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### 11.433J / 15.021J Real Estate Economics

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# Week 3: The Urban Housing Market, Structures and Density. 

- Hedonic Regression Analysis.
- Shadow "prices" versus marginal costs.
- Land value maximizing FAR.
- FAR and Urban Redevelopment.
- Land Use competition: Highest Price for Housing - versus - highest use for land


## Urban Housing

- Great diversity from historical evolution, changes in technology and tastes.
- Multiple attributes to each house: size, baths, exterior material, style....location
- Consumers value each of these attributes with the normal law of micro-economics: diminishing marginal utility.
- Huge industry has evolved to applying statistical models to understand and predict diverse house prices:
- Property Tax appraisals.
- Automatic Valuation Services for lenders, brokers...


## Hedonic Regression Analysis

1). Linear:

$$
\begin{aligned}
& R=\alpha+\beta_{1} X_{1}+\beta_{2} X_{2}+\beta_{3} X_{3}+\ldots \\
& X \text { 's are structural, location attributes }
\end{aligned}
$$

2). Log Linear:

$$
\begin{aligned}
& \mathrm{R}=\mathrm{e}^{[\alpha+\beta 1 \mathrm{X} 1+\beta 2 \mathrm{X} 2+\beta 3 \mathrm{X} 3+\ldots]} \\
& \ln (\mathrm{R})=\alpha+\beta_{1} \mathrm{X}_{1}+\beta_{2} \mathrm{X}_{2}+\beta_{3} \mathrm{X}_{3}+\ldots
\end{aligned}
$$

3). Log Log:

$$
\begin{aligned}
& R=\alpha X_{1}{ }^{\beta 1} X_{2}{ }^{\beta 2} X_{3}{ }^{\beta 3} \ldots \\
& \ln (R)=\ln (\alpha)+\beta_{1} \ln \left(X_{1}\right)+\beta_{2} \ln \left(X_{2}\right)+\ldots
\end{aligned}
$$

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## Dallas apartment rent Hedonic equation: 1998 (Log monthly rent)

| Regression statistics |  |
| :--- | ---: |
| Multiple R | 0.90518672 |
| R Square | 0.819363 |
| Adjusted R Square | 0.81899567 |
| Standard error | 0.14378576 |
| Observations | 7885 |

ANOVA

|  | df | SS | MS | F | Significance F |
| :--- | :---: | :---: | :---: | :---: | :---: |
| Regression | 16 | 737.8460495 | 46.11538 | 2230.561 | 0 |
| Residual | 7868 | 162.6657463 | 0.020674 |  |  |
| Total | 7884 | 000.5117958 |  |  |  |


|  | Coefficients | Standard error | t Stat | P-value | Lower 95\% | Upper 95\% Lower 95.0 |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Intercept | -0.57141659 | 0.176232118 | -3.24241 | 0.00119 | -0.9168784 | -0.22595 | -0.91688 |
| \#BED | -0.00076159 | 0.004946816 | -0.15395 | 0.877649 | -0.0104587 | 0.008935 | -0.01046 |
| \#BATH | 0.04799528 | 0.005624626 | 8.533063 | $1.69 \mathrm{E}-17$ | 0.0369695 | 0.059021 | 0.03697 |
| LnSQFT | 0.6432852 | 0.012443205 | 51.69771 | 0 | 0.6188932 | 0.667677 | 0.618893 |
| 1/FAR | 0.09504048 | 0.005839225 | 16.27621 | $1.31 \mathrm{E}-58$ | 0.083594 | 0.106487 | 0.083594 |
| LnAGE | -0.08762126 | 0.00195439 | -44.8331 | 0 | -0.0914524 | -0.08379 | -0.09145 |
| LnPARK | 0.09666656 | 0.00533756 | 18.11063 | $7.46 \mathrm{E}-72$ | 0.0862035 | 0.10713 | 0.086204 |
| \#POOL | -0.03185748 | 0.001586528 | -20.08 | $1.67 \mathrm{E}-87$ | -0.0349675 | -0.02875 | -0.03497 |
| RCA | 0.00732288 | 0.000715092 | 10.24048 | $1.86 \mathrm{E}-24$ | 0.0059211 | 0.008725 | 0.005921 |
| SEC | 0.01631909 | 0.002140012 | 7.625699 | $2.71 \mathrm{E}-14$ | 0.0121241 | 0.020514 | 0.012124 |
| WD | 0.00775154 | 0.002556777 | 3.031761 | 0.002439 | 0.0027396 | 0.012764 | 0.00274 |
| APP | 0.02115624 | 0.001660838 | 12.73829 | $8.35 \mathrm{E}-37$ | 0.0179006 | 0.024412 | 0.017901 |
| FP | 0.0181616 | 0.004472787 | 4.060466 | $4.94 \mathrm{E}-05$ | 0.0093937 | 0.026929 | 0.009394 |
| DEN | 0.02276466 | 0.006928009 | 3.285888 | 0.001021 | 0.0091839 | 0.036345 | 0.009184 |
| INT | 0.00872255 | 0.001784347 | 4.88837 | $1.04 \mathrm{E}-06$ | 0.0052248 | 0.01222 | 0.005225 |
| LnHome\$ | 0.17170179 | 0.005361375 | 32.0257 | $1.2 \mathrm{E}-211$ | 0.1611921 | 0.182212 | 0.161192 |
| LnSAT | 0.01175916 | 0.019835531 | 0.592833 | 0.55331 | -0.0271238 | 0.050642 | -0.02712 |

[^0]
## Optimizing House Configuration

- Builders and developers compare the incremental value of additional house features against their incremental cost.
- Profit maximizing house: where the cost of an additional square foot, bath, fireplace falls to the marginal cost of construction.
- But what about land, lot size, density or FAR?
- FAR: floor area ratio (ratio of floor to land area).
- Density: units per acre.
- Density x unit floor area = FAR
- \% of lot "open" = 1-(FAR/stories) (stories>FAR)


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Optimizing House price ( P ) minus construction cost (C) as a function of square feet (see Dallas results)


## FW Dodge data on projects tells the impact of FAR on Costs (see Dallas slide for rent impact)

| Washington, DC Apartments |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Source <br> Model <br> Residual <br> Total | SS <br> 1361.83364 <br> 688.245166 <br> 2050.07881 | $\begin{gathered} \text { df } \\ 44 \\ 7659 \\ 7703 \end{gathered}$ | $\begin{gathered} \text { M3 } \\ 30.9507646 \\ .8986097 \\ \\ .26614031 \end{gathered}$ | Nun $\mathrm{F}(4)$ Pro R-s Adj Root | $\text { fobs }=$ <br> ared | 7704 344.43 0 0.6643 0.6624 0.29977 |
| Ln(cost/sf) | Coef. | Std. Err. | t | $\mathrm{P}>\mathrm{t}$ | [95\% Conf. | Interval] |
| Area | -0.001407 | . 0000897 | -15.69 | 0.000 | -. 0015827 | -0.00123 |
| Units | 0.0011156 | . 0001058 | 10.55 | 0.000 | . 0009083 | 0.001323 |
| Stories | 0.0239439 | . 0021155 | 11.32 | 0.000 | . 0197969 | 0.028091 |
| Steel | 0.1064428 | . 0241704 | 4.40 | 0.000 | . 0590621 | 0.153823 |
| Wood | 0.0201084 | . 0081667 | 2.46 | 0.014 | . 0040995 | 0.036117 |
| Concrete | 0.01922123 | . 0233001 | 8.25 | 0.000 | . 1465378 | 0.237887 |
| Other/Unk | 0.0197511 | . 0125935 | 1.57 | 0.117 | -. 0049357 | 0.044438 |
| 1967 | -1.704015 | . 048317 | -35.27 | 0.000 | -1.798729 | -1.6093 |
| 1968 | -1.668757 | . 0463638 | -35.99 | 0.000 | -1.759643 | -1.57787 |
| 1969 | -1.554727 | . 046054 | -33.76 | 0.000 | -1.645005 | -1.46445 |
| 1970 | -1.524854 | . 0528213 | -28.87 | 0.000 | -1.628398 | -1.42131 |
| 1971 | -1.479251 | . 040121 | -36.87 | 0.000 | -1.557899 | -1.4006 |
| 1972 | -1.434557 | . 0399378 | -35.92 | 0.000 | -1.512846 | -1.35627 |
| 1973 | -1.335804 | . 0434758 | -30.73 | 0.000 | -1.421029 | -1.25058 |
| 1974 | -1.271703 | . 049658 | -25.61 | 0.000 | -1.369047 | -1.17436 |
| 1975 | -1.149854 | . 0558866 | -20.57 | 0.000 | -1.259407 | -1.0403 |

Figure by MIT OpenCourseWare.
1). $P=\alpha-\beta F$

## Optimizing FAR

 $\alpha=$ Price for all housing and location factors besides FAR$\mathrm{F}=\mathrm{FAR}$ $\beta=$ marginal impact of FAR on Price per square foot.
2). $C=\mu+\tau \mathrm{F}$
$\mu=$ "baseline" cost of "stick" SFU construction
$\tau=$ marginal impact of FAR on cost per square foot

If each unit of floor are is unprofitable then so is land regardless of FAR. As FAR approaches zero, land profit is zero no matter how profitable floor area.


$$
\text { 3). } \mathrm{p}=\mathrm{F}[\mathrm{P}-\mathrm{C}]=\mathrm{F}[\alpha-\mu]-\mathrm{F}^{2}[\beta+\tau]
$$

4). $\partial \mathrm{p} / \partial \mathrm{F}=[\alpha-\mu]-2 \mathrm{~F}[\beta+\tau]=0$, or

$$
\begin{aligned}
& \mathrm{F}^{*}=[\alpha-\mu] / 2[\beta+\tau], \text { and } \\
& \mathrm{p}^{*}=[\alpha-\mu]^{2} / 4[\beta+\tau]
\end{aligned}
$$

5). How do prices and FAR vary by:

- Location
- Other factors that shift the parameters

At "better" locations, the price of housing at any FAR is higher. This yields a substitution of capital for land and the optimal FAR rises - helping to offset rise in Prices.


## Boston Back Bay Condominium Example

- From 1984 regression: $\mathrm{R}=222$ - 1.48F, for new 2-bed, 2-bath with parking on Beacon hill. (178-1.48F for end of Commonwealth Ave.
- Construction costs: $\mathrm{C}=100+2 \mathrm{~F}$
- $\mathrm{F}^{*}=17.5, \mathrm{p}^{*}=46$ million per acre (43,560 square feet)
- At F of 4.0, 2-bed, 2-bath existing land has value of 18.8 million ( $40 \%$ as much!)


## "Optimal" Urban Design

- What if you are building a ski resort? Or Designing a "new town", or a Resort?
- Determine how much your clientele discounts FAR.
- Determine how much your clientele is willing to pay for access to the "urban Center": ski lifts, beach, town center.
- At each location from the center figure the optimal FAR and residual land value.
- Develop accordingly. What do Ski resort FAR patterns look like?


## How does actual land use "evolve"?

- Real City Development evolves gradually: from the center outward - always on vacant land at the edge.
- At each time period, there is a "shadow" value for interior land that is already built upon.
- When does that "shadow" value exceed the entire value of the existing structures?
- Fires, disasters create vacant land - shaping development
- Where does redevelopment happen?


Figure by MIT OpenCourseWare, adapted from Bertaud, Alain, and Stephen Malpezzi. "The Spatial Distribution of Population in 48 World Cities: Implications for Economies in Transition."

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## The spatial Pattern of Economic Redevelopment



## Economic Redevelopment

6). The sunk cost of existing structures generates a barrier to the smooth adjustment of FAR.
7). Rarely do we see incremental FAR increases. Rather old uses are destroyed and replace with new. Redevelopment "waves" in NY, Boston
8). Existing "older" structures:

$$
\begin{aligned}
& \mathrm{P}_{0}=\alpha_{0}-\beta \mathrm{F}_{0} \\
& \delta=\text { demolition cost per square foot } \\
& \mathrm{F}_{0}=\mathrm{FAR} \text { of existing use } \\
& \mathrm{P}_{0}=\mathrm{F}_{0}\left[\alpha_{0}-\beta \mathrm{F}_{0}\right] \text { :land acquisition cost }
\end{aligned}
$$

# 9). $\mathrm{p}^{*}-\mathrm{p}_{0}>\delta \mathrm{F}_{0}$ implies 

$\mathrm{F}^{*}\left(\alpha-\beta \mathrm{F}^{*}\right)-\mathrm{F}_{0}\left(\alpha_{0}-\beta \mathrm{F}_{0}\right)>\delta \mathrm{F}_{0}+\mathrm{F}^{*}\left(\mu+\tau \mathrm{F}^{*}\right)$
"increase in value of $>$ "demolition plus
land and capital"

Most likely if $\alpha>\alpha_{0}$ (existing capital deteriorated)
$\mathrm{F}^{*}>\mathrm{F}_{0}$ (new use much more dense)
See: [Rosenthal and Helsley].

## Boston Back Bay Condominium Example

 (continued)- Assume that historic properties have 75\% of the structure value versus new. Hence the value of 1 acre of 4-story brownstones is:

$$
4 \times[166.5-1.48 \times 4] \times 43560=27 m
$$

- Thus even with significant demolition costs the current historic stock might be ready for "market demolition". Zoning?
- Ocean Front in LA? Mid Ring Tokyo?
- The lower existing FAR - the less the opportunity cost of redevelopment.


## Land Use competition between groups

10). $\mathrm{P}_{\mathrm{i}}=\alpha-\mathrm{k}_{\mathrm{i}} \mathrm{d}-\beta_{\mathrm{i}} \mathrm{F}$
$\mathrm{d}=$ distance from desirable location
F = FAR
$\mathrm{i}=1,2$ (different household types)
$\mathrm{k}_{1}>\mathrm{k}_{2}, \beta_{1}>\beta_{2}$
i.e. 1's value location more and mind FAR more (value lot size more).
11). $\quad \partial \mathrm{P}_{\mathrm{i}} / \partial \mathrm{d}=-\mathrm{k}_{\mathrm{i}}$ hence $\mathrm{P}_{1}$ steeper than $\mathrm{P}_{2}$
(previous lecture on location of groups)
11). $\mathrm{p}_{\mathrm{i}}=\max _{\mathrm{F}}: \mathrm{F}\left[\alpha-\mathrm{k}_{\mathrm{i}} \mathrm{d}-\beta_{\mathrm{i}} \mathrm{F}-(\mu+\tau \mathrm{F})\right]$

$$
\begin{aligned}
& \mathrm{F}_{\mathrm{i}}^{*}=\left[\alpha-\mathrm{k}_{\mathrm{i}} \mathrm{~d}-\mu\right] / 2\left[\beta_{\mathrm{i}}+\tau\right], \\
& \mathrm{p}_{\mathrm{i}}^{*}=\left[\alpha-\mathrm{k}_{\mathrm{i}} \mathrm{~d}-\mu\right] \mathrm{F}_{\mathrm{i}}{ }^{*} / 2 \\
& \text { since } \beta_{1}>\beta_{2}, \mathrm{~F}_{1}{ }^{*}<\mathrm{F}_{2}{ }^{*}
\end{aligned}
$$

12). $\quad \partial \mathrm{p}_{\mathrm{i}} / \partial \mathrm{d}=-\mathrm{k}_{\mathrm{i}} \mathrm{F}_{\mathrm{i}}{ }^{*}$

Even though $\mathrm{P}_{1}$ is steeper than $\mathrm{P}_{2}$ it could be the case that $\mathrm{p}_{1}^{*}$ is less steep than $\mathrm{p}_{2}{ }_{2}$

Group 1 is willing to pay the most for houses near the center, but group 2 is willing to pay the most for central land (it is the most profitable group to develop central land for).


FIGURE 4.11 House and land price bids for two household types.

Examples of location and land bidding between groups

- Miami Waterfront has high rise condos populated by elderly who are never on the beach. Those on the beach (younger families) live inland!
- Why would wealthy families live in the center of Paris or Rome, but at the edge of Boston or Atlanta (with a few exceptions)?


## NY Land Residuals: Highest Use? <br> (2004 Data)

| $\underline{\text { Location }}$ | Office |  |  |  | Condo |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | F | $\boldsymbol{P}$ | C | $p$ | F | P | C | $p$ |
| Downtown | 20 | 220 | 250 | (-) | 6 | 524 | 350 | 1050 |
| Midtown | 20 | 376 | 250 | 2500 | 20 | 594 | 350 | 4800 |
| Conn | 4 | 225 | 150 | 300 | 2 | 350 | 200 | 300 |
| NNJ | 4 | 180 | 150 | 120 | 2 | 242 | 200 | 84 |

Sales data from the Internet, Costs from RS Means, 2004.


[^0]:    Log/Log; Verify White Settlement, Rockwall and Ft. Worth HOME\$; all observations;

