

The Housing Stock, Housing Prices, and User Costs: The Roles of Location, Structure and Unobserved Quality

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Modelling Homeownership

- In many models, it is relatively easy to have renters:
 - Downpayment constraints keep young/poor out.
 - High transaction costs of buying/selling discourage short-duration households.
- It is harder to generate owners, particularly at the high rates observed.
 - Most approaches use ad-hoc assumptions which are hard to justify/verify.

Common Approach in Literature to generate Homeownership

Some ways to get homeowners from the literature:

- Exogenous supply restrictions: rentals are smallest available size / max size of rentals.
- Owning gives a *warm-glow* utility premium.
- Tenant-landlord contracting frictions lead to low quality and/or high cost rentals. Set higher depreciation on rentals.
- Tax advantages (Gervais '02).
- Insurance against rent volatility (Sinai & Souleles '05).
- And many others.

Here: Which houses are *selected* for Rental?

- How do houses get selected for either rental or owned sector by investors?
- What characteristics of a house are the main drivers of this selection?
- We cannot exclude that owning gives extra utility, but we ask a different question:

*Under the assumption that people have preferences over location, characteristics, and money, can we understand homeownership **without** resorting to that extra utility?*

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*Under the assumption that people have preferences over location, characteristics, and money, can we understand homeownership **without** resorting to that extra utility?*

- Our results suggest that accounting for unobserved property quality is important.
- It may be enough to explain why people “prefer” ownership, all else equal. (All else is not equal).

What this paper does:

- We develop a model investor choice between rented and owned property markets.
 - Seek to explain why some housing units become rental units while others become owner-occupied.
- We analyze prices, rents and probability of being owned as functions of dwelling characteristics and detailed geographic location.
- We provide a solution to the negative correlation in rent/price and homeownership.
- We use a very simple user-cost model to interpret our estimation results.

Model

Model Overview

- Imagine a general equilibrium model of housing choice.
 - Frictionless transfer from rental to owned sector.
- All agents are price takers.
 - Investors may be risk averse, or plan to sell house in future.
 - They compare present discounted expected value of house in each sector.
- Households match to houses, based on house characteristics.
 - Some characteristics are unobserved to econometrician.

Model

- Property has observable characteristics $z \in \mathbb{R}^n$ and unobservable characteristics $\varepsilon \in \mathbb{R}^2$.
- Observable characteristics include location, type of dwelling (detached, semi-detached, etc.), size (square meters), number of bedrooms, and age of structure.
- Unobserved characteristics captured by a vector ε “unobserved quality”
 - 1 Estimation results suggest that $\dim(\varepsilon) \geq 2$.
 - 2 Allow for different hedonic valuation of unobs. characteristics in each sector

Rental properties: Hedonic rent function

- If a dwelling unit is in rental sector, we observe its rent.
- Assume log annual rent is:

$$\begin{aligned}\ln R(z, \varepsilon) &= \alpha z + \underbrace{\lambda_1^r \varepsilon_1 + \lambda_2^r \varepsilon_2}_{\text{unobserved rental quality}} \\ &= \alpha z + \eta_r\end{aligned}$$

Owner-occupied properties: Hedonic price function

- If dwelling unit is in owned sector, we observe its value (i.e. its price estimated by the owner).
- Assume log value is:

$$\begin{aligned}\ln \pi^o(z, \varepsilon) &= \beta z + \underbrace{\lambda_1^o \varepsilon_1 + \lambda_2^o \varepsilon_2}_{\text{unobserved owned quality}} \\ &= \beta z + \eta_o\end{aligned}$$

Value in rental sector

- Value in rental sector is the expected present value of future revenues minus costs.
 - We never observe this: sales price of rental property.

- Assume that the log-value in the rental sector is:

$$\ln \pi^r(z, \varepsilon) = (\beta - \gamma)z + (\lambda_1^o - \lambda_1^s) \varepsilon_1 + (\lambda_2^o - \lambda_2^s) \varepsilon_2.$$

- $(\gamma, \lambda_1^s, \lambda_2^s)$ capture reduced-form loss in value of renting vs selling to owners.

Selection equation

- Investor sells housing unit to the sector where it has the highest value so that

$$P(z, \varepsilon) = \max_{\{own, rent\}} \{\pi^o(z, \varepsilon), \pi^r(z, \varepsilon)\}.$$

- Observe housing unit in the owner-occupied sector iff

$$\ln \pi^o(z, \varepsilon) \geq \ln \pi^r(z, \varepsilon)$$

- or, unit i is selected into owned market iff

$$\begin{aligned} \mathbf{1}[\text{owned}_i] &= 1 \\ \mathbf{1}[\gamma z_i \geq -(\lambda_1^s \varepsilon_{i1} + \lambda_2^s \varepsilon_{i2})] &= 1 \\ \mathbf{1}[\gamma z_i \geq \eta_{is}] &= 1 \end{aligned}$$

Switching Regression

- Assuming that $\varepsilon \sim N(0, \Sigma)$ gives rise to a (Tobit-5) switching regression with error structure

$$\begin{bmatrix} \text{Rent:} \\ \text{Price:} \\ \text{Selected:} \end{bmatrix} = \begin{bmatrix} \eta_r \\ \eta_o \\ \eta_s \end{bmatrix} \sim \mathcal{N} \left(\begin{bmatrix} 0 \\ 0 \\ 0 \end{bmatrix}, \begin{bmatrix} \omega_r^2 & \rho_{ro}\omega_r\omega_o & \rho_r\omega_r \\ \cdot & \omega_o^2 & \rho_o\omega_o \\ \cdot & \cdot & 1 \end{bmatrix} \right)$$

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- Main specification for z :
 - dwelling type and age,
 - polynomials in size (sq. meters) and distance from Trafalgar square,
 - Location* is a flexible polynomial in 2-dimensional geographic coordinates detailing location of property.

Identification

- Selection model is identified by nonlinearities in inverse mills ratio.
- Exclusion restrictions are hard to find in this market:
 - need IV to affect selection
 - but not value/rent of the property
- Legal restrictions of which property can be rented out could work, but no such policies in place in London around 2011.

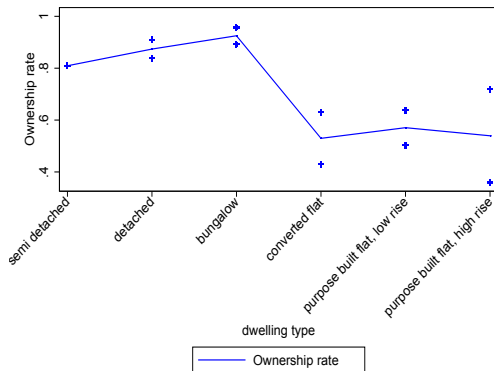
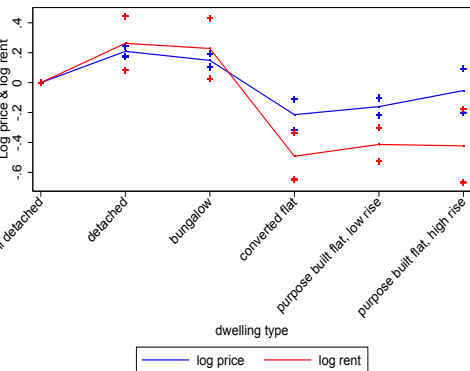
Data

- Data from restricted access version of English Housing Survey (EHS 2011-2014).
- 2011 wave consists of 17,500 households observed in 2008/09.
- Focus discussion on 2011 wave but look at other waves to check robustness over time.
- Focus on a single economic market: all properties within 140km of Trafalgar square ("Greater London").

Results

Prices and selection vs. dwelling type

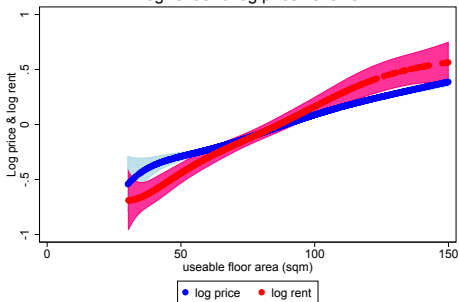
EHS 2011. *Baseline House*: semi-detached 75m² house, 10km northeast of Trafalgar Square, built 1919-1944



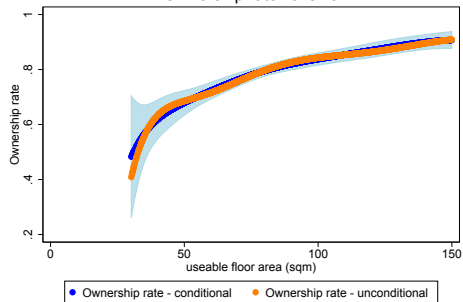
Prices and Selection vs dwelling size

EHS 2011

Log rent and log price vs. size



Ownership rate vs. size



Analytical framework

- Use a Poterba (1992)-style user cost equation.
- User-costs in sector i determined by:
 - Effective discount rate $r^i(z, \varepsilon)$.
 - Maintenance and/or contracting costs $c^i(z, \varepsilon)$.
 - Expected capital gains $g^i(z, \varepsilon)$.

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 - Effective discount rate $r^i(z, \varepsilon)$.
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 - Expected capital gains $g^i(z, \varepsilon)$.
- User-costs in the two sectors satisfy:

$$\pi^o(z, \varepsilon) = \frac{u(z, \varepsilon)}{r^o(z, \varepsilon) + c^o(z, \varepsilon) - g^o(z, \varepsilon)}$$

$$\pi^r(z, \varepsilon) = \frac{R(z, \varepsilon)}{r^r(z, \varepsilon) + c^r(z, \varepsilon) - g^r(z, \varepsilon)}$$

$u(z, \varepsilon)$: utility flow from ownership.

Discussion of Structure Results

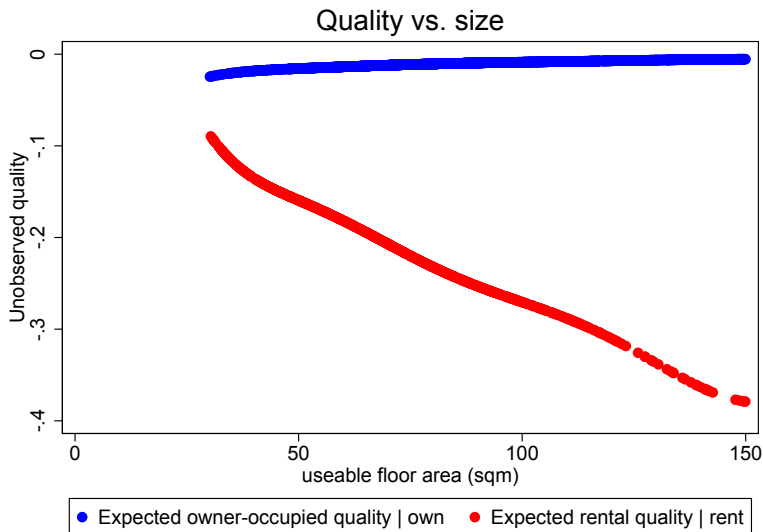
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- More structure implies more ownership: $\frac{\partial \pi^o}{\partial z_s} > \frac{\partial \pi^r}{\partial z_s}$
- But Prices increase slower than Rents with size: $\frac{\partial \pi^o}{\partial z_s} < \frac{\partial R}{\partial z_s}$

Unobserved qualities vs. dwelling size

EHS 2011: Preference for owning?



Differential Costs?

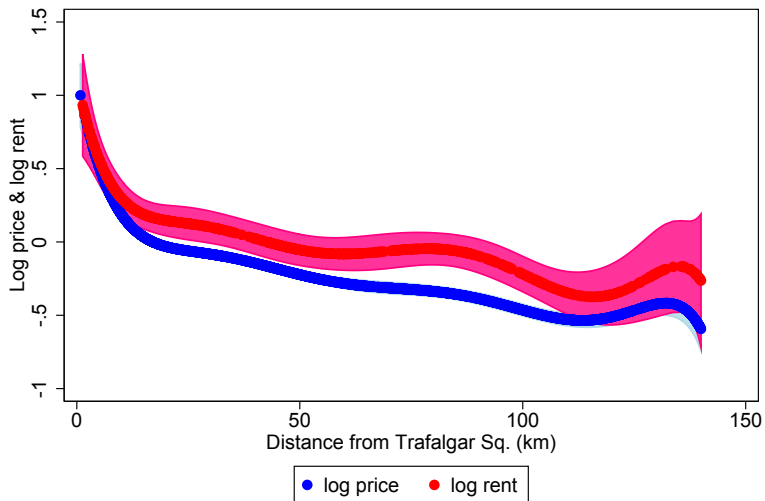
Can different maintenance/contracting costs explain selection on size?

- Would need costs in rental sector to increase faster with size than costs in the owner-occupied sector.
- Theoretical literature from 1980's discussing moral hazard in the rental market makes exactly this prediction.
- Unobservable characteristics may be the ones harder to contract upon.
- Larger rental houses have lower unobserved quality.

Rent and price vs. location

EHS 2011 *baseline house* [▶ More](#)

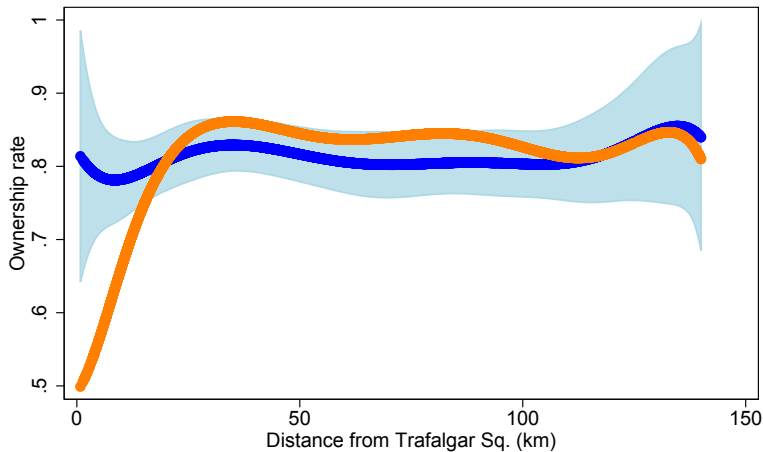
Southwest



Market share vs. location

EHS 2011 *baseline house* [▶ More](#)

Southwest



● Ownership rate: conditional ● Ownership rate: unconditional

Unobserved quality by sector

- Recall the conjecture of $\dim(\varepsilon) \geq 2$:

$$\eta_r = \lambda_1^r \varepsilon_1 + \lambda_2^r \varepsilon_2$$

$$\eta_o = \lambda_1^o \varepsilon_1 + \lambda_2^o \varepsilon_2$$

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- Properties with 1% higher “rental quality” (η_r) are 1% less likely to be in rental sector.
 - $\text{corr}(\eta_r, \eta_s) = \rho_r \approx -1$

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- Properties with 1% higher “rental quality” (η_r) are 1% less likely to be in rental sector.
 - $\text{corr}(\eta_r, \eta_s) = \rho_r \approx -1$
- Properties with higher “owner-occupied quality” (η_o) are equally likely to be in either sector.
 - $\text{corr}(\eta_o, \eta_s) = \rho_s \approx 0$

Unobserved quality by sector

One way to explain these results is as follows.

- Suppose there are two unobserved amenities:
 - 1 $\varepsilon_1 =$ A Jacuzzi
 - Increases flow utility from the property \rightarrow Increases rents
 - But also increases costs \rightarrow Reduces selection into the rental sector
 - Increased costs are capitalized into prices \rightarrow Prices in the owner-occupied sector remain constant.
 - 2 $\varepsilon_2 =$ A Beautiful View
 - No extra costs \rightarrow No affect on selection.
 - Increases flow utility \rightarrow increased rents and prices.

Implications

- We need at least two dimensions for unobserved quality ε to rationalized result.
- Evidence suggests that rental units have lower average unobserved "rental" quality.
- May explain why many models in housing literature require "warm glow" from ownership to explain the high rate of owner-occupancy.

Biased Estimates when Not accounting for Selection

- Selection on unobservables is statistically important. How important?
- It turns out to be qualitatively quite important.
- To illustrate this, we re-estimate our hedonic equations without first controlling for selection.
- A number of puzzles pop up if you looked through this mis-specified lens.

Homeownership and $\frac{\text{Rent}}{\text{Price}}$ *all else equal* (?)

- Consider the following hedonic regressions:

$$\ln R_i = \alpha z_i + u_i$$

$$\ln P_i = \beta z_i + u_i$$

- Predict rent of owned properties, and price for rented ones, and get $\frac{\text{Rent}}{\text{Price}}$ for each.
- What's the correlation between market share of owned flats and this $\frac{\text{Rent}}{\text{Price}}$?

Homeownership and $\frac{\text{Rent}}{\text{Price}}$ all else equal (?)

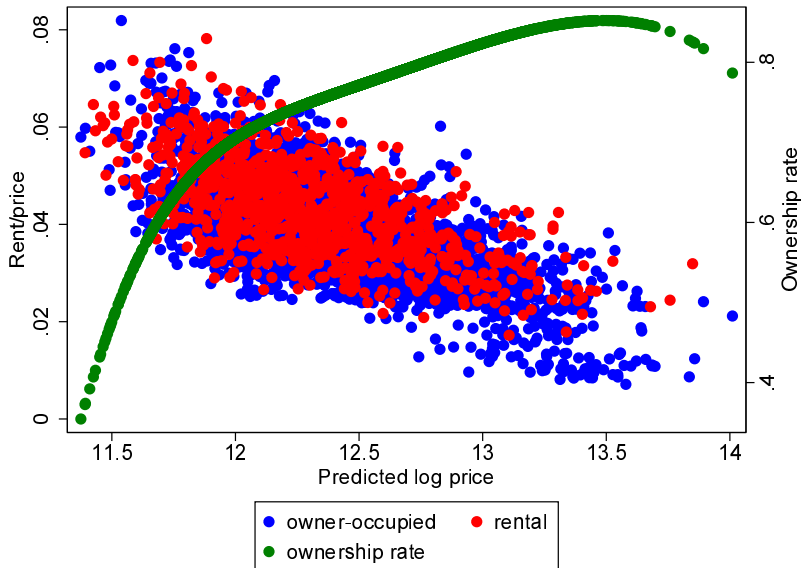
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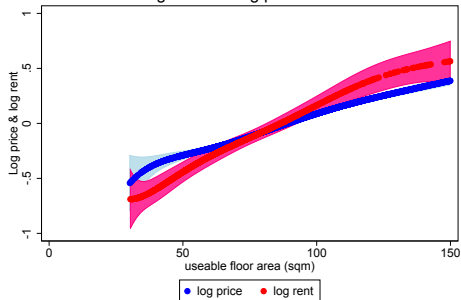
- Predict rent of owned properties, and price for rented ones, and get $\frac{\text{Rent}}{\text{Price}}$ for each.
- What's the correlation between market share of owned flats and this $\frac{\text{Rent}}{\text{Price}}$?
- As price increases, homeownership *increases* and $\frac{\text{Rent}}{\text{Price}}$ *decreases*.
- But why buy relatively expensive properties when (seemingly) equivalent rentals are much cheaper?

Homeownership and $\frac{\text{Rent}}{\text{Price}}$: all else *NOT* equal!

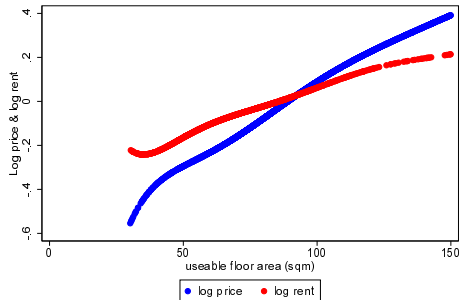


Bias in hedonic price functions: Slopes!

Log rent and log price vs. size



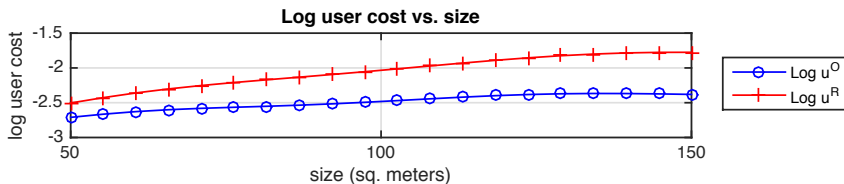
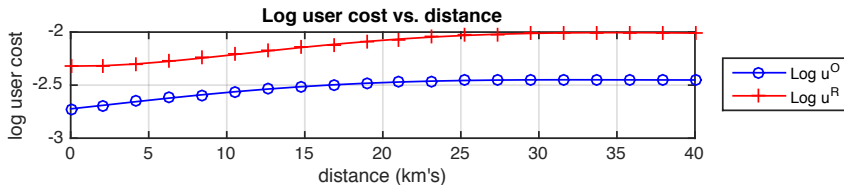
Rent and Price vs. Size



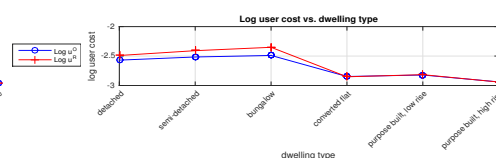
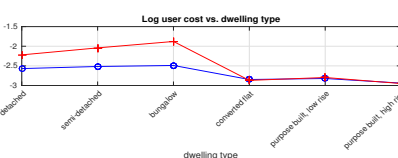
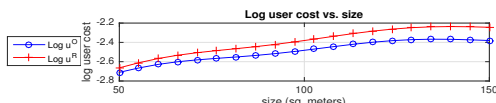
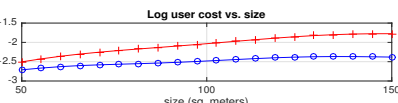
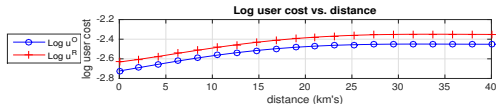
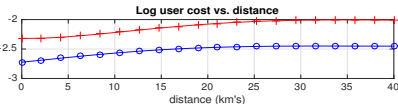
Estimating user costs

- We can use our estimates to back out how rental and own-occ user costs vary across properties.
 - We assume here that $R = u$, i.e. the service flow from the house is identical in both sectors.
- To do so we need to observe what the level of user costs are in the rental sector for at least one type of property.
- Fortunately, Bracke (2015) reports the r/p for a set of houses that are bought and then rented out.
- Then every parameter is exactly identified, except ω_{33} , which can be narrowed down to one of two values.

Empirical User Costs



Empirical User Costs



Contracting costs in rental sector: further assumptions

- Assume discount factors are equal across sectors:

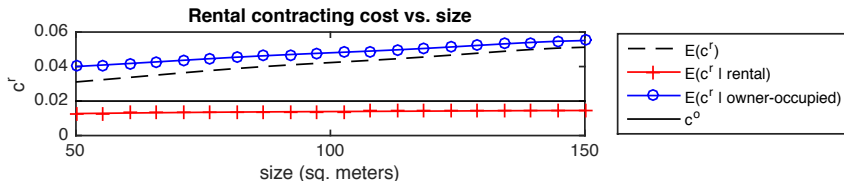
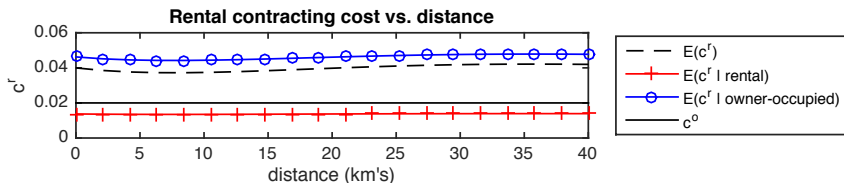
$$r^r(z, \varepsilon) = r^o(z, \varepsilon).$$

- Assume expected capital gains are equal across sectors:

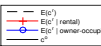
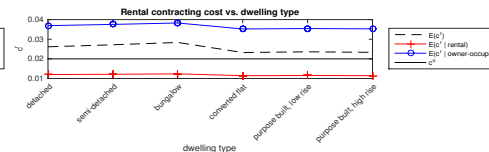
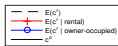
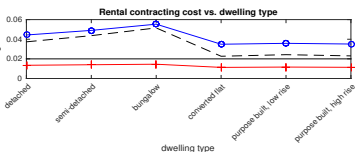
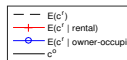
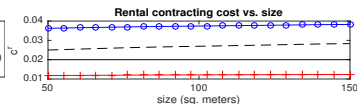
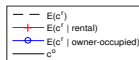
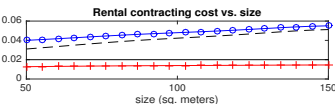
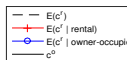
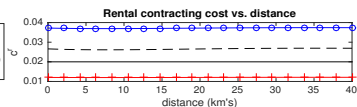
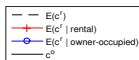
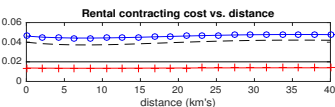
$$g^r(z, \varepsilon) = g^o(z, \varepsilon).$$

- Then we can estimate magnitude of contracting frictions in rental sector.

Contracting costs in rental sector: how does c^r vary?



Contracting costs in rental sector: how does c^r vary?



Final Point: What's next

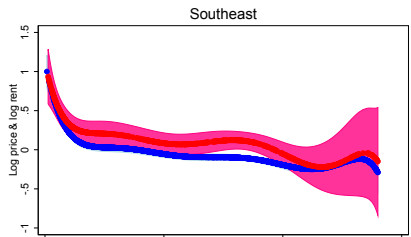
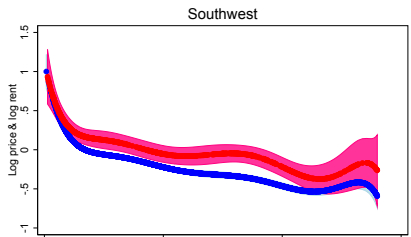
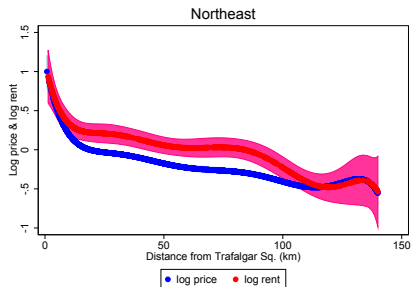
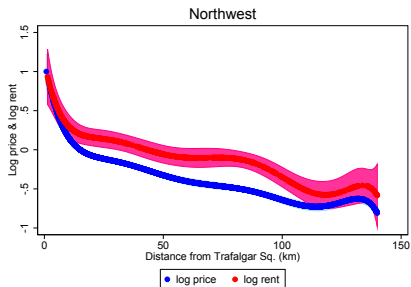
- The decisions to buy/sell/save for a home are likely strongly connected to what type of house you want to live in.
- In particular, the tradeoff between location and physical characteristics.

Final Point: What's next

- The decisions to buy/sell/save for a home are likely strongly connected to what type of house you want to live in.
- In particular, the tradeoff between location and physical characteristics.
- Connects urban economics to macroeconomics through the financial decisions of households.

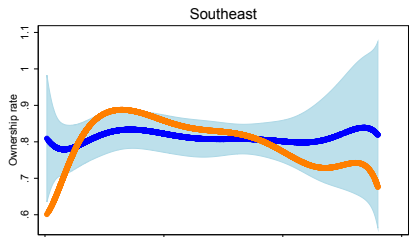
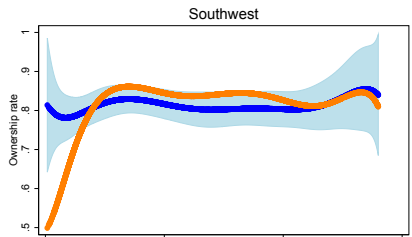
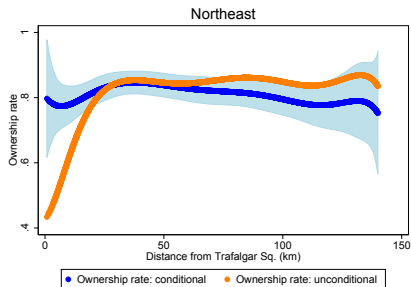
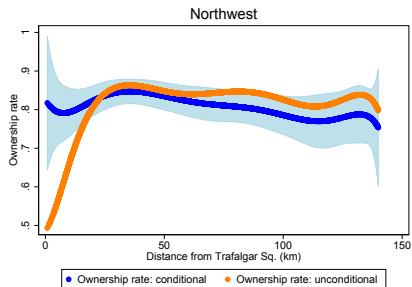
Rent and price (of the *baseline house*) vs. location

EHS 2011 [▶ back.](#)



Market Share vs. location

EHS 2011 [▶ back.](#)



Maintenance Costs as a fraction of value

- Remember the user cost formulation

$$R(z) = (r + c(z) - g)\pi^r(z)$$

- Assume value is composed of land and structure value:

$$\pi^r(z) = VL(z) + VS(z)$$

- Also, total cost is

$$TC = c(z)\pi^r(z)$$

- Assume maintenance only for structural part: $c_0 VS(z)$
- Then

$$\begin{aligned} TC &= c_0 VS(z) \\ c(z)\pi^r(z) &= c_0 VS(z) \\ c(z) &= \frac{c_0 VS(z)}{VL(z) + VS(z)} \end{aligned}$$