

```
!pip install pathway bokeh
```

```
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Requirement already satisfied: cachetools<6.0>>=2.0.0 in /usr/local/lib/python3.11/dist-packages (from google-auth!=2.24.0,!=2.25.0,<3) (5.5.2)
Requirement already satisfied: pyasn1-modules>=0.2.1 in /usr/local/lib/python3.11/dist-packages (from google-auth!=2.24.0,!=2.25.0,<3) (0.4.0)
Requirement already satisfied: rsa<5>>=3.1.4 in /usr/local/lib/python3.11/dist-packages (from google-auth!=2.24.0,!=2.25.0,<3) (4.9.0)
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```

```
import pandas as pd
import numpy as np
import pathway as pw
from bokeh.plotting import figure, show, output_notebook
from bokeh.io import push_notebook
from bokeh.layouts import column
import time
from IPython.display import display
```

```
output_notebook()
```

```
from google.colab import files
uploaded = files.upload()
```


 Choose Files dataset.csv

- **dataset.csv**(text/csv) - 1595541 bytes, last modified: 7/6/2025 - 100% done

Saving dataset.csv to dataset.csv

```
import pandas as pd
```

```
df = pd.read_csv("dataset.csv") # No need for /content/ path if uploaded manually
print("Shape:", df.shape)
df.head()
```


 Shape: (18368, 12)

	ID	SystemCodeNumber	Capacity	Latitude	Longitude	Occupancy	VehicleType	TrafficConditionNearby	QueueLength	IsSpecialDay	LastU
0	0	BHMBCCMKT01	577	26.144536	91.736172	61	car	low	1	0	
1	1	BHMBCCMKT01	577	26.144536	91.736172	64	car	low	1	0	
2	2	BHMBCCMKT01	577	26.144536	91.736172	80	car	low	2	0	
3	3	BHMBCCMKT01	577	26.144536	91.736172	107	car	low	2	0	
4	4	BHMBCCMKT01	577	26.144536	91.736172	150	bike	low	2	0	

Next steps: [Generate code with df](#) [View recommended plots](#) [New interactive sheet](#)

```
# Load the dataset (uploaded in the Files section)
df = pd.read_csv("/content/dataset.csv")
```

```
# Display basic structure
print("Shape:", df.shape)
df.head()
```

 Shape: (18368, 12)

	ID	SystemCodeNumber	Capacity	Latitude	Longitude	Occupancy	VehicleType	TrafficConditionNearby	QueueLength	IsSpecialDay	LastU
0	0	BHMBCCMKT01	577	26.144536	91.736172	61	car	low	1	0	
1	1	BHMBCCMKT01	577	26.144536	91.736172	64	car	low	1	0	
2	2	BHMBCCMKT01	577	26.144536	91.736172	80	car	low	2	0	
3	3	BHMBCCMKT01	577	26.144536	91.736172	107	car	low	2	0	
4	4	BHMBCCMKT01	577	26.144536	91.736172	150	bike	low	2	0	

Next steps: [Generate code with df](#) [View recommended plots](#) [New interactive sheet](#)

```
# Add base price for each lot
df['Price'] = 10.0 # Base price

# Get list of all unique parking lot IDs (or use Lat-Long as unique ID)
df['LotID'] = df['Latitude'].astype(str) + "_" + df['Longitude'].astype(str)

# Sort by time (assuming there's a timestamp column or simulated time index)
df['TimeIndex'] = np.tile(np.arange(0, df.shape[0] // 14), 14)
df = df.sort_values(by=['TimeIndex', 'LotID']).reset_index(drop=True)
```

```
def linear_price_update(prev_price, occupancy, capacity, alpha=2):
    usage_ratio = occupancy / capacity if capacity > 0 else 0
    return prev_price + alpha * usage_ratio
```

```
import time
from bokeh.plotting import figure, show, output_notebook
from bokeh.io import push_notebook
from bokeh.layouts import column
```

```
output_notebook()
```

```
# Initialize storage
lot_prices = {}
price_history = {lot: [] for lot in df['LotID'].unique()}
```

```

# Setup Bokeh plots
plots = []
for lot in df['LotID'].unique():
    p = figure(title=f"Price Trend - Lot {lot}", width=400, height=300)
    p.line([], [], line_width=2, legend_label="Price", name="price_line")
    plots.append(p)

layout = column(*plots)
handle = show(layout, notebook_handle=True)

# Set number of time steps to simulate
max_steps = 10 # change this to more if needed

# Linear Pricing Function
def linear_price_update(prev_price, occupancy, capacity, alpha=2):
    usage_ratio = occupancy / capacity if capacity > 0 else 0
    return prev_price + alpha * usage_ratio

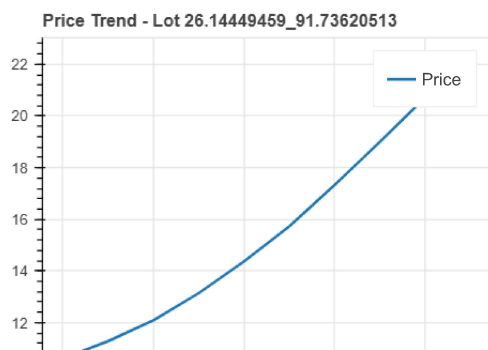
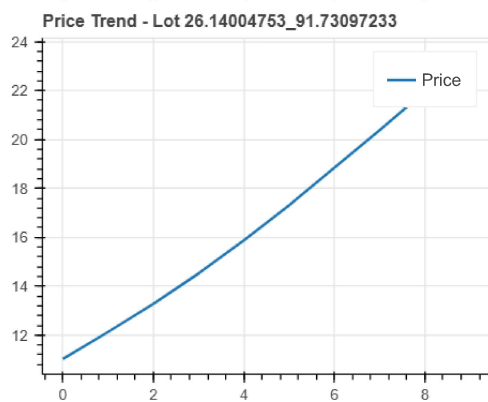
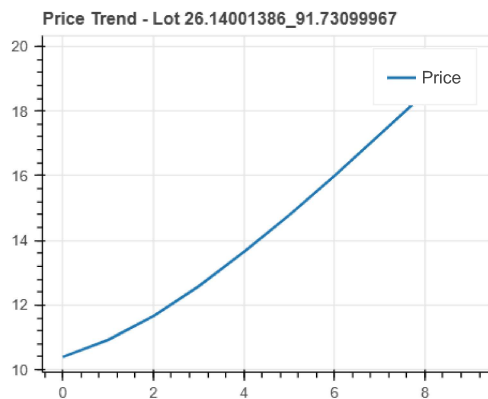
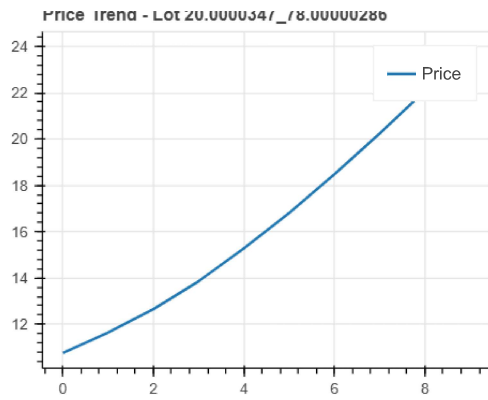
# Run real-time simulation
for t in range(min(df['TimeIndex'].max() + 1, max_steps)):
    current_time_slice = df[df['TimeIndex'] == t]

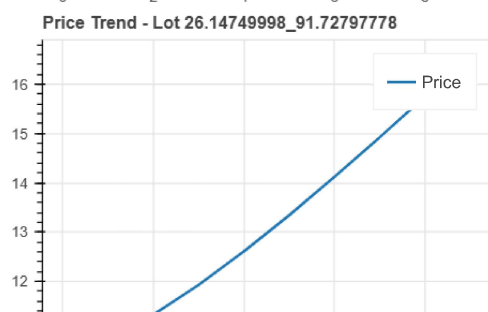
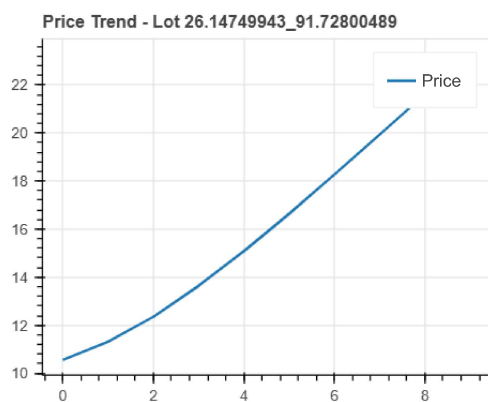
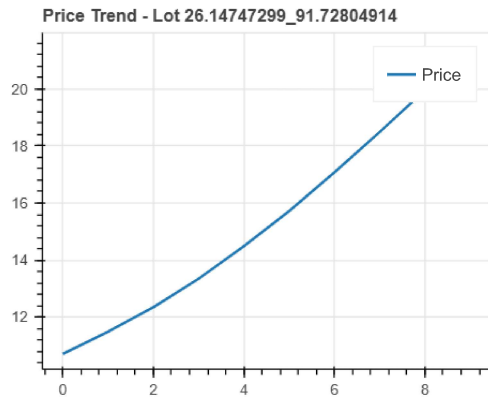
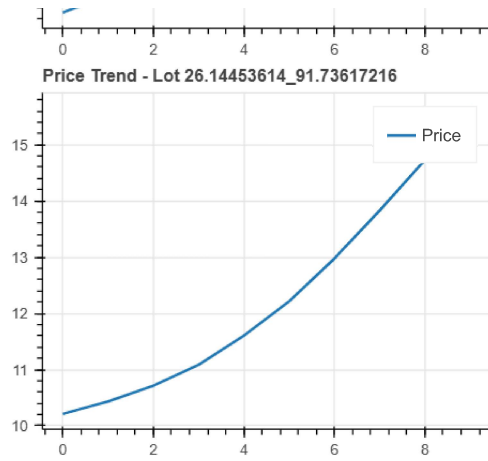
    for idx, row in current_time_slice.iterrows():
        lot = row['LotID']
        prev_price = lot_prices.get(lot, 10.0)
        new_price = linear_price_update(prev_price, row['Occupancy'], row['Capacity'])
        lot_prices[lot] = new_price
        price_history[lot].append(new_price)

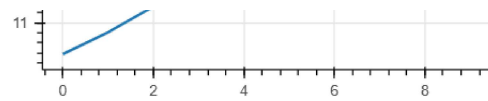
# Update plots
for i, lot in enumerate(df['LotID'].unique()):
    line = plots[i].select(name="price_line")[0]
    line.data_source.data = {
        'x': list(range(len(price_history[lot]))),
        'y': price_history[lot]
    }

push_notebook(handle=handle)
time.sleep(0.05) # fast visualization delay

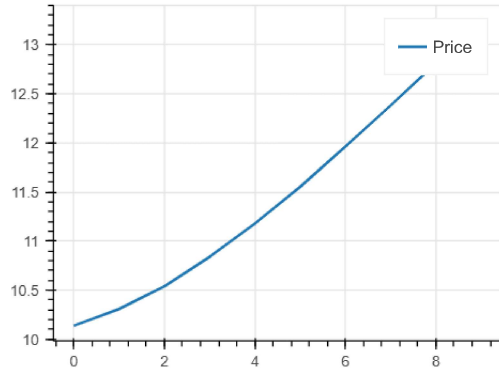
```



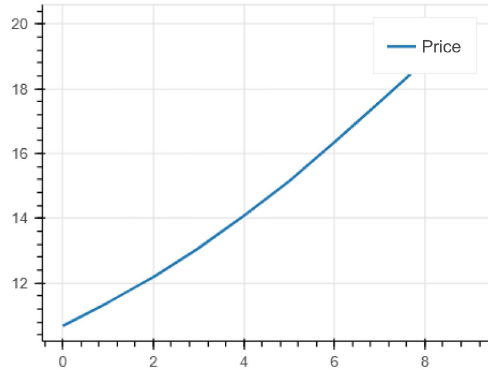




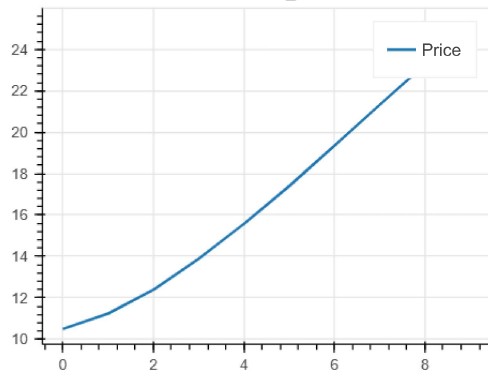
Price Trend - Lot 26.14754061\_91.72797041



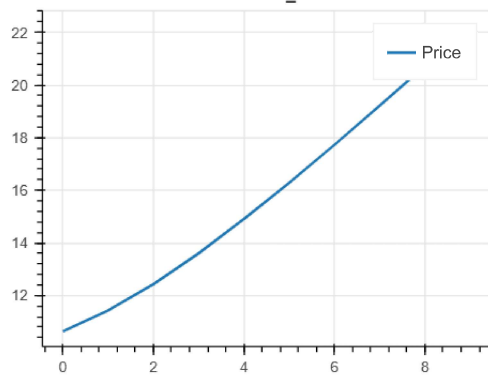
Price Trend - Lot 26.14754886\_91.72799519



Price Trend - Lot 26.14901995\_91.7395035



Price Trend - Lot 26.15050395\_91.73353109



```

# Vehicle weight mapping
vehicle_weights = {
    'car': 1.0,
    'bike': 0.5,
    'truck': 1.5
}

# Hyperparameters (tune these later)
alpha = 2.0
beta = 0.1
gamma = 0.3
delta = 1.0
epsilon = 0.5
lambda_ = 0.5 # price sensitivity to demand

# Base price
BASE_PRICE = 10.0

def demand_based_price(row, prev_price):
    # Extract features
    occ_ratio = row['Occupancy'] / row['Capacity'] if row['Capacity'] > 0 else 0
    queue = row['QueueLength']
    traffic = row['Traffic']
    is_special = row['IsSpecialDay']
    vehicle_type = row['VehicleType'].lower()

    # Assign vehicle type weight
    vehicle_weight = vehicle_weights.get(vehicle_type, 1.0)

    # Raw demand
    demand = (alpha * occ_ratio +
              beta * queue -
              gamma * traffic +
              delta * is_special +
              epsilon * vehicle_weight)

    # Normalize demand using sigmoid (to keep within [0,1])
    norm_demand = 1 / (1 + np.exp(-demand))

    # Price update formula
    new_price = BASE_PRICE * (1 + lambda_ * norm_demand)

    # Bound price between $5 and $20
    return max(5, min(20, new_price))

print(df.columns.tolist())

```

→ ['ID', 'SystemCodeNumber', 'Capacity', 'Latitude', 'Longitude', 'Occupancy', 'VehicleType', 'TrafficConditionNearby', 'QueueLength', 'Is

```

def demand_based_price(row, prev_price):
    # Extract features
    occ_ratio = row['Occupancy'] / row['Capacity'] if row['Capacity'] > 0 else 0
    queue = row['QueueLength']
    traffic = row['TrafficConditionNearby'] # ✅ corrected
    is_special = row['IsSpecialDay']
    vehicle_type = row['VehicleType'].lower()

    # Assign vehicle type weight
    vehicle_weight = vehicle_weights.get(vehicle_type, 1.0)

    # Raw demand score
    demand = (alpha * occ_ratio +
              beta * queue -
              gamma * traffic +
              delta * is_special +
              epsilon * vehicle_weight)

    # Normalize demand (sigmoid)
    norm_demand = 1 / (1 + np.exp(-demand))

    # Compute price

```

```

new_price = BASE_PRICE * (1 + lambda_ * norm_demand)

# Bound the price
return max(5, min(20, new_price))

# STEP 1: Data Cleaning (do this once after loading the dataset)
df['TrafficConditionNearby'] = pd.to_numeric(df['TrafficConditionNearby'], errors='coerce').fillna(0)
df['QueueLength'] = pd.to_numeric(df['QueueLength'], errors='coerce').fillna(0)
df['IsSpecialDay'] = pd.to_numeric(df['IsSpecialDay'], errors='coerce').fillna(0)
df['Occupancy'] = pd.to_numeric(df['Occupancy'], errors='coerce').fillna(0)
df['Capacity'] = pd.to_numeric(df['Capacity'], errors='coerce').fillna(1) # Avoid division by zero

# STEP 2: Parameters & Vehicle Mapping
vehicle_weights = {
    'car': 1.0,
    'bike': 0.5,
    'truck': 1.5
}

alpha = 2.0
beta = 0.1
gamma = 0.3
delta = 1.0
epsilon = 0.5
lambda_ = 0.5
BASE_PRICE = 10.0

# STEP 3: Demand-based price update function
def demand_based_price(row, prev_price):
    occ_ratio = row['Occupancy'] / row['Capacity'] if row['Capacity'] > 0 else 0
    queue = row['QueueLength']
    traffic = row['TrafficConditionNearby']
    is_special = row['IsSpecialDay']
    vehicle_type = row['VehicleType'].lower()
    vehicle_weight = vehicle_weights.get(vehicle_type, 1.0)

    # Demand calculation
    demand = (alpha * occ_ratio +
              beta * queue -
              gamma * traffic +
              delta * is_special +
              epsilon * vehicle_weight)

    # Normalize demand
    norm_demand = 1 / (1 + np.exp(-demand)) # Sigmoid

    # Calculate price
    new_price = BASE_PRICE * (1 + lambda_ * norm_demand)

    # Clip to bounds
    return max(5, min(20, new_price))

import time
from bokeh.plotting import figure, show, output_notebook
from bokeh.io import push_notebook
from bokeh.layouts import column

output_notebook()

# Reset storage
lot_prices = {}
price_history = {lot: [] for lot in df['LotID'].unique()}

# Setup Bokeh plots
plots = []
renderers = []

for lot in df['LotID'].unique():
    p = figure(title=f"Model 2: Price Trend - Lot {lot}",
              width=400, height=250,
              x_axis_label='Time Step',
              y_axis_label='Price ($)')
    r = p.line([], [], line_width=2, legend_label="Price", name="price_line")
    plots.append(p)

```



```
renderers.append(r)

layout = column(*plots)
handle = show(layout, notebook_handle=True)

# Simulate up to 10 steps (change as needed)
max_steps = 10

for t in range(min(df['TimeIndex'].max() + 1, max_steps)):
    current_time_slice = df[df['TimeIndex'] == t]

    for idx, row in current_time_slice.iterrows():
        lot = row['LotID']
        prev_price = lot_prices.get(lot, BASE_PRICE)
        new_price = demand_based_price(row, prev_price)
        lot_prices[lot] = new_price
        price_history[lot].append(new_price)

# Update plots
for i, lot in enumerate(df['LotID'].unique()):
    r = renderers[i]
    r.data_source.data = {
        'x': list(range(len(price_history[lot]))),
        'y': price_history[lot]
    }

push_notebook(handle=handle)
time.sleep(0.05)
```