AI Inventory Prediction & Restocking Agent

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Introduction

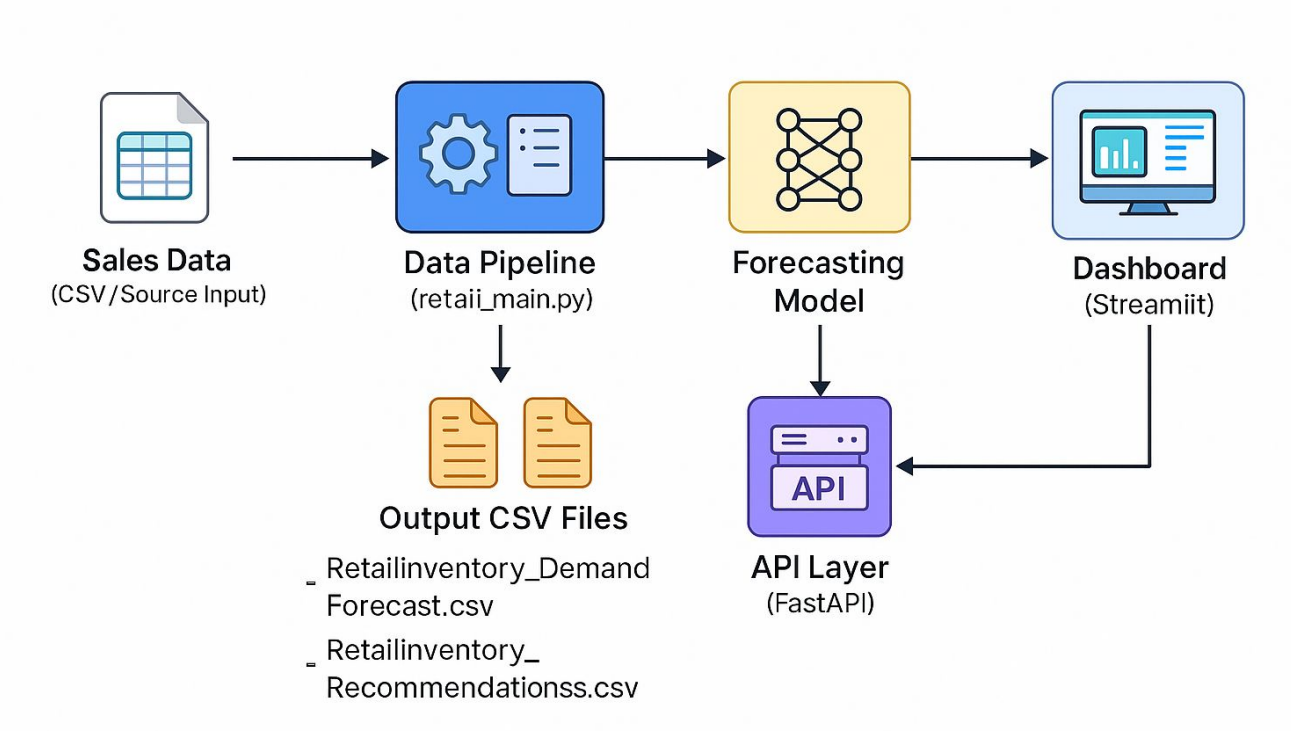
Retail businesses constantly struggle with inefficient inventory management processes, where manual tracking, inaccurate forecasts and delayed restocking decisions often lead to stockouts, excess inventory and operational bottlenecks. These challenges directly affect profitability, customer satisfaction and supply chain reliability. Traditional tools fail to provide real-time visibility or predictive insights, leaving businesses reactive rather than strategic in their inventory decisions.

To address this persistent business problem our project introduces an AI-Driven Inventory Prediction & Restocking Agent that leverages machine learning and Generative AI principles to forecast demand, identify low-stock risks early and recommend optimal reorder quantities. By integrating a complete data engineering pipeline, an automated forecasting model, an API service layer and a Streamlit dashboard, the system transforms manual inventory workflows into a predictive, autonomous and data-driven process. This solution not only enhances operational efficiency but also exemplifies how GenAI can be practically deployed to build scalable, real-world business applications.

Core Features

- Sales Data Ingestion - Automatically reads and updates sales data.
- Demand Forecasting - Predicts future product demand using ML models.
- Low-Stock Detection - Identifies items that are close to running out.
- Restocking Suggestions - Recommends when and how much to reorder.

System Workflow Overview



ML Pipeline Execution

- The process begins with the ML pipeline.
- The script loads historical inventory & sales data.
- It trains forecasting models (ARIMA / Random Forest / LSTM).
- It generates:

  - **RetailInventory_Demand_Forecast.csv**

  - **RetailInventory_Recommendations.csv**
- These files are used for prediction and restocking logic.

ML Pipeline Execution

```
Successfully installed MarkupSafe-3.0.3 altair-5.5.0 annotated-doc-0.0.4 annotated-types-0.7.0 anyio-4.12.0 attrs-25.4.0 blinker-1.9.0 cachetools-6.2.2 certifi-2025.11.12 charset-normalizer-3.4.4 click-8.1.8 exceptiongroup-1.3.1 fastapi-0.124.0 gitdb-4.0.12 gitpython-3.1.45 h11-0.16.0 idna-3.11 jinja2-3.1.6 joblib-1.5.2 jsonschema-4.25.1 jsonschema-specifications-2025.9.1 narwhals-2.13.0 numpy-2.0.2 packaging-25.0 pandas-2.3.3 pillow-11.3.0 protobuf-6.33.2 pyarrow-21.0.0 pydantic-2.12.5 pydantic-core-2.41.5 pydeck-0.9.1 python-dateutil-2.9.0.post0 pytz-2025.2 referencing-0.36.2 requests-2.32.5 rpds-py-0.27.1 scikit-learn-1.6.1 scipy-1.13.1 smmap-5.0.2 starlette-0.49.3 streamlit-1.50.0 tenacity-9.1.2 threadpoolctl-3.6.0 toml-0.10.2 tornado-6.5.2 typing-extensions-4.15.0 typing-inspection-0.4.2 tzdata-2025.2 urllib3-2.6.0 uvicorn-0.38.0
WARNING: You are using pip version 21.2.4; however, version 25.3 is available.
You should consider upgrading via the '/Library/Developer/CommandLineTools/usr/bin/python3 -m pip install --upgrade pip' command.
sh-3.2$ echo 'export PATH="$HOME/Library/Python/3.9/bin:$PATH"' >> ~/.zshrc
sh-3.2$ source ~/.zshrc
sh-3.2$ streamlit --version
Streamlit, version 1.50.0
sh-3.2$ uvicorn --version
Running uvicorn 0.38.0 with CPython 3.9.6 on Darwin
sh-3.2$ cd Desktop/InventoryProject
sh-3.2$ python3 retail_main.py
1/6: Loading and cleaning data...
Loaded 73100 daily records.
2/6: Creating features...
3/6: Training model and forecasting demand...
4/6: Generating dynamic inventory recommendations...
5/6: Saving outputs...
Forecast saved to RetailInventory_Demand_Forecast.csv
Inventory recommendations saved to RetailInventory_Recommendations.csv

6/6: Pipeline execution complete. Ready for API deployment.
sh-3.2$
[Restored Dec 6, 2025 at 6:43:51 PM]
Last login: Sat Dec  6 18:30:16 on ttys002
Restored session: Sat Dec  6 18:43:47 EST 2025
preetichougule@Mac ~ %
```

API Backend Running - FastAPI

- The process begins with the ML pipeline.
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API Backend Running - FastAPI

```
Last login: Sat Dec  6 18:15:00 on ttys000
preetichougule@Mac ~ % cd Desktop/InventoryProject
preetichougule@Mac InventoryProject % uvicorn retail_api:app --reload --port 8001
INFO:     Will watch for changes in these directories: ['/Users/preetichougule/Desktop/InventoryProject']
INFO:     Uvicorn running on http://127.0.0.1:8001 (Press CTRL+C to quit)
INFO:     Started reloader process [1584] using StatReload
INFO:     Started server process [1586]
INFO:     Waiting for application startup.
Attempting to load forecast data from: RetailInventory_Demand_Forecast.csv
Attempting to load inventory data from: RetailInventory_Recommendations.csv
Data successfully loaded and prepared for API.
INFO:     Application startup complete.
  [Restored Dec 6, 2025 at 6:43:51 PM]
Last login: Sat Dec  6 18:43:51 on ttys000
Restored session: Sat Dec  6 18:43:47 EST 2025
preetichougule@Mac InventoryProject % cd ~/Desktop/InventoryProject
uvicorn retail_api:app --reload --port 8001
INFO:     Will watch for changes in these directories: ['/Users/preetichougule/Desktop/InventoryProject']
INFO:     Uvicorn running on http://127.0.0.1:8001 (Press CTRL+C to quit)
INFO:     Started reloader process [1709] using StatReload
INFO:     Started server process [1711]
INFO:     Waiting for application startup.
Attempting to load forecast data from: RetailInventory_Demand_Forecast.csv
Attempting to load inventory data from: RetailInventory_Recommendations.csv
Data successfully loaded and prepared for API.
INFO:     Application startup complete.
INFO:     127.0.0.1:49215 - "GET /forecast HTTP/1.1" 200 OK
INFO:     127.0.0.1:49216 - "GET /inventory HTTP/1.1" 200 OK
```

Dashboard Server Running - Streamlit UI Launch

- Once the API is active, the dashboard is launched using Streamlit.
- The dashboard automatically connects to the API and retrieves:

  - Forecasts

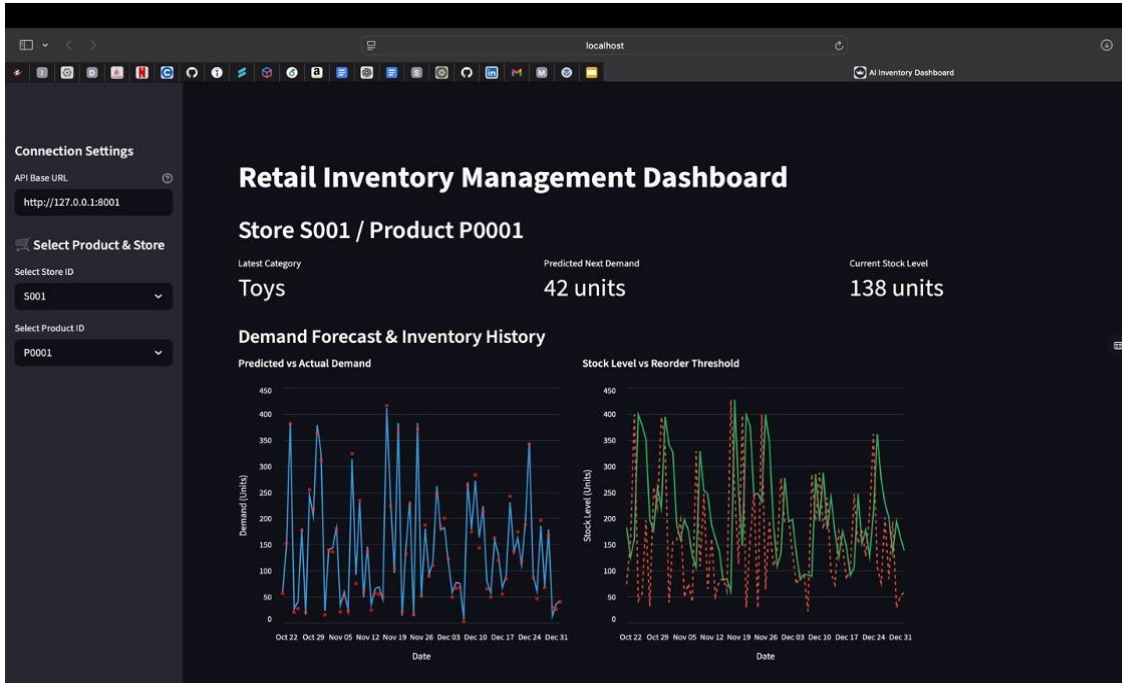
  - Inventory levels

  - Restocking recommendations
- This provides a user-friendly interface for interacting with the ML outputs.

Dashboard Server Running - Streamlit UI Launch

Dashboard Home View

- Users start by selecting:
  - Store ID
  - Product ID
- The dashboard displays:
  - Category
  - Current stock level
  - Predicted demand
  - Inventory trend over time
- This interface is the main control panel for decision-making.

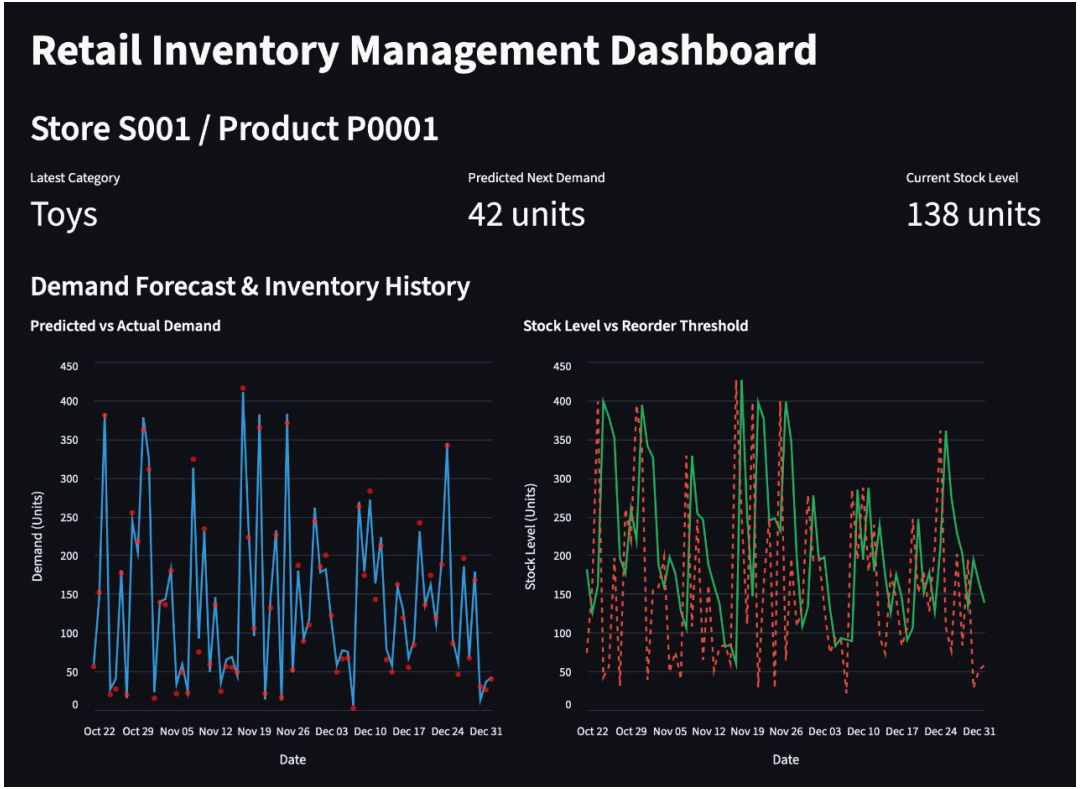


Forecast Visualization - AI Prediction

- The forecasting model predicts future demand trends.
- Two charts are shown:

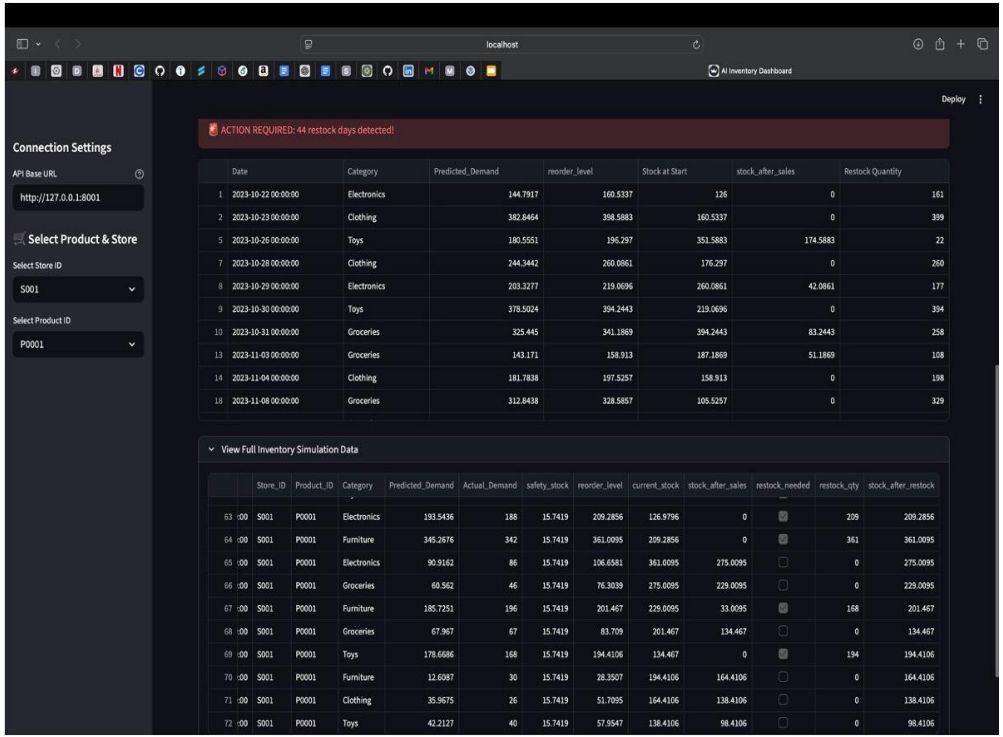
  1. Predicted vs. Actual Demand – Model accuracy visualization

  2. Stock Level vs. Reorder Threshold – Shows when stock dips below safety levels.
- These predictive charts guide the retailer on when demand will rise or fall.



Restock Alerts & Recommendations

- The dashboard analyzes forecasted demand and current stock.
- It identifies dates on which the inventory will reach low levels.
- It recommends:
  - How much quantity to reorder
  - When the stock will run out
  - What safety stock should be maintained
- This enables automated, data-driven restocking.



Tech Stack

- Python, Pandas, NumPy
- Scikit-learn, ARIMA/LSTM forecasting models
- FastAPI for backend
- Streamlit UI dashboard for recommendations

Thank You!!