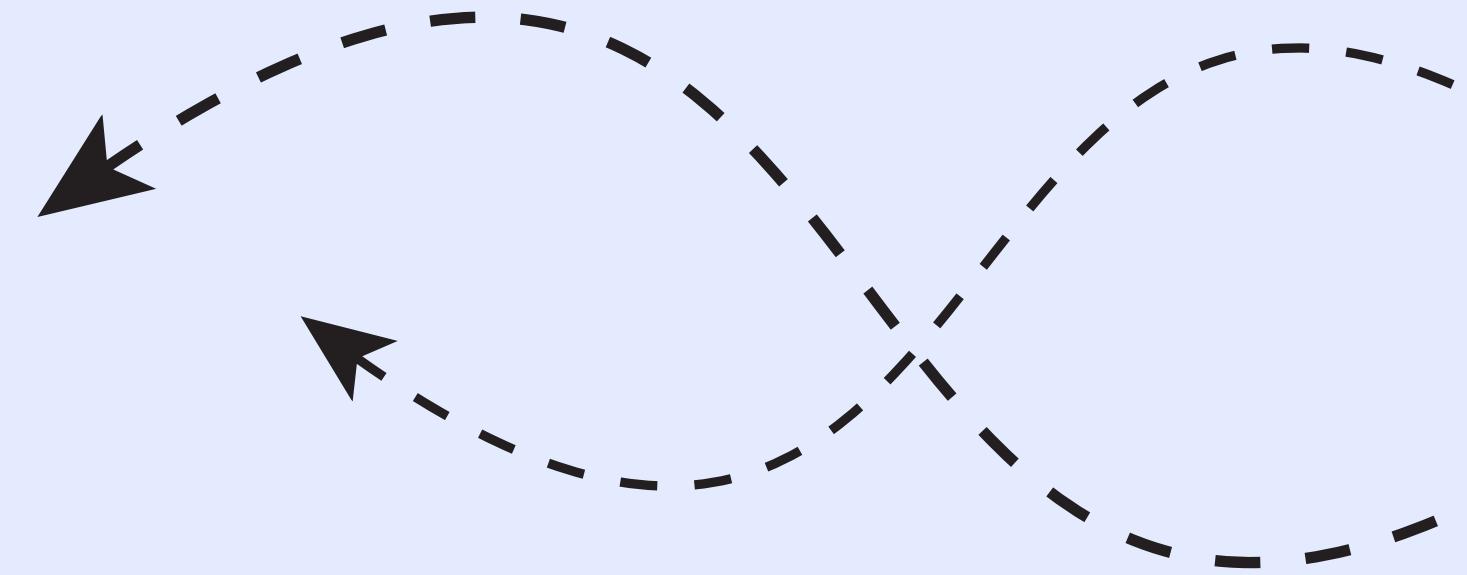
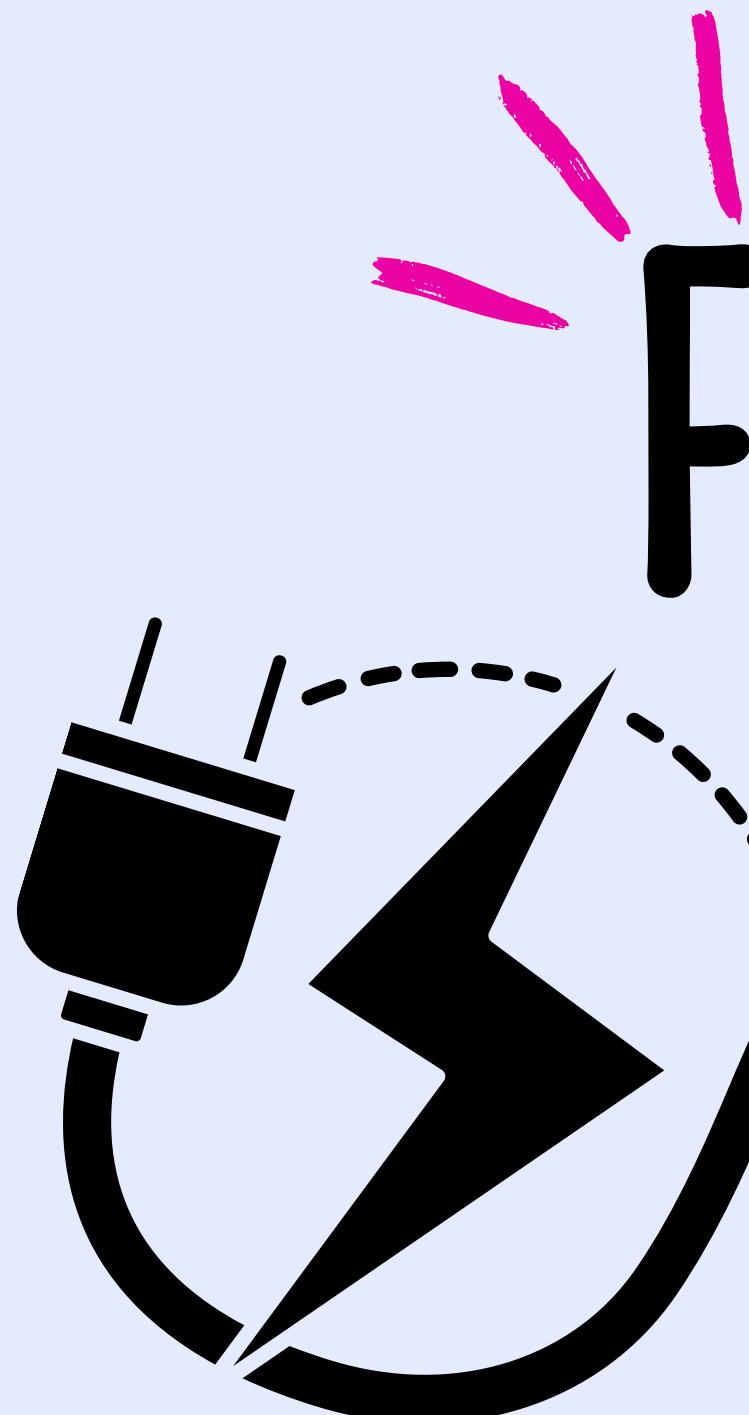


Arohi Shiraskar
Parinita Vashistha

Forecasting STRATEGISTS

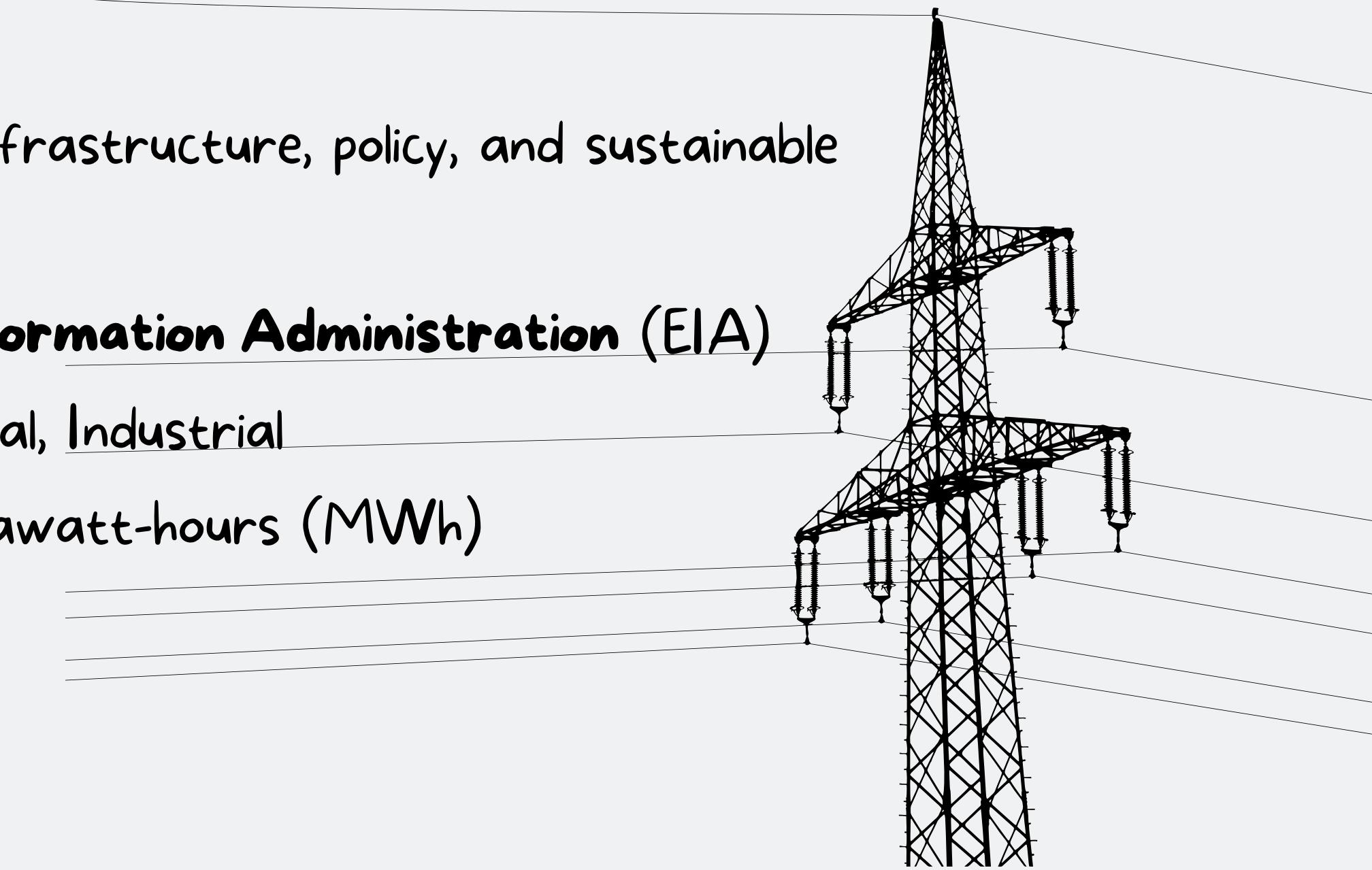
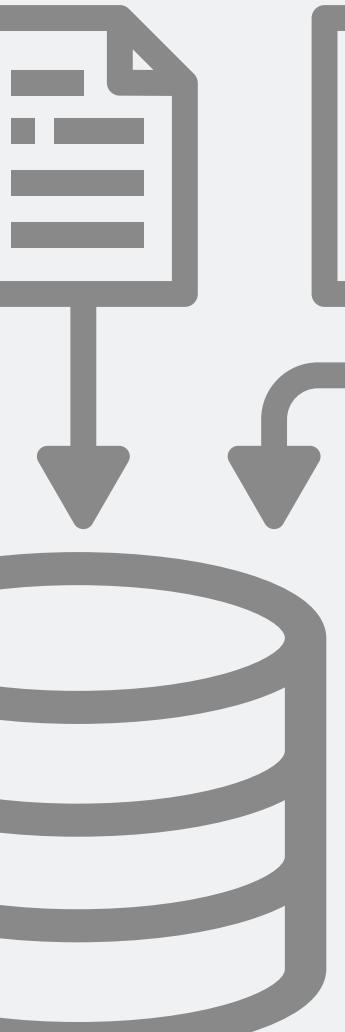
-- Electricity Forecasting Using Time Series --



INTRODUCTION

PROJECT OBJECTIVE & DATA SOURCE

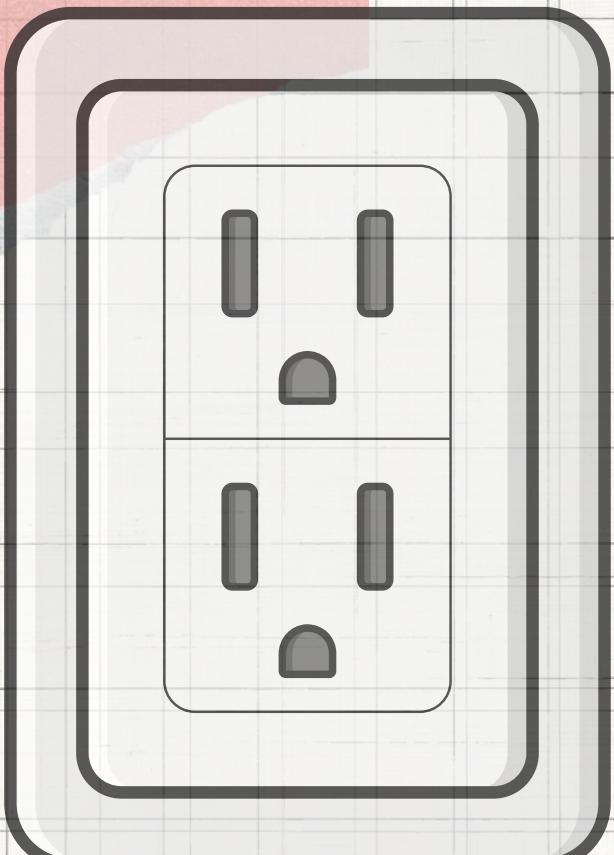
- Goal: Forecast monthly electricity sales by sector and state for the year 2025-2026
- Why it matters: Helps with infrastructure, policy, and sustainable energy planning
- Data Source: U.S. Energy Information Administration (EIA)
- Sectors: Residential, Commercial, Industrial
- Units: Sales measured in Megawatt-hours (MWh)



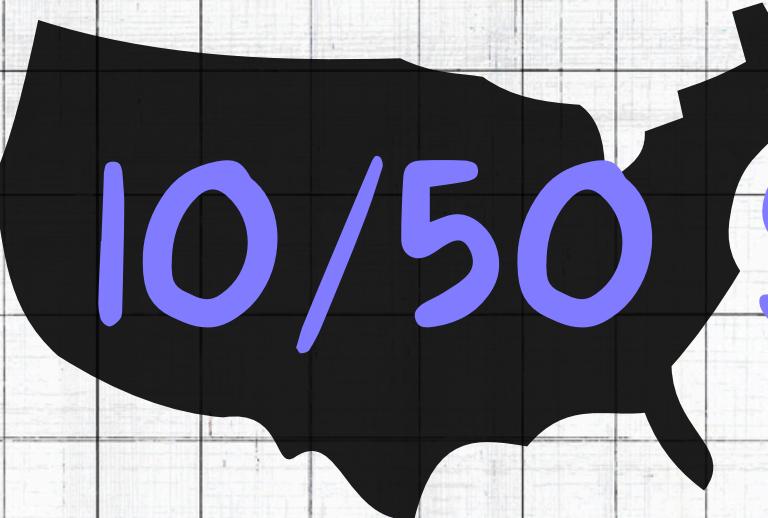
Data Processing



- Filtered time range: 2010–2025 → 2021–2024 (recent trends only)
- Dropped sectors with heavy nulls (e.g., Transportation)
- Focused on sales data — a direct measure of energy demand
- Kept 3 clean sectors: Residential, Commercial, Industrial
- Selected 10 key states:
 - 5 high-growth (e.g., New Mexico, Nevada)
 - 5 low-growth (e.g., Massachusetts, Minnesota)
- Excluded 2025 from training; used only for **forecast validation**



Selecting 10/50 States



States
with
Growing
Sales

- New Mexico (NM)
- Nevada (NV)
- Oklahoma (OK)
- Arizona (AZ)
- North Dakota (ND)

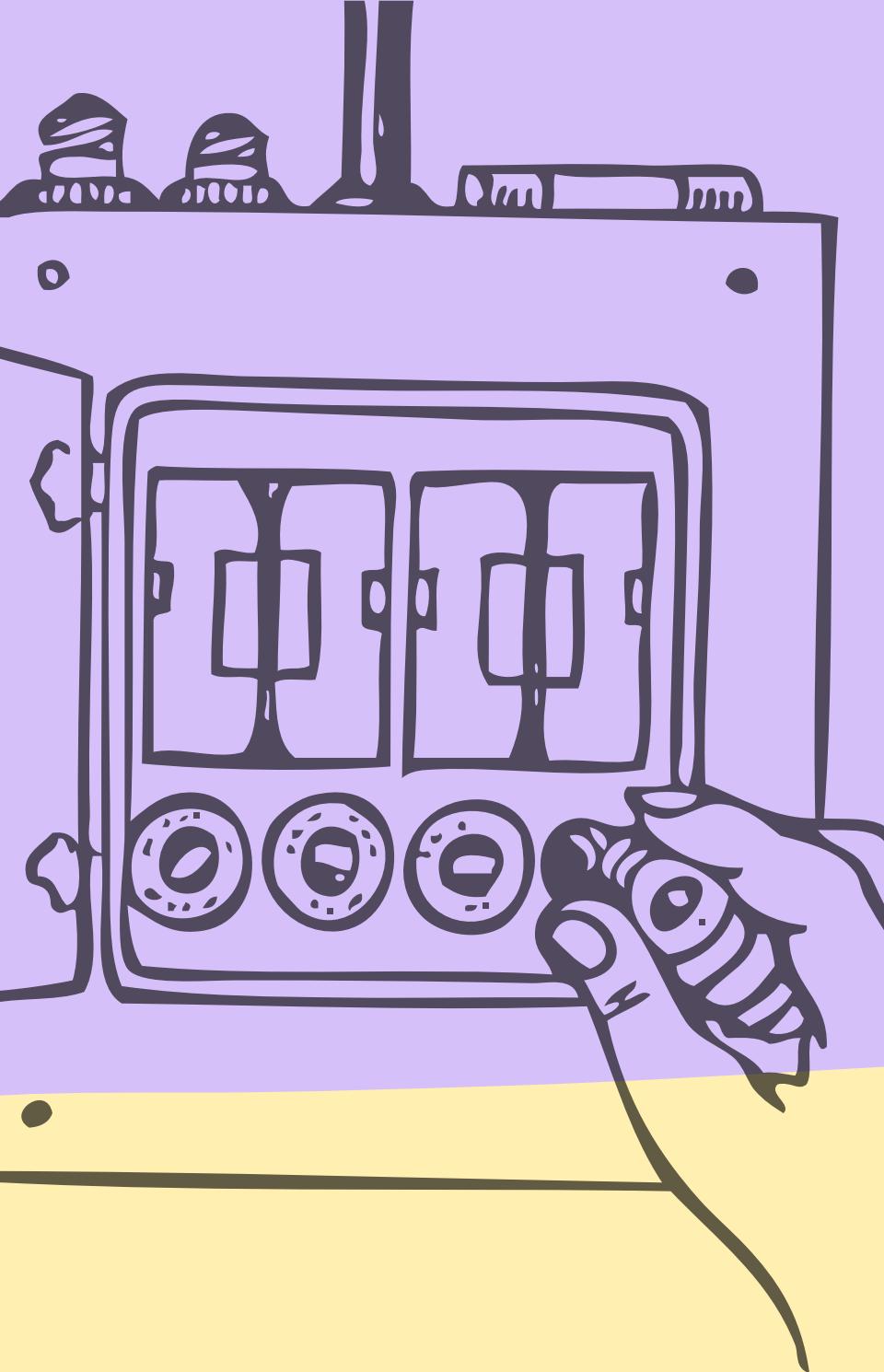
Why?

- This contrast helps highlight **emerging vs. underperforming** markets
- Reduces model and visual noise to interpret trends clearly

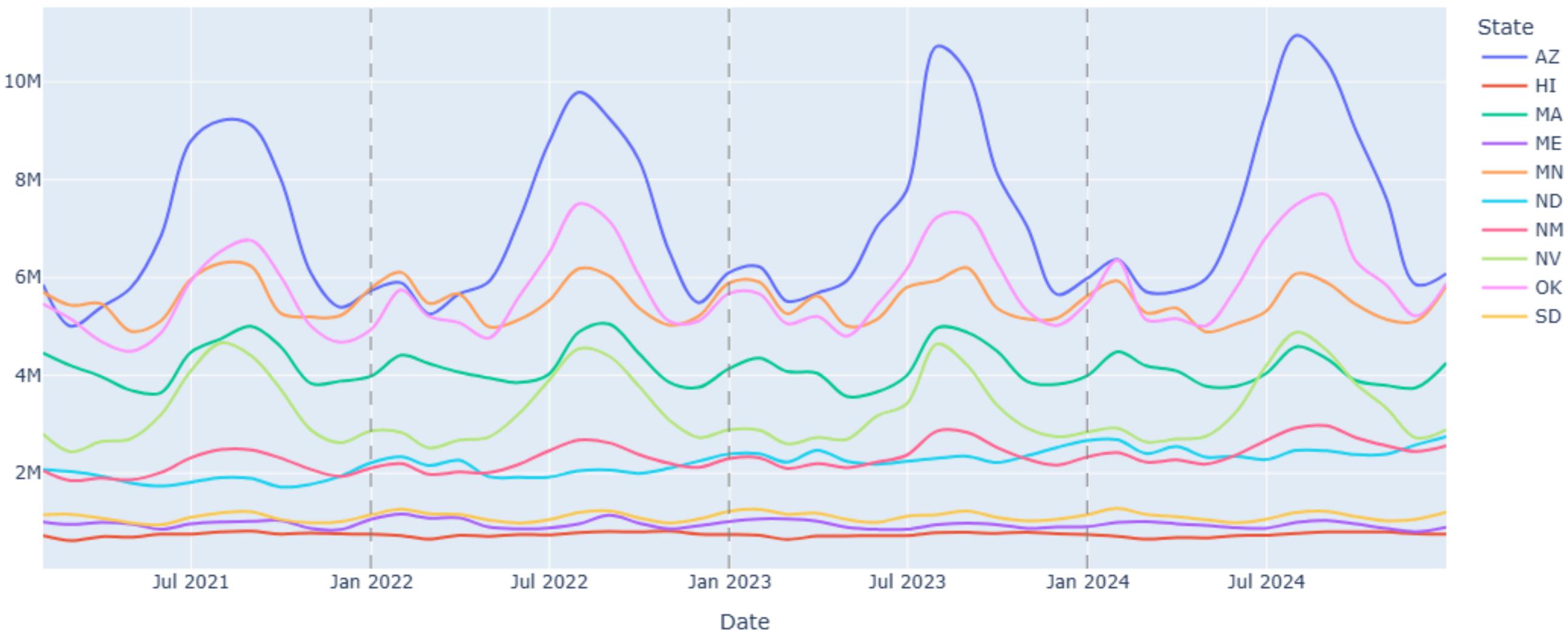
States
with
declining
sales

- Massachusetts (MA)
- Minnesota (MN)
- Maine (ME)
- Hawaii (HI)
- South Dakota (SD)

Trends from 2021-2024



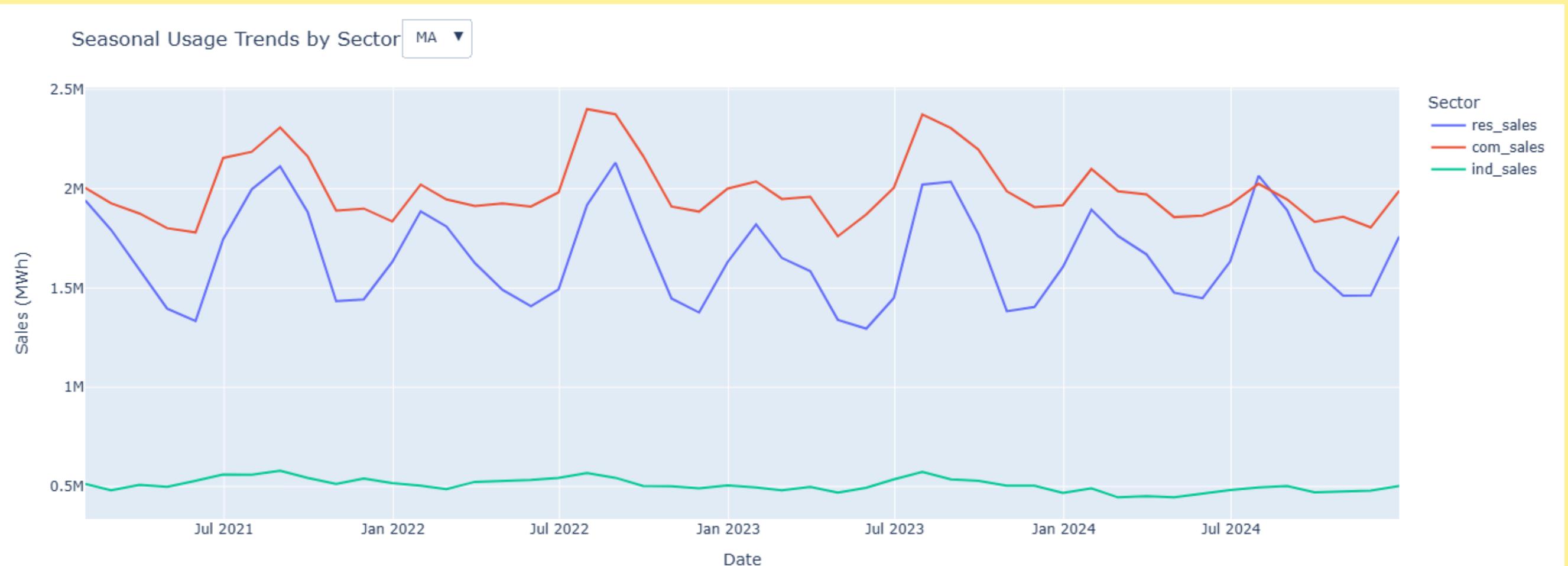
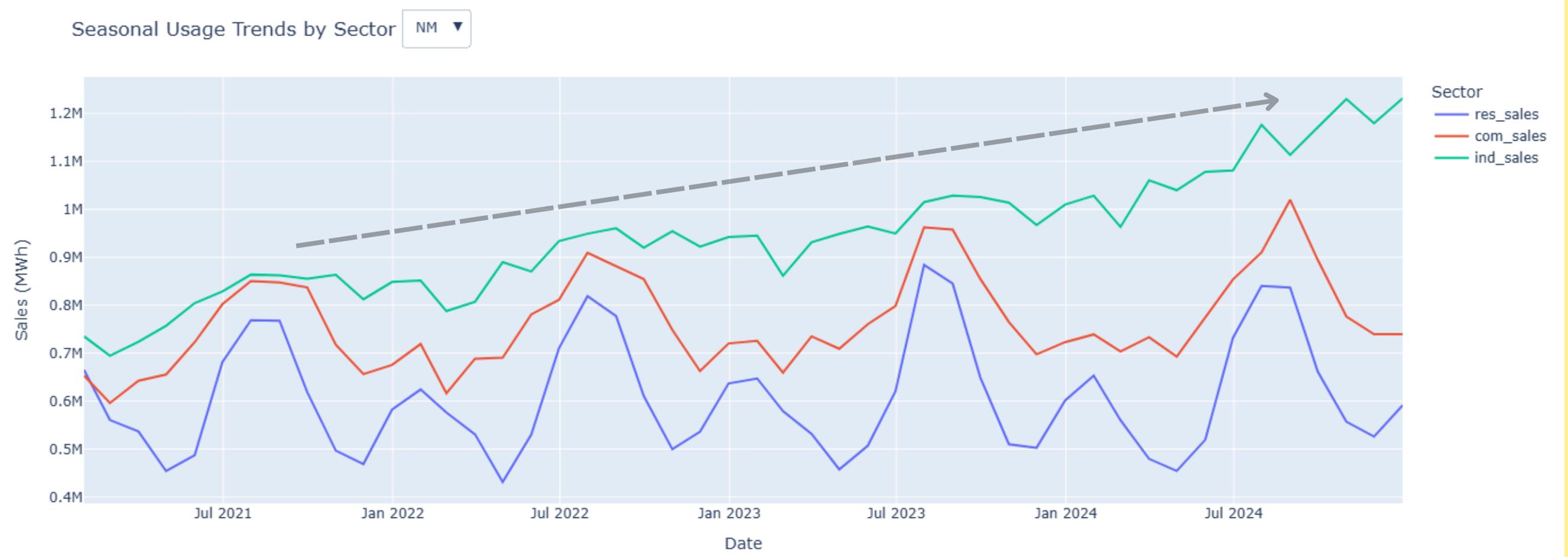
Total Sales Over Time



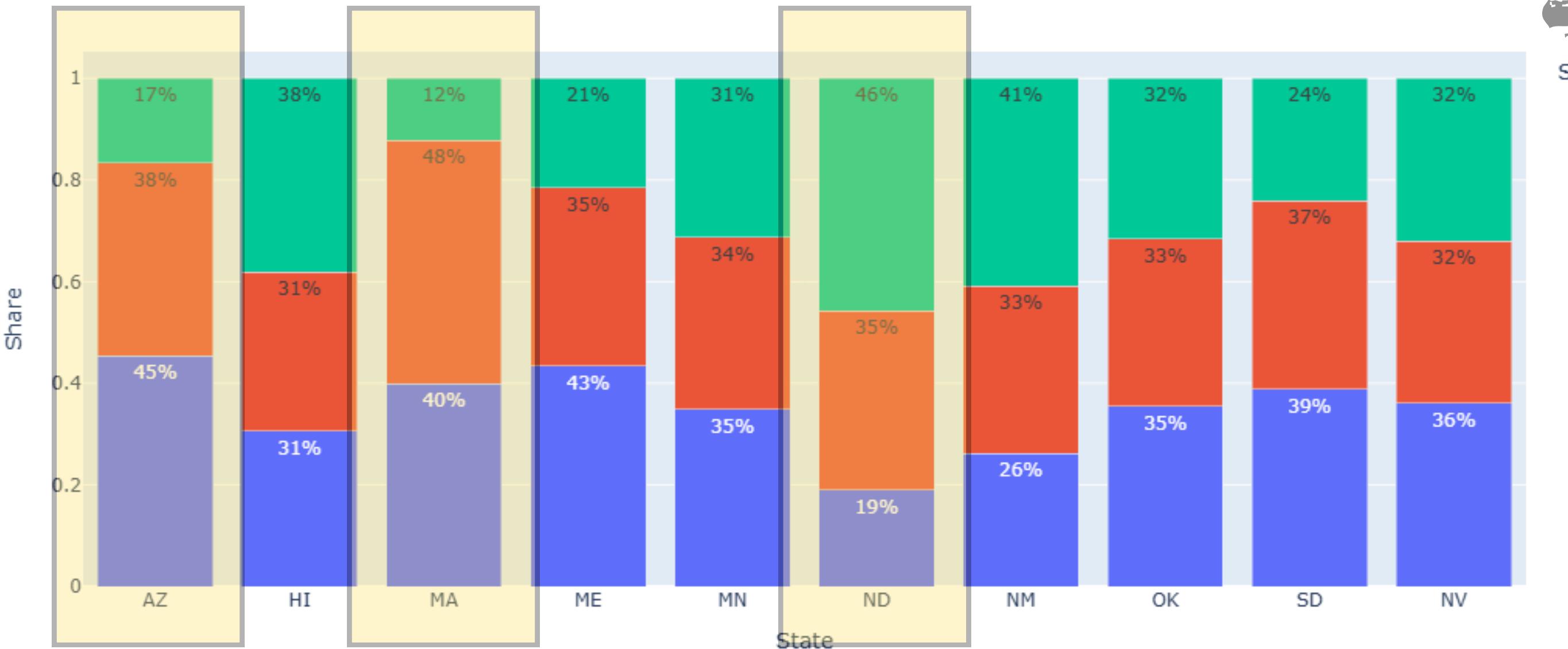
- The selected states show a **balanced** representation — both high-demand and low-demand — useful for making generalizable forecasts.
- Clear **seasonal peaks** are visible mid-year (typically summer)
- Arizona (AZ) and Oklahoma (OK) **consistently** have higher sales
- South Dakota (SD) and Maine(ME) maintain lower, **flatter curves**

Key Highlights

- New Mexico's energy market is **growing steadily** across all sectors
- Commercial and industrial demand in NM shows **consistent upward trends.**
- Massachusetts sees strong seasonal residential and commercial usage, but **growth is flat**
- Industrial sales in MA remain low, suggesting limited expansion in that sector



Sector Dependence Per State



- Arizona (AZ) shows high residential demand (45%), pointing to strong consumer usage
- Massachusetts (MA) has a **dominant commercial share** (48%), reflecting business-driven consumption
- North Dakota (ND) leads in **industrial usage** (46%), signaling a manufacturing-heavy economy
- These states show distinct sector focus, unlike others with more balanced splits
- Remaining states share a common trend of residential and commercial interdependence

Time Series Forecasting with Prophet

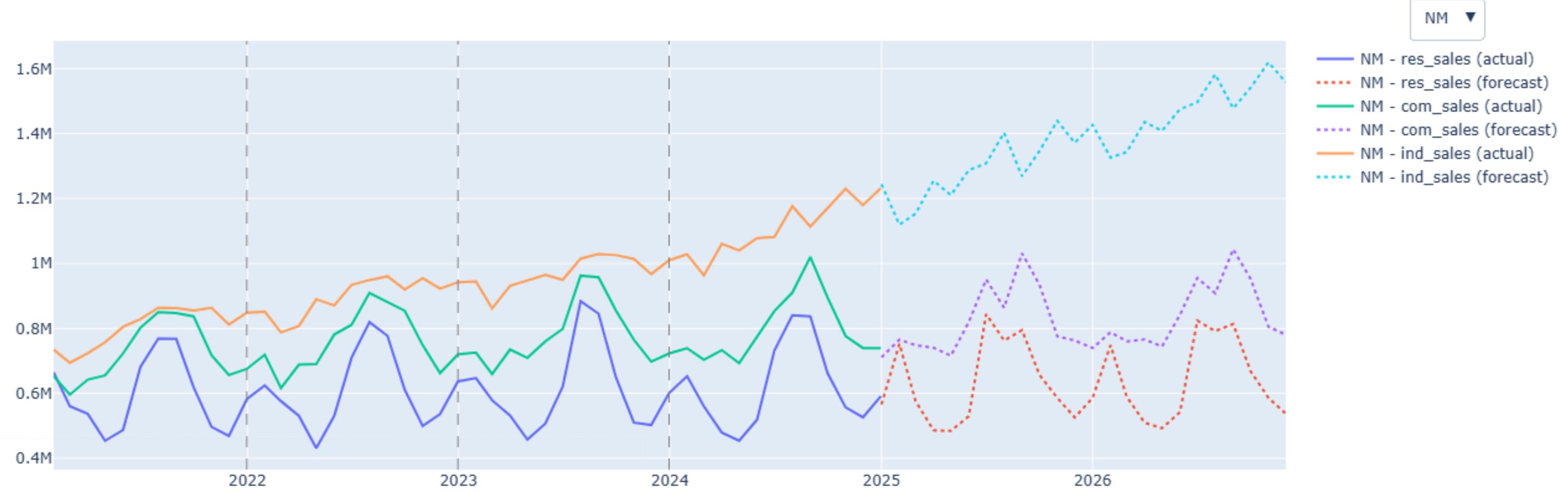
- Used **Prophet** to model electricity sales for each sector and state.
- Focused on monthly predictions for 2025-2026 (24 months).
- Trained using historical data from 2021 to 2024.
- Automatically handled trends and seasonality patterns.
- Forecasted each sector (**Residential, Commercial, Industrial**) separately.

```
model =  
Prophet(yearly_seasonality=  
True,  
weekly_seasonality=False,  
daily_seasonality=False)
```

Forecasting Accuracy

- Compared model predictions with real January 2025 data.
- Mean Absolute Error (MAE): ~78143.80
 - On average, our predictions were off by around 78,000 units.
- Mean Absolute Percentage Error (MAPE): 5.71%
 - Our predictions were off by only 5.71% from the actual values.
- Errors remain reasonable given the scale (sales in millions).
- Low error confirms the model captured seasonal trends effectively

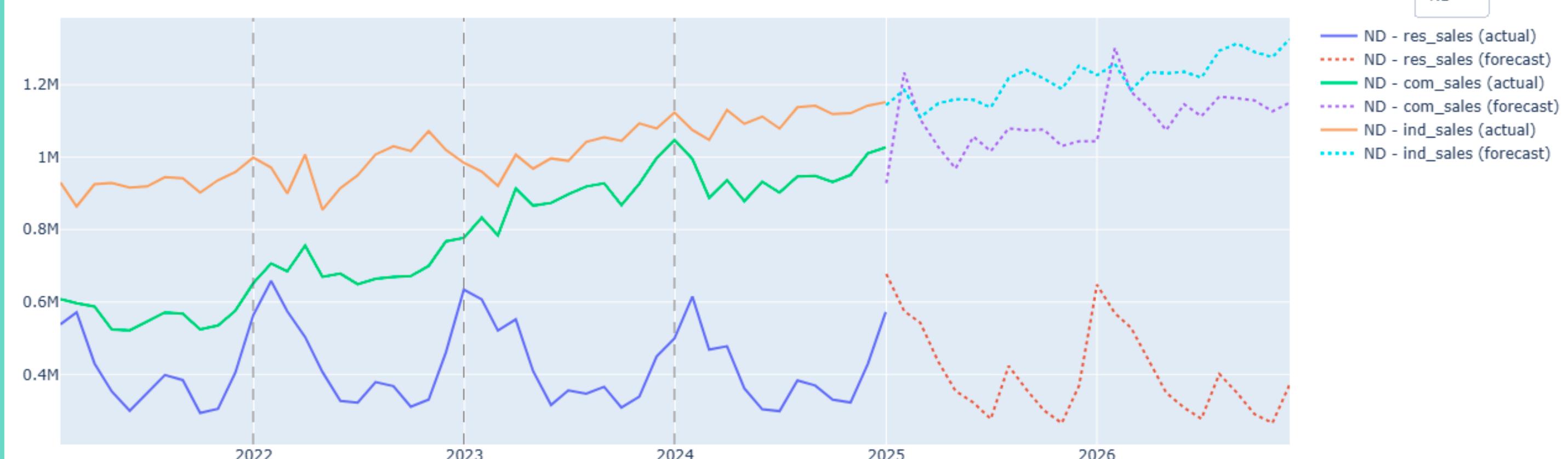
Sector-wise Energy Usage and Forecast – NM



PAST + FUTURE SALES FORECAST

- Forecasted sales are rising in New Mexico and North Dakota
- Commercial and industrial sectors show the most growth

Sector-wise Energy Usage and Forecast – ND



- Residential sales remain steady with seasonal patterns
- New Mexico shows sharper industrial growth than North Dakota
- Commercial sales increase steadily in both states

Conclusion And Strategies



Growth Observed



- New Mexico and North Dakota show steady increases in the **commercial and industrial** sectors.
- This suggests expanding business activity and infrastructure development in these states.
- **Residential sales remain stable** across all states, indicating consistent consumer demand across all states.

Stagnation & Decline



- States like Massachusetts and South Dakota exhibit flat or declining sales.
- Industrial usage in Massachusetts remains low, hinting at limited manufacturing growth.
- These regions may face challenges from efficiency upgrades or population shifts.

For Business & policymakers:

- Invest in industrial capacity in **high-growth states** (e.g., New Mexico), where manufacturing and commercial activity are rising.
- Offer targeted incentives to commercial and industrial clients to lock in long-term contracts.
- In declining markets, reallocate infrastructure investments or pivot to green and **renewable energy** initiatives.

