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Characteristics of Depreciation in Commercial and Multi-Family
Property:
An Investment Perspective

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Abstract:

This paper reports empirical evidence on the nature and magnitude of real depreciation in commercial and multi-family investment properties in the United States. The paper is based on a much larger and more comprehensive database than prior studies of depreciation, and it is based on actual transaction prices rather than appraisal estimates of property or building structure values. The paper puts forth an “investment perspective” on depreciation, which differs from the tax policy perspective that has dominated the previous literature in the U.S. From the perspective of the fundamentals of investment performance, depreciation is measured as a fraction of total property value, not just structure value, and it is oriented toward cash flow and market value metrics of investment performance such as IRR and HPR. Depreciation from this perspective includes all three age-related sources of long-term secular decline in real value: physical, functional, and economic obsolescence of the building structure. The analysis based on 107,805 transaction price observations finds an overall average depreciation rate of 1.5%/year, ranging from 1.82%/year for properties with new buildings to 1.12%/year for properties with 50-year-old buildings. Apartment properties depreciate slightly faster than non-residential commercial properties. Depreciation is caused almost entirely by decline in current real income, only secondarily by increase in the capitalization rate (“cap rate creep”). Depreciation rates vary considerably across metropolitan areas, with areas characterized by space market supply constraints exhibiting notably less depreciation. This is particularly true when the supply constraints are caused by physical land scarcity (as distinct from regulatory constraints). Commercial real estate asset market pricing, as indicated by transaction cap rates, is strongly related to depreciation differences across metro areas.

1 Introduction

This paper reports empirical evidence on the nature and magnitude of real depreciation in commercial and multi-family investment properties in the United States. By the term “real depreciation” (or simply, “depreciation”) we are referring to the long-term or secular decline in property value, after netting out inflation, due to the aging and obsolescence of the building structure, apart from temporary cyclical downturns in market values, and even after routine capital maintenance. Such depreciation is measured empirically by an essentially cross-sectional comparison of the transaction prices of properties with building structures of different ages, controlling for other non-age-related differences among the properties and the transactions. In the U.S., most prior studies of depreciation in income-producing structures have been made from the perspective of income tax policy, given that asset value in accrual income accounting in the U.S. is based on historical cost and allows for depreciation to be deducted from taxable income. But considering basic economics, depreciation is important from an investment perspective apart from tax policy, as depreciation is ubiquitous and significantly affects the nature of property investment performance. Though tax policy considerations certainly are important (including from an after-tax investment perspective for taxable investors), we leave such considerations for another paper.

This investments perspective is the major focus of this paper, though we will also make some observations relevant to the tax policy perspective. From the investment perspective depreciation constrains how much capital growth the investor can expect over the long run, and from this perspective depreciation is measured with respect to total property value not just structure value, and is measured on a cash flow and current market value basis rather than a historical cost accrual accounting basis. In this paper we explore how such depreciation varies with several correlates including metropolitan location, building type, structure age, and market conditions. We also explore the role of income versus capitalization as the source of depreciation.

2 Literature Review

Most of the prior literature on structure depreciation has focused on owner-occupied housing, and as noted, most of the U.S. literature that has focused on depreciation in commercial real estate (income property) has done so from the perspective of taxation policy. An early

and influential example is Taubman and Rasche (1969), which used limited data on building operating expenses to quantify a theoretical model of profit-maximizing behavior on the part of building owners to estimate the optimal lifetime of structures and the age and value profile of office buildings, assuming rental revenues decline with building age while operating costs remain constant. The result was a model in which the building structure (excluding land) becomes completely worthless (fit for redevelopment) after generally 65 to 85 years of life, with the rate of depreciation growing with the age of the structure.¹ The focus of the analysis was on what sort of depreciation allowances would be fair from an income tax policy perspective.

By the mid-1990s subsequent research led to a consensus that the balance of empirical evidence supported the view that commercial structures tend to decline in value in a somewhat geometric pattern (roughly constant rate over time), averaging about 3 percent per year (of remaining structure value), though there was some evidence for faster depreciation rates in the earlier years of structure life. (See most influentially Hulton & Wyckoff, 1981, 1996.) In the paper that most influenced subsequent tax policy, Hulton & Wyckoff (1981) estimated average depreciation rates of approximately 3 percent per year of remaining structure value. With the 1986 tax reform, income tax policy settled on straight-line depreciation methods (which imply an increasing rate of depreciation for older buildings), with the depreciation rate based on 27.5 years for apartments and 31 (subsequently increased to 39) years for non-residential commercial buildings. This has remained a relatively constant and non-controversial aspect of the income tax code since then.²

Gravelle (1999) reviewed the evidence on depreciation rates for the Congressional Research Service and found that rates allowed in current tax law are not too far off from economic reality, if one uses as the benchmark the present value of the allowed depre-

¹This is where the depreciation rate is measured as a percent per year of the remaining value of the structure alone, excluding the land component of the property value. Of course, any model in which the structure becomes completely worthless at a finite age (such as straight-line depreciation) will necessarily tend to have increasing depreciation rates as the structure ages measured as a fraction of the structure value alone excluding land, at least after some point of age. (For example, in the last year of building life, the depreciation rate is by definition 100% of the remaining structure value.)

²Straight-line methods are easy to understand and administer, and can be designed in principle so that the present value of the depreciation is the same as that of an actual geometric profile of declining building value which might better represent the economic reality. By completely exhausting the book value of the structure at a finite point in time (and hence, exhausting the depreciation tax shields), straight-line methods may tend to stimulate sale of older buildings (so as to re-set the depreciable basis and begin generating tax shields again).

ciation (recognizing that the straight-line pattern is only a simplification). An industry white paper produced in 2000 by Deloitte-Touche studied 3144 acquisition prices of properties held by REITs for which data existed on the structure and land value components separately as of the time of acquisition. The Deloitte-Touche study found approximately constant depreciation rates for acquisition prices as a function of structure age, measured as a percent of remaining structure value, ranging from 2.1%/year for industrial buildings to 4.5%/year for retail buildings (with office at 3.5% and apartments at 4%). However, the study was limited to only buildings less than 20 years old. The Deloitte study also separately estimated depreciation rates for gross rental income, finding rates ranging from 1.7% for office to 2.5% for retail (with industrial at 1.9%, and apartments omitted). Note that, as fractions of pre-existing rent, these depreciation rates would be more comparable to rates based on total property value than just on structure value (Like property value, rents reflect land and location value as well as just structure value.). The working consensus apparently persists that, at least for tax policy considerations, commercial structures tend to depreciate in a roughly geometric pattern at typically a rate of 2 to 4 percent of the remaining structure value per year, with apartment structures depreciating slightly faster than commercial.³

More recent literature is sparse and primarily focused on new empirical data. Fisher et al (2005) used sales of some 1500 NCREIF apartment properties to examine depreciation in institutional quality multi-family property.⁴ They conclude that a constant rate of 2.7% per year of property value including land, or 3.25% of structure value alone, well represents the depreciation profile for NCREIF apartments.⁵

There have also been a number of studies of commercial property depreciation in Europe, particularly in the U.K. Many of these studies focus on the investment perspective rather than the tax policy perspective, and they tend to be very applied, industry sponsored reports that use less sophisticated methodologies. In one of the more academic studies, Baum and McElhinney (1997) studied a sample of 128 office buildings in the City of London and estimated a capital value depreciation rate averaging 2.9%/year as a fraction of total property value (including land), with older buildings (over age 22 years) depreciating

³See United States Treasury (2000).

⁴NCREIF properties are owned by tax-exempt investors and tend to be at the upper end of the asset market. The average initial cost in the Fisher et al sample was \$17 million.

⁵NCREIF records indicate that on average almost 20% of apartment property net operating income is plowed back into the properties as capital improvement expenditures. The depreciation occurs in spite of such upkeep.

less than new or middle-aged buildings. Their study was based on appraised values. More recently, a 2011 study by the Investment Property Forum (IPF), an industry group, examined 729 buildings in the UK that were held continuously over the period 1993-2009. Office buildings were found to experience the highest rate of rental depreciation at 0.8%/year followed by industrial at 0.5% and retail at 0.3%, all as a fraction of total property value. A comparable IPF (2010) article on office properties in select European cities, estimated depreciation rates that ranged up to almost 5%/year in Frankfurt to no depreciation at all in some cities (such as Stockholm). The IPF studies were based on comparing the rental growth (based on appraisal valuation estimates) of the held properties with that of a benchmark based on a new property held in the same location. However, problems with using valuations and in benchmark selection led Crosby, Devaney & Law (2011) to conclude that these findings are not a good indication of the rates of depreciation in Europe.

3 Investment Perspective on Depreciation

Although tax policy is clearly important, the previous literature's focus on it may have complicated or omitted some considerations that are more important from a before-tax investment perspective. What we are referring to as the investment perspective on depreciation is the perspective that reflects the fundamental economic performance of investments. This perspective is the basis on which capital allocation decisions derive their economic value and opportunity cost. In the investment industry profit or performance is measured by financial return metrics such as (most prominently) the internal rate of return and the total holding period return. These metrics are based on market value and cash flow, not on historical cost accrual accounting principles. From the investment perspective there is less rationale for contriving (inevitably somewhat arbitrarily) to separate structure value from land value in investments in real estate assets. At the most fundamental level, real economic depreciation directly and importantly affects investment returns before, and apart from, income tax effects.⁶ Therefore, investors care (or should care) about the granular characteristics and determinants or correlates of property depreciation, in order to make better property investment and management decisions.

⁶It is worth noting, as well, that many major investment institutions are tax-exempt (such as pension and endowment funds). Furthermore, the U.S. is fairly unique in having financial accounting rules based on historical cost asset valuation. In most other countries the type of tax policy considerations that have dominated the U.S. literature on commercial property depreciation are not relevant.

Yet, in practice today it appears that many investors do not think carefully about depreciation in this sense. General inflation masks the existence of real depreciation, and the typical commercial property investment cash flow forecast used in industry (the so-called “pro-forma”) almost automatically and complacently projects rent growth equal to a conventionally defined inflation rate (typically 3%). Unless this assumed general inflation rate is below the realistic inflation expectation in the economy (and usually it is not), then the implication is that investors are typically ignoring the existence of real depreciation, at least in their stated pro-formas. (We shall explore this question further in this paper.)

(a) A Conceptual Framework for Analyzing Depreciation

A careful and complete view of depreciation from the investment perspective must consider the causes and correlates of differences in depreciation rates across different types or locations of properties. Such an investment perspective on depreciation must strive in particular to recognize differences and patterns in the urban economic dynamics of locations of commercial properties. The fundamental economic framework from which to view depreciation from the investment perspective is presented in Figure 1.

Figure 1 depicts a single urban site or property parcel over time, with the horizontal axis representing a long period of time, and the vertical axis representing the money value of the property asset on the site.⁷ The top (light) line connecting the U values reflects the evolution of the location value of the site as represented by the value of the “highest and best use” (HBU) development of the site whenever it is optimally developed or redeveloped (new structure built), an event that occurs at the points in time labeled R. This location value of the site fundamentally underpins the potential long-run appreciation of the property value and the capital return to the investor in the property asset. But the actual market value of the property over time is traced out by the heavy solid line labeled P, which represents the opportunity cost or price at which the property asset would sell at any given time. P declines relative to U due to the depreciation of the building structure on the site. Based on standard cash flow (opportunity cost) based investment return metrics such as IRR or total HPR, it is the combination of the change in location value (U) and the occurrence of structure depreciation which determines the price path of P and hence the capital return

⁷A very long span of time must be represented, because depreciation is, by definition, a long-term secular phenomenon, reflecting permanent decrease in building value, and buildings are long-lived, transcending medium-term or transient changes in the supply/demand balance in the real estate asset market.

possibility for the investor over the long run.⁸

From an investment perspective one can define the “land value” component of the property value in either of two alternative and mutually exclusive ways as indicated in Figure 1. The more traditional conception of land value is labeled L and may be referred to as the “legalistic” or “appraisal” value of the land. It reflects what the parcel would sell for if it were vacant, that is, with no pre-existing structure on it. The second, newer conception of land value comes from financial and urban economics and views the land (as distinct from the building on it) as consisting of nothing more (or less) than the call option right (without obligation) to develop or redevelop the site by constructing a new building on it.⁹ This value, labeled C, generally differs from L. The redevelopment call option is nearly worthless just after a (re)development of the site, because the site now has a new structure on it built to its HBU. But at the time when it is optimal (value maximizing) to tear down the old structure and build a new one, the entire value of the property is just this call option value, the land value. Out-of-the-money call options are highly risky, meaning they have very high opportunity cost of capital (high required investment returns), and the investment returns of options must be achieved entirely by capital appreciation as options themselves pay no dividends. Thus, the call option value of the site tends to grow very rapidly over time between the R points, ultimately catching up with the legalistic or appraisal value of the land.

At the reconstruction points (R) all three measures and components of property value, P, L, and C are the same; the old building is no longer worthwhile to maintain (at least, given the redevelopment opportunity), so the property value entirely equals its land value.¹⁰

⁸Although it is the total investment return that matters most, including current income (cash flow) plus change in capital value, there is also interest in breaking out the total return into components, one of which is the current income return or yield rate (net cash flow as a fraction of current asset market value). In such breakout, current routine capital improvement expenditures which are financed internally as plow-back of property earnings are a cash outflow from the property owner, netted out of the income return (i.e., not taken out of the capital return component, from a cash flow perspective). Thus, the investment capital return indicated by the change in P between R points reflects the growth in total property value including (after) the effect of such routine capital improvement expenditures. In the figure 1 model, major externally financed capital improvement expenditures would be considered redevelopments associated with the R points on the horizontal axis.

⁹The exercise cost (or “strike price”) of the call option consists not only of the construction cost of the new building plus any demolition costs of the old building, but also includes the opportunity cost of the foregone present value of the net income that the old building could still continue to earn (if any). Thus, for it to make sense to exercise the redevelopment option either the old building must be pretty completely obsolete or the new HBU of the site must be considerably greater than the old HBU to which the previous structure was built.

¹⁰It makes sense for functional and economic obsolescence to detract from the value of the structure, not

At that point new capital (cash infusion) in an amount of K is added to the site, as depicted in Figure 1, and this value of K (construction costs including demolition costs) adds to the site-acquisition cost (the pre-existing property value, $\text{Old } P = L = C$) to create the newly redeveloped property value (the new P value = $\text{Old } P + K$) upon completion of the development. The net present value (NPV) of the redevelopment project investment is: $\text{NPV} = \text{New } P - \text{Old } P - K$. In an efficient capital market super-normal profits will be competed away and this NPV will equal zero, providing just the opportunity cost of its invested capital as the expected return on the investment.¹¹

The investor's capital return is represented by the change in the property value P between the reconstruction points in time. The change in P across a reconstruction point R includes new external capital investment (K), not purely return to pre-existing invested financial capital. By definition, property value, P , is the sum of land value plus building structure value. The path of P between reconstruction points therefore reflects the sum of the change in the building structure value plus the change in the land value. The latter reflects the underlying usage value of the location and site as represented by its HBU as if vacant, the U line at the top in Figure 1. Thus, the land value component does not tend to decline over time in real terms in most urban locations, although there certainly are exceptions to this rule. However, the building structure component of the property value will almost always tend to decline over the long run, at least in real terms (net of inflation), reflecting building depreciation. In any case, the extent to which the property value path falls below the location value of the site (U), causing a reduction in the investors capital return below the trend rate in U , is due largely and ubiquitously to building structure depreciation. This is the fundamental reason why, and manner in which, the investor cares about depreciation.

from the value of the land. "Functional obsolescence" refers to the structure becoming less suited to its intended use or relatively less desirable for its users/tenants compared to newer competing structures, for example due to technological developments or changes in preferences, such as need for fiber-optic instead of copper wiring or need for sustainable energy-efficient design. "Economic obsolescence" refers to the phenomenon of the HBU of the site evolving away from the intended use of the structure, the type and scale of the building becoming no longer the HBU for the site as if it were vacant, as for example if commercial use would be more profitable than the pre-existing residential, or high-rise residential would be more profitable than the pre-existing low-rise.

¹¹Note that this zero NPV assumption is consistent with the classical "residual theory of land value", in which any windfall in location value accrues to the pre-existing landowner (thus adding to the "acquisition cost" of the redevelopment site, the value of C or L or $\text{Old } P$ at the time of redevelopment). However, if the redevelopment is particularly entrepreneurial or innovative, perhaps there will be some Schumpeterian profits for the new developer.

Note that from this perspective the rate at which the building structure itself declines in value due to depreciation is fundamentally ambiguous. This is because building value equals the total property value minus the land value. But there are two very different yet fundamentally equally valid ways to define and measure land value, the legalistic or appraisal perspective (L) and the economic or functional call option perspective (C). The structure value component (labeled S in Figure 1), can be defined either as $P - L$ or $P - C$. Thus, the rate of depreciation expressed as a fraction of building structure value is ambiguous from the investment perspective. However, depreciation measured as a fraction of total property value, P, is not ambiguous.¹² Therefore, from the investment perspective (as distinct from the tax policy or accrual accounting perspective), it is more appropriate to focus on depreciation relative to total property value including land value (P) rather than only relative to remaining structure value (S). We will adopt this approach for the remainder of this paper.

Finally, given that land generally does not depreciate, an implication of this framework is that we should expect newer properties to depreciate at a faster rate since land value is a smaller proportion of the total property value of a new building. This also suggests that depreciation rates may vary across metropolitan areas as different cities have different scarcity of land, and therefore, different land value proportions of total property value. We test both these hypotheses in our subsequent empirical analysis.

(b) Source of Depreciation: Income or Capitalization?

It is of interest from an investment perspective to delve deeper into the depreciation phenomenon and explore how much depreciation is due to changes in the current net cash flow the property can generate as it ages versus how much is due to the property asset market's reduction in the present value it is willing to pay for the same current cash flow as the building ages. This latter phenomenon is sometimes referred to as "cap rate creep". Such

¹²It is worth noting that, apart from the conceptual problem, measuring depreciation as a fraction of structure value (S) is also difficult to estimate empirically. This is because, compared to quantifying the total property value, P, it is usually relatively difficult to quantify either L or C for a given property at a given time. While appraisers or assessors sometimes estimate the value of L, such valuations are only estimates, and are often crude and formulaic. In built-up areas there is often little good empirical evidence about the actual transaction prices of comparable land parcels recently sold vacant. And land value estimates can be circular from the perspective of quantifying structure depreciation, as the land value may be backed out from property value minus an estimate of depreciated structure value, meaning that for purposes of empirically estimating structure depreciation we get an estimate of depreciation based on an estimate of depreciation!

an understanding could improve the accuracy of investment return forecasts, and possibly improve the management and operation of investment properties.¹³

By way of clarification and background, consider the fundamental present value model of an income property asset:

$$P_{i,t} = \sum_{s=t+1}^{\infty} \frac{E_t[CF_s]}{(1+r_{i,t})^{s-t}} \quad (3.1)$$

where $P_{i,t}$ is the price of property i at time t ; $E_t[CF_s]$ is the expectation as of t of the net cash flow generated by the property in future period s ; and $r_{i,t}$ is the property asset market opportunity cost of capital (OCC, the investor's required expected total return) for property i as of time t . With the simplifying assumption that the expected growth rate in the future cash flows is constant (at rate $g_{i,t}$) and the property resale price remains a constant multiple of the current cash flow, (3.1) simplifies to the classic "Gordon Growth Model" of asset value (GGM), which is a widely used valuation model in both the stock market and the property market:¹⁴

$$P_{i,t} = \frac{E_t[CF_s]}{r_{i,t} - g_{i,t}} \quad (3.2)$$

With the slight further simplification that the net operating income approximately equals the net cash flow ($NOI_{i,t} \approx E_t[CF_s]$),¹⁵ this formula provides the so-called "direct capitalization" model of property value which is widely used in real estate investment:

$$P_{i,t} = \frac{NOI_{i,t}}{k_{i,t}} \quad (3.3)$$

¹³For example, there might be things the investor could do to mitigate the decline in net cash flow, whereas there might be less that can be done to influence caprates.

¹⁴Clearly the GGM is a simplification of the actual long-term cash flow stream as modeled in Figure 1. But the GGM is widely used and its simplification is relatively benign for our purpose, which is only to explicate the basic roles in property depreciation of the two factors, current net cash flow and asset market capitalization.

¹⁵The difference between NOI and CF is the routine capital improvement expenditures: $CF_t = NOI_t - CI_t$. Although this difference does not matter for our purpose in this paper, it is of interest to note that among properties in the NCREIF Property Index, the historical average capital expenditure (CI) is over 2% of property value (including land value) per year. Deloitte-Touche (2000) reports that U.S. Census data indicates overall post-construction capital improvement expenditures on buildings is approximately 40% of the cost of new construction. (If the average building is somewhat more than 20 years old, this would be roughly consistent with the NCREIF 2%/year rate.) The Deloitte-Touche study also conducted a survey which suggested that capital expenditures may often exceed 5% of structure value per year. (If structure value is on average halfway between 80% and 0% of total property value, then this too would be roughly consistent with the NCREIF data.) However, the D-T survey was very limited.

where $k_{i,t} = r_{i,t} - g_{i,t}$ is the capitalization rate (“cap rate” for short) for property i as of time t . The property value equals its net operating income divided by its cap rate.

Thus, if the property real value tends to decline over time with depreciation, due to the aging of the building, then such value decline may be (with slight simplification) attributed either to a decline over time in the real *NOI* that the property can generate, or to an increase over time in the cap rate that the property asset market applies to the property as it ages, or to a combination of these two sources of present value. To the extent depreciation results from an increase in the cap rate with building age (“cap rate creep”), this could result either from an increase in the OCC or from a decrease in the expected future growth rate, $g_{i,t}$, or a combination of those two. In the present paper we will not attempt to parse out this OCC versus growth expectations breakout. We content ourselves with exploring the question of how much of the depreciation in P is due to the *NOI* and how much is due to k . To answer this question, we will estimate the effects of depreciation on both property value and on cap rates. The difference between the total depreciation and effect of the cap rate creep will be attributable to NOI depreciation. We now turn to outlining our empirical model.

4 The Hedonic Price and Cap Rate Models

In this section, we outline our approach for estimating the effects of depreciation on both total property value and the property cap rate. Following in the tradition of depreciation estimation modeling, the approach known as “used asset price vintage year” analysis is applied to quantify real depreciation. This involves an essentially cross-sectional analysis of the prices at which properties of different ages (defined as the time since the building was constructed) are transacted, controlling for other variables that could affect price either cross-sectionally or longitudinally. This is estimated via the hedonic price model given in equation (4.1)

$$\ln(p_{i,t}) = \sum_{h=1}^H \beta_A A_{h,i,t} + \sum_{j=1}^J \beta_X X_{j,i,t} + \sum_{m=1}^M \beta_M M_{m,i,t} + \sum_{s=1}^T \beta_T T_{s,i,t} + \epsilon_{i,t} \quad (4.1)$$

where,

- $p_{i,t}$ is the price of property sale transaction i occurring in year t .
- $A_{h,i,t}$ is a vector of H property and location characteristics attributes for property sale transaction i as of year t .
- $X_{j,i,t}$ is a vector of J transaction characteristics attributes for property sale transaction i as of year t .
- $M_{m,i,t}$ is a vector of fixed-effects dummy variables representing M metropolitan markets for property sale transaction i as of year t
- $T_{s,i,t}$ is a vector of $s = 1, 2, \dots, T$ time-dummy variables equaling one if $s = t$ and zero otherwise (for property sale transaction i as of year t).

The A_h property and location characteristics in the model include, most importantly, the property age in years since the building was constructed and age-squared, but also include the natural log of the property size in square feet, dummy variables for property usage type sector (office, industrial, retail, or apartment), and a dummy variable flagging whether the property is in the central business district (CBD) of its metro area. The X_j transaction characteristics include an indicator of seller type, a dummy variable to control whether the sale was in distress, a dummy variable to indicate if the buyer had a loan that was part of a CMBS pool, as well a flag to indicate whether the property had excess land available (was not fully built out).

(a) Censored Sample Bias and Correction

As pointed out by Hulton & Wyckoff (1981), any estimation of the depreciation rate would need to take into account the experience of torn-down buildings in order to avoid introducing a survivorship bias. Since buildings that have been demolished have already depreciated to a point that their structure has no value, omission of such data is likely going to result in an estimate that is smaller than it should be. Hulton & Wyckoff (1981) correct for this censored sample bias by noting that the average price of a building (of a given age) is the price of surviving buildings, multiplied by the survival probability (having survived until that age), plus the zero value of torn-down buildings (of that vintage) times the probability of being torn-down (having not survived by that age). Using this approach, we can re-write the left-hand side of equation (4.1) as

$$\ln(P_i * p_{i,t}) = \sum_{h=1}^H \beta_A A_{h,i,t} + \sum_{j=1}^J \beta_X X_{j,i,t} + \sum_{m=1}^M \beta_M M_{m,i,t} + \sum_{s=1}^T \beta_T T_{s,i,t} + \epsilon_{i,t} \quad (4.2)$$

where P_i is the probability of survival until the age of building i .

This expected price formulation of equation (4.2) will be the focal regression for the remainder of this study. In order to estimate a survival probability for our sample properties, we will employ data on demolished buildings (along with surviving buildings) and use the Kaplan-Meier estimator to calculate the survival probability at each building age.

(b) Cap Rate Model

We also estimate a hedonic model of the cap rate that can, similar to the analysis of property price, quantify how the cap rate is a function of the age of the property's building structure (holding other characteristics constant). This cap rate model can then be combined with the hedonic price model to derive how much of the overall depreciation in the property value is due to depreciation in the property net operating income and how much is due to change in the cap rate.

Our hedonic cap rate model is very similar to our hedonic model of property price in (4.1) except that we replace the dependent variable with a normalized construct of the property's cap rate at the time of sale instead of the property price. The normalized cap rate is the difference between the property's cap rate minus the average cap rate prevailing in the property's metropolitan market (for the type of property) during the year of the transaction. This normalization controls for systematic differences in cap rates across metropolitan areas, as well as for cyclical and market effects on the cap rate.¹⁶ The normalized cap rate thus allows the individual property differences in cap rates that could be caused by the age of the buildings to be estimated in the model below:

$$CapRate_{i,t} = \sum_{h=1}^H \beta_A A_{h,i,t} + \sum_{j=1}^J \beta_X X_{j,i,t} + \sum_{m=1}^M \beta_M M_{m,i,t} + \sum_{s=1}^T \beta_T T_{s,i,t} + \epsilon_{i,t} \quad (4.3)$$

¹⁶Alternatively, cap rates on the left hand side and interacted dummies between MSA and time would also capture the between market variation in cap rate over time. This alternative specification gives nearly identical results, not surprisingly.

5 Data

This study is based on the Real Capital Analytics Inc (RCA) database of commercial property transactions in the U.S.¹⁷ RCA collects all property transactions greater than \$2,500,000, and reports a capture rate in excess of 90 percent. Properties smaller than \$2.5M are often owner-occupied or effectively out of the main professional real estate investment industry. We believe the data represent a much larger and more comprehensive set of investment property transactions than prior studies of depreciation. The present analysis is limited to the four major core property sectors of office, industrial, retail, and apartment. The study dataset consists of all such transactions in the RCA database from 2001 through the second quarter of 2014 and which pass the data quality control filters and for which there is sufficient hedonic information in the RCA database, 107,805 transactions in all.¹⁸ This includes 80,431 non-residential commercial property sales and 27,374 apartment property sales. A subsample of 81,310 transactions are located in the top 25 metropolitan area markets which are studied separately.¹⁹ 32,481 sales have, in addition to sufficient hedonic data, also reliable information about the cap rate (as defined in section 3). This cap rate subsample will be used in subsequent analysis of the cap rate creep. Table 1 presents the summary statistics for the overall dataset. The average age of the properties in our sample is 32 years and the median age is 25 years. The data are fairly equally distributed across the four core property types. The seller types are broadly categorized as Equity, Institutional, Public, Private, User and CMBS Financed, of which Private constitutes about 69% of the data. Figure 2 shows the number of observations in each of the top 25 RCA Metro Markets. The sample sizes range from 15,380 transactions in Metro Los Angeles down to only 288 in Pittsburgh.

¹⁷In general from here on, unless specified otherwise or it is clear from the context, we will use the term “commercial” property to refer to all income-producing property including multi-family apartments.

¹⁸We drop sales that were part of a portfolio sale to avoid an uncertain sale price for a property within the portfolio. We also drop properties for which the sale price was not classified as confirmed by RCA’s standards and if they were older than 150 years.

¹⁹RCA has their own definition of metropolitan areas which differ slightly from the U.S. Census definitions and conform better to actual commercial property markets. We refer to these as “RCA metros” or “Metro Markets.”

(a) Torn-Down Building Data, Multiple Imputation of Age-at-Demolition and Survival Probabilities

In addition to the above described data which will serve as the basis of our analysis, we have a stock of 12,903 buildings that were either demolished or acquired with the intention of demolition. Unfortunately, of these, only 2,109 observations have non-missing age information. In order to calculate survival probabilities at each building age, we first need to impute the missing age-at-demolition data. We choose a multiple imputation approach where each missing age is imputed 20 times. The method of imputation outlined by Royston (2007) is particularly suited for imputing censored variables. It's main feature is that the researcher can specify an interval of the normal distribution from which the imputed values will be simulated. In our case, we specified that interval to be between ages 10 and 150 years, the assumption being that buildings with age less than ten years are very unlikely to be demolished. An added advantage of this approach is that our imputed values are always going to be non-negative and within a sensible range. As recommended by the multiple imputation literature, the model for the conditional distribution of Age contains all co-variates, including price and a dummy variable for surviving properties. Upon obtaining 20 imputations of age-at-demolition, we construct 20 separate sets of survival probabilities using the Kaplan-Meier estimator. Figure 3 shows an example survival function using one such imputation. We find that the other 19 sets are very similar in shape. Finally, we construct a single set of survival probabilities (P_i in (4.2)) by taking an average over the 20 sets. The thus obtained survival probabilities are then multiplied by the price of the surviving buildings (107,805 transactions) to create the left-hand side (in logs) of the regression equation (4.2).

6 Empirical Analysis

(a) Depreciation Magnitude and Age Profile

The first set of results is based on the bias-corrected hedonic price model in (4.2), run on the entire 107,805 US transaction sample, and focuses on the overall rate of depreciation and its profile over time. Column (1) in Table 2 presents the regression results. The variables of interest, both Age and Age-squared, are highly significant, with the coefficient on Age being negative and that on Age-squared being positive; a convex quadratic function. Thus, the property value tends to decline in real terms with building age, but at a de-

clining rate. Also shown in column (2) of Table 2 is the regression from equation (4.1), reflecting an estimate that does not correct for censored sample bias caused by torn-down buildings whose structures have already fully depreciated. There are two points worthy of note when comparing the Age and Age-squared coefficients between columns (1) and (2). First, the coefficients are less precise in the bias-corrected estimates of column (1). The standard errors are greater due to the uncertainty introduced by the multiple imputation (of age-at-demolition) step in the estimation of the survival probabilities. Nevertheless, the results are still statistically significant. Second, the biased estimates of column (2) do indeed underestimate the rate of depreciation. This is best seen in Figure 4, where the two quadratic specifications are compared in an implied Age-Price profile (constructed using both Age and Age-squared coefficients). It is clear that while the biased and un-biased profiles mostly agree up until the first 40 years of building age, the biased quadratic specification fails to capture the continued decay in property value much beyond that point. Also shown in Figure 4 is an alternate bias-corrected age dummy specification as a robustness check.²⁰ We also show a two standard error bound around this specification to depict the noise in these estimates in the range beyond 110 years, a point where the data starts to get thin. The age dummy specification suggests that the bias-corrected quadratic approach is a very good approximation to a more flexible but noisier alternative.

Using the quadratic specification as the more parsimonious model, we model the depreciation rate (using the Age and Age-squared coefficients) for all building ages from 1 to 50 years old. We then take, as our summary measure of average depreciation rate, the equally-weighted average rate across the 50 year horizon. (That is, each of the 50 years' rates counts equally. This average is normally very similar to the depreciation rate of a 25 year old building.²¹) Thus, in effect, this is a summary depreciation metric that holds the age of the building structure constant across comparisons, at the time-weighted average depreciation rate over a 50-year building life horizon.

For the national sample, this gives an average real depreciation rate of 1.5%/year of property value (including land). The depreciation rate declines from 1.82%/year for a property with a new building down to 1.12%/year for a property with a 50-year old building (see Figure 5). At first glance, these depreciation rates appear to be smaller than what was reported in earlier studies in the U.S., such as the Hulton-Wyckoff (1981) and Deloitte-

²⁰In this specification, there is a dummy for each age up until age 129, while ages 130 to 150 are lumped together into one final dummy variable.

²¹As noted earlier, the mean building age in our sample is 32 years, with a median age of 25 years.

Touche (2000). But those studies were quoting rates as a fraction of remaining estimated structure value, not total property value which is our focus.

We have noted in Section 3 that from the investment perspective it is less important to attempt to quantify depreciation as a fraction of only structure value. Nevertheless, to compare our results with the previous U.S. depreciation literature, it may be of some interest to make some observations in that regard. Given our bias-corrected empirical model in column (1) of Table 2, we can estimate an implied average structure lifetime by finding the minimum point (over Age) at which there is no further property depreciation. The minimum point of the quadratic $Ln(p) = -0.0185 * Age + 0.00007 * Age^2$ is at age 128 years (see also Figure 4). When a building is no longer depreciating, it is worthless and hence it is time for redevelopment. At that point, the entire property value is land value. As a fraction of value of newly-built property value, this pure land value component can be found by plugging the building lifetime age (i.e., age when structure becomes worthless as indicated by no further depreciation) back into our hedonic price equation [$\exp(-0.0185 * 128 + 0.00007 * (128)^2 = 0.31)$]. Since land value fraction is 31% of newly-built property value, the corresponding structure value fraction would be 69%. Given this initial structure value fraction and our property value depreciation profile, we back out that the rate of structure depreciation (per annum) is 2.7% at the median building age of 25 years. This estimate would be roughly consistent with previous studies' findings.

In Table 3, we run separate regressions for the 4 core property types. We find (consistent with the national aggregate results) signs and significance for the Age and Age-squared variables across all property types. In the case of non-residential commercial real estate, office and retail properties depreciate the fastest at similar rates, while industrial depreciates the slowest (at least until buildings become very old). In Figure 6, we lump all the non-residential commercial property sectors together and break out the analysis separately for apartments and non-residential commercial properties. It is not clear a priori why apartment properties should depreciate at different rates than commercial property, but tax policy has long differentiated them (possibly for political reasons). In fact, we see that apartments do on average depreciate slightly faster than non-residential commercial properties, holding age constant. In our sample, the average apartment building is 10 years older than the average non-residential commercial property (median of 35 years vs 23 years old) and the depreciation rate of the median apartment property is 1.63% vs 1.5% per annum for commercial.

In summary, our aggregate-level findings suggest depreciation rates that average 1.5%

per annum as a fraction of total property value (including land). Compared to the previous literature, our estimates are based on actual transaction prices rather than building structure value estimates, and are based on a much larger and more comprehensive property sample. Given our model's implications for structure depreciation, the rates we find are consistent with the earlier findings. We find clear evidence that properties depreciate slower as buildings age. There is also clear evidence that apartment properties depreciate faster, but only slightly faster, than non-residential commercial properties.

(b) Estimation of Cap Rate and NOI Effects on Total Depreciation

In order to estimate how much property value depreciation would result purely from cap rate creep, and how much from NOI decline, we estimate the (bias-corrected) hedonic price and cap rate models (equations (4.2) and (4.3) respectively) on the same transaction subsample for which we have cap rate data available. These regressions are shown in columns (1) and (2), respectively, of Table 4. We first compute the total depreciation in property value from the age coefficients in the price model (column (1) of Table 4), much as described in the previous section. We next compute how much decline in property value with building age would result purely from the increase in the cap rate due to age as implied by the age coefficients in the cap rate model (column (2) of Table 4), holding the property net operating income constant. The difference between the total depreciation and the pure cap rate creep depreciation presumably is attributable to NOI depreciation.

The result of this analysis is shown in Figure 7. It can be seen that almost all of the property value real depreciation results from the decline in the real *NOI* and very little from cap rate creep. Using our previously defined average-age metric for the summary depreciation rate, the overall average depreciation rate in the subsample is 1.5%/year, while the average depreciation rate due solely to cap rate creep is only 0.17%/year. The implication is that the NOI source of depreciation accounts for 1.38%/year or 92% of all the depreciation. This implies that the conventional approach in current investment industry practice in commercial property pro-formas of forecasting rent and cash flow growth at a standard 3% rate (presumably equal to inflation but in reality if anything slightly greater than inflation in recent years) is substantially biased on the high side, especially for newer buildings.

Because discounted cash flow (DCF) analyses of such pro-forma cash flow forecasts must of necessity arrive at a present value for the property approximately equal to the

current market value of the property, this implies that the discount rate employed in such analyses must be substantially greater than the actual opportunity cost of capital. In other words, the discount rate typically employed in micro-level real estate investment analysis in the industry today is substantially greater than the actual realistic expected total return on the investment.

The dominance of net income and the space market as the fundamental source of property value in real depreciation is interesting in view of the fact that changes in capitalization, in the asset market's opportunity cost of capital or future growth expectations, have been found to play a major and perhaps even dominant role in short to medium-term movements in property value.²² But depreciation is a very long-term secular phenomenon, and it makes sense that it would largely reflect underlying fundamentals.

(c) Depreciation and Metropolitan Location

We noted previously that real depreciation is a phenomenon of decline in the value of the building structure on the property, as land generally does not depreciate (or not as much or as relentlessly). This probably largely accounts for why the rate of depreciation is greater in properties with newer buildings. This also strongly suggests that property depreciation rates may vary across metropolitan areas, as different cities have different scarcity of land and different land value proportions of total property value. To analyze this issue, we estimated the bias-corrected hedonic price model in (4.2) separately for the top 25 Metro Markets (see again Figure 2 for the sample sizes in each metro).²³

Figure 8 shows the resulting estimated coefficients on the Age variable in (4.2), in terms of absolute value (higher value is faster depreciation). The Age coefficients are statistically significant in all 25 Metro Markets and Age-squared coefficients are statistically significant for all but 9 Metro Markets. The Figure ranks the metros from greatest (fastest) to lowest (slowest) depreciation (based on the Age coefficient) and shows the 2-standard-deviation confidence bounds around the Age coefficient estimate in each metro. However, recall that the Age coefficient by itself is not the complete story about depreciation, as the effect of the Age-squared coefficient must also be considered, which makes the property depreciation rate a function of building age. Table 5 therefore shows for each metro the implied depreciation rates as a function of building age, as well as the time-weighted

²²See for example Geltner & Mei (1995), and Plazzi, Torous & Valkanov (2010).

²³For this analysis, the imputation of the age-at-demolition data was computed separately for each market.

average summary metric for each metro (which effectively compares across metro holding building age constant). Finally, Figure 9 depicts some representative age/value profiles for three major metropolitan areas, providing a visual impression of how both the average depreciation rate and the age profile of the depreciation can vary across select metropolitan areas.²⁴

The extent of variation across metropolitan areas is striking. For the age-constant summary metric, the average depreciation rate for all income-producing commercial property ranges from 2.95%/year in Dallas down to 0.42%/year in Los Angeles. The age profile (see Figure 9) also can vary greatly, with NY apparently exhausting the property depreciation just prior to 85 years of building age. This probably does not generally reflect an historic building or “vintage effect” as has been sometimes found for single-family houses.²⁵ And income-producing properties, essentially capital assets traded in the investments industry, are probably not very susceptible to architectural style vintage year preference effects like houses may be. Rather, the exhaustion of property depreciation probably suggests rapid economic obsolescence in a dynamic metropolitan area where the highest and best use (HBU) of locations has been rapidly changing over the past couple of generations.

On the other hand, metro areas that show little depreciation right from the start, even when buildings are new, may reflect systematically higher land value proportions of total property value, even when the buildings are new. This may reflect land scarcity. Figure 10 explores this issue by regressing the metro areas’ depreciation rates onto the Saiz (2010) measure of metro area real estate supply elasticity.²⁶ The Saiz elasticity measure is based on both regulatory and physical land supply constraints on real estate development, which Saiz (2010) has shown are major determinants of overall real estate development supply elasticity. Thus, the Saiz elasticity measure should be highly correlated (negatively) with land value and the land value fraction of total development costs (and therefore, with the average land value fraction of total property value). Metro Markets with higher Saiz elasticity measures probably tend to have lower land values. Figure 10 indeed reveals a strong positive relationship between depreciation and the Saiz elasticity. Metro areas that tend to have more elastic supply of real estate by the Saiz measure (which probably have

²⁴The Age-Price profile is noisy for several metro areas as that level of granularity introduces more noise in the imputation and survival probability estimations.

²⁵See Clapp & Giacotto (1998), who document that home buyers may develop preferences for certain vintages of housing construction.

²⁶Figures 10, 11, 12 and 13 show results for 24 instead of 25 metro areas because at present there is no elasticity estimate available for Sacramento MSA.

lower land costs resulting in building value being a larger share of total property value) are associated with faster depreciation, especially in the early years of building life.²⁷ We see the opposite in metros that have the lowest Saiz elasticities.²⁸

In Figure 11, we regress MSA depreciation rates against the physical land constraint component of Saiz's elasticity measure. The physical land constraint measure is a sum of various geographical constraints within a 50km radius from the center of an MSA. These constraints include the share of land area that's at more than a 15% slope, or if it is under open water or wetlands, or generally not available for development. The figure shows that depreciation rates are lower in MSAs where there are greater (higher value) physical constraints to development. This again is consistent with the view that land value proportions of total property value would be higher in such MSAs and therefore, depreciation in the structure would be a smaller percentage of total property value.

In Figure 12, we regress MSA depreciation rates against the Wharton Land Regulation Index (WLRI, also a component of Saiz's elasticity measure). In the Figure, higher values reflect greater regulatory constraints and we see a negative relationship between average depreciation rates and the WLRI. However, the relationship between depreciation and regulatory constraints in Figure 12 is weaker than the relationship between depreciation and physical land constraints in Figure 11. Onerous regulations constrain development without adding to land value (they don't cause land scarcity per se but merely an increase in development costs), while physical land constraints should cause land scarcity and higher land costs. In a simple regression of average MSA depreciation rates onto the Saiz physical land constraints measure and the WLRI, we find that the physical land constraints measure has greater explanatory power than the WLRI measure. The physical land constraint measure has a bigger coefficient (-0.71) and higher statistical significance (at 1% level) than WRLI, which has a coefficient of -0.37 and is only statistically significant at the 10% level. Physical land constraints alone can explain over 40% of the variation in average depreciation rates across MSAs while adding WRLI only marginally increases the explained variation to 50%. Thus, low depreciation is more associated with physical land constraint than with regulatory constraints.

²⁷As noted, lower depreciation as a fraction of property value in later years (older buildings) in metro areas with rapid initial depreciation rates could reflect exhaustion of building value due to widespread economic obsolescence of structures reflecting very dynamic metropolitan growth. Ex.s. include Dallas, Denver, Phoenix, Atlanta, etc.

²⁸Most notably the West Coast metros (LA, SF, SD, Seattle, Portland) and major North Atlantic metros (NY, Bos, DC).

The analysis in Figures 10, 11 & 12 explores a major cause of the cross-section of metropolitan depreciation rates in commercial property. On the other hand, the analysis in Figure 13 explores a major effect of this variation in depreciation rates. Figure 13 regresses the average cap rates of property sale transactions onto the average depreciation rates across the Metro Markets. As noted in our derivation of the direct capitalization formula for property value in Formula (3.2) in Section 3, cap rates can be viewed as reflecting essentially or primarily the current opportunity cost of capital (the investors' expected total return, $r_{i,t}$) minus the long-term expected growth rate in property value (what we labeled $g_{i,t}$, which fundamentally and primarily reflects the long-term growth in property net income). Clearly the long-term growth rate strongly reflects the property depreciation rate that we have been estimating. Therefore, we should expect property transaction prices, as reflected in their cap rates, to be partially and importantly determined by depreciation expectations. Thus, the dispersion in cap rates should be correlated with the dispersion in depreciation rates across Metro Markets. Figure 13 shows that this is exactly what we find. The relationship is strongly positive and statistically significant.

However, the cap rate/depreciation relationship in Figure 13 is less than a one-to-one correspondence (slope is less than 1.00). If cap rates were completely determined by the $r_{i,t} - g_{i,t}$ relationship, and if $g_{i,t}$ were completely determined by depreciation (growth is the negative of depreciation), then we would expect the estimated slope line in Figure 13 to be closer to 1.00. Instead, the slope is just under 0.5. Apparently cap rates are a bit more complicated than $r_{i,t} - g_{i,t}$ and/or the growth that matters to investors is more complicated than just the long-term depreciation that characterizes the metro area.

Nevertheless, Figure 13 suggests that the type of depreciation we are measuring is important for investors, as it should be. This finding suggests some nuance on the point we made previously that in current industry practice the routine cash flow forecasts in individual property investment DCF valuations seem to ignore real depreciation and the differences in depreciation across metro areas. While this is true of the cash flow forecasts in the numerators of the DCF present value analyses, the discount rates applied in the denominators are more flexible and are used to bring those cash flow forecasts in the numerators to a present value that coincides with current asset market valuation which does, apparently, reflect sensitivity to differences in growth and depreciation across metro areas. In other words, the discount rates used by investors must tend to be smaller in metro areas with less depreciation, and larger in those with greater depreciation. An effect which actually, realistically exists in the numerators (cash flows) is instead applied in the

denominators (discount rate). As the discount rate is, in principle, the investor's going-in expected return, this suggests a lack of realism in these expected returns, both on average in general, and relatively speaking cross-sectionally, particularly in high depreciation Metro Markets such as many in the South and interior Sun Belt.²⁹

7 Conclusion

In this paper we have analyzed the wealth of empirical data about U.S. commercial investment property contained in the RCA transaction price database in order to characterize the nature and magnitude of real depreciation. We introduce and explicate what we call the investment perspective for this analysis, which differs from that of the income tax policy oriented studies that have dominated most of the past literature in the U.S. The investment perspective is based on before-tax cash flow and market value metrics such as the IRR and the holding period total return that are prominent in the financial economics field, instead of on the historical cost accrual accounting perspective that underlies IRS tax policy in the U.S. Given our investment perspective, we focus on depreciation as a fraction of property total value (including land value), although we make some observations about building value fractions in order to place our empirical findings in comparison to results reported in earlier literature.

To briefly summarize our empirical findings about depreciation in income property viewed from the investment perspective, we see first that depreciation is significant. With average rates well over 100 basis-points per year, often over 200 bps in newer properties, depreciation has an important impact on realistic expected returns and property investment values. Furthermore, depreciation varies in interesting ways. It tends to be greater in younger properties (those with more recently constructed buildings). This probably largely reflects the relative share of land value and building structure value in overall property value, as land does not tend to depreciate. Holding building age constant, depreciation tends to be slightly greater in apartment properties than in non-residential commercial properties. Depreciation varies importantly across metropolitan areas. We see that metros

²⁹This lack of a realistic correspondence between the implied expected returns and the realistic expected returns does not necessarily imply that asset mispricing exists. Asset prices reflect supply and demand for investment assets, and could rationally reflect risk and return preferences and perceptions. For example, Dallas properties may realistically provide less expected return than is suggested by the discount rates employed in their DCF analyses, but they also may present less risk than would warrant expected returns as high as the discount rates.

with lower development supply elasticity, especially places with physical land constraints such as the large East and West Coast metropolises, have lower depreciation rates. Places with plenty of land and less development constraints (higher supply elasticity) have higher average depreciation (holding building age constant). We also confirm that investment property asset prices do significantly reflect the differences in depreciation rates across metropolitan areas (as they should with rational asset pricing), though depreciation can only explain about half of the cross-sectional differences in cap rates.

Finally, we have seen that real depreciation is largely caused by (or reflects) real depreciation in the net operating income (NOI) that the property can generate, rather than by “cap rate creep” (increasing property cap rate with building age). Depreciation is a long-term secular phenomenon, so it makes sense that it would largely reflect property value fundamentals. This finding, combined with the magnitude of real depreciation that we find, strongly undercuts the realism in the typical prevailing industry practice of automatically forecasting a rental growth rate of 3%/year in most cash flow pro-formas and DCF present value analyses of individual property investments.

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The component of total property value (P) attributed to the building structure equals the component not attributed to land value. There are two ways to conceptually define land value: "L" is the legal/appraisal definition (value of comparable vacant lot); "C" is the economic definition (value of the redevelopment call option). In the graph below, $S = P - C$. But most practical applications use the legal definition of land value, and $S = P - L$. Depreciation results from any/all of three forms of obsolescence: (i) Physical (wearing out, more expensive maintenance), (ii) Functional (components & design no longer optimal for the intended use), & (iii) Economic (intended use no longer optimal for the site).

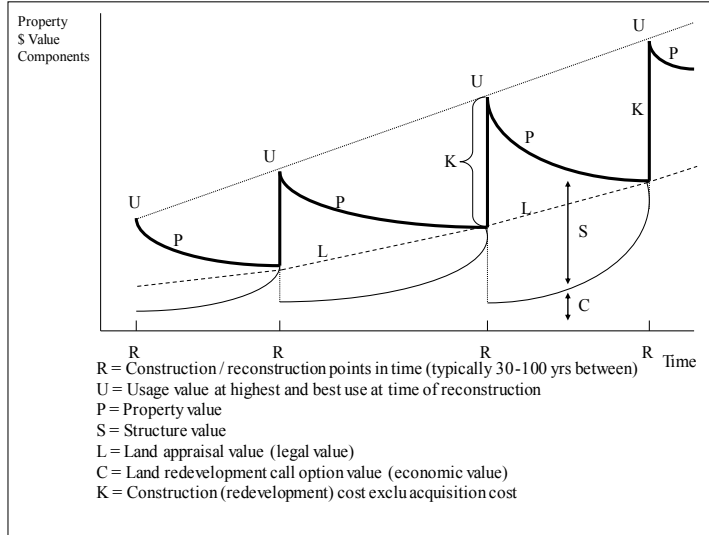


Figure 1: A Framework for Analyzing Depreciation

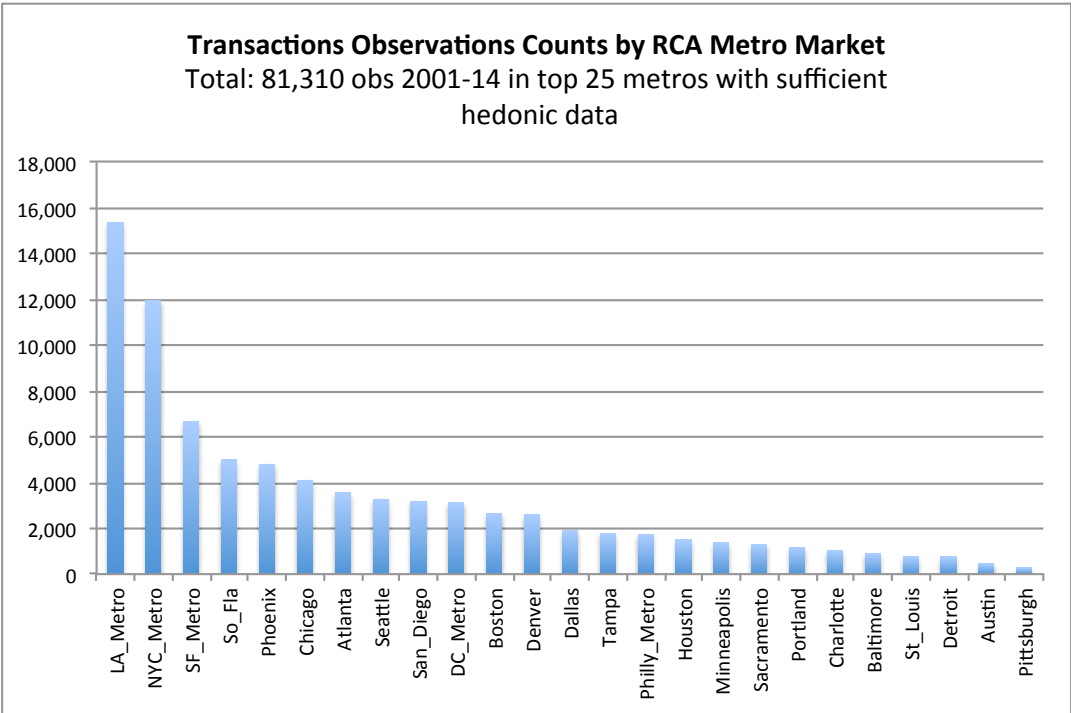


Figure 2: Transactions by RCA Metro Area

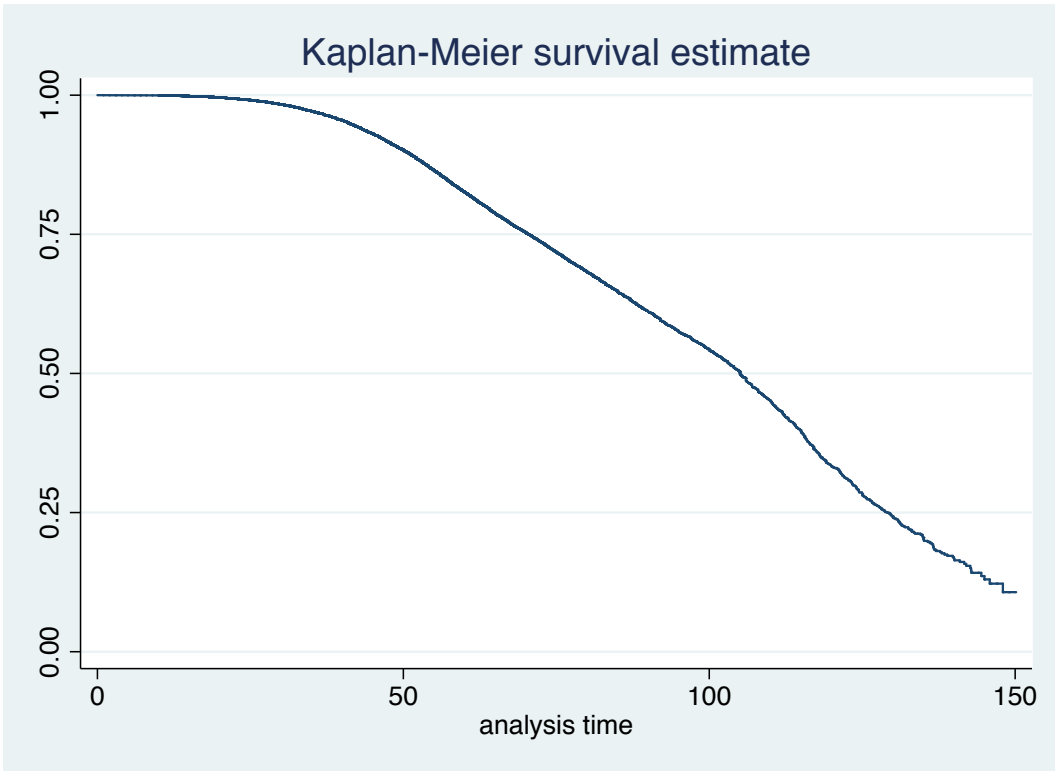


Figure 3: Kaplan-Meier Survival Function (based on one set of imputations)

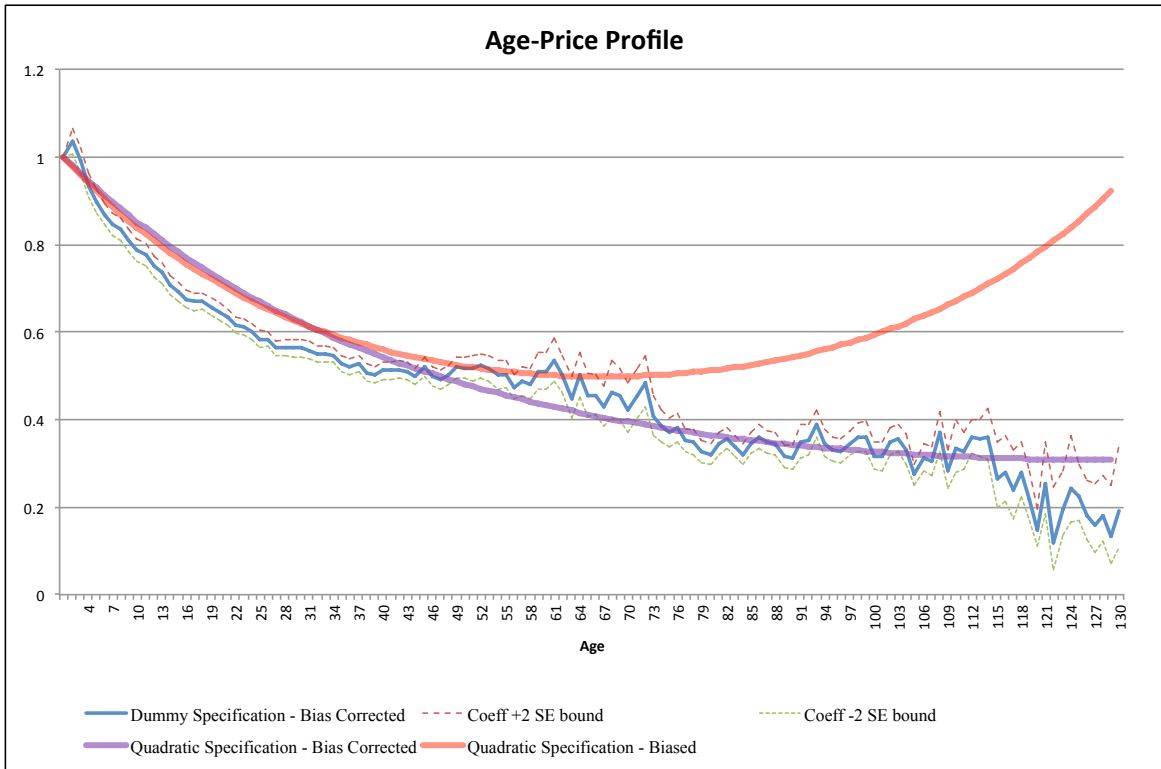


Figure 4: Implied Age-Price Profiles - Alternate Specifications

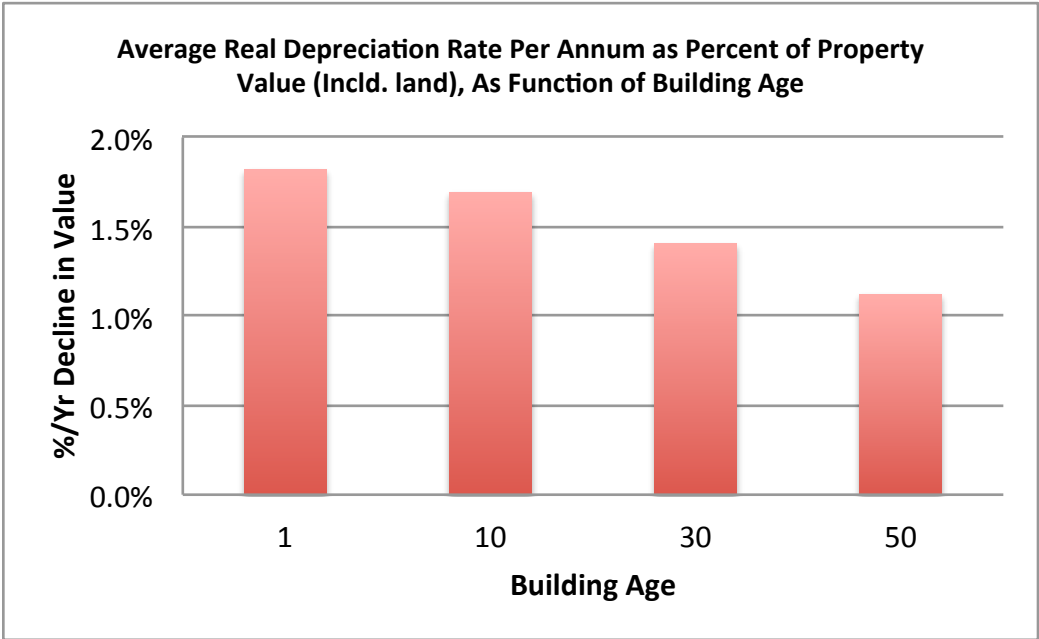


Figure 5: Real Depreciation (per annum) by Building Age

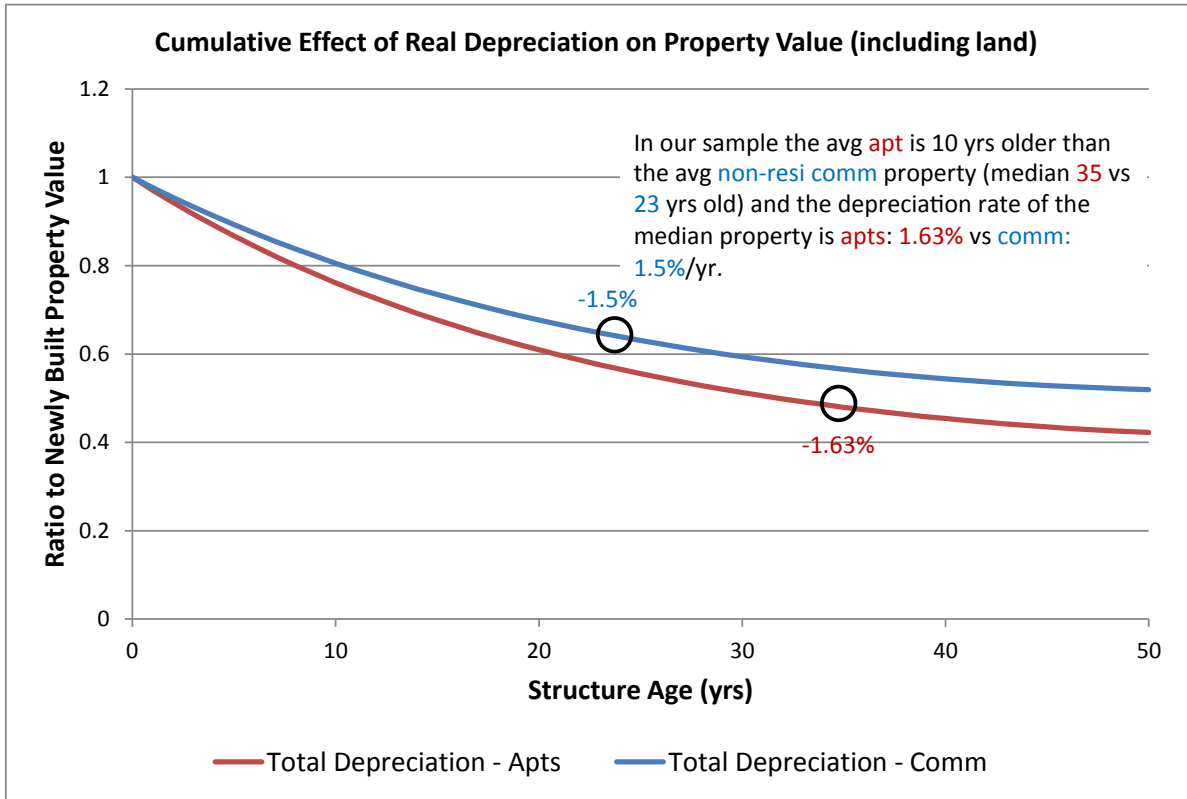


Figure 6: Real Depreciation: Apartments vs Non-Residential

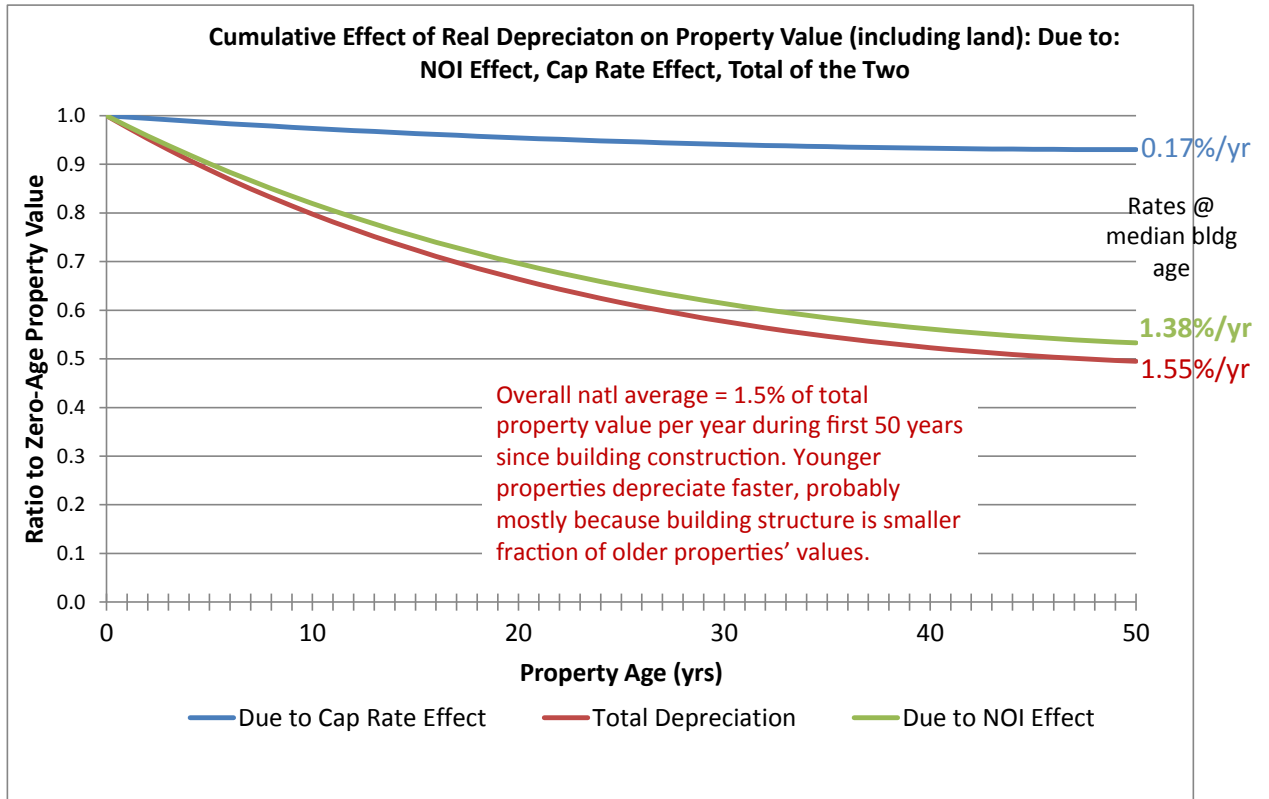


Figure 7: Real Depreciation due to Cap Rate Effect vs NOI Effect

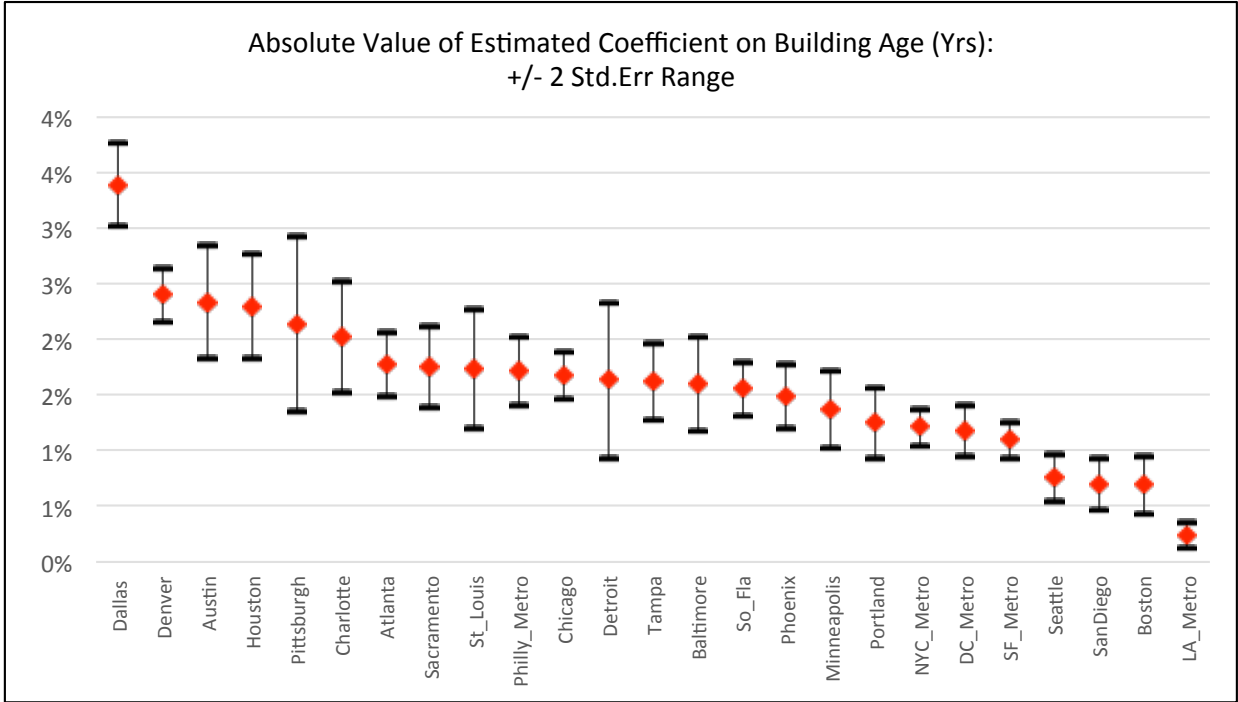


Figure 8: MSA Age Coefficients and Standard Errors

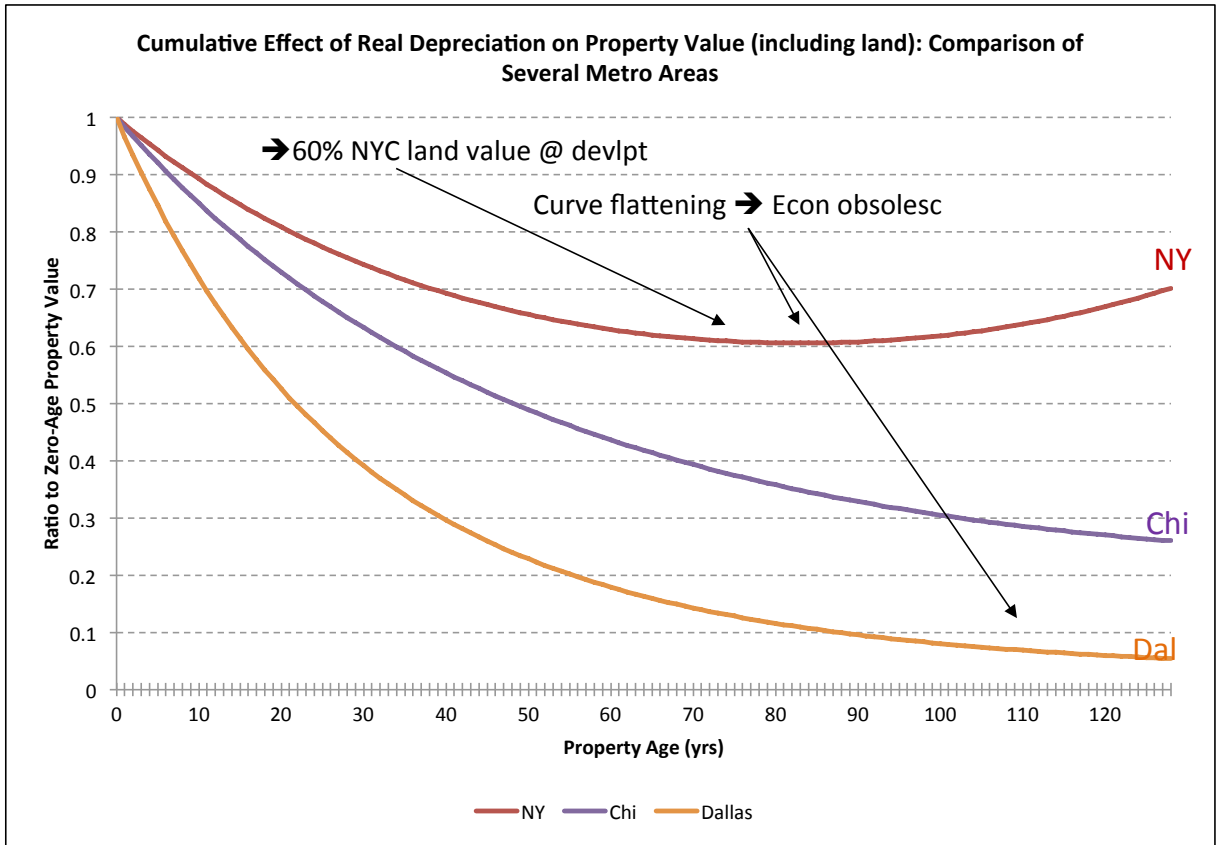


Figure 9: Depreciation Rates and Age Profiles Across MSAs

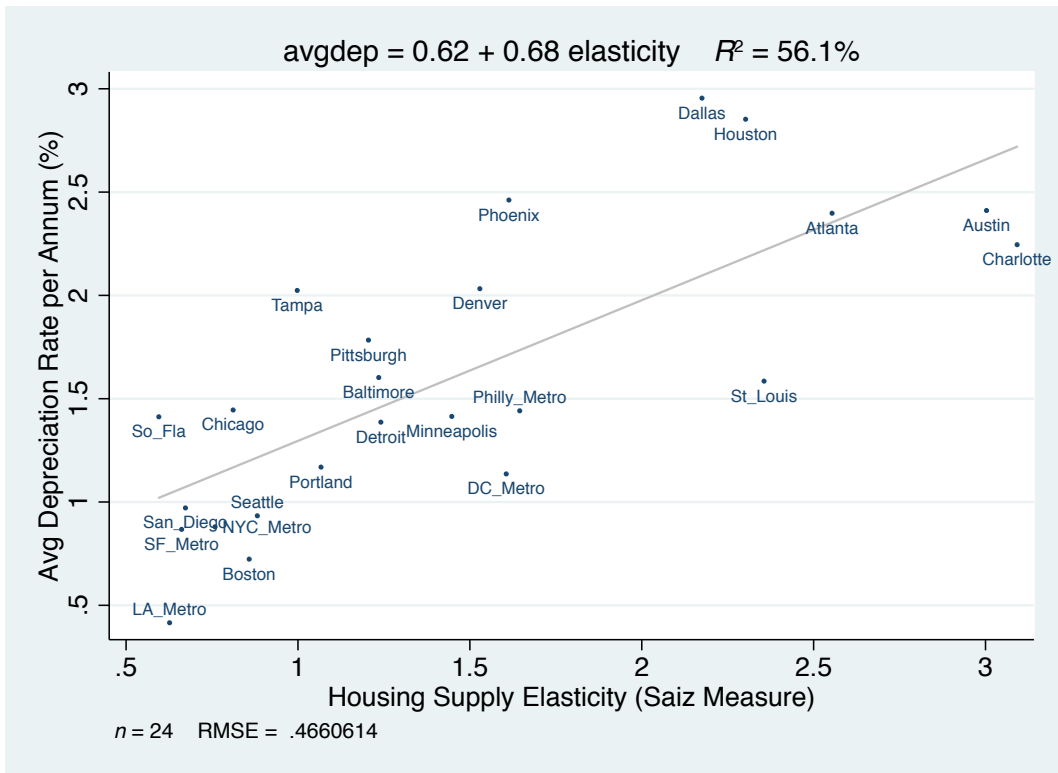


Figure 10: Depreciation and Housing Supply

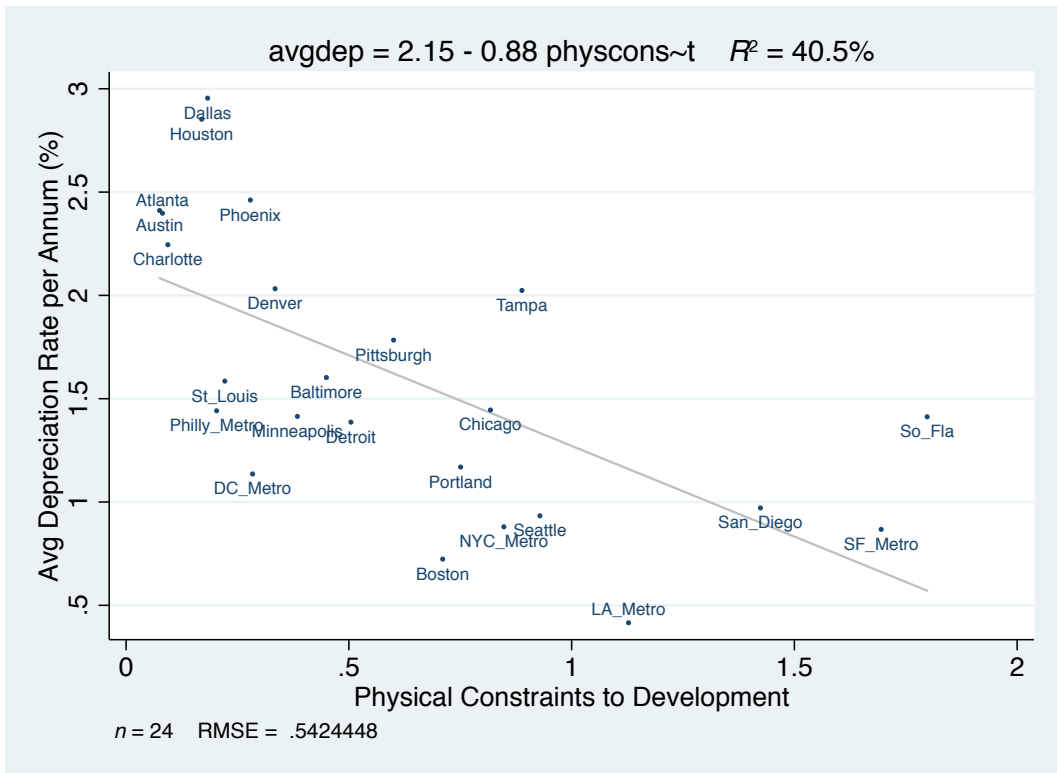


Figure 11: Depreciation and Physical Constraints to Development

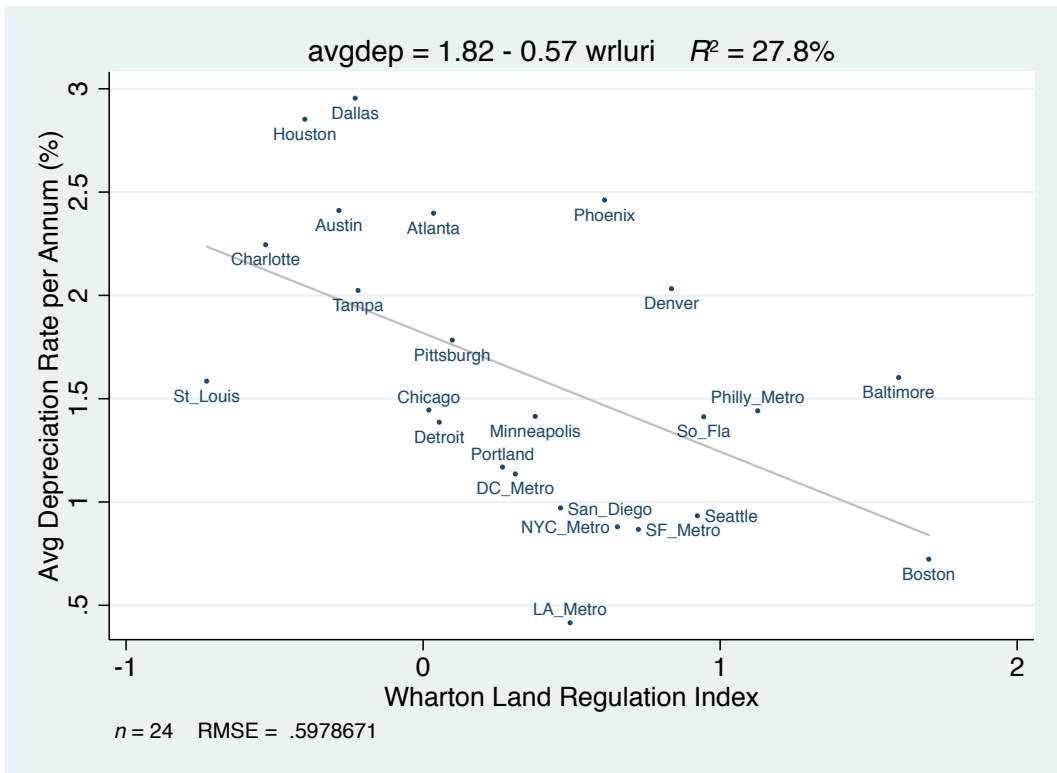


Figure 12: Depreciation and the Wharton Land Regulation Index

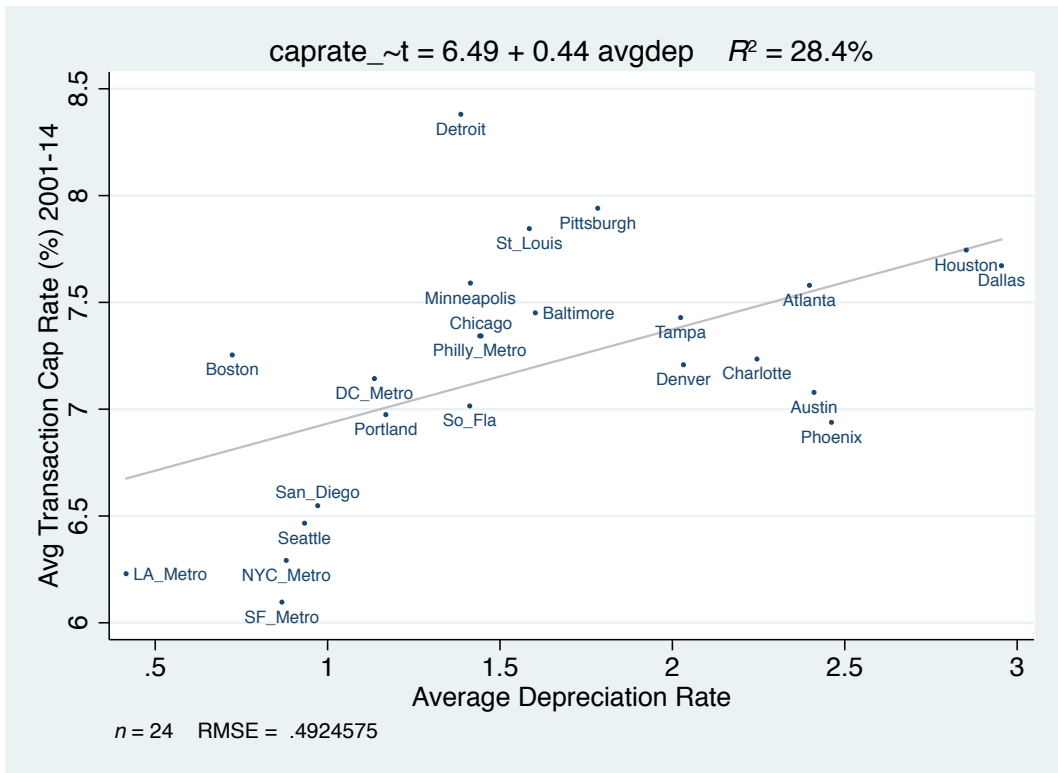


Figure 13: Depreciation and Cap Rates

Variable	Mean	Std. Dev.	N
Age	32	26	107,805
Age Squared	1706	2726	107,805
Price	\$15,176,605	\$47,556,544	107,805
Square Feet	116,694	178,773	107,805
Cap Rate	0.07	0.017	32,481
Normalized Cap Rate	0	0.013	32,481
CBD	0.153	0.36	107,805
Distress Flag	0.067	0.25	107,805
CMBS Financed	0.109	0.311	107,805
Excess Land Potential Flag	0.023	0.151	107,805
Apartments	0.254	0.435	107,805
Industrial	0.259	0.438	107,805
Office	0.234	0.423	107,805
Retail	0.253	0.435	107,805
Seller Type - User/Other	0.037	0.189	107,805
Seller Type - CMBS Financed	0.003	0.05	107,805
Seller Type - Equity Fund	0.032	0.175	107,805
Seller Type - Institutional	0.105	0.307	107,805
Seller Type - Private	0.689	0.463	107,805
Seller Type - Public	0.048	0.215	107,805

Table 1: Summary Statistics

Table 2: Effect of Depreciation on Property Value

	(1) Log Expected Price	(2) Log Price
Age	-0.01845 (75.12)**	-0.02110 (88.27)**
Age Squared	0.00007 (26.52)**	0.00016 (62.37)**
Ln Sqft	0.69647 (318.60)**	0.69709 (319.45)**
CBD	0.41110 (52.55)**	0.40685 (52.33)**
Industrial	-0.34602 (73.75)**	-0.34429 (73.49)**
Office	0.26328 (50.46)**	0.26551 (51.00)**
Retail	0.29279 (52.99)**	0.29383 (53.26)**
Distress Flag	-0.58159 (60.84)**	-0.58180 (60.91)**
CMBS Financed	0.25262 (47.89)**	0.25220 (47.89)**
Excess Land Potential Flag	0.20432 (15.67)**	0.20389 (15.66)**
Seller Type - CMBS Financed	0.00262 (0.08)	0.00355 (0.10)
Seller Type - Equity Fund	0.35121 (27.66)**	0.35172 (27.73)**
Seller Type - Institutional	0.23632 (28.44)**	0.23696 (28.54)**
Seller Type - Private	0.09390 (16.85)**	0.09358 (16.82)**
Seller Type - Public	0.19405	0.19503

Table 2: Effect of Depreciation on Property Value

	(1) Log Expected Price	(2) Log Price
	(19.37)**	(19.49)**
Constant	7.64135	7.64808
	(108.58)**	(108.94)**
R^2	0.72	0.70
N	107,805	107,805

* $p < 0.05$; ** $p < 0.01$

MSA and Year dummies not shown

Log Expected Price	Apartments	Industrial	Office	Retail
Age	-0.02699 (56.08)**	-0.01133 (23.03)**	-0.01759 (33.25)**	-0.01739 (34.21)**
Age Squared	0.00015 (29.83)**	0.00001 (1.37)	0.00006 (11.16)**	0.00009 (14.95)**
Ln Sqft	0.80033 (167.64)**	0.59403 (144.12)**	0.83244 (194.53)**	0.59855 (129.36)**
CBD	0.27821 (17.46)**	0.38906 (22.04)**	0.42497 (36.66)**	0.34850 (17.82)**
Distress Flag	-0.46068 (28.00)**	-0.44758 (24.21)**	-0.67668 (36.12)**	-0.61466 (29.05)**
CMBS Financed	0.13760 (14.20)**	0.34349 (23.53)**	0.22706 (23.71)**	0.29982 (33.39)**
Excess Land Potential Flag	0.31029 (7.81)**	0.16883 (7.98)**	0.17500 (8.34)**	0.18751 (6.74)**
Seller Type - CMBS Financed	0.08695 (1.20)	0.11973 (1.95)	0.08416 (1.44)	0.01474 (0.25)
Seller Type - Equity Fund	0.14889 (6.21)**	0.33638 (14.22)**	0.31126 (15.96)**	0.37409 (10.44)**
Seller Type - Institutional	0.20924 (11.71)**	0.17049 (12.25)**	0.18319 (12.08)**	0.25393 (12.36)**
Seller Type - Private	0.10168 (7.29)**	0.06406 (8.15)**	0.06786 (5.62)**	0.15205 (12.37)**
Seller Type - Public	0.30655 (16.17)**	0.19398 (12.24)**	0.13518 (6.63)**	0.14470 (6.72)**
Constant	6.32318 (51.93)**	8.77162 (57.60)**	6.12840 (51.50)**	9.11602 (67.83)**
R^2	0.79	0.63	0.80	0.62
N	27,374	27,959	25,231	27,241

* $p < 0.05$; ** $p < 0.01$
MSA and Year dummies not shown

Table 3: Effect of Depreciation on Expected Property Value, by Property Type

	(1) Log Expected Price	(2) Normalized Cap Rate
Age	-0.02296 (62.01)**	0.00021 (23.49)**
Age Squared	0.00018 (42.13)**	-0.00000 (19.04)**
Ln Sqft	0.78572 (236.86)**	0.00011 (1.46)
CBD	0.45527 (35.91)**	-0.00632 (19.78)**
Industrial	-0.22395 (25.07)**	0.01270 (53.55)**
Office	0.41326 (53.56)**	0.01079 (50.37)**
Retail	0.40223 (50.30)**	0.00854 (43.31)**
Distress Flag	-0.48032 (24.65)**	0.00527 (9.57)**
CMBS Financed	0.09227 (14.91)**	-0.00204 (12.70)**
Excess Land Potential Flag	0.14649 (7.25)**	-0.00169 (3.37)**
Seller Type - CMBS Financed	-0.28012 (3.16)**	-0.00596 (1.85)
Seller Type - Equity Fund	0.23578 (13.09)**	-0.00343 (7.68)**
Seller Type - Institutional	0.16904 (12.42)**	-0.00307 (8.63)**
Seller Type - Private	0.03202 (3.10)**	-0.00107 (3.95)**
Seller Type - Public	0.08835 (5.90)**	-0.00115 (3.06)**
Constant	6.84101 (46.02)**	-0.01142 (3.98)**
R^2	0.82	0.14
N	32,481	32,481

* $p < 0.05$; ** $p < 0.01$
MSA and Year dummies not shown

Table 4: Effect of Depreciation on Cap Rate

Metro Market	1 Yr	10 Yrs	30 Yrs	50 Yrs	Average
Dallas	3.32%	3.17%	2.83%	2.50%	2.95%
Houston	2.29%	2.52%	3.04%	3.56%	2.85%
Phoenix	1.50%	1.90%	2.78%	3.66%	2.46%
Austin	2.31%	2.35%	2.45%	2.54%	2.41%
Atlanta	1.77%	2.03%	2.61%	3.18%	2.40%
Charlotte	2.00%	2.10%	2.33%	2.55%	2.25%
Denver	2.36%	2.22%	1.92%	1.62%	2.03%
Tampa	1.62%	1.79%	2.16%	2.53%	2.02%
Pittsburgh	2.10%	1.97%	1.68%	1.39%	1.78%
Sacramento	1.74%	1.76%	1.80%	1.83%	1.78%
Baltimore	1.59%	1.59%	1.61%	1.62%	1.60%
St Louis	1.71%	1.66%	1.54%	1.43%	1.59%
Chicago	1.65%	1.57%	1.38%	1.19%	1.45%
Philly Metro	1.69%	1.59%	1.36%	1.13%	1.44%
Minneapolis	1.36%	1.38%	1.43%	1.48%	1.41%
So Fla	1.54%	1.49%	1.37%	1.25%	1.41%
Detroit	1.61%	1.52%	1.31%	1.11%	1.39%
Portland	1.24%	1.21%	1.15%	1.08%	1.17%
DC Metro	1.17%	1.16%	1.12%	1.09%	1.14%
SanDiego	0.70%	0.81%	1.06%	1.31%	0.97%
Seattle	0.76%	0.83%	0.99%	1.15%	0.93%
NYC Metro	1.19%	1.06%	0.78%	0.49%	0.88%
SF Metro	1.09%	1.00%	0.79%	0.59%	0.87%
Boston	0.69%	0.70%	0.73%	0.76%	0.72%
LA Metro	0.25%	0.32%	0.47%	0.63%	0.42%
Average	1.57%	1.59%	1.63%	1.67%	1.61%

All estimated rates are statistically significant

Table 5: Real Depreciation Rates (per annum) by Building Age