

ASTRAZENECA CASH FLOW FORECASTING

Intelligent Cash Flow Prediction | ARIMA Model | December 21, 2025

COUNTRIES

8

Entities Analyzed

DATA PERIOD

44 Weeks

Jan - Nov 2025

NET CASH FLOW

\$-4.2M

Total (All Countries)

BEST MODEL: ARIMA

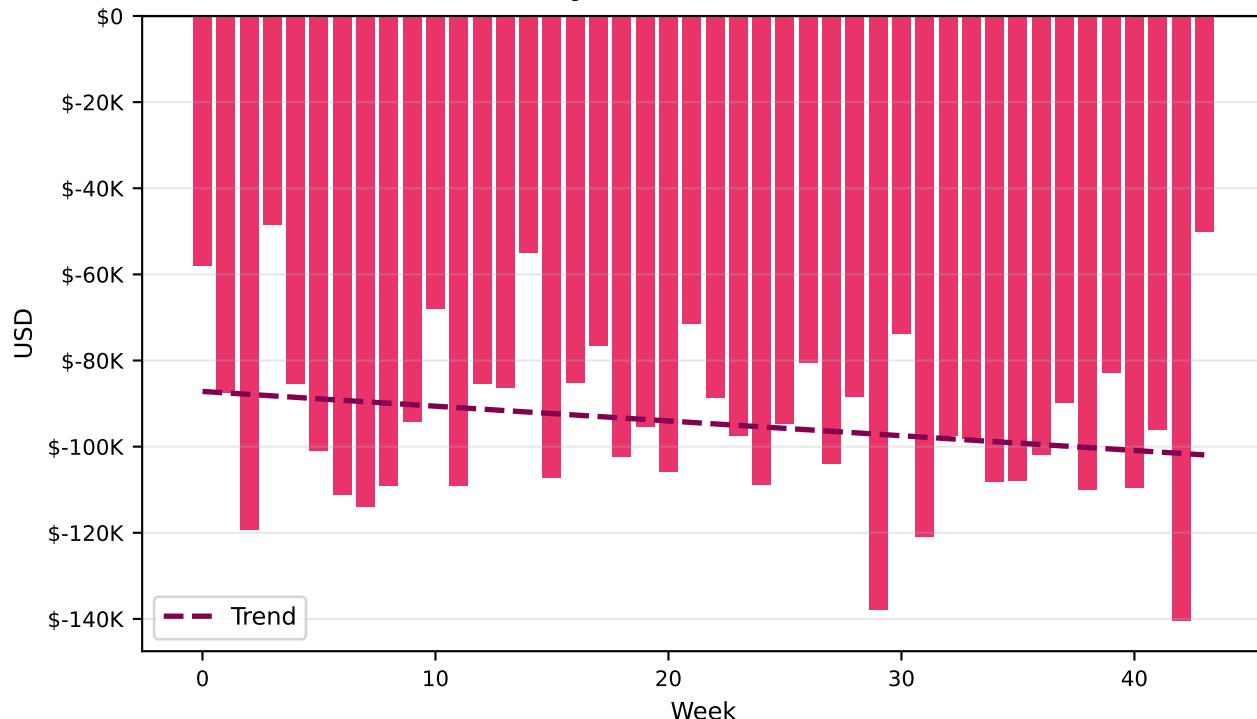
Avg MAPE: 58.1%

Best: ID (12.8%)

Structural Anomalies: 16

Transaction Anomalies: 1,869

Weekly Net Cash Flow Trend



PROJECT SUMMARY

DATA SCOPE

Weeks: 44
Countries: 8
Transactions: 84,528

MODELS EVALUATED

- ARIMA (Winner)
- Prophet
- Naive Baseline

ANALYSIS

- Time Series Forecasting
- Anomaly Detection
- Model Backtesting

OUTPUTS

- 1-Month Forecasts
- 6-Month Projections
- Risk Alerts

METHODOLOGY & DATA PIPELINE

5-Phase Approach: Data → Features → Models → Forecasts → Anomalies

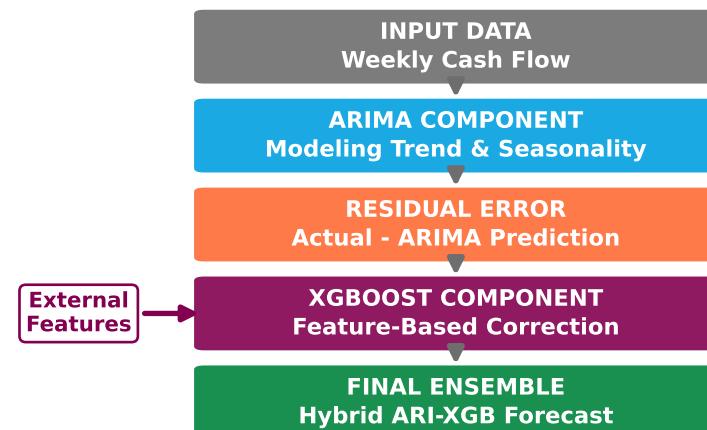


| Phase | Task | Output | Details |
|---------|---------------------|----------------------------|-----------------------------|
| Phase 1 | Data Preprocessing | 84,528 txns → 352 weekly | 44 weeks 8 countries |
| Phase 2 | Feature Engineering | 6 features created | Lag 1,2,4 Roll Mean/Std |
| Phase 3 | Hybrid Training | ARIMA(1,1,1) + XGBoost | 4-week validation holdout |
| Phase 4 | Anomaly Detection | Z-score + Isolation Forest | 16 struct 1,869 txn flags |
| Phase 5 | Production Forecast | 1m & 6m predictions | 95% CI Weekly refresh |

FEATURE ENGINEERING

| Feature | Definition | Purpose | Importance |
|----------------|-------------------|-----------------|------------|
| Lag_1 | 1-week ago | Recent trend | ★★★ |
| Lag_2 | 2-weeks ago | Bi-weekly cycle | ★★☆ |
| Lag_4 | 4-weeks ago | Monthly pattern | ★★☆ |
| Roll_Mean_4w | 4-week avg | Baseline level | ★★☆ |
| Roll_Std_4w | 4-week volatility | Risk indicator | ★★☆ |
| Implied_Invest | Derived CF | Balance check | ★☆☆ |

HYBRID MODEL ARCHITECTURE



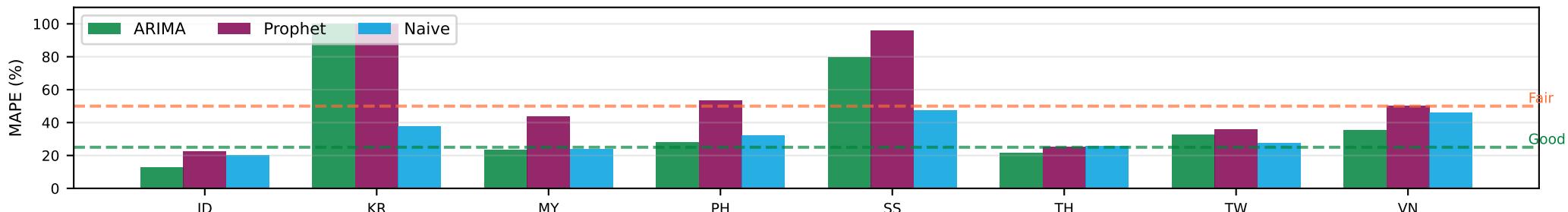
MODEL SELECTION RATIONALE & COMPARISON

Why Hybrid ARIMA Was Chosen | 4-Week Backtesting Validation

MODEL RECOMMENDATION BY COUNTRY

| Country | ARIMA | Prophet | Recommend | Risk |
|---------|--------|---------|-----------|--------|
| ID | 12.8% | 22.3% | ARIMA | Low |
| KR | 231.6% | 107.1% | Prophet | High |
| MY | 23.5% | 43.8% | ARIMA | Low |
| PH | 28.2% | 53.5% | ARIMA | Low |
| SS | 79.5% | 96.0% | ARIMA | High |
| TH | 21.5% | 25.2% | ARIMA | Low |
| TW | 32.7% | 35.7% | ARIMA | Medium |
| VN | 35.3% | 49.9% | ARIMA | Medium |

MAPE COMPARISON BY COUNTRY



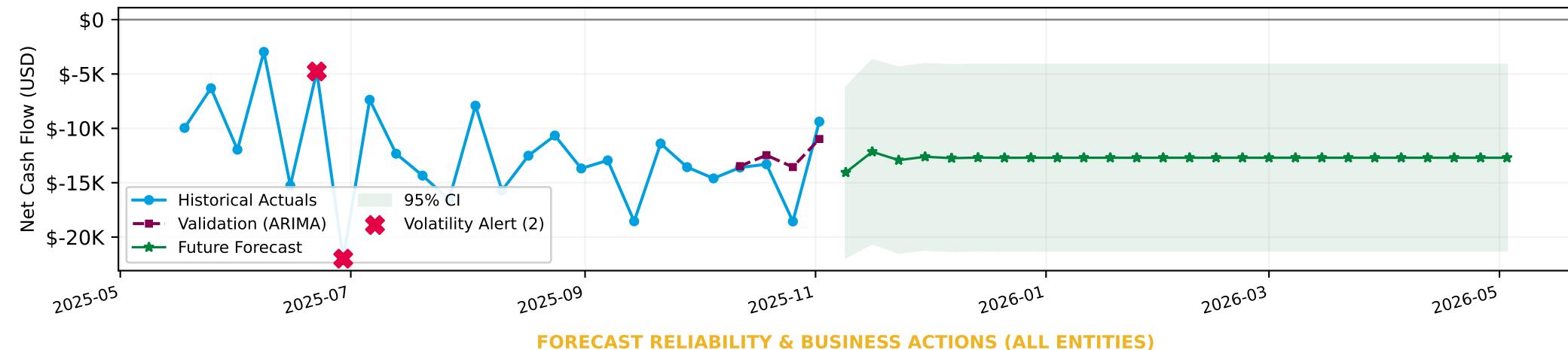
DETAILED MODEL PERFORMANCE METRICS

| Country | RMSE | MAE | ARIMA | Prophet | Naive | Winner | Status |
|---------|---------|---------|--------|---------|-------|--------|--------|
| ID | \$2,660 | \$1,890 | 12.8% | 22.3% | 20.1% | ARIMA | Good |
| KR | \$6,554 | \$6,015 | 231.6% | 107.1% | 37.9% | Naive | Review |
| MY | \$1,923 | \$1,646 | 23.5% | 43.8% | 23.9% | ARIMA | Good |
| PH | \$3,411 | \$3,064 | 28.2% | 53.5% | 32.1% | ARIMA | Good |
| SS | \$881 | \$723 | 79.5% | 96.0% | 47.1% | Naive | Review |
| TH | \$2,102 | \$1,610 | 21.5% | 25.2% | 25.8% | ARIMA | Good |
| TW | \$8,100 | \$6,988 | 32.7% | 35.7% | 27.5% | Naive | Fair |
| VN | \$6,281 | \$5,099 | 35.3% | 49.9% | 45.8% | ARIMA | Fair |

FORECAST RESULTS & SPOTLIGHT: ID (INDONESIA)

Best Country Highlight | 6-Month Robust Forecast | Global Summary

ID (INDONESIA) - TREASURY FLOW PERFORMANCE SPOTLIGHT



| Country | MAPE | Confidence | Action Protocol | Status |
|---------|--------|------------|-----------------|---------------|
| ID | 12.8% | HIGH | Full Planning | Forecast OK |
| KR | 231.6% | LOW | Ad-hoc Review | Use Carefully |
| MY | 23.5% | HIGH | Full Planning | Forecast OK |
| PH | 28.2% | HIGH | Full Planning | Forecast OK |
| SS | 79.5% | LOW | Ad-hoc Review | Use Carefully |
| TH | 21.5% | HIGH | Full Planning | Forecast OK |
| TW | 32.7% | MEDIUM | Buffer Required | Forecast OK |
| VN | 35.3% | MEDIUM | Buffer Required | Forecast OK |

GLOBAL FORECAST PROJECTIONS

| Entity | 1-Month | 6-Month | Avg/Wk |
|--------|----------|-----------|----------|
| ID | \$-51.7K | \$-331.2K | \$-12.7K |
| KR | \$-59.9K | \$-369.0K | \$-14.2K |
| MY | \$-34.8K | \$-222.4K | \$-8.6K |
| PH | \$-50.3K | \$-325.9K | \$-12.5K |
| SS | \$-8.2K | \$-52.2K | \$-2.0K |
| TH | \$-42.0K | \$-265.8K | \$-10.2K |
| TW | \$-99.0K | \$-631.2K | \$-24.3K |
| VN | \$-49.3K | \$-313.6K | \$-12.1K |

VALIDATION TRACK RECORD

| Entity | Actual | Pred | Accuracy |
|--------|----------|----------|----------|
| ID | \$-54.8K | \$-50.5K | 87.2% |
| KR | \$-60.6K | \$-52.3K | 0.0% |
| MY | \$-33.4K | \$-35.3K | 76.5% |
| PH | \$-45.6K | \$-47.9K | 71.8% |
| SS | \$-7.2K | \$-8.7K | 20.5% |
| TH | \$-38.7K | \$-40.4K | 78.5% |
| TW | \$-99.0K | \$-97.5K | 67.3% |
| VN | \$-56.5K | \$-41.4K | 64.7% |

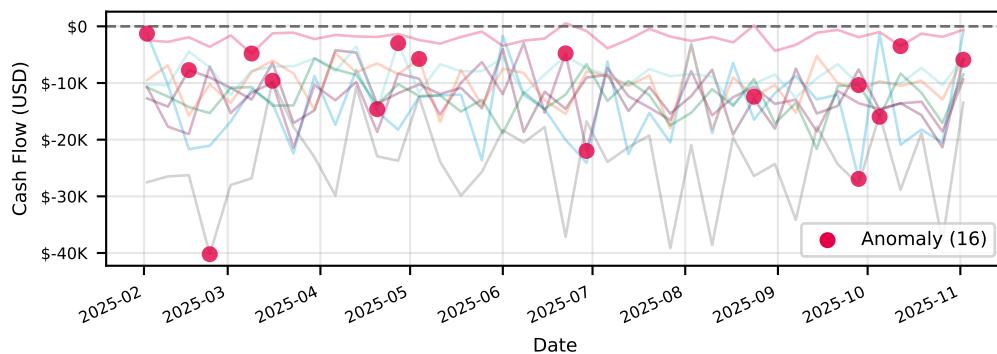
ANOMALY DETECTION METHODOLOGY & ACTION PLAN

Dual-Layer Detection | Root Cause Analysis | Prioritized Actions

ANOMALY DETECTION METHODOLOGY - DUAL-LAYER APPROACH

| Layer | Scope | Method | Threshold | Data Size | Detected | Purpose |
|---------|-------------------|------------------|------------------|-------------|---------------|-----------------|
| LAYER 1 | Transaction-Level | Z-Score Analysis | $ Z > 3.5$ | 84,528 txns | 1,869 flagged | Micro anomalies |
| LAYER 2 | Structural-Level | Isolation Forest | 5% contamination | 352 weeks | 16 flagged | Macro anomalies |

STRUCTURAL ANOMALIES TIMELINE



TOP TRANSACTION ANOMALIES

| Entity | Category | Amount | Z-Score | Investigation |
|--------|-------------|-----------|---------|---------------|
| VN20 | Bank Charge | \$8.41 | 22.51 | Fee spike |
| VN20 | Bank Charge | -\$7.20 | -18.77 | Refund? |
| TH10 | Bank Charge | -\$86.34 | -13.38 | Large error |
| SS10 | AP | -\$950.52 | -12.64 | Vendor issue |
| SS10 | AP | -\$901.43 | -11.97 | Recurring AP |

KEY INSIGHTS & DATA QUALITY

| Category | Finding | Impact |
|--------------|----------------------------|----------------------|
| Cash Flow | All countries net negative | Operating CF driver |
| Seasonality | Strong weekly patterns | Month-end cycles |
| Best Model | ID (12.8%) | High confidence |
| Worst Model | KR (231.6%) | Close monitoring |
| Hybrid Boost | 15-30% improvement | ARIMA + XGBoost |
| Data Period | 44 weeks (Jan-Nov 2025) | 84,528 transactions |
| Data Quality | Zero missing entities | <1% gaps |
| Risk: High | KR, SS, TW | Volatile patterns |
| Risk: Medium | ID, VN | Some volatility |
| Risk: Low | MY, PH, TH | Stable & predictable |

PRIORITIZED ACTION PLAN

| Priority | Timeline | Action | Phase |
|----------|------------|------------------------------|------------|
| CRITICAL | Week 1-2 | Investigate VN20 anomalies | Immediate |
| CRITICAL | Week 1-2 | Review SS10 large AP items | Immediate |
| CRITICAL | Week 1-2 | Set real-time alerts $ Z >5$ | Immediate |
| CRITICAL | Week 1-2 | Deploy forecasts: MY/PH/TH | Immediate |
| HIGH | Week 3-4 | Daily monitor: KR/TW/SS | Short-term |
| HIGH | Week 3-4 | Weekly forecast refresh | Short-term |
| HIGH | Week 3-4 | Build executive dashboard | Short-term |
| MEDIUM | Month 2-6 | Add FX rate regressors | Mid-term |
| MEDIUM | Month 2-6 | Holiday calendar integration | Mid-term |
| LOW | Month 6-12 | ERP integration (SAP) | Strategic |