

Walmart Sales Forecasting & Time Series Analysis

Predicting Weekly Sales Using Machine Learning

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Research Question:

- Can we accurately forecast weekly sales for Walmart stores using historical data?

Why This Matters:

- Accurate forecasting enables better inventory management
- Reduces stockouts and overstock costs
- Informs staffing and operational decisions
- Critical for retail business planning

Project Goals:

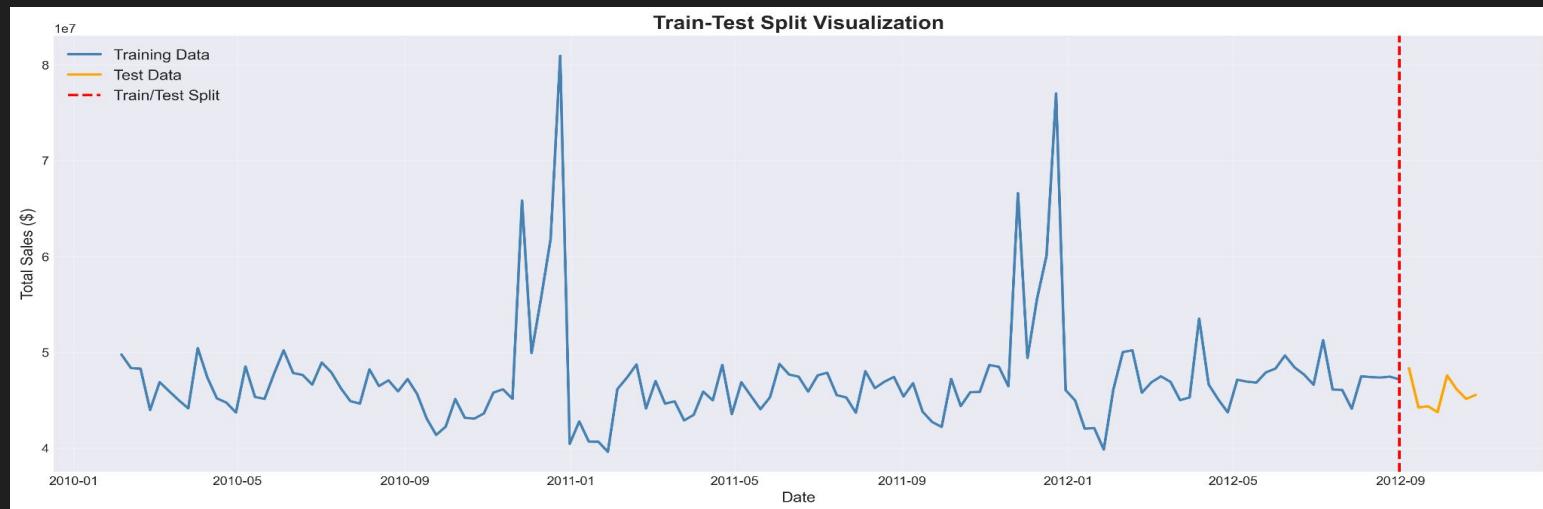
- Analyze sales patterns and seasonality
- Build and compare multiple forecasting models
- Generate actionable 4-week ahead predictions
- Achieve forecast accuracy under 5% error

DATA SOURCES

- Walmart sales data (2010-2012):
<https://www.kaggle.com/competitions/walmart-recruiting-store-sales-forecasting/data?select=train.csv.zip>
- Size: 421,570 weekly sales records
- Scope: 45 stores, 81 departments
- Time Period: 143 weeks (Feb 2010 - Oct 2012)

METHODOLOGY

1. Exploratory Analysis - Identified patterns, seasonality, trends
2. Train/Test Split - 135 weeks training, 8 weeks testing
3. Model Building - Tested 3 forecasting approaches
4. Evaluation - Compared using MAPE, MAE, RMSE
5. Future Forecast - Generated 4-week predictions



KEY FINDINGS

Sales Patterns:

- Average weekly sales: \$15,981
- Clear upward trend over time
- High variance between stores

Strong Seasonality:

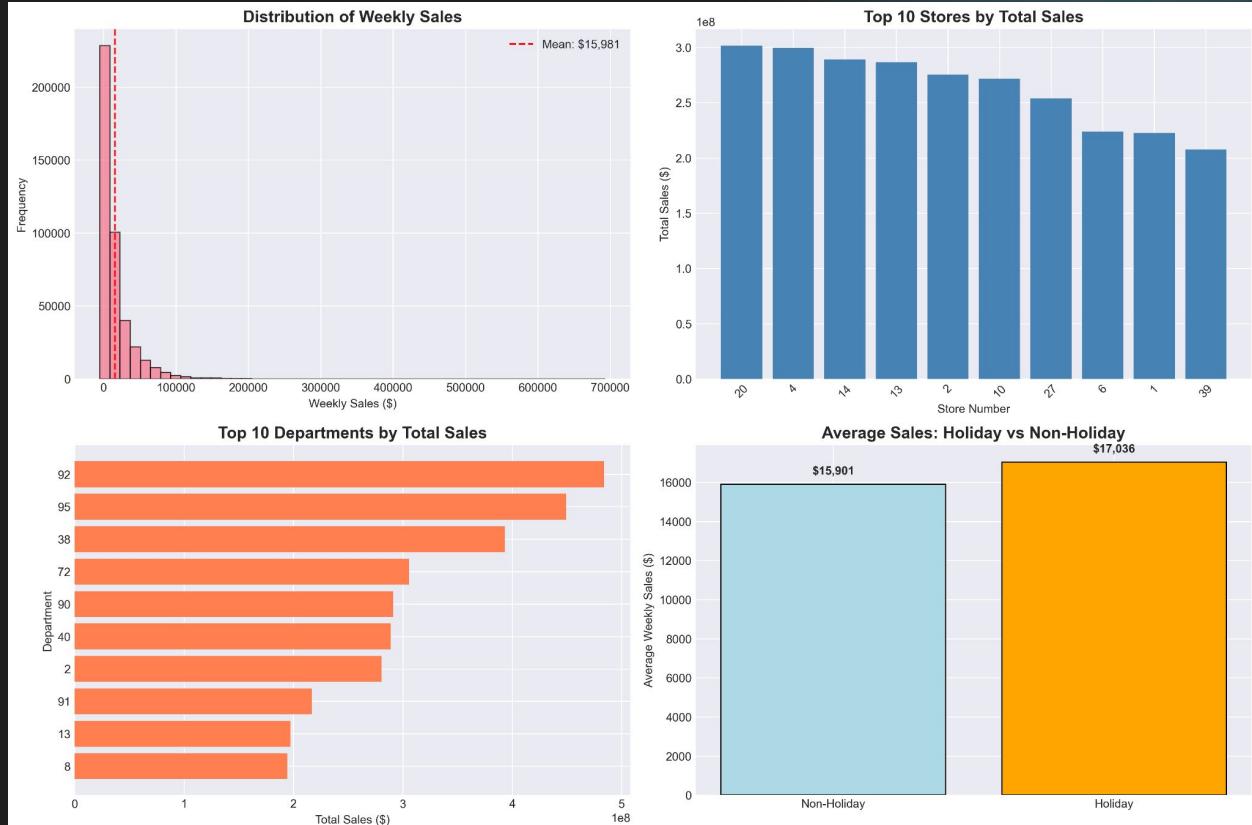
- December highest sales month
- Q4 outperforms other quarters
- Holiday weeks boost sales by 7.1%

Store Performance:

- Top store: \$301M total sales
- Significant variation across locations
- Top 5 stores drive 30% of revenue

Holiday Impact:

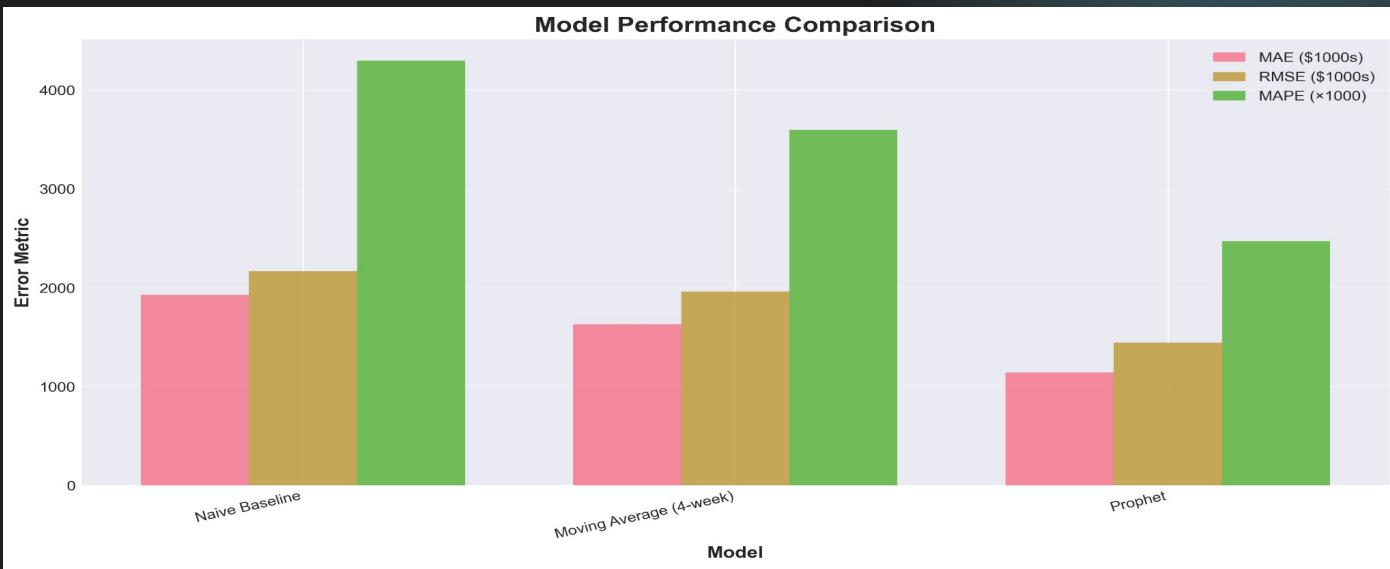
- Sales spike during Thanksgiving/Christmas
- Holiday weeks: 7% of dataset
- Account for 10%+ of total sales



FORECASTING MODELS & RESULTS

Prophet Model Achieved
2.47% Error

- Predictions off by only 2.47% on average
- Captures seasonal patterns effectively
- Significantly outperforms simple baselines
- Suitable for business planning and decision-making



Model	Description	MAPE	Performance
Naive Baseline	Uses last known value	4.30%	Baseline
Moving Average	4-week rolling average	3.59%	16% improvement
Prophet	Facebook ML algorithm	2.47%	42% improvement

PROPHET MODEL PERFORMANCE

Why Prophet Performed Best:

- Automatically detects seasonality patterns
- Handles holiday effects
- Adapts to trend changes
- Provides uncertainty intervals

Model Accuracy:

- Mean Absolute Error: \$1.14M
- Root Mean Squared Error: \$1.44M
- Mean Absolute Percentage Error: 2.47%



FORECASTING MODELS & RESULTS

Forecast shows expected seasonal increase

- Sales rising into holiday season (Nov/Dec)
- Consistent with historical patterns
- Confidence intervals allow risk assessment



Week	Date	Predicted Sales	95% Confidence Interval
1	Oct 28, 2012	\$45.1M	±\$4.3M
2	Nov 04, 2012	\$47.3M	±\$4.5M
3	Nov 11, 2012	\$50.2M	±\$4.3M
4	Nov 18, 2012	\$52.4M	±\$4.4M

Conclusions and Recommendations

Main Conclusions:

Strong seasonal patterns drive sales variability

- Q4 and December show highest performance
- Holiday weeks critical for revenue

Prophet model delivers accurate forecasts

- 2.47% error rate suitable for business use
- 42% improvement over naive baseline
- Captures complex seasonal patterns

Significant store-level variation

- Top performers drive disproportionate revenue
- Suggests opportunity for targeted strategies

Recommendations:

- Inventory Planning: Use forecasts for 4-week ahead stock optimization
- Staffing Decisions: Align workforce with predicted demand peaks
- Promotional Timing: Leverage holiday boost patterns
- Store Strategy: Apply best practices from top performers to lagging stores

Future Enhancements:

- Store-level individual forecasts
- Incorporate external factors (weather, competition, promotions)
- Real-time model updates as new data arrives

Thank you!

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