-of-array irradiance (POA) in SCADA
- Mean = 76.4%, about 3% lower than typical pre-con PRs (77-81%).
- Outliers suggest equipment performance or maintenance issues at two sites





NET AC CAPACITY FACTOR AND PERFORMANCE

- Monthly energy totals adjusted to first-year values using a typical modeled degradation rate of 0.65% per year.
- Net capacity factor (NCF) calculated from reported MWAC
- Presented as a function of reported POA
- Compared to typical pre-construction relationship between POA and NCF





NET AC CAPACITY FACTOR AND PERFORMANCE

- Operational performance is within 0.3% of AWST's estimates (on average)
- Standard deviation of 2.1% from the regression line, somewhat influenced by configuration-specific factors not considered for operational relationship (equipment/technology, DC-AC ratio)
- AC over-sizing may compensate for the ~3% difference between preconstruction and operational PRs
- Outliers by 5-10% below regression (despite high availability) have poor PRs, suggesting equipment underperformance or poor O&M activities





DEGRADATION

- Degradation calculated as percent energy decrease after irradiance correction
- Projects with only four years of data showed a greater range of degradation rates due to a shorter assessment period.
- Early-year degradation rates are more uncertain, making them difficult to predict and analyze.
- System degradation rates may be greater than material-only impact





OEPR ANALYSIS

Approximately 50 Operational projects:

- Desert Southwest
- Canada
- South America
- India



Findings:

- Perceived underperformance sometimes due to optimistic PRs from some IEs (2% underperformance, or 2% over-prediction?)
- Key loss areas overlooked:
 - DC array performance loss (0.5-1.5%)
 - String-level mismatch (0.5%)
 - Snow loss under-prediction (up to 5-10%)
 - Plant operation of curtailment on string, inverter, or plant level
- Availability for well-maintained projects: 98-99%
- Annual degradation (system level) influenced by unresolved DC system failures



CONCLUSIONS

- Availability is within ~1% of pre-construction estimates
- AWST's pre-construction estimates align well with operational experience; however:
 - Pre-construction performance ratios may be 2-3% optimistic
 - Some modelers overlook DC factors, leading to ~2% over-prediction
- Degradation:
 - Is difficult to estimate until year 5
 - Exceeds material-only degradation estimates (despite inverter limitation loss reclamation)
- Pre-construction estimates can be improved by considering:
 - Undetected/unmitigated/unaccounted-for DC array issues
 - O&M service consistency/quality
 - Snow loss underprediction in certain climates
 - Long-term degradation on a system-level, accounting for:
 - Mismatch increase
 - Unresolved DC array issues





THANK YOU FOR YOUR TIME

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