

# Innovation and Entrepreneurship in Housing\*

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## Abstract

In this chapter, I discuss innovation and entrepreneurship in residential real estate and construction (housing). Based on R&D spending and patent statistics, housing does not appear to be a very innovative sector. But in the last two decades, there has been a significant increase in the amount of investment going to real estate technology companies. I discuss the companies and technologies which have drawn the most attention from investors. I then review the literature on two major innovation trends in housing: the growth of the internet as a tool for housing search, and the development of home-sharing platforms which allow homeowners to use their homes as short-term rentals. These innovations have likely increased the efficiency of housing markets, leading to higher quality matches between buyers and sellers, and more efficient utilization of space. However, the effects are hard to measure due to the difficulty of separating quality changes from price changes. In comparison to residential real estate, there appears to have been less recent innovation in residential construction. In many areas, residential construction is artificially constrained by local land use policies, and estimates from the literature suggest that relaxing these constraints could increase economic growth significantly. Finally, I discuss anti-competitive practices in real estate which may hinder entrepreneurship and the adoption of new innovations, and I discuss how innovation and entrepreneurship in other sectors may affect the housing market.

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# 1 Introduction

In this chapter I discuss innovation and entrepreneurship in housing as it relates to economic growth and productivity. There are two main issues that I seek to address in this chapter: 1) What is the impact of innovation and entrepreneurship as a driver of productivity and growth in housing, and 2) What are the factors that facilitate or hinder innovation and entrepreneurship in housing. Since housing is such a large and important part of the economy, the answers to these questions have important implications for the impact of innovation and entrepreneurship on overall economic growth and well-being.

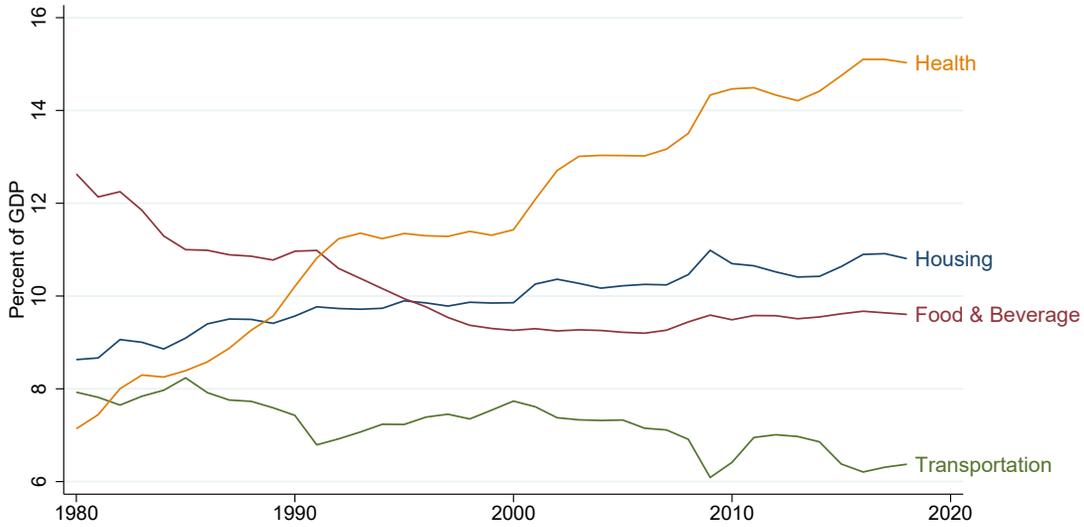
## 2 Overview of the Housing Sector

Housing is a large and growing sector of the economy. From 1980 to 2018, personal consumption expenditures on housing rose from 8.6% to 10.8% of GDP. Of the major household spending categories shown in Figure 1, only healthcare grew at a higher rate over the same period.

Because housing is durable, most of the economic activity in housing is related to the leasing, sale, and management of existing housing stock (i.e. the real estate industry). A relatively smaller share of the economic activity is related to the actual production of new housing (i.e. the construction industry). Figure 2 shows the size of the real estate, construction, and a few other industries in terms of gross output as percentage of GDP, as measured by the BEA. In 2018, gross output of residential real estate was \$2.2 trillion, and for residential construction it was \$681 billion.

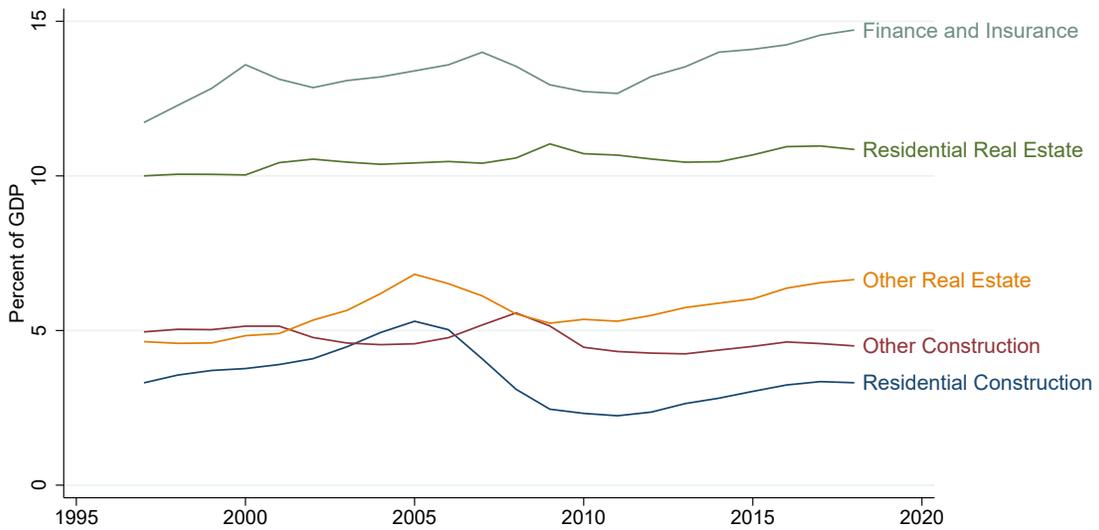
An important measurement issue that arises in housing is how to value the economic output of owner-occupied housing. A standard thought experiment illustrates the problem: suppose Annie and Betty own and live in identical houses next door to each other. Because each owns her own house, no rental payments are made, and no value of housing services is recorded. Now, suppose they switch houses without changing ownership. Instead, Annie pays Betty \$1,000 in monthly rent and Betty pays Annie \$1,000 in monthly rent. Annie and Betty are each no better or worse off, but economic output appears to have increased by \$2,000 a month. Conceptually, economic output should not depend on whether Annie and Betty chose to live in their own homes, or chose to rent from each other, and so national income

Figure 1: Personal Consumption Expenditures on Selected Goods and Services as Percent of GDP, 1980-2018



Source: BEA National Income and Product Accounts. Transportation includes vehicles, parts, gasoline, and transportation services.

Figure 2: Gross Output of Selected Industries as Percent of GDP, 1997-2018



Source: BEA Industry Economic Accounts.

accountants have developed methods for estimating what is known as the imputed rent of owner-occupied housing (BEA, 2019). Roughly speaking, the imputed rent can be thought of as the rent that the owner-occupier would have to pay to rent a house of similar quality and characteristics. Imputed rents of owner-occupied housing form a large share of the measured economic output in residential real estate. In 2018, imputed rents from owner-occupied housing were \$1.6 trillion, while rents from tenant-occupied housing were \$611 billion.

Although the National Income and Product Accounts measure a high level of economic output in housing, most of it does not come from firms. Table 1 shows industry statistics from the 2017 Economic Census for selected housing-related subsectors. Despite residential real estate’s relative importance in terms of total economic output, it is comparatively small in terms of firm revenue and employment. The discrepancy arises because most real estate rental payments are either imputed (for owner-occupiers) or paid to individuals not classified as firms.<sup>1</sup> Moreover, both residential real estate and construction are highly competitive, loosely concentrated industries, with the average firm earning less than \$2 million in annual revenues. The disconnect between total economic output and firm revenues suggests that the social returns to innovation in housing may exceed private returns. I return to this thought later in the chapter.

Finally, it is important to note that housing consists of both structure and land—and related to land, location—hence the old real estate adage, “Location, location, location.” Innovations that affect the ability to produce structures on land and innovations that affect the ability to derive more value out of the same size or location of land both will affect economic growth and productivity in housing.

Structures and land have very different supply-side characteristics. The supply of structures is affected by the labor market for construction workers, materials costs, and topography. The amount of buildable land in desirable locations, however, is in fixed supply. In theory, the availability of buildable land does not put any hard con-

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<sup>1</sup>The BEA estimates economic output in real estate using all rental payments regardless of who the recipient is (including imputed rents for owner-occupiers). Thus, rental payments made to individual landlords and to firms not primarily engaged in the real estate business would be counted in gross output (BEA, 2009). In contrast, the Economic Census only measures the revenue received by real estate firms. Individual landlords will typically not be counted as firms in the Economic Census because the Economic Census counts non-employer firms based on business income tax filings, which does not include individuals’ real estate rental income reported on 1040 Schedule E (Census, 2019).

Table 1: Statistics for Selected Industries, 2017

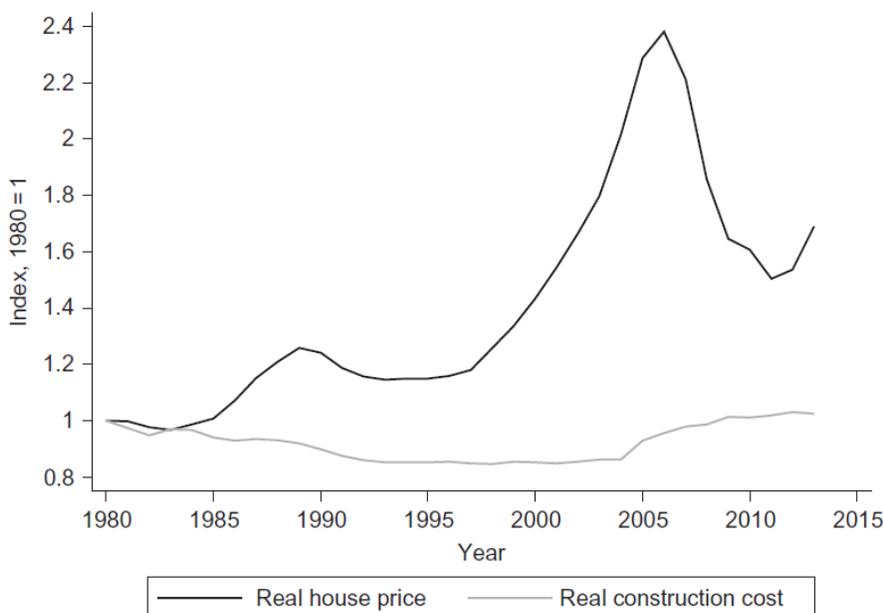
NAICS	Industry Description	Number of Firms	Number of Establishments	Total Revenue (\$bil)	Number of Employees
531	Real Estate	283,734	350,536	477.2	1,687,621
53111	Lessors of residential dwellings	52,243	71,552	120.2	361,997
53121	Offices of real estate agents and brokers	106,548	121,901	113.7	333,854
531311	Residential property managers	35,668	49,420	45.3	449,176
2361	Construction of residential buildings	170,510	171,901	342.1	690,798

Source: Economic Census. Real estate includes both residential and non-residential real estate. Construction of residential buildings does not include subcontractors (NAICS 2332) due to lack of data.

straint on the quantity of housing if housing could be built as densely as desired, but in reality most cities and neighborhoods in the U.S. place restrictions on the density of residential construction. Figure 3, which is a reproduction of Figure 19.1 in Gyourko and Molloy (2015), shows that growth in house prices has vastly outpaced the growth in the labor and material costs of construction—which has been flat—suggesting that most of the growth in house prices comes from growth in the price of land as opposed to structures, some of which may be caused by regulations. Thus, local land use policy is an important factor when discussing productivity and growth in housing, and it may be that innovations to *policy* would be more marginally productive than technological innovations in the housing industry. I return to this thought later in the chapter.

The rest of this chapter is organized as follows. In section 3, I discuss the existing data on innovation, entrepreneurship, and productivity in residential real estate and construction, and compare to other sectors. Based on R&D spending and patenting statistics, direct innovation inputs and outputs in real estate and construction are shown to be miniscule. However, the amount of venture capital investment in real estate technology companies is growing rapidly, especially from 2013 to 2019. The major waves of innovation in residential real estate from 2000 to 2019 are: 1) the growth of online portals for housing search, 2) the growth of home-sharing platforms that allow homeowners to use their homes as short-term rentals, 3) the growing use of property management software, and 4) the growth of companies using technology to compete directly with residential brokers. The best available statistics on labor productivity show that labor productivity has been roughly flat in single-family residential construction, but growing recently in multi-family residential construction.

Figure 3: Real Construction Costs and House Prices, 1980-2013



Notes: This is a reproduction of Figure 19.1 from Gyourko and Molloy (2015). Construction costs are the cost, including labor at union wage rates, of an economy-quality home from RSMMeans deflated by the consumer price index. House prices are the repeat-sales index published by CoreLogic deflated by the price index for personal consumption expenditures, excluding housing services.

Labor productivity in real estate has been growing, and this appears to be mostly explained by a deepening of software and IT capital, as well as deepening in purchased services. The productivity statistics should be interpreted with caution, however, due to measurement issues which I discuss in the chapter.

In section 4, I review the literature on how the internet has affected housing search. In theoretical models, the growing use of internet in housing search has been modeled as either a decline in search costs or an increase in matching efficiency. The main theoretical prediction of a lowered search cost or increased match efficiency is that buyers and sellers will search more intensely, resulting in a higher number of visited homes and higher average transaction price due to higher surplus between buyer and seller. Empirical evidence is limited by the difficulty of isolating variation in internet use, but the existing evidence appears to consistently show that internet use by either the buyer or the seller results in higher prices, but not necessarily shorter search durations. If the main effect of increased search efficiency is higher match quality, but not necessarily shorter search durations or higher rates of sale, then the effect of

internet search on the productivity of housing may be hard to measure because it is difficult to separate quality from price. The number of homes sold per hour worked in the real estate brokerage industry has not changed much over the past 30 years, and realtor commissions have not been driven down significantly by the growth of internet search, though this may also be due to anticompetitive practices, which I discuss further in section 6.

In section 5, I review the literature on how the growth of home-sharing platforms like Airbnb has affected the housing market. Home-sharing is one of the largest targets for venture capital investment in residential real estate over the last 10 years. In theory, what home-sharing platforms do is they make it easier for homes that are traditionally supplied in the residential housing market to instead be supplied to the short-term rental market (or travel accommodations market). For homeowners, this increases the option value of spare capacity in housing, which should raise the price of housing. Furthermore, if some homeowners switch from supplying the residential market to the short-term rental market, then rental rates in the residential market will increase further. The empirical literature suggests that, in the short-run at least, home-sharing platforms have indeed caused reallocation from the long-term rental market to the short-term rental market, along with a corresponding increase in rental rates and house prices. It is still unclear what the long-run effects of home-sharing will be. There could be an increase in the quantity of residential housing and a decrease in the quantity of hotel rooms, and there could be growth in the number of housing units built with spare capacity in mind, such as with attached dwelling units or Pied-à-terres. Empirically, however, it is still too early to test for long-run effects.

In section 6, I discuss the future outlook of innovation and entrepreneurship in housing, as well as our study of it. I discuss measurement issues in housing and how better measurement can help us to better understand the full impact of recent technological innovations. I discuss anti-competitive practices in the real estate brokerage industry, and how that may be hindering entrepreneurship and the adoption of new innovations. I discuss how land use regulations may be hindering economic growth—not just in housing but in the economy as a whole. I discuss how innovations in other sectors can affect housing through their effect on locational preferences, amenities, and transportation costs. And I briefly discuss how housing can influence innovation and entrepreneurship in other sectors. Section 7 concludes.

## 3 Key Trends and Cross-Sectoral Metrics

### 3.1 Innovation Inputs and Outputs

Traditionally, residential real estate and construction are considered low-innovation industries. Writing for *Forbes*, David Snider and Matt Harris write that “up until a few years ago there were only a handful of significant U.S. real estate tech success stories” (Snider and Harris, 2018). They attributed the lack of high tech success in real estate to difficulties in creating “meaningful client value” and “competitive barriers” in a space that is defined by “real and physical experiences,” as well as to landlords and developers who are “reticent to make significant investments.” There is likely much truth to this, as the real estate and construction industries are loosely concentrated and dominated by very small firms (Table 1), indicating perhaps a lack of economies of scale that would make significant investments worthwhile.

Data on actual innovation inputs and outputs seem to confirm this sentiment. Figure 4 shows R&D spending as a percent of revenue for selected industries in 2016. R&D spending in the real estate, rental, and listing industries (NAICS 531-532, the lowest industrial level reported in the BRDIS) is less than a tenth of one percent, compared to 3.4 percent for the manufacturing sector and 13.5 percent for research-intensive industries like pharmaceuticals. R&D spending is not reported for the construction industry, but it totals less than \$930 million, which is again less than a third of one percent of construction industry revenues, and probably much smaller.<sup>2</sup> Data on measured innovation output, such as patents, is similarly miniscule. In 2016, the BRDIS reports that companies in the real estate, rental and leasing industry (NAICS 53) filed for only 87 patents in total, and the number of patents issued was smaller than the disclosure threshold.

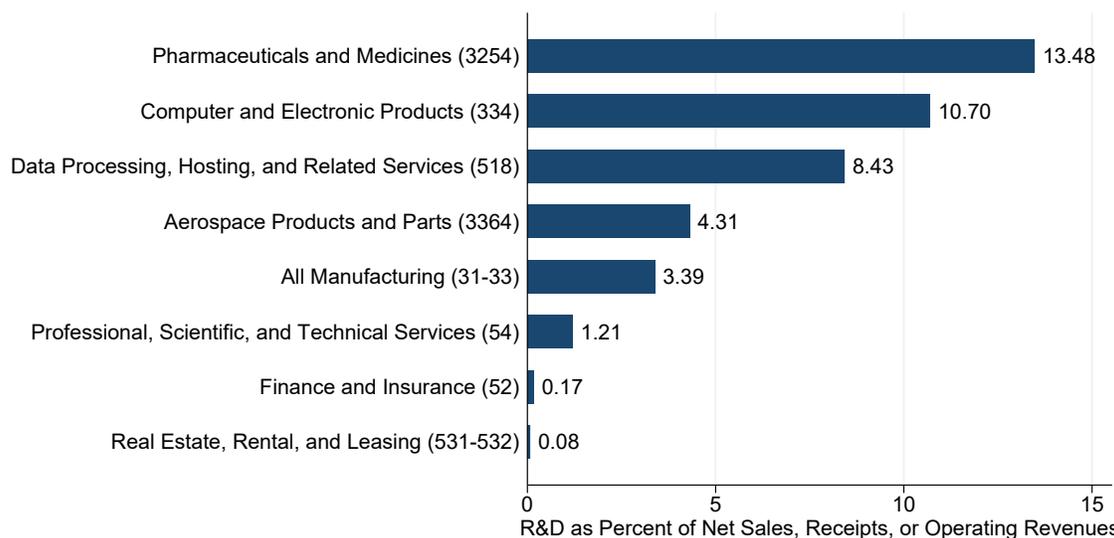
### 3.2 Entrepreneurship

The data on measured innovation inputs and outputs paints a picture of low innovation in the housing sector. However, this belies a general sense that the real estate business is being transformed by technology. Everyone is familiar, for exam-

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<sup>2</sup>The BRDIS reports that total R&D spending for non-manufacturing industries (including construction) was \$119,690 million, and for the reported sub-industries (not including construction) the total R&D spending was \$118,760 million, so R&D spending in construction was at most \$930 million.

Figure 4: R&D Spending for Selected Industries, 2016

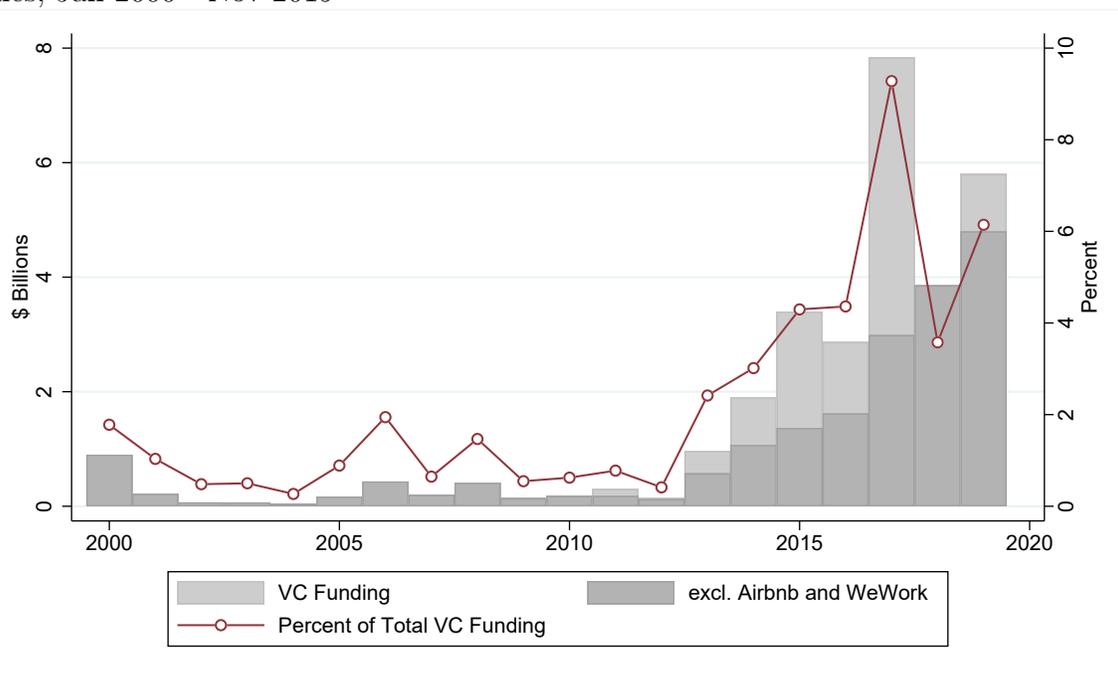


Source: R&D spending is from the NSF Business R&D and Innovation Survey. Manufacturing revenue is from the Quarterly Financial Reports, non-manufacturing revenue is from the Service Annual Survey.

ple, with how internet marketing of homes through websites like Zillow and Redfin have transformed the way people buy and sell homes. According to a recent report by the National Association of Realtors, 48% of real estate firms cited keeping up with technological change as one of the biggest challenges they currently face (NAR, 2018).

Data on venture capital funding shows that there is indeed growing investor interest in real estate technology. Figure 5 shows the amount of venture capital funding for real estate and construction related companies, as reported by CrunchBase, a data vendor specializing in tracking startups and innovative companies. I focus on both residential and commercial real estate and construction because the innovations and technologies driving both sectors appear to be similar, and because it is difficult to accurately distinguish between residential and commercial in the CrunchBase data. The data show that \$900 million in venture capital was raised by real estate and construction related companies in 2000, but by November 2019 this number had grown to \$5.8 billion. This growth is not an artifact of a shift in the total amount of venture capital funding, nor does it reflect spurious growth in the amount of data that CrunchBase collects: Figure 5 shows that venture capital in real estate and construction is growing at a rapid rate even when measured as a percentage of all

Figure 5: Venture Capital Funding of Real Estate and Construction Related Companies, Jan 2000 - Nov 2019



Source: CrunchBase. Only companies headquartered in the U.S. are included. Real estate and construction related companies are companies that CrunchBase has identified with at least one of the following category tags: “Real Estate”, “Commercial Real Estate”, “Property Management”, “Property Development”, “Home Improvement”, “Home Renovation”. Short-term vacation rental companies like Airbnb were also included.

venture capital funding reported in CrunchBase. Moreover, this growth is not driven by just a handful of superstar companies. WeWork and Airbnb are the two largest fundraisers through this time period, but even if they are excluded from the data, the amount of venture capital funding for real estate and construction related companies still increased markedly after 2013, and is steadily growing.

It is instructive to look at which of these companies received the most venture capital funding over the last two decades. Figure 6 shows a selection of major venture capital fundraisers for each half-decade starting from 2000. The first wave of innovation occurred in the early 2000s with the movement towards the online marketing of homes via web portals. Interestingly, the initial wave of web portals were not necessarily the most successful ones in capturing the market. The second wave of online portals, including Zillow and Trulia, now command a larger share of real estate searches, and Zillow is the market leader in residential real estate today. Besides online portals, the 2000s also saw investments in developers of property management

software, which suggests capital deepening in the real estate industry, as well as the beginnings of the nascent home-sharing industry with HomeAway.

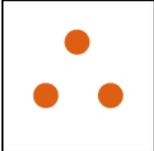
By the first half of the 2010s, the online portal business appears to have matured, with fewer online portals raising significant amounts of venture investment. Zillow filed for IPO in 2011 and acquired Trulia in 2015, solidifying its position as the market leader in residential real estate portals. Instead, the early 2010s saw the emergence of a number of new businesses harnessing technology to directly compete with traditional firms in related markets. Airbnb, a vacation rental platform that allows homeowners to rent rooms or their entire house to vacationers, is one of the most highly valued startups in the world and competes directly with the hotel industry. Houzz is an online platform for interior design and home improvement where people can share design ideas and match with contractors. RedFin and Compass bill themselves as technology driven brokerages, believing that technology will give them a competitive advantage against more traditional brokers. Cityscape Residential is a multifamily residential property developer and is the only company on this list which does not appear to be explicitly technology driven. Its inclusion may highlight a potential trend in multifamily housing development, which I return to discuss later.

The late 2010s saw the emergence of a new type of technology-driven real estate business: the i-Buyer. i-Buyers are companies that want to cut out the middle-man in housing transactions and simplify the home-selling process. They use machine learning to estimate the market value of a home, make offers to sellers so that sellers can circumvent the long and complicated selling process and avoid paying realtor fees, and then flip the house for a profit. They also collect fees like realtors, but they believe that sellers are willing to pay the fee for the convenience. i-Buyers have attracted significant investor interest, to the tune of over \$1.7 billion in venture capital over the last 3 years. It is still too early to tell what effects this will have on the housing market.

### **3.3 Labor Productivity**

The growth of online portals, property management software, and technology-driven brokerages suggests that technological capital and service inputs are becoming increasingly important for the real estate industry. Has this translated to an increase in labor productivity?

Figure 6: Major Fundraisers Among Housing Related Companies, Jan 2000- Nov 2019

<p><b>HomeGain.com</b></p>  <p>\$53M raised Online Portal</p>	<p><b>HomeAway</b></p>  <p>\$477M raised Vacation Rental</p>	<p><b>Airbnb</b></p>  <p>\$794M raised Vacation Rental</p>	<p><b>Airbnb</b></p>  <p>\$2.6B raised Vacation Rental</p>
<p><b>RealPage</b></p>  <p>\$52M raised Property Management Software</p>	<p><b>Zillow</b></p>  <p>\$87M raised Online Portal</p>	<p><b>Houzz</b></p>  <p>\$214M raised Home Design</p>	<p><b>Compass</b></p>  <p>\$1.5B raised Brokerage</p>
<p><b>Rent.com</b></p>  <p>\$47M raised Online Portal</p>	<p><b>Trulia</b></p>  <p>\$33M raised Online Portal</p>	<p><b>Redfin</b></p>  <p>\$178M raised Brokerage</p>	<p><b>Opendoor</b></p>  <p>\$1.3B raised iBuyer</p>
<p><b>Homes.com</b></p>  <p>\$39M raised Online Portal</p>	<p><b>Redfin</b></p>  <p>\$32M raised Brokerage</p>	<p><b>Cityscape Residential</b></p>  <p>\$82M raised Multifamily Developer</p>	<p><b>Vacasa</b></p>  <p>\$527M raised Vacation Rental</p>
<p><b>ZipRealty</b></p>  <p>\$35M raised Brokerage</p>	<p><b>Appfolio</b></p>  <p>\$30M raised Property Management Software</p>	<p><b>Compass</b></p>  <p>\$73M raised Brokerage</p>	<p><b>Knock</b></p>  <p>\$448M raised iBuyer</p>
<p>2000-2004 \$1,299M Raised</p>	<p>2005-2009 \$1,349M Raised</p>	<p>2010-2014 \$3,492M Raised</p>	<p>2015-2019 \$23,755M Raised</p>

Source: Crunchbase. The companies are not exactly the top 5 largest fundraisers in each half-decade, but all are in the top 10. The companies were chosen to be representative of innovative trends in housing.

Unfortunately, measuring productivity in construction and real estate is a challenging task. The Bureau of Labor Statistics has only recently begun to produce official estimates of labor productivity in the residential construction industry (Sveikauskas, Rowe, and Mildemberger, 2018) and still does not produce any official estimates of productivity in the residential real estate industry. One of the main difficulties is that buildings vary widely in their quality and characteristics, making it difficult to construct reliable output price deflators. Another difficulty, especially as it pertains to real estate, is accounting for the depreciation of structures, as well as the treatment of owner-occupied housing and non-firm entities that receive rental payments, as discussed earlier. Nevertheless, it is instructive to look at trends in labor productivity with the measures that are available.

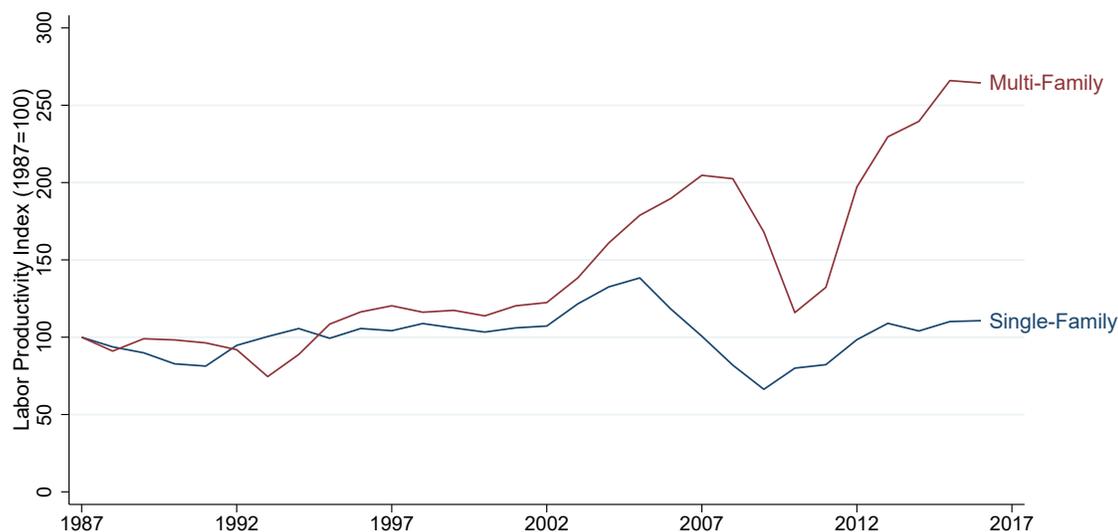
### **3.3.1 Labor Productivity in Residential Construction**

In 2018, the BLS began publishing official estimates of gross output-based labor productivity separately for residential and non-residential construction. The advance is attributed to improved producer price indexes for the separate construction sub-industries, also published by the BLS.<sup>3</sup> Figure 7 reports these estimates separately for the single-family residential construction industry and the multi-family residential construction industry. Labor productivity in single-family construction has been roughly flat for the last two decades, consistent with the evidence in Gyourko and Molloy (2015) (Figure 3) that the real construction cost of single family housing has not changed much. Labor productivity in multi-family construction is a much different story, with significant productivity gains especially within the last 15 years. Because data on capital expenditures for multi-family construction is not readily available, it is not immediately clear whether these gains are due to increases in total factor productivity or capital deepening. Another issue is that these measures do not reflect subcontractor hours. Sveikauskas, Rowe, and Mildemberger (2018) showed that accounting for subcontractor hours significantly reduces the gains in multifamily labor productivity, though the overall trend is still that multifamily labor productivity is growing at a much faster rate than single-family labor productivity.

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<sup>3</sup>The new producer price indexes are not based on the sale prices of actual buildings. Instead, the BLS establishes a building with standardized features and collects cost information from many builders. The cost data is then supplemented with information on profit margins beyond these costs. See Sveikauskas, Rowe, and Mildemberger (2018) for a further discussion.

Figure 7: Labor Productivity in Residential Construction, 1987-2016



Source: Bureau of Labor Statistics, Office of Productivity and Technology.

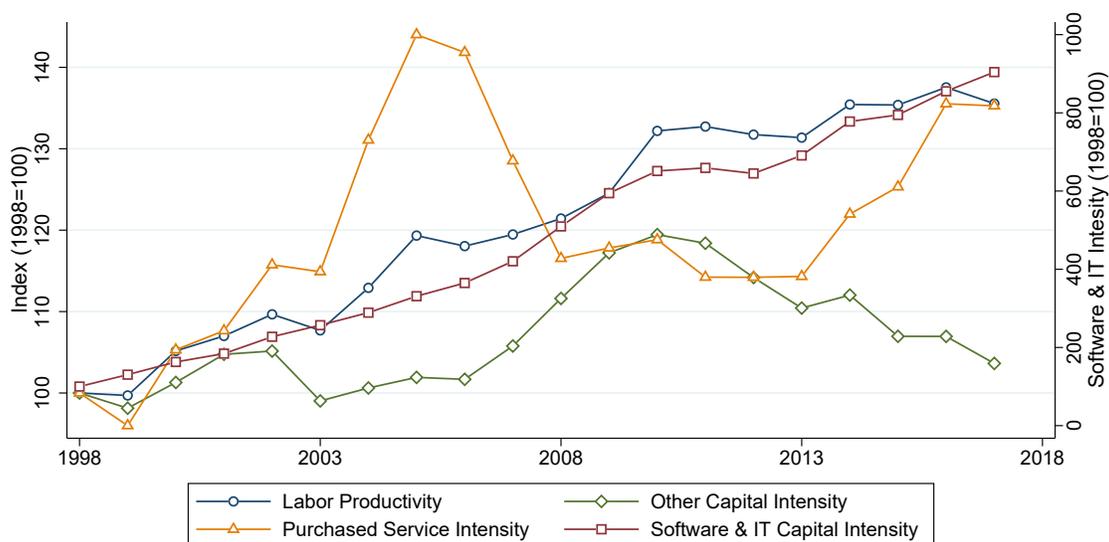
### 3.3.2 Labor Productivity in Real Estate

Currently, neither the BLS nor the BEA publish official estimates of labor productivity in the residential real estate industry. The BEA does publish an estimate of labor productivity in real estate as a whole (NAICS 531), through its Integrated Industry-Level Production Account (KLEMS Account).<sup>4</sup> The KLEMS data must be interpreted with caution, however, because of the discrepancy in how gross output is measured and how inputs are measured. In the KLEMS account, gross output in real estate includes all rental payments made, including to firms not primarily classified as real estate and to non-firm landlords. The imputed rents of owner-occupiers are also included. Data on inputs, however, are typically measured from surveys of real estate firms and establishments (see BEA, 2009). Thus, there is a difference in the entities from which gross output is measured and from which inputs are measured. It is likely that a significant amount of both labor and capital input goes unmeasured in real estate, such as the amount of time individual landlords and owner-occupiers spend managing their properties, and the equipment, software, and services they employ to help them.

Nevertheless, I present in Figure 8 labor productivity estimates as reported in

<sup>4</sup>Available at <https://www.bea.gov/data/special-topics/integrated-industry-level-production-account-klems>. “KLEMS” stands for capital, labor, energy, materials, services.

Figure 8: Labor Productivity and Capital and Service Intensity in Real Estate, 1998-2017



Source: BEA-BLS Integrated Industry-Level Production Accounts. Intensity is the quantity of the input divided by the quantity of labor.

the BEA’s KLEMS accounts. According to BEA KLEMS data, labor productivity in real estate has been steadily rising since 1998. Over the same period, software and IT capital intensity rose by over 900 percent. By contrast, other non-software and non-IT capital intensity did not rise by nearly as much. The intensity of purchased services also increased, though it exhibits much more cyclicity than the intensity of software and IT capital.

### 3.4 Summary

I now summarize the information presented in this section on sectoral trends and metrics.

#### 1. Real estate and construction firms perform little resesarch and development.

Data from the NSF Business R&D and Innovation Survey shows that real estate and construction firms spend very little on R&D and produce very few patents. This is not surprising, and does not imply that real estate and construction firms do not innovate. Rather, whatever innovation does occur is not reported as R&D on the

BRDIS, or perhaps the R&D is not conducted by real estate firms themselves, but rather by software and technology companies that service the real estate industry.<sup>5</sup>

## **2. There is growing investor interest in real estate technology companies.**

Venture capital funding for real estate technology companies has increased rapidly since the early 2000s. Investment activity in real estate technology companies reveals the major waves of innovation in real estate. In the early 2000s, the focus was on online platforms for the digital marketing of homes over the internet, and on software companies that built tools for property management. These companies provide supportive services to traditional firms in real estate, rather than act as direct competitors. The late 2000s to early 2010s saw the growth of more companies harnessing technology to directly compete with traditional firms in multiple areas, such as Airbnb competing in the hotel space and RedFin competing in the brokerage space. A new trend that emerges in the late 2010s is the growth of i-Buyers, companies that aim to buy homes directly from sellers and then sell them for a profit, thus competing directly with brokers but also promising to transform the way real estate is bought and sold.

## **3. Software and IT capital has been increasing rapidly in real estate, along with labor productivity.**

Consistent with the growth in real estate technology companies, data from the BEA KLEMS accounts reveals that software and IT capital intensity has increased very rapidly in real estate, along with labor productivity. By contrast, the intensity of other non-software and non-IT capital has not increased nearly as much.

## **4. Labor productivity growth in single-family construction has been slow, but may have increased recently for multi-family construction.**

The best available data for labor productivity in construction shows that labor productivity in single-family residential construction has been mostly flat over the last three decades. This is consistent with previous findings on the real cost of constructing

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<sup>5</sup>For example, Zillow, in its SEC filings, is classified with SIC code 7389: “Business Services, Not Elsewhere Defined”.

single-family homes (Gyourko and Molloy, 2015). On the other hand, labor productivity in multi-family residential construction appears to have increased markedly over the past 15 years. It is not immediately clear what is driving the trend in multi-family construction, and I leave this question to future research.

## **5. Measurement issues continue to be a problem.**

The productivity data need to be interpreted with caution because of measurement issues. One of the difficulties in measurement is the reliability of price deflators when buildings vary widely in their quality and characteristics. Another difficulty, especially as it pertains to real estate, is the discrepancy between how outputs and inputs are measured. I discuss measurement further in section 6.

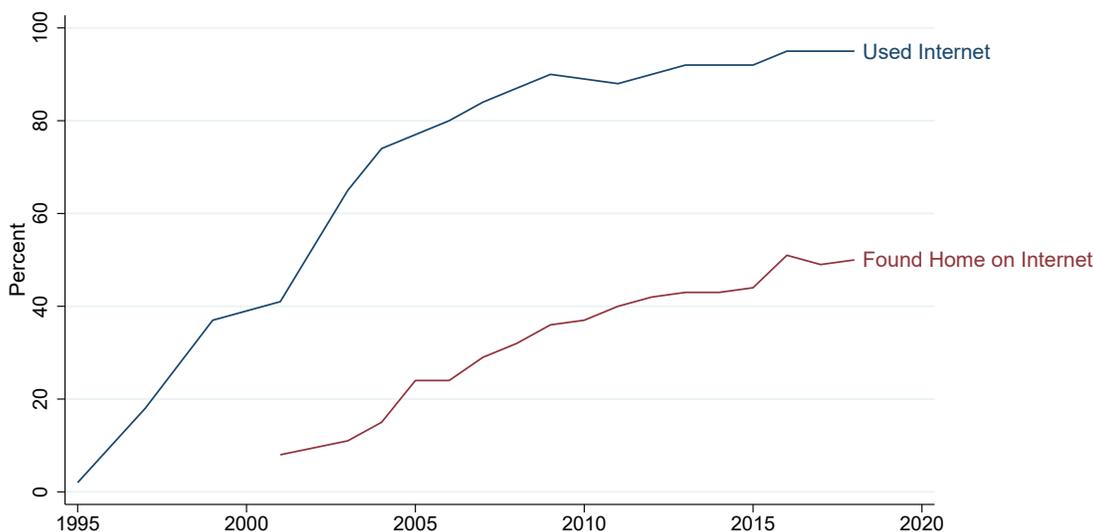
# **4 Internet Search and the Housing Market**

One of the major technological trends affecting housing in the past two decades has been the movement of housing search from a primarily offline activity to the internet. According to the National Association of Realtors, 44% of home buyers in 2018 began their search for a home online, 95% used the internet at some point in their search, and 50% found the home they ultimately purchased online. 100% of home buyers rated online websites as a useful source of information for the home buying process. By contrast, in 2001, only 41% of buyers used the internet at some point in their search, and only 8% found their homes online (Figure 9). The three largest housing-tech IPOs in the last 10 years were RedFin, Zillow, and Trulia, all three of which offer internet-based search as one of their primary services. Today, prospective home buyers can search for homes anywhere in the U.S., look at pictures, and take virtual tours, all from the comfort of their own home and without ever speaking to a real estate agent.

## **4.1 Theoretical Effects**

How has the internet affected the efficiency of housing search? Has it made search more efficient, or has old activity simply moved to a new medium? Economic models of housing search follow models of labor market search developed in Diamond (1982), Pissarides (1985), and Mortensen and Pissarides (1994), in which search is modeled

Figure 9: Internet Use by Home-Buyers, 1995-2018



Source: National Association of Realtors Profile of Home Buyers and Sellers.

as a frictional process through which buyers and sellers meet and learn about match quality.<sup>6</sup> There are three major components to housing search models: 1) search costs—it is costly in terms of time and effort to search, and therefore both buyers and sellers in a housing search market pay costs for each period in which they are searching, 2) match function—the match function is the rate at which buyers and sellers meet in the market and is typically modeled as a reduced-form object<sup>7</sup>, and 3) match quality distribution—once buyers and sellers meet, they find out the quality of their match, which is drawn from a distribution. There is heterogeneity in match quality because some buyers prefer some features of a home more than others. Match quality is unknown prior to the buyer and seller meeting because there are some features of the home that are not observed until personally inspected by the buyer. If the surplus generated by a match between the buyer and seller exceeds the sum of their reservation values, then the buyer and seller will transact.

<sup>6</sup>See Wheaton (1990), Novy-Marx (2009), Genesove and Han (2012), Ngai and Tenreyro (2014), Head, Lloyd-Ellis, and Sun (2014), Guren (2018), and Anenberg and Kung (2018) for some examples of economic housing search models.

<sup>7</sup>There have been attempts to provide microfoundations for the match function. See Petrongolo and Pissarides (2001).

A standard economic model of housing search is described by two equations:

$$rV_s = -c_s + q(\theta)\beta E[S - y|S \geq y] G(y) \quad (1)$$

$$rV_b = -c_b + \frac{q(\theta)}{\theta}(1 - \beta)E[S - y|S \geq y] G(y) \quad (2)$$

Equation (1) describes the value function of a seller searching for a buyer, and equation (2) describes the value function of a buyer searching for a seller.  $r$  is the discount rate.  $q(\theta)$  is the match function that describes the instantaneous rate at which sellers meet buyers. It is assumed to depend on  $\theta$ , which is the *market-tightness*, or the ratio of buyers to sellers. If the match rate for sellers is  $q(\theta)$  then the match rate for buyers is  $q(\theta)/\theta$ .  $y$  is defined as the sum of reservation values for buyer and seller, and is equal to  $y = V_b + V_s$ .  $S$  is a random variable representing the surplus generated from the match.  $G(y)$  is the survivor function for the distribution of  $S$ , and thus  $G(y)$  is the probability that the match surplus exceeds reservation value  $y$ . The rate at which a seller successfully finds a buyer to transact with is therefore  $q(\theta)G(y)$  and the rate at which a buyer successfully finds a seller to transact with is  $q(\theta)G(y)/\theta$ . The net surplus generated is  $S - y$ , and it is assumed that the transaction price is such that sellers get  $\beta$  share of the net surplus and buyers get  $1 - \beta$  share.  $c_s$  and  $c_b$  are, respectively, the search costs for the seller and for the buyer.

The literature has primarily interpreted the effect of the internet as reducing the cost of searching (declining  $c_s$  or  $c_b$ ; Ford, Rutherford, and Yavas, 2005), or increasing the match rate (increasing  $q(\theta)$ ; Genesove and Han, 2012). The main prediction of either effect is that equilibrium match quality and reservation value will be higher, and therefore equilibrium transaction prices will be higher. Reservation values increase because a lower search cost and a higher match rate both increase the expected returns to rejecting an offer and continuing to search. Thus,  $y$  goes up in equilibrium, resulting in more rejected offers but also higher surplus transactions. The predicted effect on time-on-market is ambiguous, but the number of offers looked at should increase on average.

## 4.2 Empirical Evidence

Empirical evidence on the effect of internet on housing search is limited due to significant identification challenges. One early study by Ford, Rutherford, and Yavas (2005)

used data from a North Texas MLS in 1999 to regress price and time-on-market on an indicator for whether or not the property was listed on the internet in addition to being on the MLS. They found that homes listed on the internet sold at 1.9 percent higher price and took 6 days longer to sell. A limitation of their results is that the decision of whether or not to list on the internet is endogenous, which the paper only controls for using a Heckman selection equation. While helpful, the Heckman procedure may not be valid if the observable controls used to predict internet listing are related to sale price and time-on-market in non-linear ways. Moreover, only 7% of their sample was not listed on the internet, which further raises endogenous selection concerns. Nevertheless, this was one of the first attempts to estimate the effect of the internet on housing search, and it found results consistent with theoretical predictions.

On the buyer side, Zumpano, Johnson, and Anderson (2003) use data from the National Association of Realtors' 2000 Home Buyer and Seller Survey to study the relationship between buyer internet use and search behavior. They find no effect of internet use on the total buyer search duration, but found a statistically significant increase in search intensity, defined as the number of properties visited per week, which is again consistent with theory. To control for the endogeneity of internet use, Zumpano, Johnson, and Anderson (2003) also use a Heckman selection equation. An interesting finding in the selection equation was that out-of-town buyers and first-time home-buyers were more likely to use the internet.

Related to these findings are results presented in Genesove and Han (2012). Using NAR survey data across multiple cities and years, they found that, at the city-year level, the fraction of buyers who reported finding their home on the internet is positively associated with buyer time-on-market and on the number of home visits that buyers conduct. Since the focus of this paper was not on the internet, there is no further attempt to establish the causality of this result, but the findings are nevertheless consistent with the theory that internet increases the intensity of buyer search.

Han and Strange (2014) document a secular increase in the probability of bidding wars (defined as sale price above list price), from 3.5% of transactions being a bidding war in 1986, to 10% in 2010. To explore whether the internet may have played a role in increasing the frequency of bidding wars, they use NAR survey data to regress whether or not a listing was sold in a bidding war on an indicator for whether the buyer found the home through the internet. They found that the buyer's use of

the internet is associated with a 4.3% higher probability of a bidding war. As with Genesove and Han (2012), the focus of Han and Strange (2014) was not specifically on the internet, and so no further causal analysis was attempted. Still, this finding is consistent with the possibility that the internet increased the match rate between buyers and sellers, as bidding wars can only happen when multiple buyers vie for the same property. Since bidding wars tend to result in higher prices, the finding is also consistent with the result in Ford, Rutherford, and Yavas (2005) relating internet listing to higher sale prices.

### 4.3 Implications for Economic Growth and Productivity

If internet search is increasing equilibrium match quality, then some of the recent observed house price increases may be due to improvements to match quality rather than basic supply and demand factors. Assuming that gross output measures should be adjusted for quality changes, this implies that real growth in the output of housing may be understated due to quality increases being misattributed to the price deflator. Standard hedonic methods for estimating constant-quality price deflators in housing typically only control for the observed physical characteristics of a home, and do not account for unobserved match quality between the buyer and the house.<sup>8</sup>

Is there a limit to the efficiency gains due to reductions in search frictions? After all, search frictions cannot “fall below zero”. The answer is that it depends on how important learning about match quality is to the search process. If search is primarily “frictional”, meaning that it takes time and effort for buyers and sellers to meet and transact, then an instantaneous match rate would simply reduce the equilibrium vacancy rate to zero without a corresponding increase in the expected surplus of any match.<sup>9</sup> The upper bound on the search efficiency gain would simply be the vacancy rate multiplied by the economic output of occupied homes. Since the current gross output of housing is \$2.2 trillion, and the current home vacancy rate (including both rental and owner-occupied) is 3.3%, this implies an upper bound on search efficiency gains of \$73 billion.

If learning about match quality is also important, then the potential efficiency

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<sup>8</sup>Unobserved differences in match quality could arise due to commute times, heterogeneous preference for neighborhood amenities, or distance to friends/relatives, among potentially many other things.

<sup>9</sup>See Appendix A for a derivation.

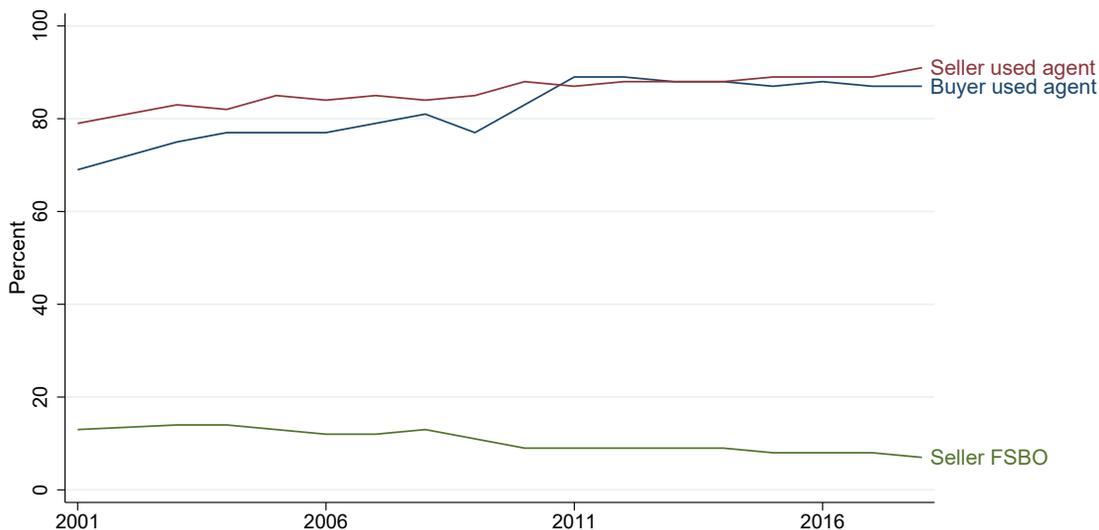
gains due to more efficient search may be much higher. Let  $\bar{S}$  be the upper bound of the support of the match quality distribution. As  $q(\theta)$  increases to infinity and the match rate becomes instantaneous, vacancy rate goes to zero and the expected surplus on every match approaches  $\bar{S}$ .<sup>9</sup> The efficiency gains will be a combination of the increase due to fewer vacancies and the increase due to higher match surplus. Since we do not know how far away current match surpluses are from  $\bar{S}$ , it is impossible to say what the maximum efficiency gains from search might be. If the support of  $S$  has no upper bound, then the gains are potentially unlimited, and equilibrium vacancy rate may be positive in the limit even as matching becomes instantaneous.

The possibility that efficiency gains are showing up in price increases due to higher quality matches is a broader issue that applies to all search markets, not just housing. Martellini and Menzio (2018) argue that this may explain why the labor market has not experienced significant declines in job vacancy and unemployment rates despite known technological improvements in job search. Martellini and Menzio (2018) showed that if the match quality distribution is Pareto, then unemployment, job vacancy, job-finding, and job-loss rates remain constant even as the efficiency of search grows over time. Improvements in search technology show up in productivity growth. Applied to the housing market, this suggests that improvements in search technology will show up in house price growth, and not *necessarily* in lower vacancy rates or lower search durations. Accounting for how match quality increases have contributed the growth in productivity of housing seems like an exciting area for future research.

#### 4.4 Impact on Real Estate Agents and Brokers

How has internet search affected the market structure of the real estate brokerage industry? Early speculation on the effects of the internet on real estate agents theorized that the internet would lead to disintermediation by making it easier for buyers and sellers to market their homes without the help of brokers, and that there would be an unbundling of services where listing would be untied from other services that brokers provided (Baen and Guttery, 1997). This was seen as desirable due to a long line of research documenting inefficiencies in the brokerage industry, centering on a lack of price competition due to fixed commission rates (Hsieh and Moretti, 2003; Han and Hong, 2011; Barwick and Pathak, 2015), and incentive misalignment between broker and seller (Levitt and Syverson, 2008; Hendel, Nevo, and Ortalo-Magné, 2009;

Figure 10: Real Estate Agent Use by Home-Buyers and Home-Sellers, 2001-2018



Source: National Association of Realtors Profile of Home Buyers and Sellers.

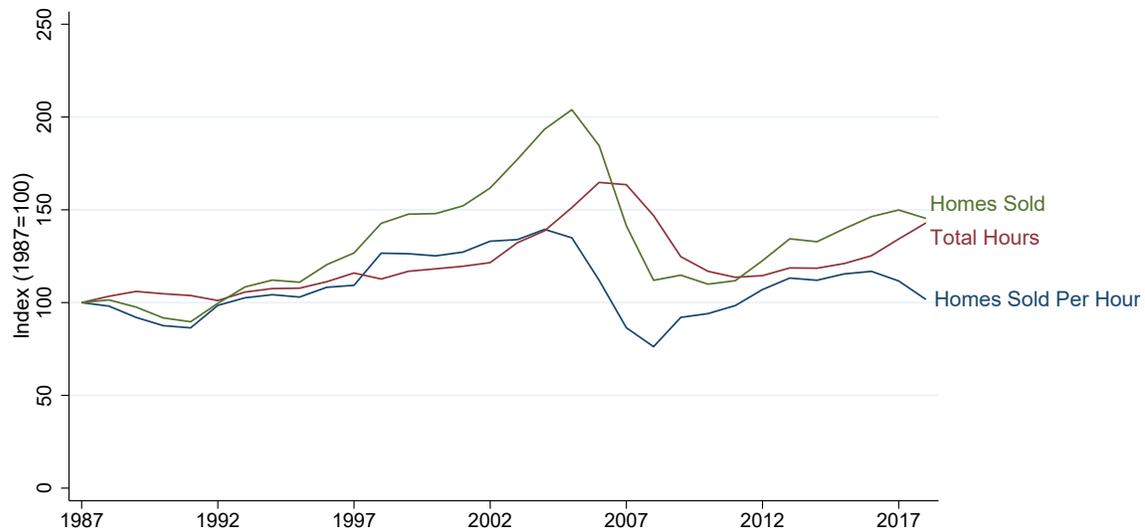
Bernheim and Meer, 2013).

In the aggregate, it does not appear that growing internet use has led to disintermediation. Data from the National Association of Realtors shows that the use of real estate agents has actually gone up over the last two decades, and the percentage of homes sold by the owner without an agent has actually gone down (Figure 10).

The growing importance of the internet in housing search does not appear to have affected the productivity of real estate agents either. Although the BLS does not publish official estimates of labor productivity in the real estate brokerage industry (NAICS 53121), it does estimate the number of hours worked. This data can be combined with NAR estimates on the number of existing homes sold each year, and Census estimates of the number of new homes sold each year, to calculate an index of the number of homes sold per hour worked.<sup>10</sup> Clearly, the number of homes sold may not be an accurate measure of the quantity of brokerage services being supplied—for example, the amount of service required to sell a unique, luxury mansion may be very different from the amount of service required to sell a standardized condo in a planned community—but this measure can still give us a sense of productivity trends in the brokerage industry under the assumption that the distribution of services

<sup>10</sup>NAICS 53121 consists of both residential and commercial real estate brokers. NAICS does not separate real estate brokerage by residential and commercial.

Figure 11: New and Existing Homes Sold and Hours Worked in Real Estate Brokerage, 1987-2018



Source: Bureau of Labor Statistics, Census Bureau, and National Association of Realtors. NAICS 53121: Offices of Real Estate Agents and Brokers.

provided per home has remained relatively stable. Figure 11 shows the result of this calculation. The number of homes sold and the number of hours worked are highly cyclical, following the house price cycle closely, with the number of hours worked lagging a few years behind, but there does not appear to be any long-run trend in the productivity of real estate agents and brokers, at least by this metric.

Real estate agent commission rates do appear to be falling slightly. RealTrends reports that between 2012 and 2017, average commission rates fell 20 basis points from 5.32 to 5.12.<sup>11</sup> Investors have made big bets that technology would disrupt the real estate brokerage industry, as seen by the big investments in RedFin, a discount brokerage that charges listing commission rates of 1 to 1.5 percent, compared to an average of 2.5 to 3. The advent of i-Buyers promises to disrupt this market further. However, the overall effect of new technologies on the real estate brokerage industry may be currently limited by certain anti-competitive behaviors from the incumbents. I discuss these anti-competitive practices further in Section 6.

<sup>11</sup>Source: <https://www.realtrends.com/blog/whats-going-on-with-brokerage-profitability/>.

## 5 “Sharing Economy” and the Housing Market

A second major innovation affecting housing markets is the growth of online platforms like Airbnb that allow homeowners to “share” space with travelers by renting out a spare couch, a spare room, or even an entire home when the owner is not present. Since its founding in 2008, Airbnb has experienced remarkable growth. According to data in Barron, Kung, and Proserpio (2019), by 2016 over one million listings in the U.S. had been placed on Airbnb, across more than 700,000 unique hosts. Investors have surely taken notice, and Airbnb was the second largest venture capital fundraiser among real estate related companies in the past 20 years (the largest was WeWork). Other home-sharing and vacation-rental companies like HomeAway and Vacasa have also attracted significant attention from investors. Although these companies most directly compete with hotels and bed and breakfasts in the market for travel accommodations, they also have an impact on the housing market because they draw some of their supply from residential housing.

### 5.1 Theoretical Effects

Traditionally, the market for short-term accommodations, which serves travelers, and the market for residential housing, which serves local residents, have been strongly segmented. The segmentation arises from the different needs of the consumers in each market (e.g. short-term demanders may only require a bed and a bathroom, while long-term demanders may also require a kitchen and living area) as well as differences in the regulatory environment (e.g. residential tenants are typically afforded rights and protections not available to short-term visitors). Because of these differences, the marketplaces for long-term rentals (housing) and for short-term rentals (accommodations) have historically evolved along separate paths.

The advent of home-sharing platforms has blurred the segmentation on the supply side. It is now much easier than in the past for owners of traditionally residential homes to also supply the short-term rental market.<sup>12</sup> What might we expect the effects to be? First, some owners of residential homes might reallocate from the long-term rental market to the short-term rental market. By reallocate I mean an owner who was previously supplying a long-term tenant and now supplies a short-term

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<sup>12</sup>See Einav, Farronato, and Levin (2016) for a discussion of the technological innovations that reduced transactional frictions and gave rise to these new markets.

renter after the advent of home-sharing. The degree to which this reallocation occurs depends on a number of factors, including relative prices in the long and short-term markets, relative costs of maintaining a short-term rental property vs. a long-term rental property, and the flexibility of keeping a home primarily for short-term use vs. the stability of having a long-term tenant. The propensity to reallocate also depends on the owner's intended personal use of the home. Owner-occupiers by definition do not reallocate from long to short-term rental because they can be considered both the landlord and the tenant in a long-term rental transaction. However, they may still participate in the short-term rental market by selling spare capacity such as spare rooms, a spare couch, or the entire home when they are not present.<sup>13</sup> Vacation home owners who participate in the short-term rental market would also not be considered as reallocating if the vacation home would not have been rented to a long-term tenant anyway, perhaps due to the restrictiveness of long-term leases. Landlords of residential renters may therefore be most at risk of reallocating, and this decision depends on their personal preferences as well as relative prices and costs.

Since housing and hotel supply is inelastic in the short run, reallocation reduces the supply of housing units available in the residential market and increases the supply of rooms available in the short-term rental market. This pushes up rental rates and house prices in the housing market, and drives down prices in the short-term rental market.

In the long run, the supply of housing and of hotels may also be affected. The quantity of homes that are able to supply both the long and the short-term rental markets would be expected to increase, and the quantity of hotel rooms that are only able to supply the short-term market would be expected to decrease. The characteristics of the housing stock may change as well. For example, by increasing the option value to having spare capacity, home-sharing may cause future homes to be built with spare capacity in mind. There may be an increase in the supply of homes with accessory dwelling units that are optimized for delivery to short-term renters with the main unit simultaneously being occupied by the owner.

Besides reallocation, the increased option value of spare housing capacity would also be expected to have direct effects on house prices and rents. The increase will depend on the degree to which capacity is currently underutilized due to the frictions

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<sup>13</sup>On the other hand, if they were previously renting a spare room to a roommate and then decide to use that room for short-term rental instead, this would constitute a reallocation.

that are being resolved by the home-sharing platform. An increase in house prices and rents due to increased option value from home-sharing represents real growth in the productivity of housing.

Finally, home-sharing may entail positive and negative spillovers. On the negative side, neighbors may complain about noisy and unpleasant guests. Concern over neighbors has proven to be a salient point in public debates over home-sharing. On the positive side, home-sharing may help bring in revenue for local businesses, and may help tourists discover new destinations and experiences that they had previously not known about.

## 5.2 Empirical Evidence

There is a growing body of literature studying the effects of home-sharing on housing market outcomes. The following papers, Horn and Merante (2017), Barron, Kung, and Proserpio (2019), and Garcia-López et al. (2019), all find that home-sharing drives up rental rates and housing costs, using various research designs and data from various markets. Horn and Merante (2017) examine the effect of Airbnb on rental rates in the Boston housing market from 2015 to 2016. Barron, Kung, and Proserpio (2019) study the effect of Airbnb on house prices and rental rates using data from the entire U.S. from 2011 to 2016. Garcia-López et al. (2019) study the effect of Airbnb on the Barcelona housing market. Estimates of the effect of a one-standard deviation increase in the number of Airbnb listings on the percentage increase in rental rates range from about 0.4 to 0.6 percent.

Barron, Kung, and Proserpio (2019) present additional evidence on the channels through which home-sharing affects housing markets. They present direct evidence for housing supply reallocation, showing that growth in Airbnb listings is causally associated with a decline in the number of rental housing units, and an increase in the number of housing units which are classified as vacant for “seasonal or recreational use” (which is how units held for short-term use would be classified as by the Census). They also show that the size of the reallocation depends on the share of owner-occupiers. Zipcodes with a greater share of owner-occupiers experience a smaller amount of reallocation, and correspondingly smaller effect on house prices and rents, consistent with the theory that owner-occupiers are less likely to reallocate from the long-term rental market to the short-term rental market.

All of the aforementioned studies estimate only short-run effects. To my knowledge, there is not yet any research on the long-run effects of home-sharing on house prices and the housing supply. This is likely because home-sharing is a relatively new phenomenon, and is it still too early to look for long-run effects.

Besides the housing market, a number of papers also study the effect of home-sharing on other markets. Zervas, Proserpio, and Byers (2017) and Farronato and Fradkin (2018) study the effects of home-sharing on the hotel market. Zervas, Proserpio, and Byers (2017) shows evidence that Airbnb entry drives down hotel revenue, and Farronato and Fradkin (2018) show that Airbnb expands the supply of hotel rooms during times of peak demand, which leads to significant welfare gains for travelers. Alyakoob and Rahman (2018) find a positive relationship between Airbnb entry and restaurant employment. These papers suggest that home-sharing may have welfare implications beyond their effects on the housing market.

To my knowledge, no paper has attempted to decompose the housing price effect of home-sharing into the effect on option value and the effect due to supply reallocation.

## 6 Future Outlook

### 6.1 Measurement Issues

In section 2 of this chapter, I noted the discrepancy between gross economic output and firm revenues in residential real estate. In 2017, gross output in residential real estate alone was \$2.1 trillion, \$1.5 trillion of which was owner-occupied housing. By comparison, revenue for all real estate firms in 2017 (including both residential and commercial) was only \$477 billion. The discrepancy itself is not concerning, as gross output and firm revenues are meant to measure different concepts. However, the discrepancy does suggest that a significant amount of housing services are being supplied by non-firm entities, such as owner-occupiers (who supply themselves), and individual landlords who are not counted as firms. Because data on labor, capital, material, energy, and service inputs come from surveys of firms or establishments, a significant amount of input in real estate may go unmeasured, such as the labor hours that owner-occupiers and landlords spend managing their properties and the labor hours that home-buyers and home-sellers spend on the search process. More accurate measurement of these inputs would help us to better understand the impact

of technological innovations on the efficiency of these activities. Questions on the time spent and the cost of managing properties or searching for homes could be included on the American Housing Survey, for example.

Another measurement issue that arises in housing is how increases in the efficiency of search should be measured and accounted for. This may be especially salient given that the last major wave of technological innovation in real estate was the movement of housing search to the internet. As discussed in section 4, improvements in the efficiency of search will show up in higher prices and higher match quality, but not necessarily in a higher rate of transaction or a reduced vacancy rate. Since an increase in match quality represents growth in the real economic output of housing, attributing gains in match quality entirely to the price deflator may cause us to understate the amount of real output growth in housing. Methods to estimate how much of price gains can be attributed to higher match quality would help us to better understand how improvements to search technology are affecting productivity growth in real estate.

## 6.2 Barriers to Innovation and Entrepreneurship

In addition to measurement issues, the discrepancy between firm revenue and gross output in housing suggests that the potential social returns to innovation may be much higher than the private returns. Aghion et al. (2005) have shown evidence of an inverted-U relationship between industry concentration and industry innovation, so the high degree of competition in real estate and construction suggests a possible reason for why direct innovation by real estate and construction firms is low. It may also explain why many of the main innovators in real estate technology, including the initial wave of online portals and software developers, have been primarily upstream firms that supply the real estate industry with software and services, rather than direct providers of real estate services.

Of course, this has not stopped innovative firms from entering into direct competition with industry incumbents. RedFin, for example, offers particularly low listing commission rates relative to the rest of the market. Despite this, commission rates only appear to be falling slightly. RealTrends reports that between 2012 and 2017, average commission rates fell 20 basis points from 5.32 to 5.12.

The impact of innovation and entrepreneurship in residential brokerage may be

limited by certain anti-competitive behaviors. In 2005, the National Association of Realtors was sued by the U.S. Department of Justice over its “virtual office website” (VOW) policy, as internet-based listings websites were known back then. The VOW policy allowed traditional brokers to discriminate against VOWs by withholding listings information from them, in violation of standard MLS rules governing data-sharing between brokers. In 2008, a settlement was reached in which the NAR agreed to repeal its old VOW policy and replace it with a new one that does not discriminate against VOWs.

The new policy applied only to websites operated by actual brokers who participate in a local MLS, and not to listing aggregators like Zillow that do not directly provide brokerage services. Thus, non-broker websites that want to provide listings information still need to purchase listings information directly from brokers, MLS’s, or national listings syndicators. Speaking at a FTC conference on competition in residential brokerage, industry journalist Brad Inman noted that, “our ability to aggregate a national database of listings is very, very expensive... it only costs \$2 million to license data and normalize it and publish it, [but] \$2 million is a lot of money for an entrepreneur starting out with his or her credit card... [and] the reality is \$2 million will get you in, but how much do the portals currently spend just schmoozing with MLS executives, not to mention the teams and the maintenance and everything that goes into it” (Inman, 2018). Thus, the cost of acquiring and maintaining listings data may still be a significant barrier to entry for firms that want to provide real estate related services, but not necessarily be brokers themselves.

In addition to protectiveness over data, real estate brokers may also engage in another anti-competitive practice known as steering. The DOJ describes steering as any action taken by a broker or agent to avoid cooperating with a particular competitor (DOJ, 2007). For example, a buyer’s agent may avoid showing a house listed by a competitor’s agent, or by a discount brokerage, despite knowing that the house would be well suited to the buyer’s preferences. Barwick, Pathak, and Wong (2017) showed evidence of steering using data from Massachusetts from 1988-2011. They showed that properties listed with lower commissions were less likely to sell, and that this was best explained by buyers’ agents steering away from low commission properties, rather than by buyer preferences. This kind of behavior may make it harder for brokers to compete on price, and may explain why realtor commission rates have not fallen more despite the growing ease of housing search.

### 6.3 Land Use Regulation

As noted in section 2, land use regulations are an important factor to consider when thinking about growth and productivity in housing, especially as it pertains to construction and the housing supply. To what degree are restrictive land use regulations limiting the quantity of housing supply, and what are the implications for economic growth and productivity? Glaeser and Gyourko (2018) measure the restrictiveness of land use regulations by comparing the price of new homes to the minimum profitable construction cost. Their theory was that price should not exceed the minimum profitable construction cost significantly in a competitive market unless there are barriers to development. They found that restrictive land use regulations are primarily concentrated in certain high-cost metropolitan areas. However, the number of metropolitan areas for which the price-to-cost ratio exceeds 1.25 is growing, from 6.4 percent in 1985 to 15.9 percent in 2013. Moreover, these metro areas tend to be innovation hubs like New York City and San Francisco that have experienced the greatest job and productivity gains over the last three decades.

Hsieh and Moretti (2019) argued that these artificially restrictive land use regulations deter workers from moving to the most productive locations, and estimated that this may have reduced GDP by as much as 9 percent in 2009, and reduced GDP growth by 36 percent from 1964 to 2009. If we roughly estimate the efficiency gains of housing search as at most 3.3 percent of housing output due to the elimination of vacancies, plus 1.9 percent of housing output due to increased match quality (Ford, Rutherford, and Yavas, 2005), this is still less than the potential gain of 9 percent of total output from more efficient labor allocation if we eliminated restrictive housing supply regulations.

Thus, innovations to housing *policy* may currently be more marginally productive in driving growth in the housing sector than technological innovations. One such policy innovation may be to move control of land use policy from the local level to the state or even federal level, in recognition of the fact that local incumbents often have an incentive to restrict housing production in order to raise their own asset value. There are currently efforts underway in California to do this (e.g. California SB50). It remains to be seen whether such efforts will be successful and what their impact will be.

## 6.4 Innovation and Urban Economics

When a house is purchased or leased, part of what is being transacted is the right to occupy the land that the property sits on. This enables the occupant to live in closer proximity to their workplace or to other desirable or productive amenities. Innovation that affects transportation (and thus the demand for proximity) and innovation that affects local productivity or the value of local amenities therefore also affect the housing market. It is therefore important to consider the spatial aspect of housing and how innovations in other sectors may be affecting it.

A well documented trend is that housing is becoming more expensive nearer to city centers (Couture and Handbury, 2019), and especially so in cities with intensive knowledge-based industries (Moretti, 2013). While some of this price growth is undoubtedly due to restrictive land use regulations, land use regulations change much less year to year than house prices, and so most of the year to year growth in prices can be attributed to growing demand to live near city centers.

Has technological innovation contributed to the growing demand to live near city centers and in major metropolitan areas? The key question is whether these technological innovations are complements or substitutes to urban density. The existing evidence seems to suggest that they are complements. Jaffe, Tratjenberg, and Henderson (1993) showed that patent citations are geographically localized, which means that geographic concentration might be becoming more important as more of the economy moves towards knowledge production. Gaspar and Glaeser (1998) showed that improvements in telecommunication technology, rather than substituting for face-to-face meetings, actually increased the number of face-to-face interactions, thus suggesting that information technology complements geographic proximity. Other papers showing evidence for complementarity between urban density and technology include Sinai and Waldfoegel (2004), Anenberg and Kung (2015), and Anenberg, Kuang, and Kung (2019). Anenberg and Kung (2015) and Anenberg, Kuang, and Kung (2019) focus on how information technology reduces informational uncertainties that may be especially prevalent in urban areas, such as information on traffic and parking conditions, and on the quality of local restaurants when there are too many to learn about by personal experience. Couture and Handbury (2019) also find limited evidence that technology may have contributed to the growing preference among young, high income households to locate in more urban areas.

The literature on how technology interacts with urban density may have lessons

for how we expect near-future technological innovations in transportation to affect housing markets. Normally, one expect innovations that reduce the cost of transportation to reduce the demand for proximity to jobs and amenities, and thus reduce the demand for urban living. However, it may be that the most promising current and forthcoming technologies in transportation, such as self-driving and self-parking cars, and the wide availability of mapping and routing software, have a larger effect on reducing the cost of congestion. Anyone who has driven around in a big city knows how much time finding parking adds to the trip, so the promise of self-driving and self-parking cars includes the ability to no longer have to do that ourselves. If the upcoming innovations in transportation primarily reduce the cost of congestion, then this would further increase the demand to live in urban areas, and thus house prices in those areas.

## **6.5 Housing’s Impact on Innovation and Entrepreneurship**

Thus far I have focused on how innovation and entrepreneurship affects housing. Now, I briefly discuss whether housing can affect innovation and entrepreneurship. I already mentioned the paper by Hsieh and Moretti (2019), which showed the impact of supply restrictions on aggregate output. This can also translate to reduced innovation and entrepreneurship, if it leads people to choose not to move to places with the best potential for innovation and entrepreneurship. House prices themselves can also affect innovation and entrepreneurship. Adelino, Schoar, and Severino (2015) showed that from 1998 to 2010, small business employment grew faster in areas that experienced greater house price increases, and that this effect was more pronounced in industries that need little startup capital, and for which lending based on housing collateral is relatively more important. Thus, improvements to the ability of homeowners to borrow against the collateral value of their home may spur greater entrepreneurship.

## **7 Conclusion**

Housing is a large and growing sector of the economy. Economic activity in housing is comprised of primarily two industries: real estate, which involves the leasing and sale of existing housing, and construction, which involves the production of new housing. Both industries are highly competitive and do not appear to invest much in research

and development. However, there is growing entrepreneurial interest in companies that provide innovative software and business services to the real estate industry, and in companies that harness technology to directly compete with real estate industry incumbents. Labor productivity appears to be growing in real estate, along with growing intensity of software and IT capital, but caution must be used when interpreting these results due to measurement issues. Labor productivity in single-family housing construction appears to be flat, whereas labor productivity in multi-family residential construction appears to be growing, especially within the last 15 years.

Two recent technological innovations highlight some important issues in how we are measuring economic growth in housing. First, the movement of housing search to the internet has presumably improved the efficiency of how buyers and sellers find each other. Yet, we do not observe significant improvements in the productivity of residential brokers, nor do we observe significant decreases in the time it takes to buy or sell a home. This is, in fact, consistent with economic search theory which predicts that the main effect of an improvement in search efficiency is higher quality matches, which shows up in higher transaction prices. If the most important technological innovation in residential real estate over the past 20 years has its primary effect on increasing match quality, then this would be difficult to detect by standard economic accounting methods which do not account for unobserved match quality in its price deflators. Similarly, the introduction of home-sharing platforms may have increased the option value of residential housing, as owners can now use the property *either* in the housing market or in the travel accommodations market, and they can even use it for both, using part of the space for housing and selling part of the space in the short-term rental market. Increases to the option-value of housing would again show up primarily in prices, and would again be difficult to detect by standard economic accounting methods. The analysis suggests that we need improved methods for measuring output, growth, and productivity in housing if we are to fully understand how recent innovations have impacted the efficiency of housing markets.

The future of housing markets is likely to be shaped by three important factors. First, many economists suspect that stringent land use regulations are responsible for significant inefficiencies in the level of housing production we currently make. Before considering how technology can improve efficiency in housing markets, it may be more useful to consider first how better policy can improve efficiency in housing markets. Second, researchers have documented a number of anti-competitive behav-

iors in the residential brokerage industry which may limit the impact of innovation and entrepreneurship in making the housing market more efficient. For the impact of new technologies and business practices to have their full effect, barriers to entry and to price competition must be broken down. Finally, new technologies and the movement of the U.S. towards a knowledge-based economy may be rapidly increasing the demand to live in denser, more urban, more educated areas. This has implications for the spatial distribution of housing and house price growth, and further emphasizes the need to re-examine land use policy, since many of the most stringent policies are located precisely in the cities that are experiencing the greatest productivity growth.

## References

- Adelino, Manuel, Antoinette Schoar, and Felipe Severino (2015). “House Prices, Collateral, and Self-Employment”. In: *Journal of Financial Economics* 117, pp. 288–306.
- Aghion, Philippe, Nick Bloom, Richard Blundell, Rachel Griffith, and Peter Howitt (2005). “Competition and Innovation: An Inverted-U Relationship”. In: *Quarterly Journal of Economics* 120.2, pp. 701–728.
- Alyakoob, Mohammed and Mohammad Rahman (2018). *The Sharing Economy as a Local Economic Engine: The Heterogeneous Impact of Airbnb on Restaurant Employment Growth*. Working Paper. Purdue University.
- Anenberg, Elliot, Chun Kuang, and Edward Kung (2019). *Social Learning and Local Consumption Amenities: Evidence from Yelp*. Working Paper. Federal Reserve Board, University of International Business and Economics, and CSU-Northridge.
- Anenberg, Elliot and Edward Kung (2015). “Information Technology and Product Variety in the City: The Case of Food Trucks”. In: *Journal of Urban Economics* 90, pp. 60–78.
- (2018). *Interest Rates and Housing Market Dynamics in a Housing Search Model*. Working Paper. Federal Reserve Board and CSU-Northridge.
- Baen, John S. and Randall S. Guttery (1997). “The Coming Downsizing of Real Estate: Implications of Technology”. In: *Journal of Real Estate Portfolio Management* 3.1, pp. 1–18.

- Barron, Kyle, Edward Kung, and Davide Proserpio (2019). *The Effect of Home-Sharing on House Prices and Rents: Evidence from Airbnb*. Working Paper. USC and CSU-Northridge.
- Barwick, Panle Jia and Parag A. Pathak (2015). “The Costs of Free Entry: An Empirical Study of Real Estate Agents in Greater Boston”. In: *RAND Journal of Economics* 46.1, pp. 103–145.
- Barwick, Panle Jia, Parag A. Pathak, and Maisy Wong (2017). “Conflicts of Interest and Steering in Residential Brokerage”. In: *American Economic Journal: Applied Economics* 9.3, pp. 191–222.
- BEA (2009). *Concepts and Methods of the Input-Output Accounts*. U.S. Department of Commerce, Bureau of Economic Analysis.
- (2019). *Concepts and Methods of the U.S. National Income and Product Accounts*. U.S. Department of Commerce, Bureau of Economic Analysis.
- Bernheim, Douglas and Jonathan Meer (2013). “Do Real Estate Brokers Add Value When Listing Services Are Unbundled?” In: *Economic Inquiry* 51.2, pp. 1166–1182.
- Census (2019). *Nonemployer Statistics Technical Documentation: Methodology*. U.S. Census Bureau. URL: <https://www.census.gov/programs-surveys/nonemployer-statistics/technical-documentation/methodology.html>.
- Couture, Victor and Jessie Handbury (2019). *Urban Revival in America*. Working Paper. UC Berkeley and Wharton.
- Diamond, Peter A. (1982). “Wage Determination and Efficiency in Search Equilibrium”. In: *Review of Economic Studies* 49.2, pp. 217–227.
- DOJ (2007). *Competition in the Real Estate Brokerage Industry*. U.S. Department of Justice. URL: <https://www.justice.gov/atr/competition-real-estate-brokerage-industry>.
- Einav, Liran, Chiara Farronato, and Jonathan Levin (Oct. 2016). “Peer-to-Peer Markets”. In: *Annual Review of Economics* 8, pp. 615–635.
- Farronato, Chiara and Andrey Fradkin (2018). *The Welfare Effects of Peer Entry in the Accommodation Market: The Case of Airbnb*. Working Paper. National Bureau of Economic Research.
- Ford, James Scott, Ronald C. Rutherford, and Abdullah Yavas (2005). “The Effects of the Internet on Marketing Residential Real Estate”. In: *Journal of Housing Economics* 14, pp. 92–108.

- Garcia-López, Miquel-Àngel, Jordi Jofre-Monseny, Rodrigo Martínez Mazza, and Mariona Segú (2019). *Do Short-term Rental Platforms Affect Housing Markets? Evidence from Airbnb in Barcelona*. IEB Working Paper.
- Gaspar, Jess and Edward Glaeser (1998). “Information Technology and the Future of Cities”. In: *Journal of Urban Economics* 43, pp. 136–156.
- Genesove, Davide and Lu Han (2012). “Search and Matching in the Housing Market”. In: *Journal of Urban Economics* 72, pp. 31–45.
- Glaeser, Edward and Joseph Gyourko (2018). “The Economic Implications of Housing Supply”. In: *Journal of Economic Perspectives* 32.1, pp. 3–30.
- Guren, Adam (2018). “House Price Momentum and Strategic Complementarity”. In: *Journal of Political Economy* 126.3, pp. 1172–1218.
- Gyourko, Joseph and Raven Molloy (2015). “Regulation and Housing Supply”. In: *Handbook of Regional and Urban Economics*. Ed. by Gilles Duranton, J. Vernon Henderson, and William C. Strange. Vol. 5. Handbook of Regional and Urban Economics. Elsevier, pp. 1289–1337.
- Han, Lu and Seung-Hyun Hong (2011). “Testing Cost Inefficiency Under Free Entry in the Real Estate Brokerage Industry”. In: *Journal of Business & Economic Statistics* 29.4, pp. 564–578.
- Han, Lu and William C. Strange (2014). “Bidding Wars for Houses”. In: *Real Estate Economics* 42.1, pp. 1–32.
- Head, Allen, Huw Lloyd-Ellis, and Hongfei Sun (2014). “Search, Liquidity, and the Dynamics of House Prices and Construction”. In: *The American Economic Review* 104.4, pp. 1172–1210.
- Hendel, Igal, Aviv Nevo, and François Ortalo-Magné (2009). “The Relative Performance of Real Estate Marketing Platforms: MLS versus FSBOMadison.com”. In: *American Economic Review* 99.5, pp. 1878–1898.
- Horn, Keren and Mark Merante (2017). “Is Home Sharing Driving Up Rents? Evidence from Airbnb in Boston”. In: *Journal of Housing Economics*.
- Hsieh, Chang-Tai and Enrico Moretti (2003). “Can Free Entry Be Inefficient? Fixed Commissions and Social Waste in the Real Estate Industry”. In: *Journal of Political Economy* 111.5, pp. 1076–1122.
- (2019). “Housing Constraints and Spatial Misallocation”. In: *American Economic Journal: Macroeconomics* 11.2, pp. 1–39.

- Inman, Brad (2018). Remarks made at *What's New in Residential Real Estate Brokerage Competition: An FTC-DOJ Workshop*, on June 5th, 2018. Transcript available at. URL: <https://www.ftc.gov/news-events/events-calendar/2018/04/whats-new-residential-real-estate-brokerage-competition-ftc-doj>.
- Jaffe, Adam B., Manuel Tratjenberg, and Rebecca Henderson (1993). “Geographic Localization of Knowledge Spillovers as Evidenced by Patent Citations”. In: *Quarterly Journal of Economics* 108.3, pp. 577–598.
- Levitt, Steven D. and Chad Syverson (2008). “Market Distortions When Agents Are Better Informed: The Value of Information in Real Estate Transactions”. In: *Review of Economics and Statistics* 90.4, pp. 599–611.
- Martellini, Paulo and Guido Menzio (2018). *Declining Search Frictions, Unemployment and Growth*. Working Paper. University of Pennsylvania and NYU.
- Moretti, Enrico (2013). *The New Geography of Jobs*. Mariner Books.
- Mortensen, Dale T. and Christopher A. Pissarides (1994). “Job Creation and Job Destruction in the Theory of Unemployment”. In: *Review of Economic Studies* 61.3, pp. 397–415.
- NAR (2018). *Real Estate in a Digital Age 2018 Report*. National Association of Realtors. URL: <https://www.nar.realtor/sites/default/files/documents/2018-real-estate-in-a-digital-world-12-12-2018.pdf>.
- Ngai, L. Rachel and Silvana Tenreyro (2014). “Hot and Cold Seasons in the Housing Market”. In: *American Economic Review* 104.12, pp. 3991–4026.
- Novy-Marx, Robert (2009). “Hot and Cold Markets”. In: *Real Estate Economics* 37.1, pp. 1–22.
- Petrongolo, Barbara and Christopher A. Pissarides (2001). “Looking into the Black Box: A Survey of the Matching Function”. In: *Journal of Economic Literature* 39, pp. 390–431.
- Pissarides, Christopher A. (1985). “Short-Run Equilibrium Dynamics of Unemployment, Vacancies, and Real Wages”. In: *American Economic Review* 75.4, pp. 676–690.
- Sinai, Todd and Joel Waldfogel (2004). “Geography and the Internet: Is the Internet a Substitute or a Complement for Cities?” In: *Journal of Urban Economics* 56, pp. 1–24.
- Snider, David and Matt Harris (2018). “The Future of Real Estate Tech: How We Got Here and What’s Next in an Exploding New Ecosystem”. In: *Forbes.com*.

URL: <https://www.forbes.com/sites/valleyvoices/2018/02/13/future-of-real-estate-tech>.

- Sveikauskas, Leo, Samuel Rowe, and James D. Mildenberger (2018). “Measuring Productivity Growth in Construction”. In: *Monthly Labor Review*, pp. 1–34.
- Wheaton, William C. (1990). “Vacancy, Search, and Prices in a Housing Market Matching Model”. In: *Journal of Political Economy* 98.6, pp. 1270–1292.
- Zervas, Georgios, Davide Proserpio, and John W. Byers (2017). “The Rise of the Sharing Economy: Estimating the Impact of Airbnb on the Hotel Industry”. In: *Journal of Marketing Research* 54.5, pp. 687–705.
- Zumpano, Leonard V., Ken H. Johnson, and Randy I. Anderson (2003). “Internet Use and Real Estate Brokerage Market Intermediation”. In: *Journal of Housing Economics* 12.2, pp. 134–150.

## A Increasing the Match Rate in Search Models

Instead of  $q(\theta)$  I let the match rate be  $Aq(\theta)$  and consider the effect of  $A \rightarrow \infty$ . Equations (1) and (2) become

$$rV_s = -c_s + Aq(\theta)\beta E[S - y | S \geq y] G(y) \quad (3)$$

$$rV_b = -c_b + \frac{Aq(\theta)}{\theta}(1 - \beta)E[S - y | S \geq y] G(y) \quad (4)$$

To isolate the effect of increasing match efficiency without a change in match quality, I first consider a setting in which all matches give a surplus of  $S \geq y$ , where  $S$  is fixed and not a random variable. The equations become:

$$\begin{aligned} rV_s &= -c_s + Aq(\theta)\beta(S - y) \\ rV_b &= -c_b + \frac{Aq(\theta)}{\theta}(1 - \beta)(S - y) \end{aligned}$$

Combining the two equations gives:

$$\begin{aligned} ry &= -c_s - c_b + Aq(\theta) \left[ \beta + \frac{1 - \beta}{\theta} \right] (S - y) \\ S - y &= \frac{ry + c_s + c_b}{Aq(\theta) \left[ \beta + \frac{1 - \beta}{\theta} \right]} \end{aligned}$$

Taking the limit as  $A \rightarrow \infty$  means that  $S - y \rightarrow 0$ .<sup>14</sup> Thus, the reservation value becomes exactly equal to  $S$ , and the match rate becomes instantaneous. There are therefore no vacancies and every match generates a surplus of  $S$ . When  $A < \infty$ ,  $y$  is less than  $S$ , and the difference depends on the search costs and the match rate.

Now I consider a setting in which the upper bound of the support of the match quality distribution is  $\bar{S}$ . Further, for simplicity, assume that  $G(\bar{S}) > 0$  (so there is a positive probability that  $S$  is exactly equal to  $\bar{S}$ ). Combining equations (3) and (4) gives:

$$E[S - y | S \geq y] G(y) = \frac{ry + c_s + c_b}{Aq(\theta) \left[ \beta + \frac{1-\beta}{\theta} \right]}$$

Taking the limit of  $A \rightarrow \infty$  means that  $E[S - y | S \geq y] G(y) \rightarrow 0$  in the limit. Thus,  $y \rightarrow \bar{S}$ . Since  $G(\bar{S}) > 0$ ,  $Aq(\theta)G(y) \rightarrow \infty$  as  $A \rightarrow \infty$ , and thus the vacancy rate approaches zero. If  $G(y) \rightarrow 0$  as  $y \rightarrow \bar{S}$ , then it may be possible for the vacancy rate to remain positive as  $A \rightarrow \infty$ , as not all vacancies are immediately filled.

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<sup>14</sup>Note that it doesn't matter what  $\theta$  approaches.  $Aq(\theta) \left[ \beta + \frac{1-\beta}{\theta} \right] \rightarrow \infty$  as  $A \rightarrow \infty$  regardless of whether  $\theta$  is finite or approaches zero or infinity.