

Optimizing the U.S. Energy Mix

Multi-Objective Decision Model

BQOM 2512: Advanced Decision Technology
Prof – Elena Rokou

Team Introduction



Azure Hsiao
MS Marketing & Business Analytics



Revati Wankhede
MS Management & Business Analytics



Timothy Liu
MS Marketing & Business Analytics

Today's Agenda

1. Project Case

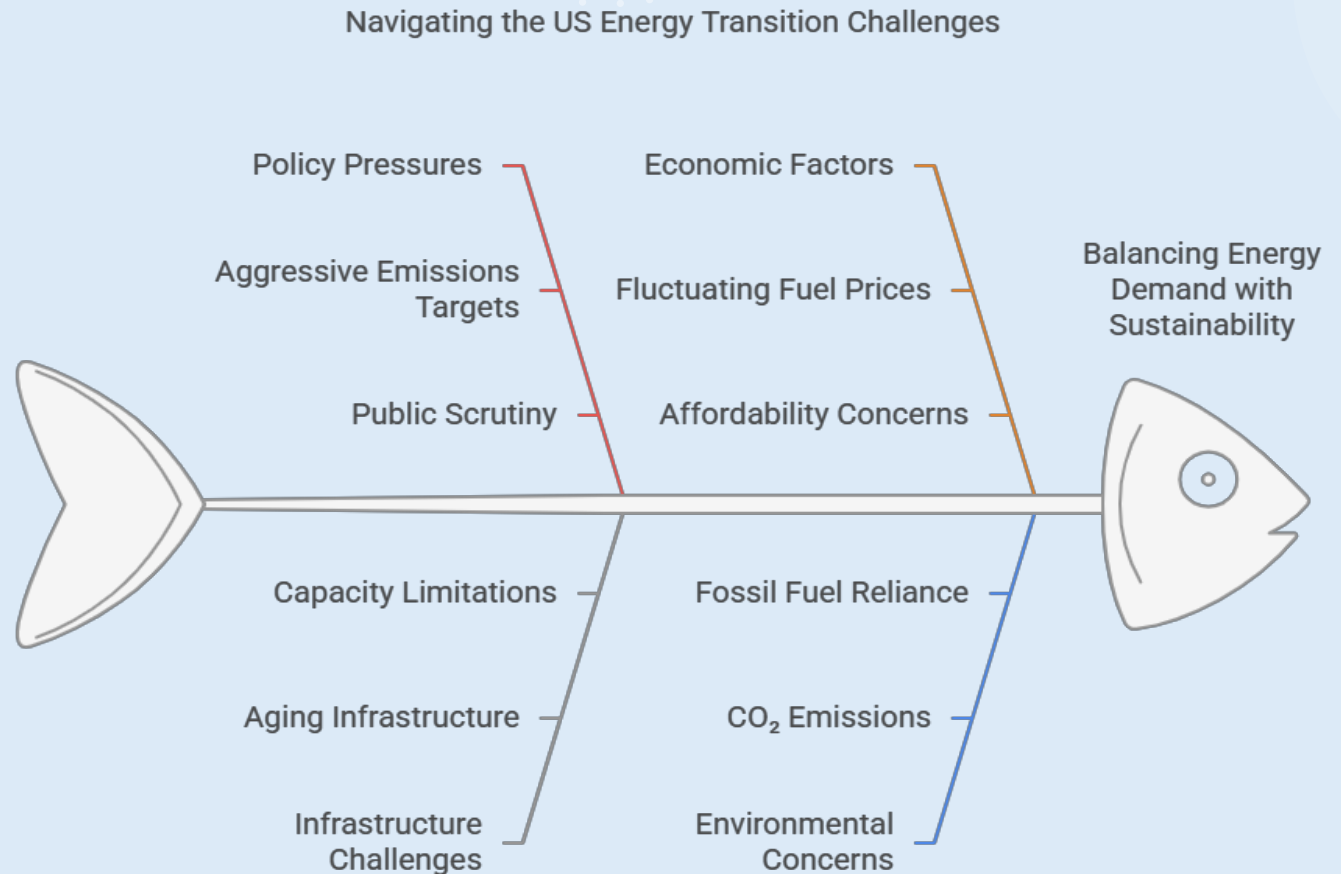
2. Methodology

3. Insights

4. Recommended Next Steps

Energy Landscape in the US

- The U.S. must meet a 1000 MWh electricity demand while balancing cost, reliability, and sustainability.
- Strict CO₂ caps (≤ 100 metric tons/year) and capacity constraints add pressure on planning.
- Utilities face volatile fuel costs, infrastructure challenges, and growing scrutiny of traditional energy sources.



Energy Landscape - Challenges

How do we strike the right balance between cost and reliability while staying within environmental and capacity limits?

- Instead of optimizing for just **cost** or **reliability**, we apply a **Pareto-based multi-objective approach**
- This method explores trade-offs to identify the **most balanced and practical energy mix**
- The goal is to support **real-world decision-making**—not rely on idealized assumptions

Problem Statement

The United States plans to meet a projected electricity demand of 1000 MWh using four generation sources: Solar, Wind, Nuclear, and Fossil. Each source differs in cost and reliability and is constrained by generation capacity and environmental policy. The goal is to determine the optimal mix that:

- **Minimizes total cost**
- **Maximizes overall reliability**

Subject to:

- A **CO₂ emissions cap** of 100 metric tons per year
- Source capacity limits
- Total generation must meet demand

Methodology - Pareto Multi-objective

- **Objective:**

Determine the optimal mix of energy sources (Solar, Wind, Nuclear, Fossil) to meet **1000 MWh demand**

- **Goals:**

Minimize total generation **cost**

Maximize overall **reliability**

- **Constraints:**

Emissions cap: ≤ 100 metric tons CO₂/year

- **Source capacity** limits

- **Total generation** must equal **1000 MWh**

Decision Variables

S: MWh from Solar

W: MWh from Wind

N: MWh from Nuclear

F: MWh from Fossil

Constraints

Total generation meets demand:

$$S+W+N+F=1000$$

Source capacity limits:

$$0 \leq S \leq 400, 0 \leq W \leq 400, 0 \leq N \leq 300, 0 \leq F \leq 1000$$

CO₂ emissions constraint (hard cap):

$$0.40F \leq 100$$

$$S, W, N, F, d1^-, d1^+, d2^-, d2^+, d3^-, d3^+ \geq 0$$

Objectives:

Objective 1: Minimize Total Cost

$$\text{Cost} = 50S + 52W + 100N + 40F$$

Objective 2: Maximize Reliability

$$\text{Reliability} = 0.25S + 0.35W + 0.95N + 0.90F / 1000$$

Single Objective Results – Minimizing Cost

| Source | DV | Cost (\$/MWh) | Emission (tons/MWh) | Reliability (%) | | Max Gen (MWh) |
|---------------|------|---------------|---------------------|-----------------|----|---------------|
| Solar (S) | 400 | 50 | 0 | 25% | <= | 400 |
| Wind (W) | 350 | 52 | 0 | 35% | | 400 |
| Nuclear (N) | 0 | 100 | 0 | 95% | | 300 |
| Fossil (F) | 250 | 40 | 0.4 | 90% | | 1000 |
| | | | | | | |
| Actual Amount | 1000 | 48200 | 100 | 45% | | |
| Limit | 1000 | Min | 100 | Max | | |
| | = | | <= | | | |

- **Cost: 48,200 (\$/MWh)**
- **Reliability: 45%**

- Due to the emissions constraint, the model limits fossil fuel usage to 250 MWh, even though it is cheap and reliable.

Single Objective Results – Maximizing Reliability

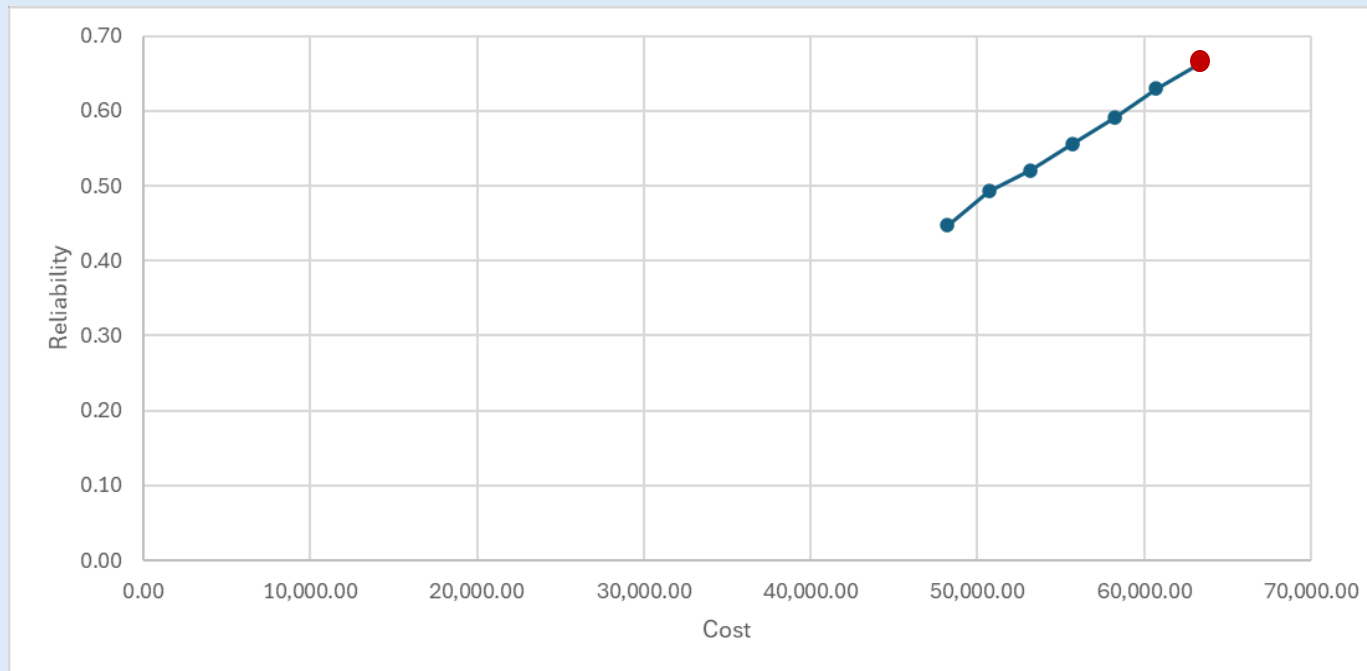
| Source | DV | Cost (\$/MWh) | Emission (tons/MWh) | Reliability (%) | | Max Gen (MWh) |
|---------------|------|---------------|---------------------|-----------------|----|---------------|
| Solar (S) | 50 | 50 | 0 | 25% | <= | 400 |
| Wind (W) | 400 | 52 | 0 | 35% | | 400 |
| Nuclear (N) | 300 | 100 | 0 | 95% | | 300 |
| Fossil (F) | 250 | 40 | 0.4 | 90% | | 1000 |
| Actual Amount | 1000 | 63300 | 100 | 66% | | |
| Limit | 1000 | Min | 100 | Max | | |
| | = | | <= | | | |

- **Cost: 63,300 (\$/MWh)**
- **Reliability: 66%**

- To increase reliability, the model leans more on **nuclear energy**, which is **expensive but highly reliable**.

Pareto: Trade-off Analysis

- For each point, we solve the model again using **constraint adjustment**, generating a set of **non-dominated solutions**



| Cost | Reliability |
|-----------|-------------|
| 48,200.00 | 0.45 |
| 50,700.00 | 0.49 |
| 53,200.00 | 0.52 |
| 55,700.00 | 0.56 |
| 58,200.00 | 0.59 |
| 60,700.00 | 0.63 |
| 63,300.00 | 0.66 |

Recommendations



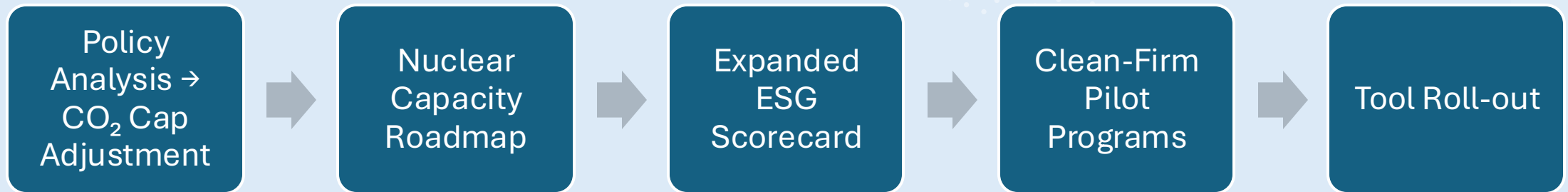
When reliability drops below 90%, it's not just a number. It means blackouts, disruptions, and real-world consequences for families, hospitals, and businesses.



To build a grid that's both resilient and responsible, we must rethink limits, unlock cleaner firm power, and adapt our planning in real time.

| Problems | Recommendations |
|---|--|
| Current 100 t CO ₂ cap holds fleet reliability at ~66 %, well below the 90 % target. | Raise the CO ₂ cap to enable greater fossil fuel use, boosting firm generation and improving reliability. |
| Baseload gap: existing 300 MWh nuclear ceiling limits zero-carbon, high-reliability supply. | Invest in nuclear generation, raising the maximum generation limit. |
| Reliability penalty for staying under the cap: grid lacks clean-firm resources that can replace fossil peakers. | Invest in complementary “clean-firm” solutions: long-duration storage and demand response. |

Next Steps



- **Policy Analysis → CO₂ Cap Adjustment:** Reassess the 100 t CO₂ cap based on system reliability needs; explore how raising the cap could enable limited fossil generation to prevent blackouts.
- **Nuclear Roadmap:** Evaluate options to raise the 300 MWh nuclear ceiling via uprates or SMR deployment to expand carbon-free, high-reliability baseload.
- **Expanded ESG Scorecard → Clean-Firm Pilots:** Integrate broader sustainability metrics (land, water, waste, jobs); launch long-duration storage and demand-response pilots to increase reliability without added emissions.
- **Tool Roll-out:** Launch a cloud-based tool that helps DOE and EIA teams re-optimize the generation plan every quarter—adjusting to real-world shifts in prices, emissions limits, and available technologies.

Questions

Appendix

Data Sources:

- [2025 Sustainable Energy in America Factbook](#)
- [U.S. Renewable Energy Factsheet | Center for Sustainable Systems](#)
- [Electric power sector CO2 emissions drop as generation mix shifts from coal to natural gas - U.S. Energy Information Administration \(EIA\)](#)
- [Nuclear Energy Factsheet | Center for Sustainable Systems](#)
- [Cost of electricity by source - Wikipedia](#)
- [2019 Electricity ATB - Natural Gas Plants](#)