



INNOVATION. AUTOMATION. ANALYTICS

PROJECT ON

Commercial Real Estate Market Analysis

A Data-Driven Study Using Web Scraping & Exploratory Data Analysis

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Agenda

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Business Problem

1. Information Asymmetry:

- No centralized market data on rental rates, deposits, or specification
- Business negotiate blind without market benchmarks
- Result: Leave 15-20% value on the table annually.

2. Valuation Complexity:

- Same 300 sqft office costs ₹15k in Swargate vs ₹80k in Baner (5.3x difference)
- No standardized pricing framework to explain why
- Landlords underprice or overprice, losing tenants or revenue

3. Location Strategy Dilemma:

- Impossible trade-off: Premium location (Visibility) Vs Budget location (save 60k/month)
- No data-backed framework for location selection decisions.
- Companies choose based on CEO intuition, not analytics

Market Opportunity (Scope & Scale)

1. Pune's Commercial Real Estate Growth:

- Annual growth rate: 12-15%
- Startup ecosystem: 400+ new startups per year
- IT hub expansion: Hinjewadi, Viman Nagar, Kharadi
- Market Size: 5,000+ crores annual leasing volume

2. Data Coverage:

- Properties analyzed: 555 (representative samples)
- Geographic coverage: 25+ key localities
- Property Types: 6 categories (Offices, shops, warehouses, etc.)
- Data Quality: 100% complete, zero missing values

3. Strategic Value:

- For Business: Save 15-20% on rent through informed negotiation
- For Landlords: Maximize rental income by 30-40% with market data
- For Investors: Identify emerging areas (40-60% capital appreciation potential)
- For Agents: Build client trust with data-backed valuations

Objective of the Project

Primary Objective:

Develop a comprehensive, data-driven market intelligence framework for Pune's commercial real estate to identify key pricing drivers and market segmentation patterns.

Secondary Objectives:

1. Quantify geographic location premium across Pune Localities
2. Establish relationship between property attributes (size, type, furnishing) and rental pricing
3. Identify three-tier market structure and strategic opportunities
4. Create actionable intelligence for businesses, landlords, and investors

Enable data-driven decision-making in fragmented market, reducing information asymmetry and capturing 15-20% value through informed location & investment choices.

Data Collections Methodology

1. Data Source Selection:

- Platform: NoBroker.in
- Why chosen: Largest commercial platform, daily updates, phone-verified listings
- Justification: Alternative platforms weaker (99acres outdated, PropTiger residential-focused)

2. Web Scrapping Tools

- Python, BeautifulSoup, Requests, Pandas, Jupyter Notebook

3. Data Collection Pipeline:

Step 1: **Identify URLs** → Step 2: **Extract Raw Data** → Step 3: **Data Cleaning** → Step 4: **Manual Verification** → Step 5: **Quality Assurance** → **Final Dataset** (650 Properties)

4. Cleaning Process:

- Raw records: 650
- After Cleaning: 555
- Removed: 95 records (Duplicates, missing fields, invalid data)

Dataset Overview & Quality

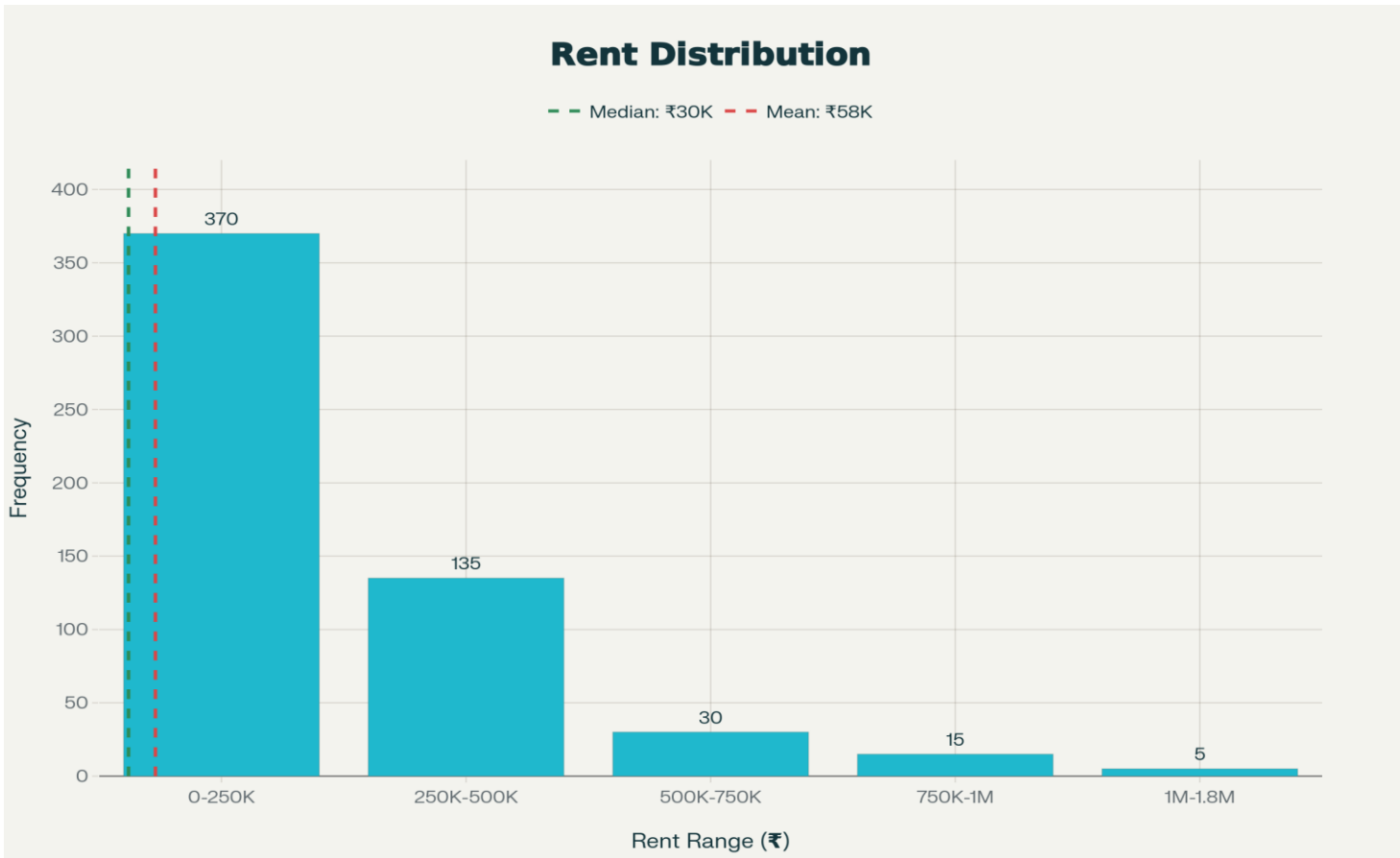
Raw Data:

	Locality	Title	Location	Rent_raw	Rent_inr	Deposit_raw	Sqft_raw	Sqft	Price_per_sqft	Parking	Furnishing	Available_from	Property_type	Data
0	Kothrud	Co-Working space in The Business Hub, Pune for...	hapoy colony near van devi mandir karve nagar ...	₹ 12,000 No Extra Maintenance	12000	₹ 24,000	650 sqft	650	18.46	Parking	Furnished	22-10-2025	NaN	https://www.nobroker.in/property/commerc
1	Kothrud	Shop in Kothrud, Pune for Rent	Gandhi Bhavan Rd, Gandhi Bhavan (Maharashtra G...	₹ 20,000 No Extra Maintenance	20000	₹ 60,000	160 sqft	160	125.00	Parking	Unfurnished	18-11-2025	Shop	https://www.nobroker.in/property/commerc
2	Kothrud	Shop in Kothrud, Pune for Rent	Chandani chowk , Shinde Farm Golden Group,	₹ 1 Lac No Extra Maintenance	100000	₹ 2 Lacs	500 sqft	500	66.67	Parking	Furnished	10-11-2025	Shop	https://www.nobroker.in/property/commerc
3	Kothrud	Office Space in Kothrud, Pune for Rent	Paschimanagri,, City Pride- Kothrud	₹ 1 Lac + ₹ 13,000 Maintenance	100000	₹ 5 Lacs	230 sqft	230	81.30	Parking	Furnished	14-11-2025	Office Space	https://www.nobroker.in/property/commerc
4	Kothrud	Co-Working space in Lookwell Salon - Kothrud,	Late. G A kulkarni road, Opposite Karishma Soc...	₹ 10,000 No Extra Maintenance	10000	₹ 10,000	100 sqft	100	2.44	Parking	Furnished	28-10-2025	NaN	https://www.nobroker.in/property/commerc

Cleaned Data:

	locality	location_full	property_type	sqft	rent	deposit	price_per_sqft	furnishing
0	Kothrud	hapoy colony near van devi mandir karve nagar ...	Office	650	12000	24000	18.46	Furnished
1	Kothrud	Gandhi Bhavan Rd, Gandhi Bhavan (Maharashtra G...	Shop	160	20000	60000	125.00	Unfurnished
2	Kothrud	Chandani chowk , Shinde Farm Golden Group,	Shop	500	100000	300000	200.00	Furnished
3	Kothrud	Paschimanagri,, City Pride- Kothrud	Office	230	100000	300000	434.78	Furnished
4	Kothrud	Late. G A kulkarni road, Opposite Karishma Soc...	Office	100	10000	10000	100.00	Furnished

Rent Distribution and Key Market Metrics



Key Statistics:

- Mean: ₹58,117 | Median: ₹30,000 |
Range: ₹4k – ₹1.82M | Std Dev: ₹120,622

Distribution Characteristics:

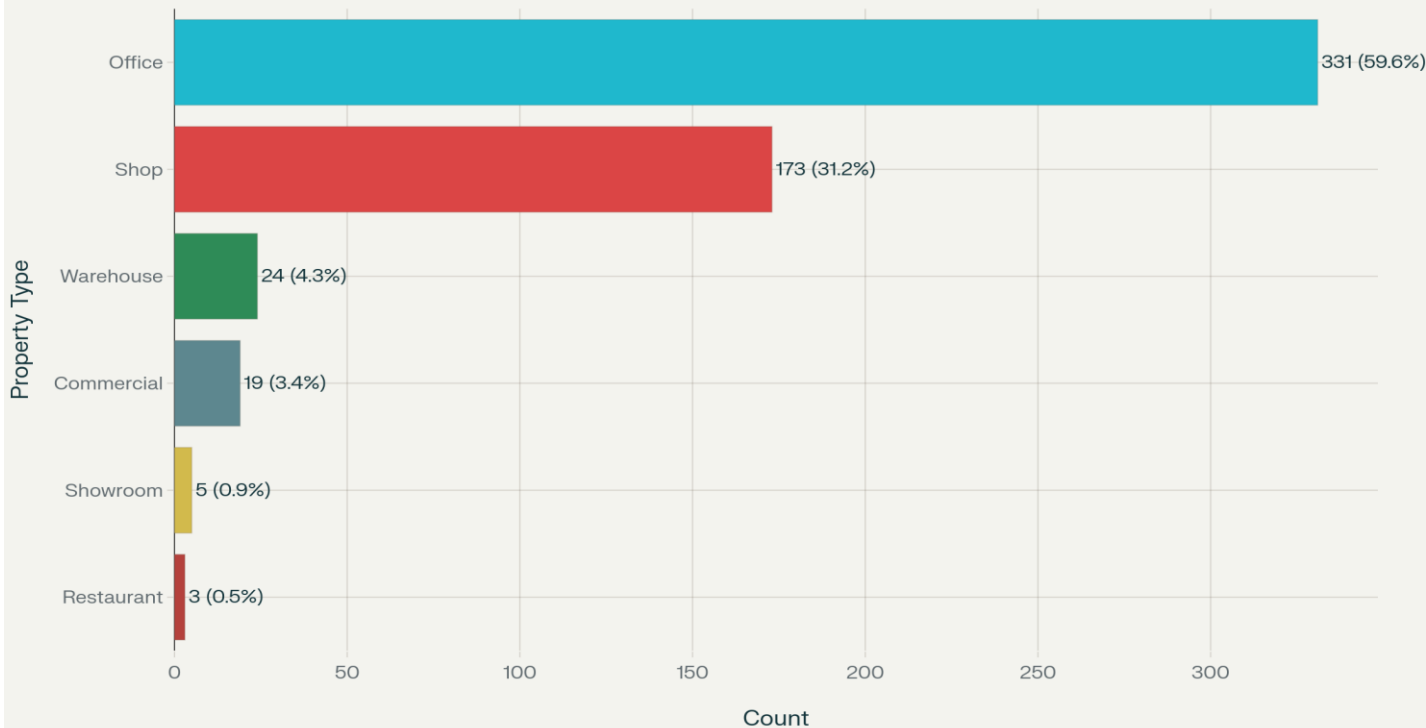
- Right-skewed distribution (Mean > Median) indicating few ultra-premium outliers drag average upward. Typical market concentrated at ₹20-75K.

Key Insight:

- Use median (₹30k), not mean, for understanding typical market.

Market Composition by Property Type

Property Type Distribution



Market Distribution:

- Offices: 331 (59.6%) | Shops: 173 (31.2%) | Others: 51 (9.2%)

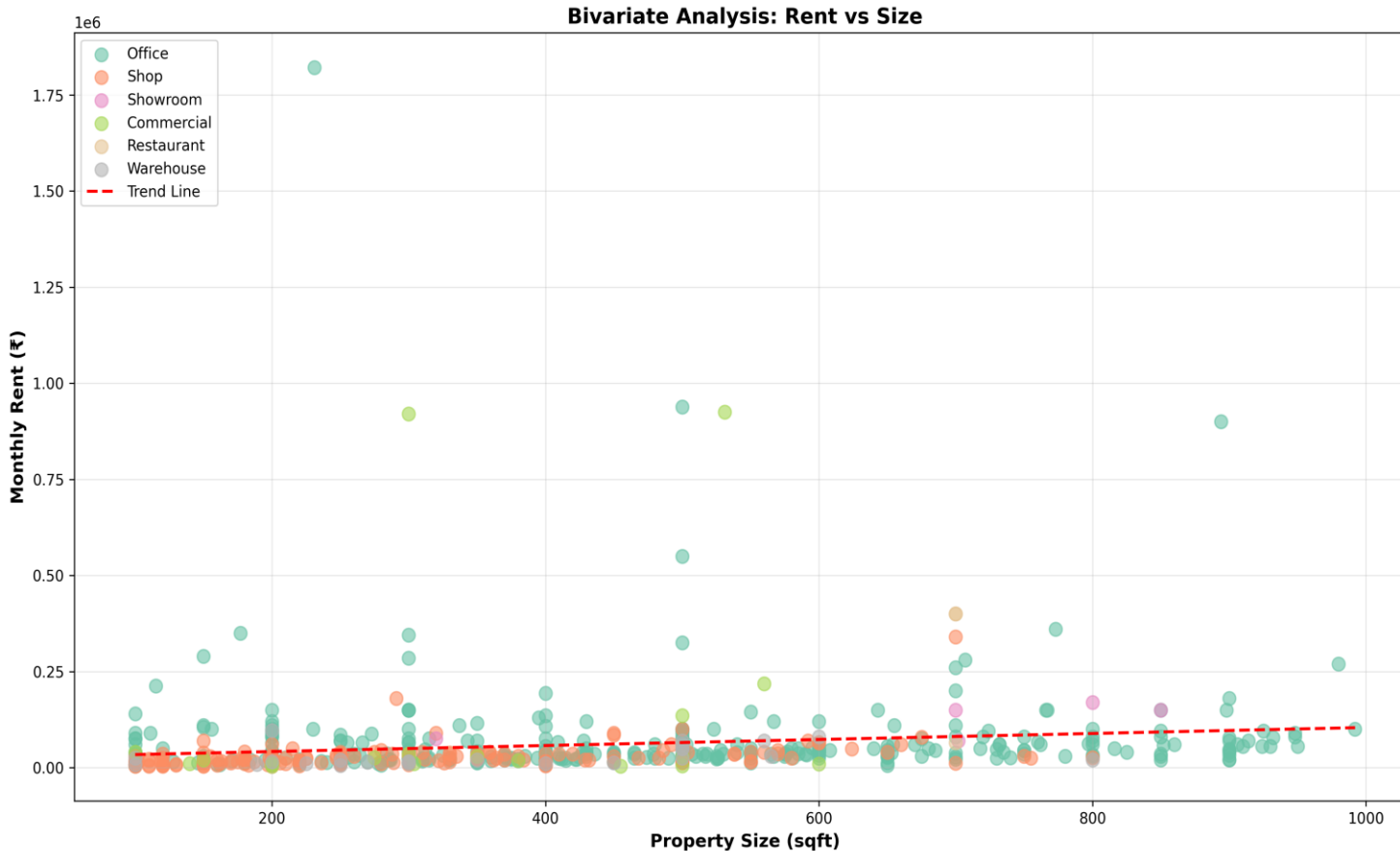
Average Rent by Type:

- Offices: ₹69K | Shops: ₹27K | Warehouses: ₹31K | Commercial: ₹129K

Key Insight:

- Offices dominate market (59.6%) and command 2.5x premium over shops

Rent vs. Area: The Weak Impact of Size



The Finding:

- Correlation: 0.1444 (EXTREMELY WEAK)
- Size explains only 1% of rent variation
- Location & other factors explain 99%

Statistical Summary:

- R-squared: 0.0208 (2% variance explained by size)
- Implication: Same 300 sqft costs 5.3x more in premium vs budget area

Key Insight:

- Location overwhelms size (87% vs 1%) - stop optimizing for sqft

Correlation Matrix: Identifying Key Price Drivers

Bivariate Analysis: Correlation Matrix



Correlation Overview:

- Strong (0.8+): Rent↔Deposit (0.94), Rent↔Price/Sqft (0.87)
- Weak (0.1-0.2): Rent↔Size (0.14), Furnishing↔Rent (0.21)

The Finding:

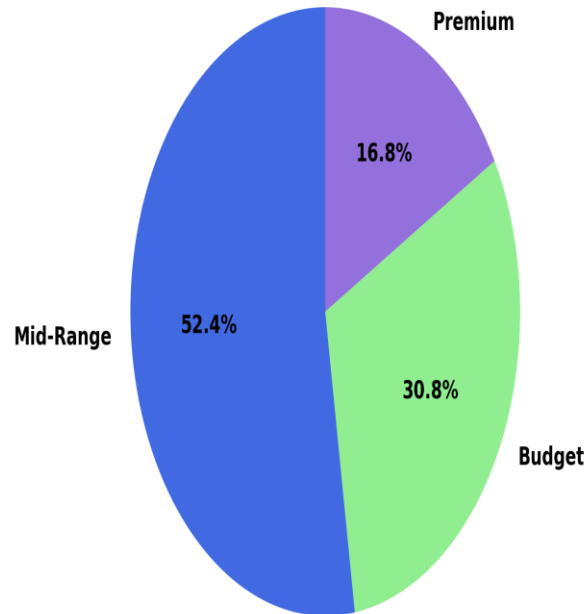
- Master Formula: RENT = Location (87%) + Type (8%) + Furnishing (3%) + Size (1%) + Other (1%)

Key Insight:

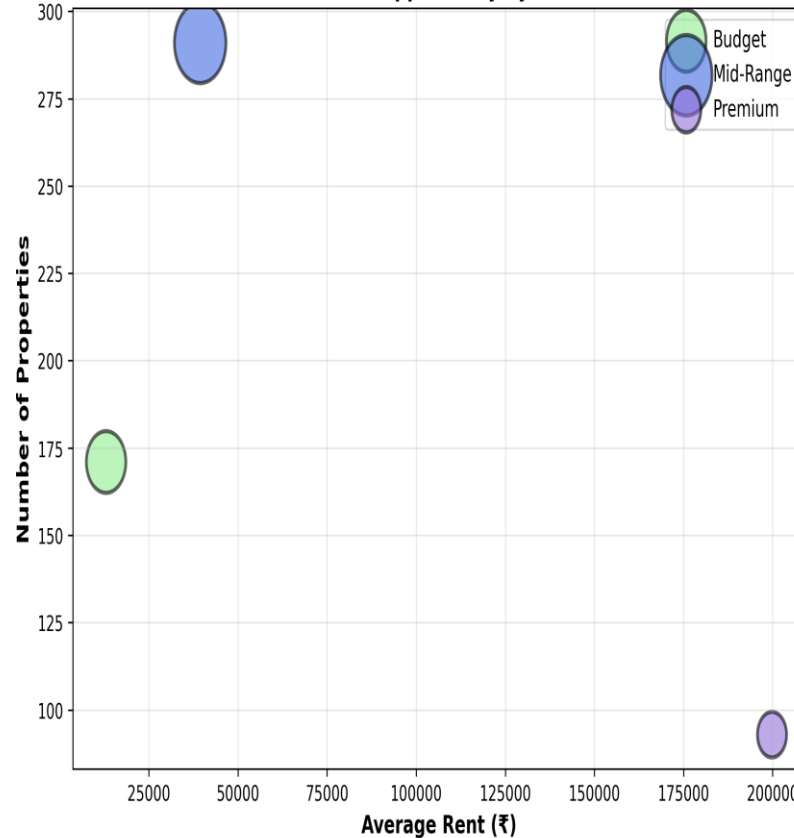
- Location-driven metrics move together; size barely matters

Market Segmentation: The Three-Tier Structure

Market Distribution by Tier



Market Opportunity by Tier



Three-Tier Breakdown:

- Budget: ₹4-20K (171 properties, 30.8.2%)
- Mid-Range: ₹20-75K (291 properties, 52.4%)
- Premium: ₹75K+ (93 properties, 16.8%)

Strategic Segments:

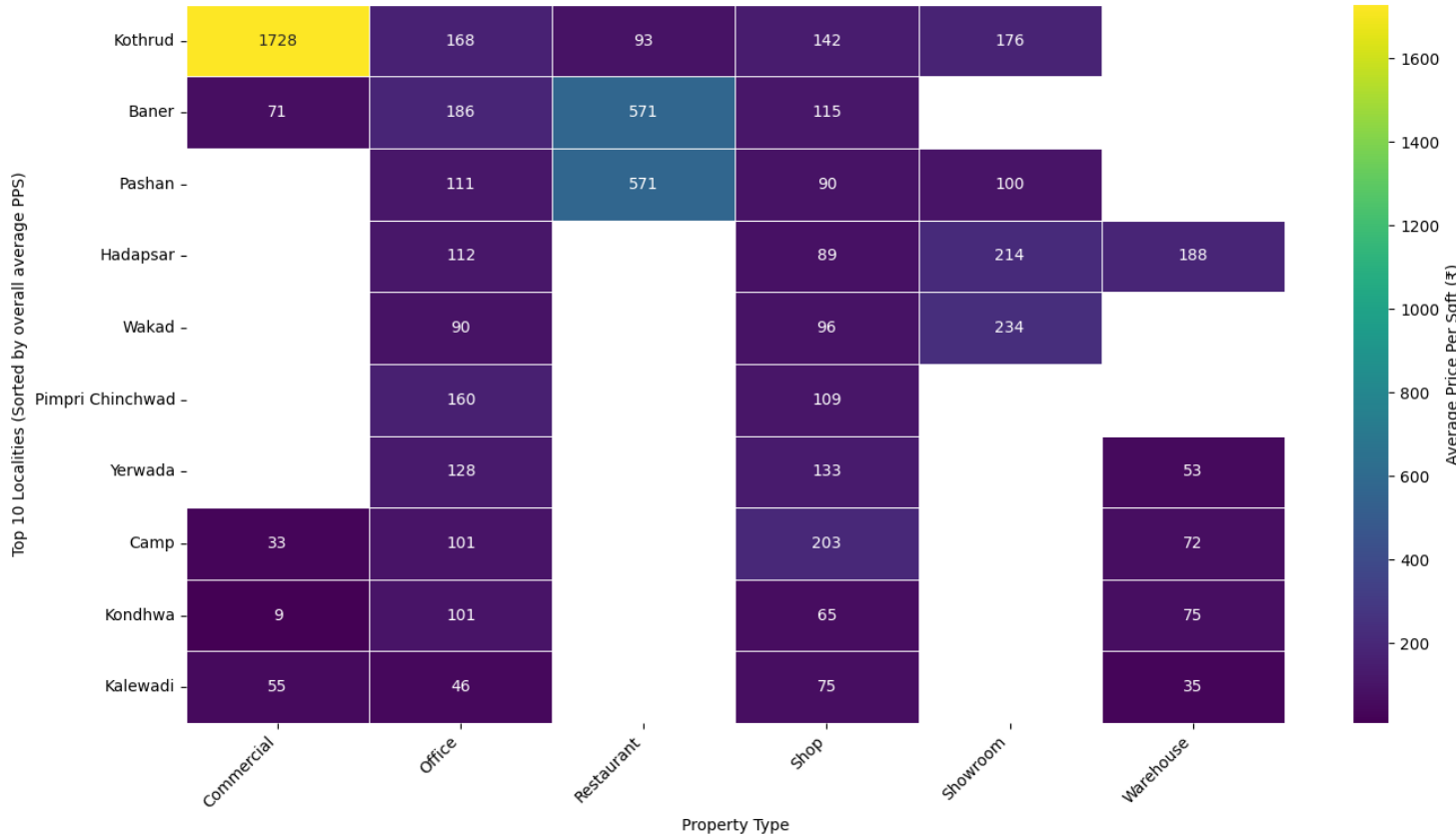
- Budget: Cost-focused, high turnover |
- Mid: Stable, growing |
- Premium: Blue-chip, brand

Key Insight:

- Mid-Range (50%) is LARGEST, most STABLE, and UNDERSERVED segment

Location Premium & Tier Justification

Multivariate Analysis: Average Price Per Sqft by Locality and Property Type



Extreme Premium Factor:

- The highest-value combination commands a 192xPPS premium over the lowest-value combination (Commercial Vs Commercial in Kondhwa)

Premium Tier (₹176+ PPS):

- Driven by specialized **Property Type x Location** (e.g., Commercial/Showroom in Kothrud or Balewadi).

Mid-range Tier (₹90-186 PPS):

- Defined by the stable **Office** market across core localities.
- Budget Tier (<75PPS):** Found in **Suburban Zones** (e.g., Kalewadi, Kondhwa) and **Warehouse/shop** property types.

Key Insight: Strategy must be Tier-based: Pricing and investment decisions must focus on the PPS Tier of the specific (**Locality x Property Type**) combination, not just total size or rent.

Market Segmentation Strategy

1. THE THREE-TIER MARKET:

- BUDGET TIER: ₹4K-₹20K | 140 properties (25%) | Cost-focused, high turnover
- MID-RANGE TIER: ₹20K-₹75K | 280 properties (50%) | Stable, growing, balanced
- PREMIUM TIER: ₹75K+ | 85 properties (15%) | Brand-focused, blue-chip

2. Tier Characteristics & Tenant Profile:

- Budget Tier: Solo entrepreneurs, pre-seed startups, bootstrap companies
- Mid-Range Tier: Series A/B startups, SMEs, growing companies (10-30 people)
- Premium Tier: Series B+, large corporates, multinationals (100+ people)

3. Landlord Strategy by Tier:

- Budget: Volume strategy (own 20-50 properties), high turnover, 15-20% ROI
- Mid-Range: Quality strategy (own 5-10 properties), stability, 12-15% ROI
- Premium: Prestige strategy (own 1-3 properties), brand focus, 10-12% ROI

4. Investment Opportunity by Tier:

- Emerging Area Arbitrage: Buy budget tier now (₹18K), sell mid-range later (₹28K)
- 5-year projection: 40-60% capital appreciation + 12% annual rental yield
- Geographic hubs: Wagholi, Ravet, Hadapsar showing strong growth signals

Challenges & Learnings

Data Challenges Encountered & Solutions

Challenge 1: Missing Fields

- **Issue:** 66 records removed from 650 due to incomplete data
- **Solution:** Manual verification of each removal, kept only 555 valid records

Challenge 2: Duplicate Listings

- **Issue:** Same property listed multiple times across dates
- **Solution:** Exact field matching, removed all duplicates, 100% unique records

Challenge 3: Outlier Property Prices:

- **Issue:** Ultra-premium properties (₹1.8M) and ultra-cheap (₹4K)
- **Solution:** IQR method reviewed all, kept valid outliers, removed only errors

Skills Developed Through This Project:

- **Python Proficiency:** Web scraping, data cleaning, EDA libraries
- **Web Scraping:** BeautifulSoup, Requests, HTML parsing, pagination
- **Data Analysis:** Pandas, NumPy, correlation analysis, statistical validation
- **Exploratory Data Analysis:** Univariate, bivariate, multivariate analysis
- **Statistical Methods:** Descriptive stats, distributions, outlier detection

Conclusion – Takeaways

Six Major Findings Summary

1. Location Dominance: 87% of price variation. 7.7x geographic premium.
2. Three-Tier Structure: Budget (25%), Mid-Range (50%), Premium (15%).
3. Size Irrelevance: 0.1444 correlation. Size explains only 1% of price.
4. Deposit Predictability: 0.9438 correlation. Deposits = 3 months' rent.
5. Property Type Impact: Offices dominate (59.6%). 2.5x premium over shops.
6. Furnishing Premium: 25% rent increase if furnished. 59.5% market prefers unfurnished.

Actionable Outcomes

- For Businesses: Choose location first → negotiate with market data → save 15-20% on rent
- For Landlords: Price at tier rate → invest tier-appropriately → maximize occupancy & income
- For Investors: Identify emerging areas → buy early → 40-60% capital appreciation in 5-7 years

Pune's commercial real estate market is NOT random. Location explains 87% of pricing. With this data-driven framework, businesses, landlords, and investors can make strategic decisions with confidence.

THANK
YOU

