

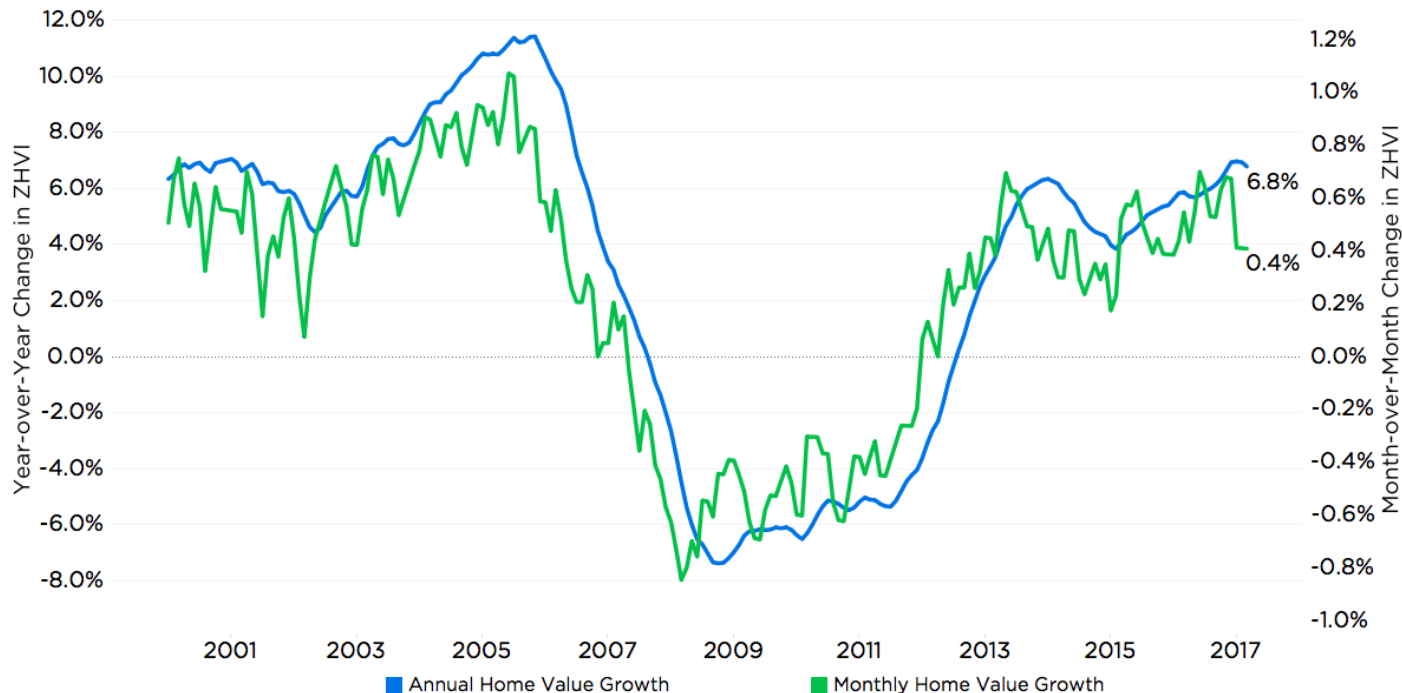


Housing Market Overview + Using Analytics to Solve Real Estate Problems

Dr. Stan Humphries, Chief Analytics Officer & Chief Economist, Zillow Group
@StanHumphries

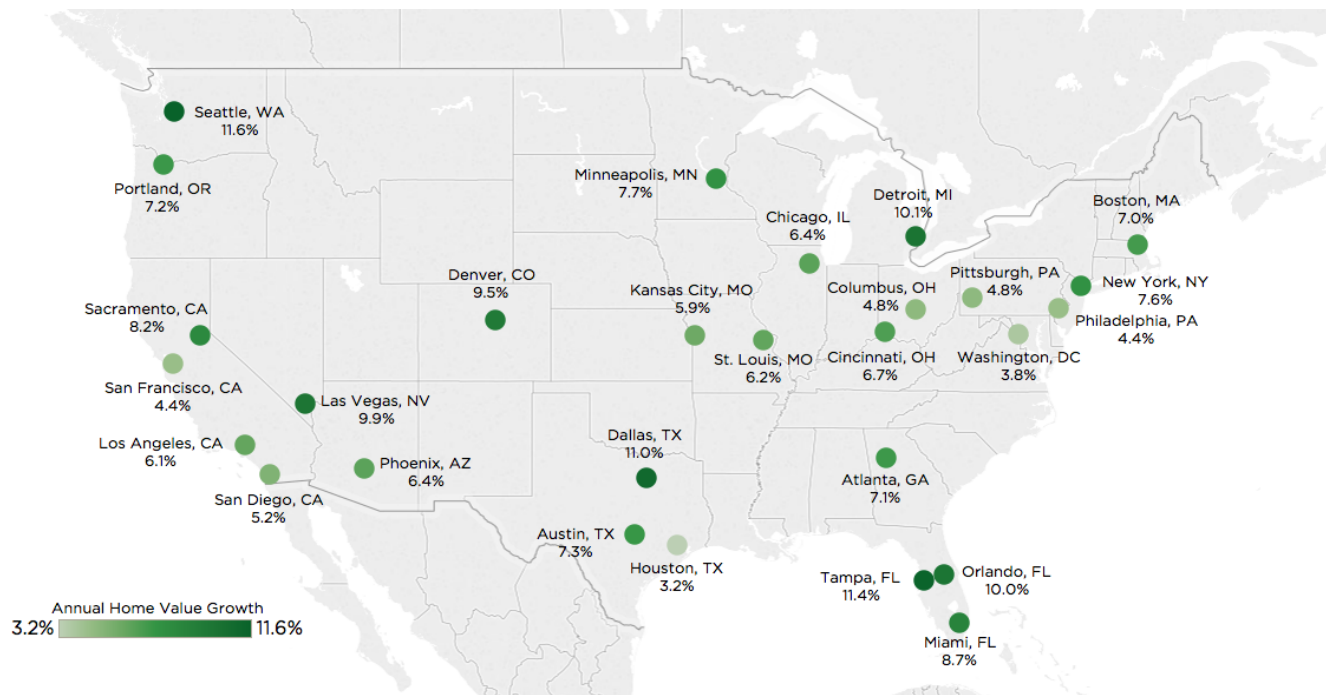
Housing Market Overview

Annual U.S. home value appreciation accelerated in the second half of 2016



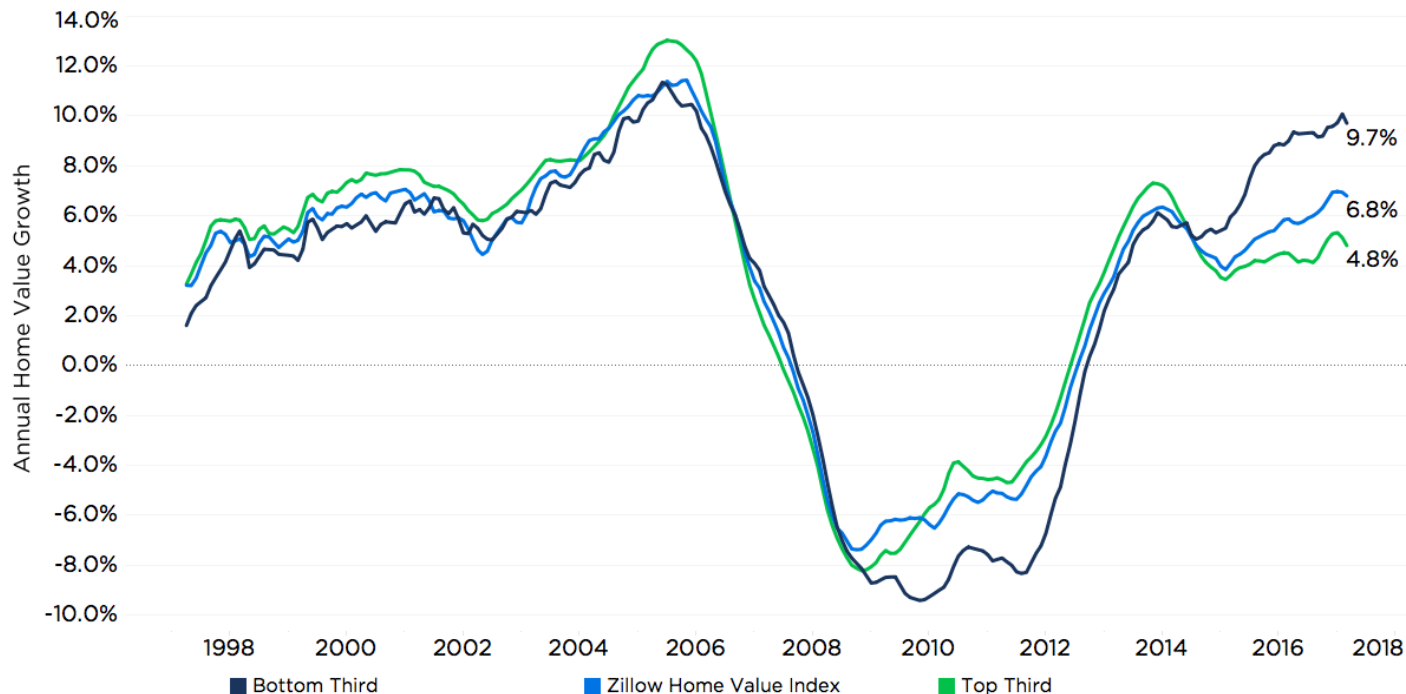
Source: Zillow Home Value Index (March 2017)

Markets in the Pacific Northwest, Texas, Florida and parts of the Southwest continue to outperform slower-moving markets in the Midwest and Mid-Atlantic



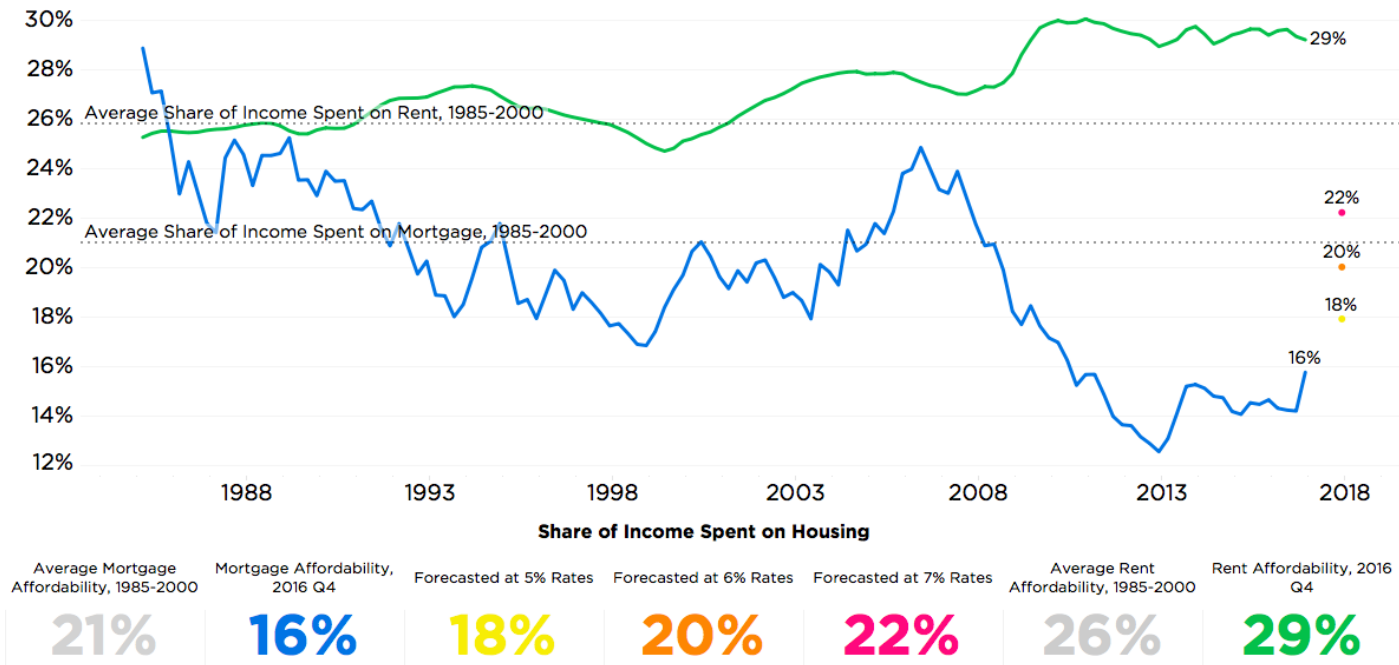
Source: Zillow Home Value Index (March 2017)

Home value appreciation for bottom-third homes continues to outpace home value growth in top-third homes



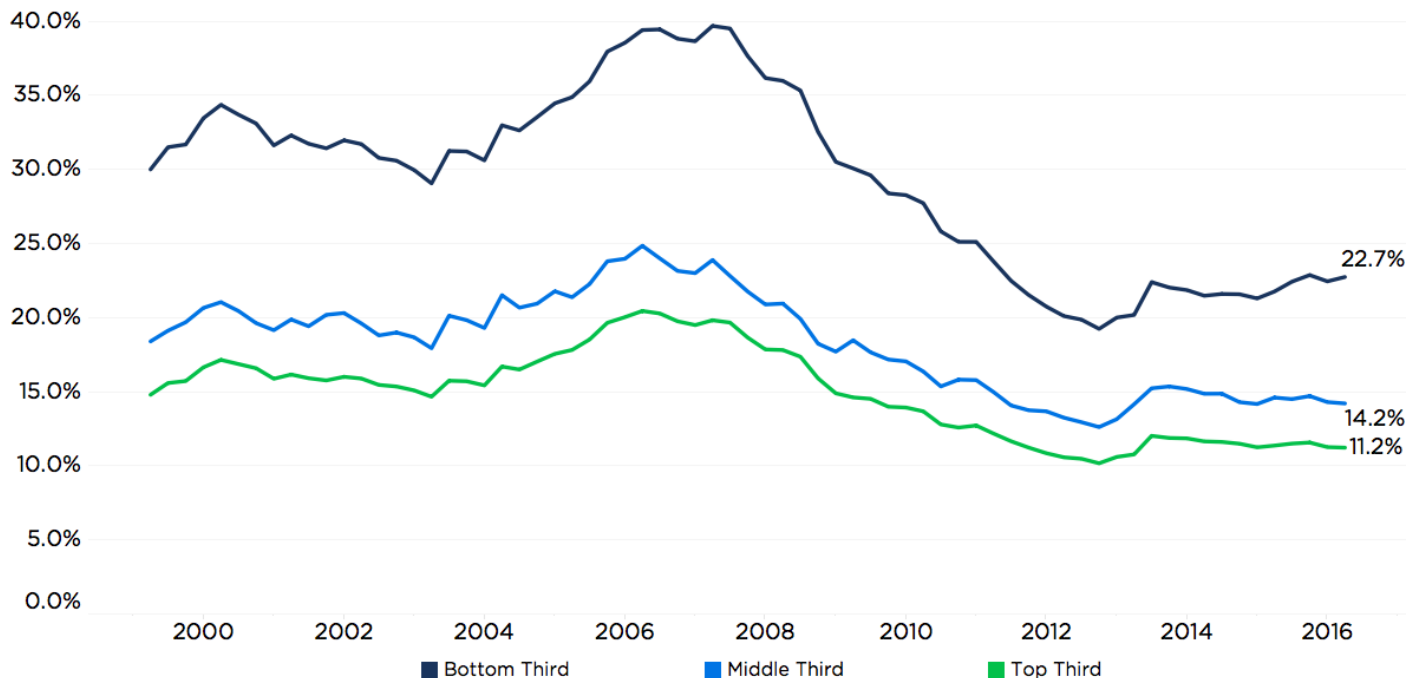
Source: Zillow Home Value Index (March 2017)

Nationwide, the share of income spent on a mortgage is well below historic norms



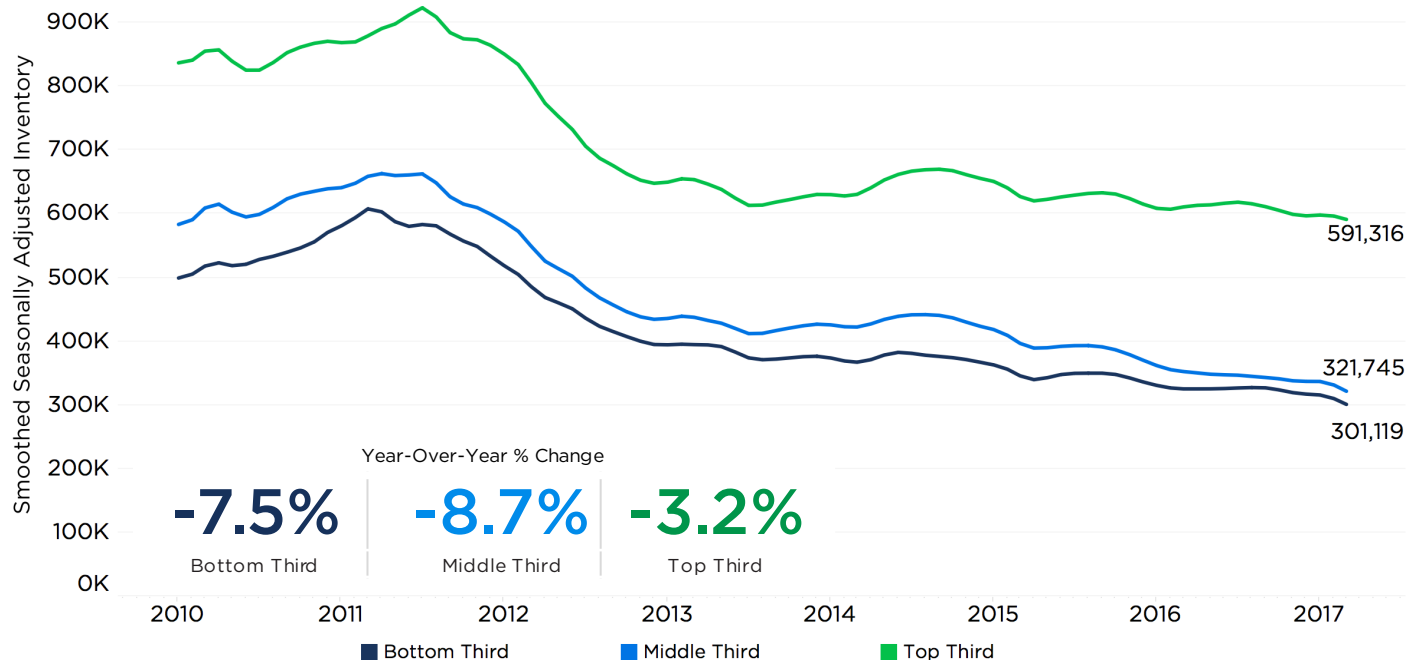
Source: Zillow Mortgage Affordability, Zillow Rent Affordability (2016 Q4)

Weak income growth and rapid appreciation, even with very low mortgage interest rates, means homes are becoming more unaffordable, more quickly for bottom-third home buyers



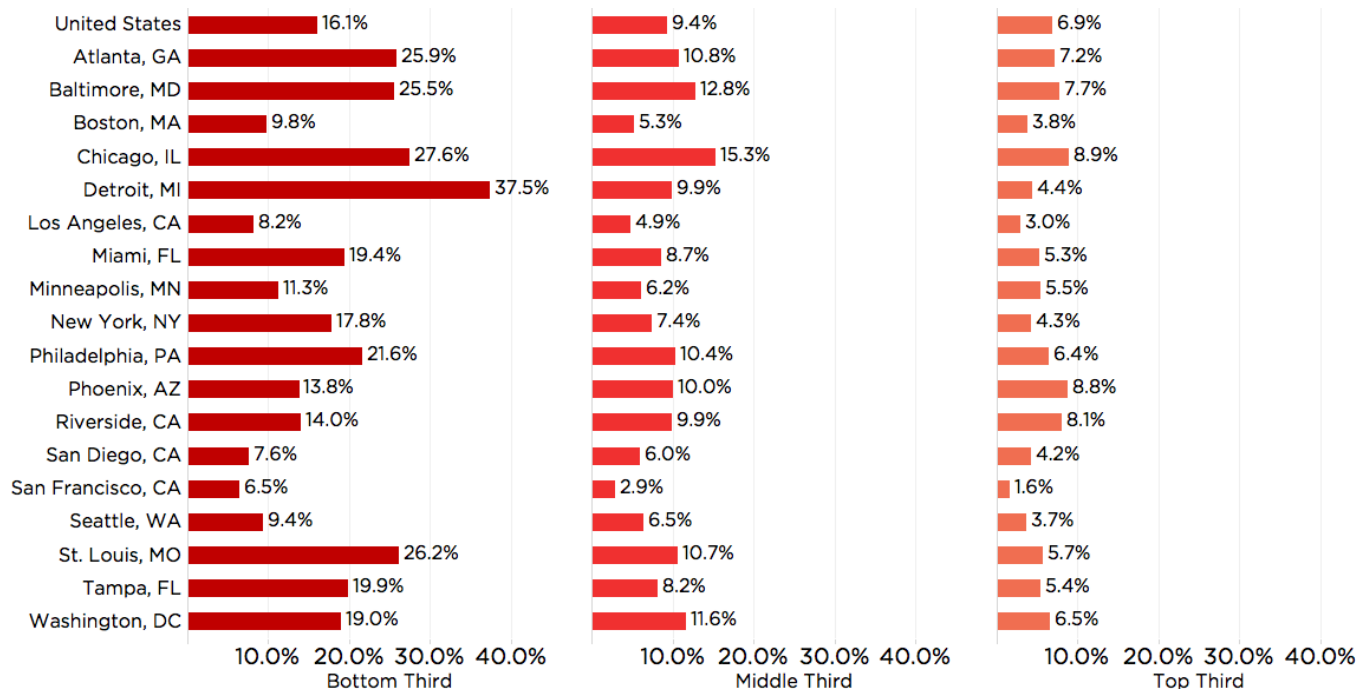
Source: Zillow Mortgage Affordability (2016 Q2)

Inventory shortages are particularly acute among bottom- and middle-tier homes



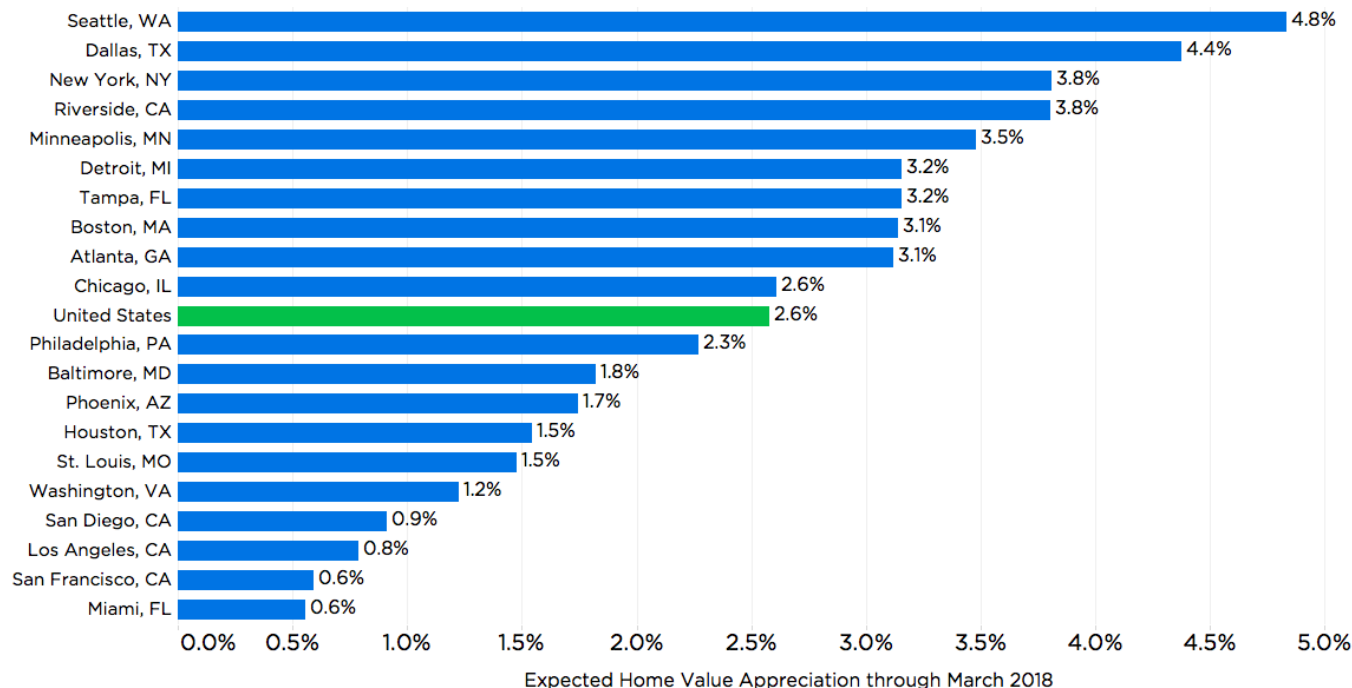
Source: Zillow For-Sale Inventory (Seasonally Adjusted, Smoothed) (March 2017)

Negative equity is worst among bottom-third homes



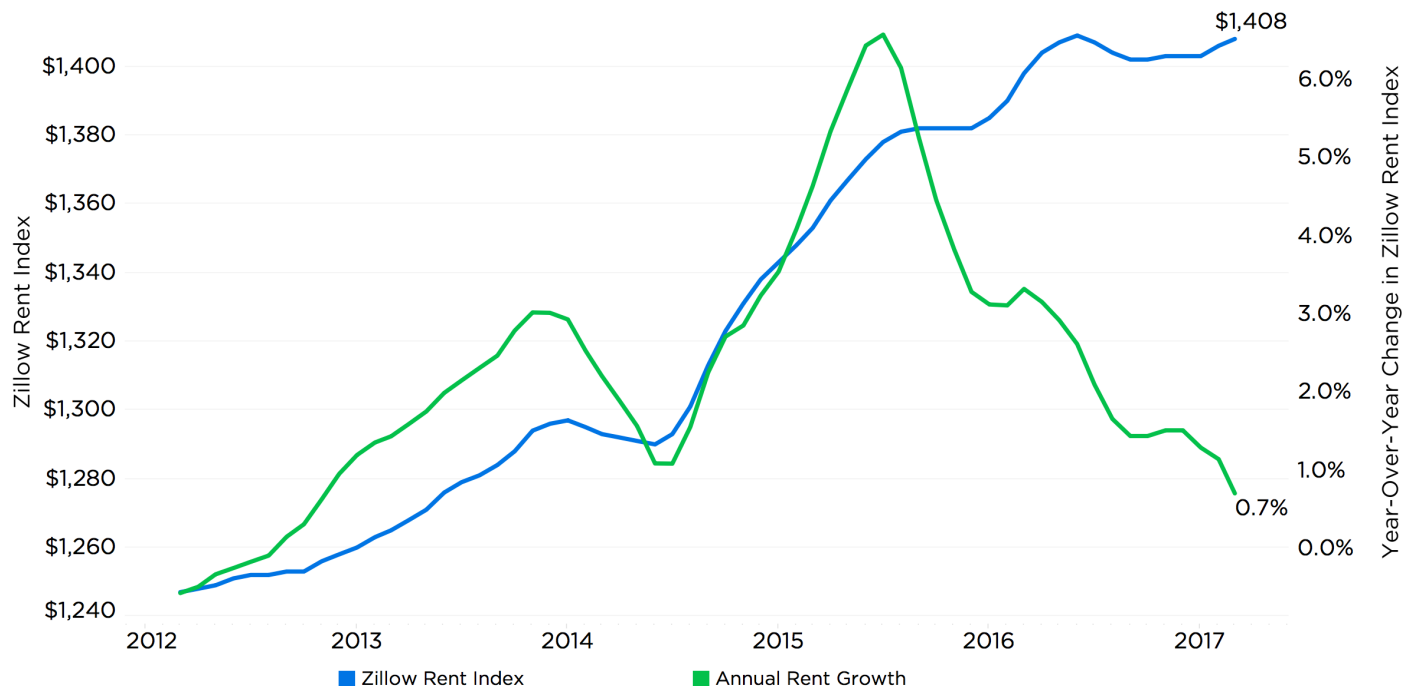
Source: Zillow Negative Equity by Thirds (2016 Q4)

Home value growth is expected to slow through 2018 Q1



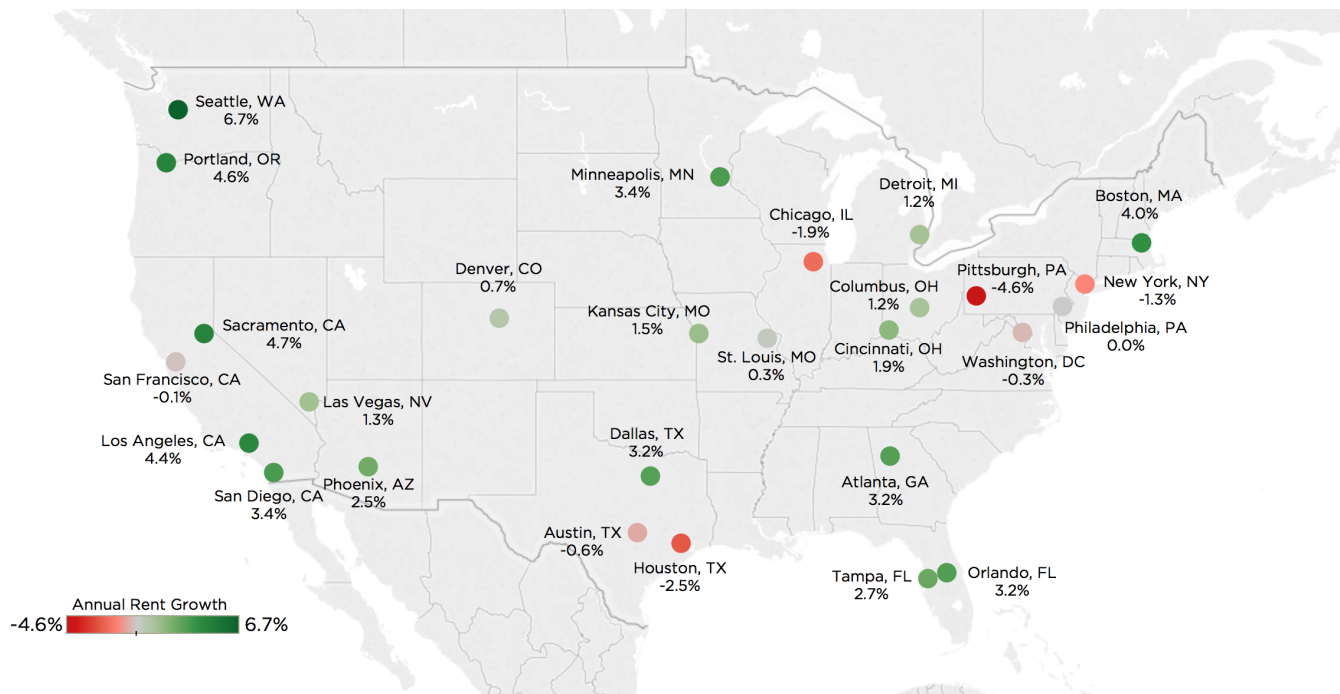
Source: Zillow Home Value Forecast, Top 20 Metros (March 2017)

Growth in rents flattened in the second half of 2016



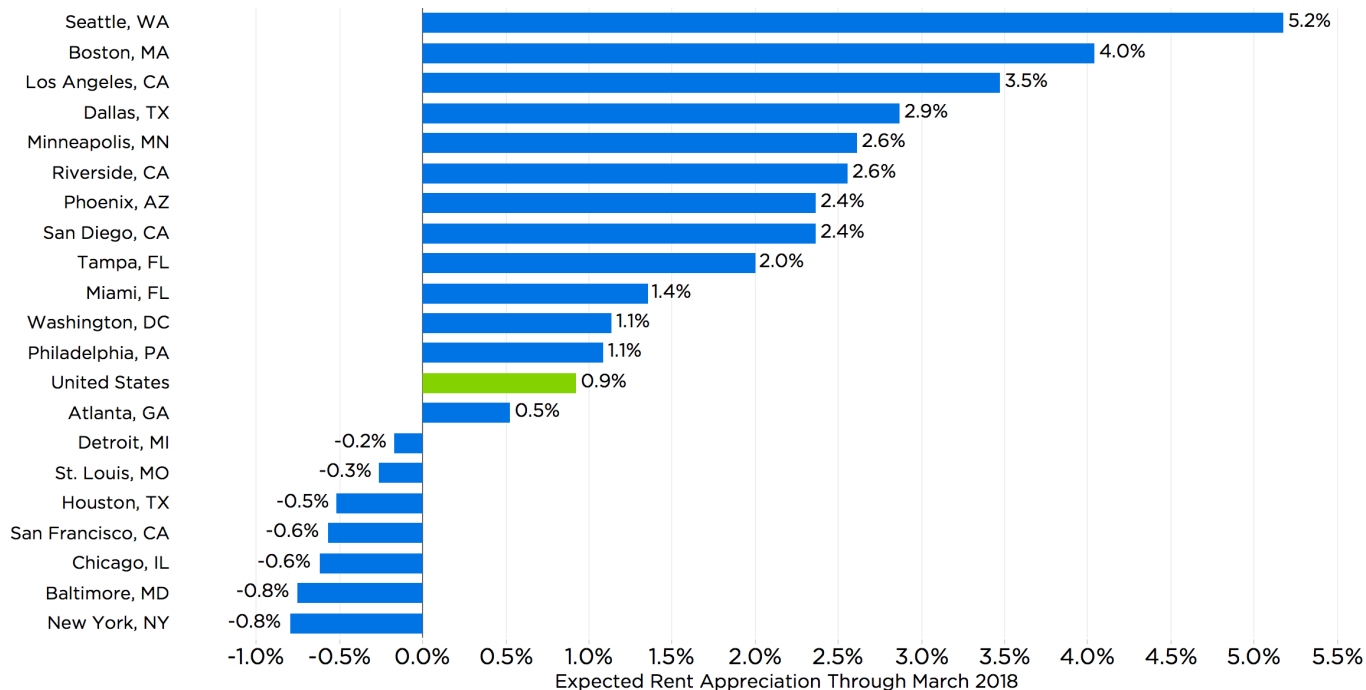
Source: Zillow Rent Index (March 2017)

Annual rent growth is strongest in the Pacific Northwest



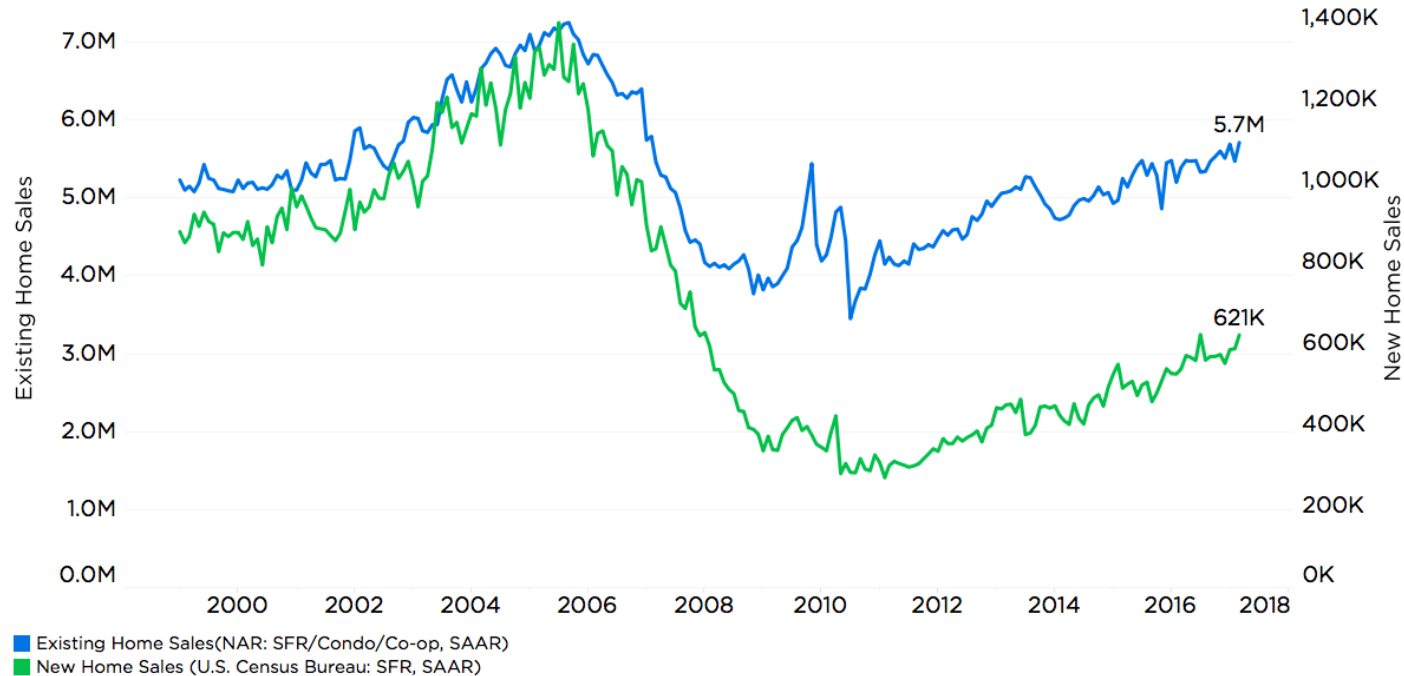
Source: Zillow Rent Index (March 2017)

Growth in rents over the next year is expected to slow in many high-growth markets



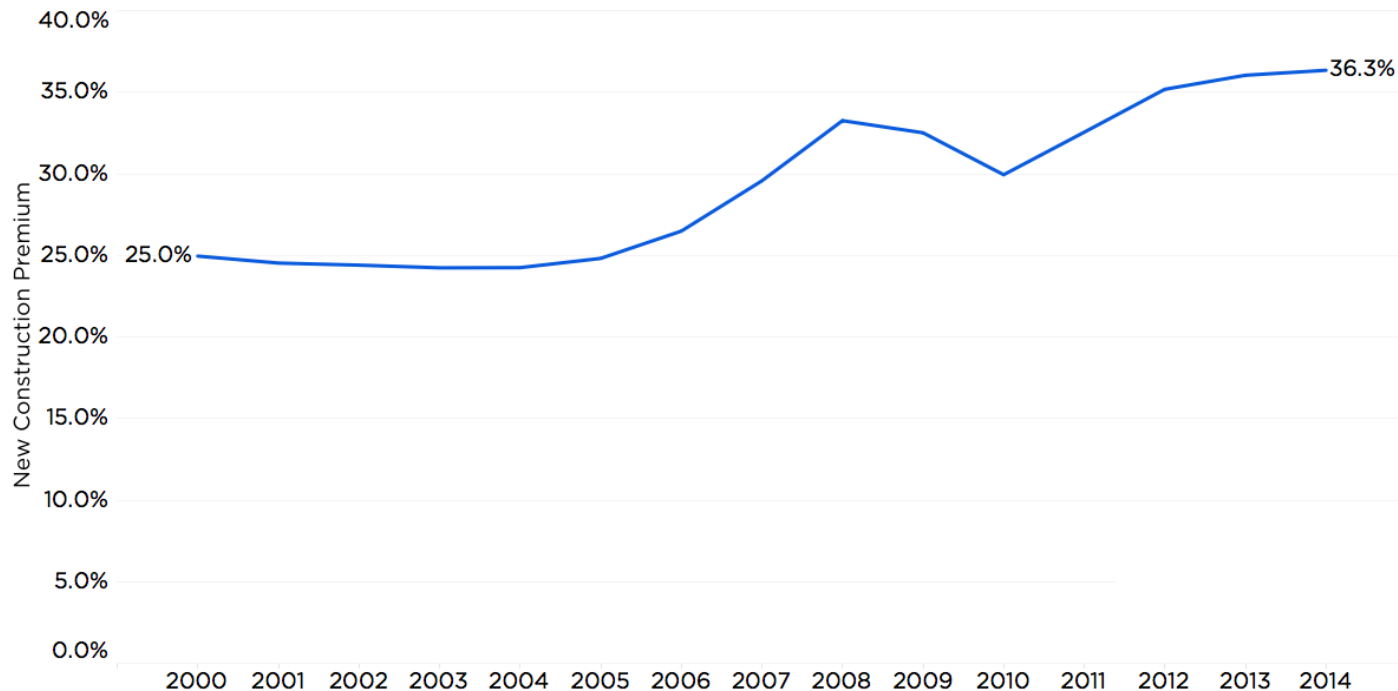
Source: Zillow Rent Forecast (March 2017)

Sales of new homes in particular have struggled to get back to pre-recession levels



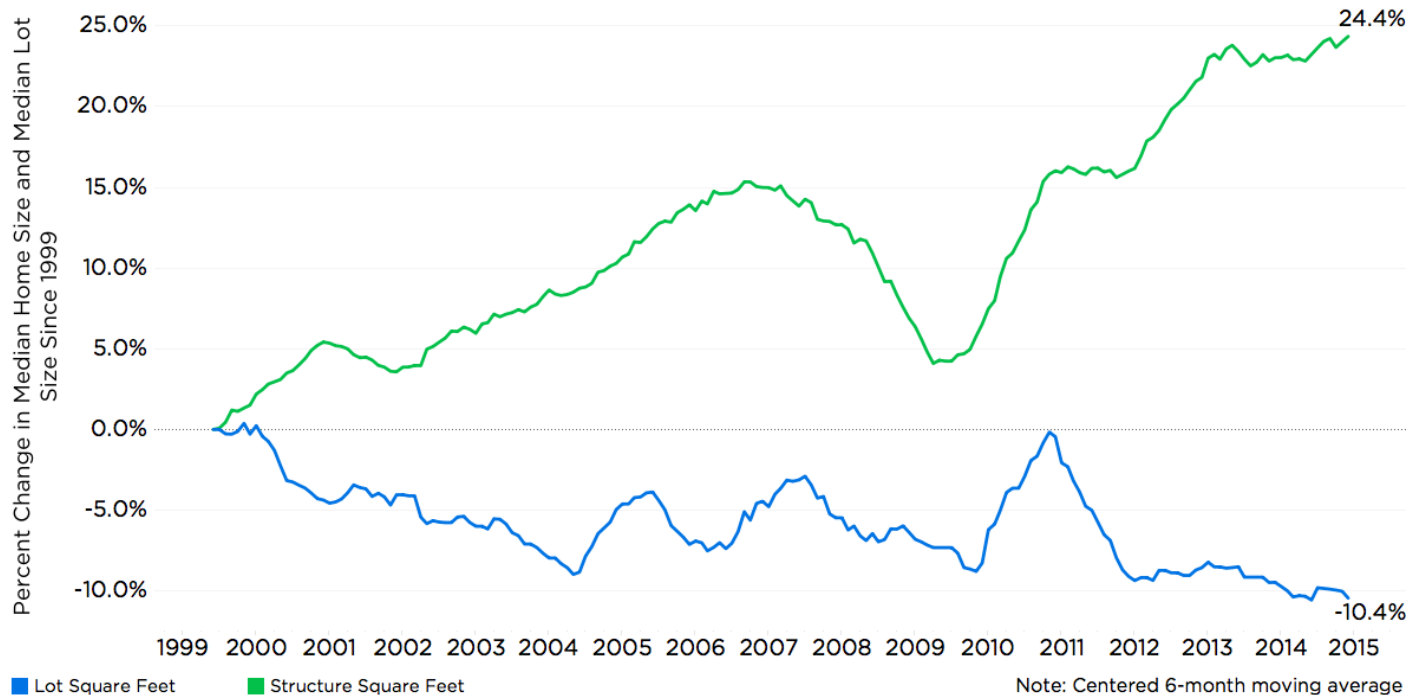
Source: National Association of Realtors, U.S. Census Bureau (March 2017)

Buyers are willing to pay upwards of 30% more for a newly built home than an older one



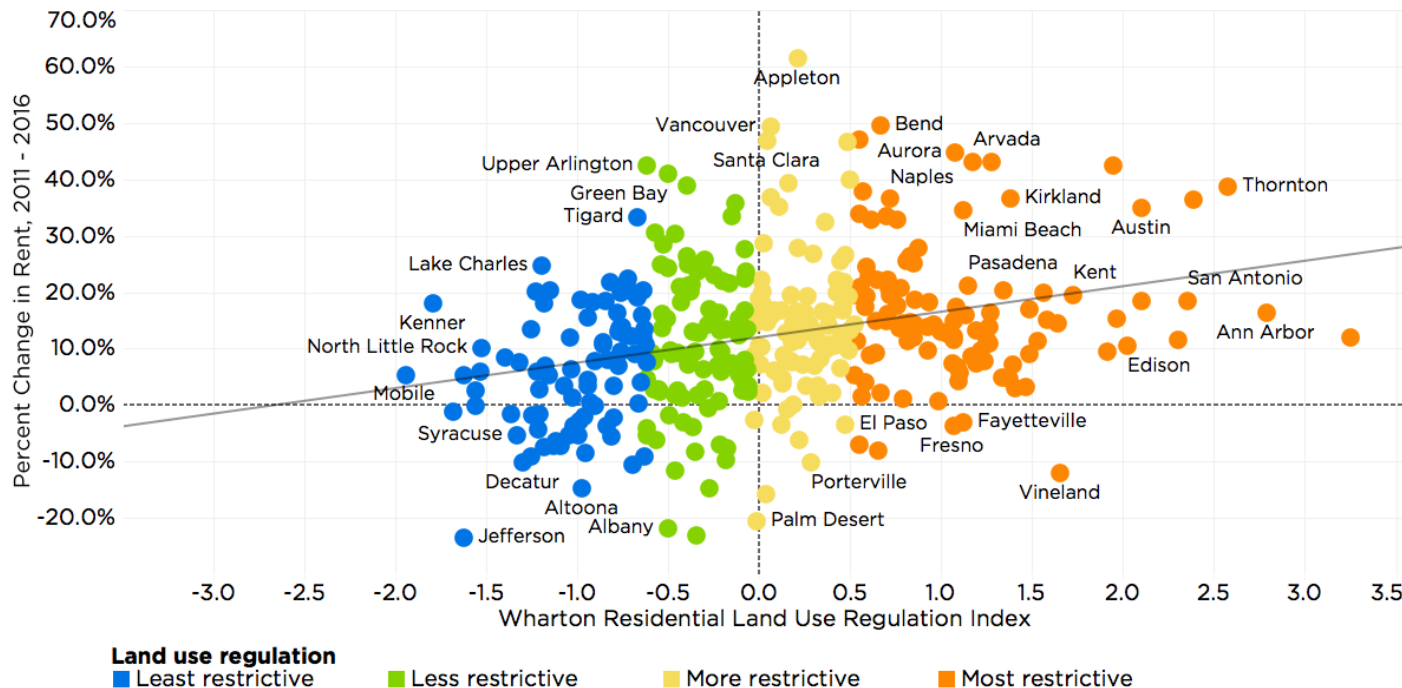
Source: Zillow analysis of Zestimates 2000-2014 and Zillow New Construction data

Since 1999, homes have gotten larger while lots have gotten smaller



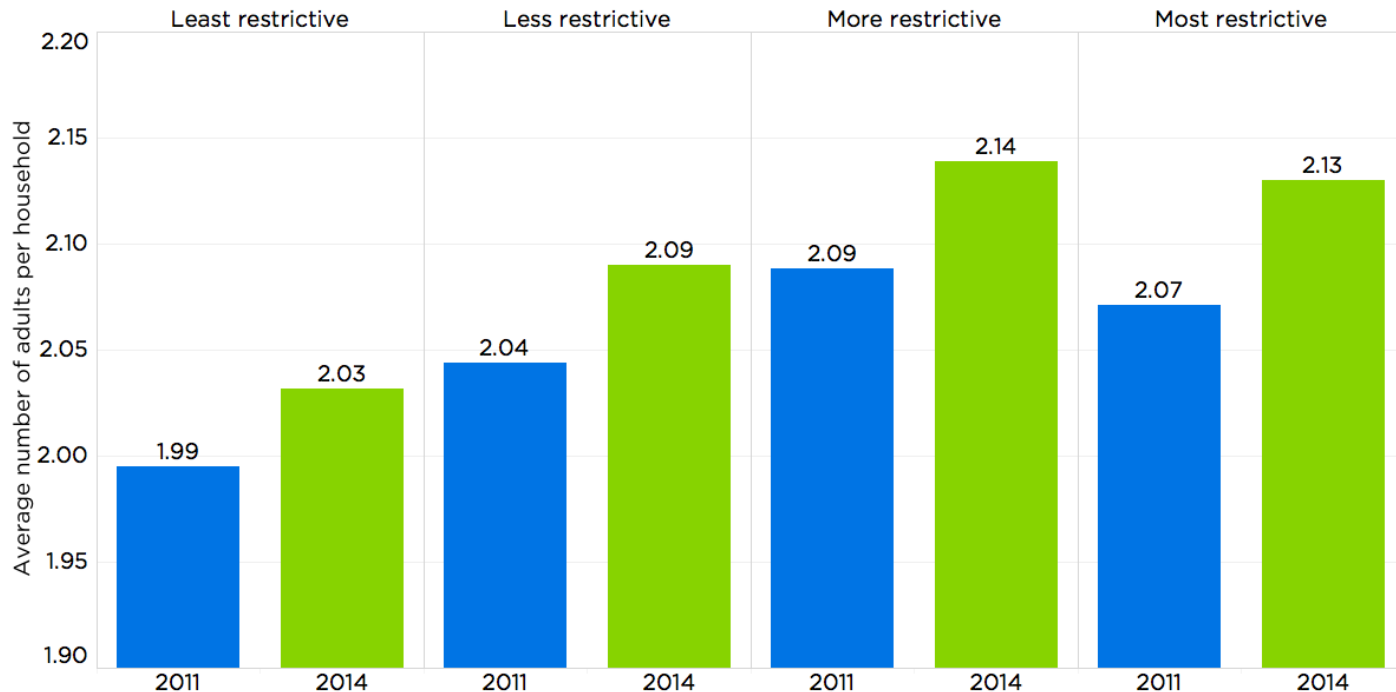
Source: Zillow analysis of U.S. Census Bureau: Survey of Construction Microdata, 2000-2016

Rent tends to rise faster in cities with stricter land-use regulations



Source: Zillow analysis of data from the Wharton Residential Land Use Regulation Index, 2008, and Zillow Rent Index, January 2011 - January 2016

In cities with more restrictive land use regulation, more adults are living in a household



Source: Zillow analysis of data from the Wharton Residential Land Use Regulation Index, 2008, and the U.S. Census Bureau, American Community Survey, 2011 and 2014.

About Zillow Economic Research

In-depth research and monthly reports

www.zillow.com/research



Data is available for download at:

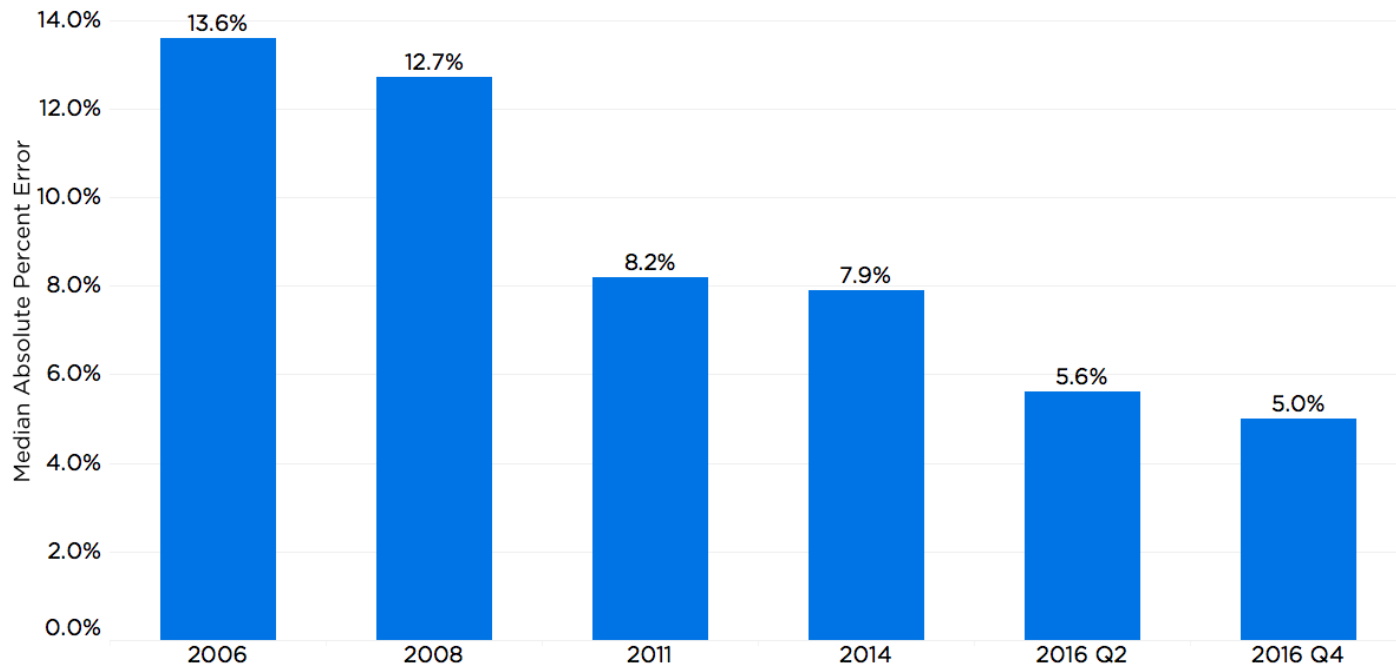
www.zillow.com/data

Real Estate Metrics


- Zillow Home Value Index
- Zillow Rent Index
- Zillow Home Value Forecast
- Zillow Rent Forecast
- Negative Equity
- For-Sale Inventory
- Age of Inventory
- List Prices
- Sale Prices
- Rental Prices
- Home Sales
- Home Value/Square Foot (\$)
- Price/Square Foot (\$)
- Listings with Price Cuts (%)
- Median Price Cut (%)
- Homes Sold for Loss/Gain (%)
- Homes Foreclosed (out of 10k)
- Foreclosure Re-sales (%)
- Percent of Homes Increasing/Decreasing in Value
- Homes Sold in the Past Year (%)
- Cash Buyers
- Price-to-Rent Ratios
- Price-to-income Ratios
- Mortgage and Rent Affordability
- Buy-Rent Breakeven
- Zillow Home Prices Expectations Survey
- 15-minute Mortgage Rate Series: Conventional/Jumbo
- Existing Home Sales Forecast
- Case-Shiller Forecast
- New Home Sales Forecast

Using Analytics To Solve Real Estate Problems: Deep Learning on Image Data

Zestimate accuracy over the years

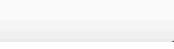

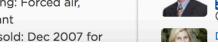

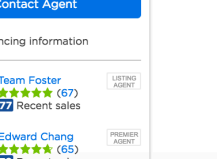
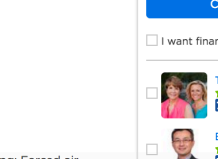

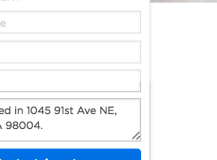
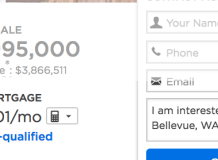

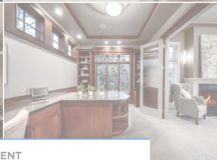
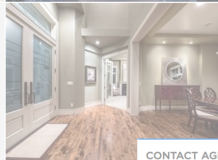



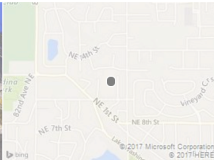



Zestimate today: Location, home facts, prior sales, tax assessments

[Buy](#) [Rent](#) [Sell](#) [Mortgages](#) [Agent finder](#) [Advice](#) [Home design](#) [More](#) [Advertise](#) [Sign in](#) or [Join](#)

[CONTACT AGENT](#) [SAVE](#) [HIDE](#) [GET UPDATES](#) [SHARE](#) [MORE](#)

[Public View](#) [Owner View](#) Washington · Bellevue · 98004 · Northwest Bellevue · 1045 91st Avenue Northeast



Is this your home?

Add a free video walkthrough to get three times more views!

[Learn more](#)

1045 91st Ave NE,
Bellevue, WA 98004

5 beds · 5 baths · 5,700 sqft

Perfectly Placed in West Bellevue, This custom Lochwood-Lozier home is inspired by timeless style traditional charm. Enjoy the western views in both formal casual spaces. The epicurean kitchen opens to the family room and is great for gatherings. The luxurious view master suite is the perfect retreat. The lower level features rec room, theatre, exercise area wine cellar. Host friends in the private, fenced backyard. Just minutes to world-class shopping restaurants. Medina Elementary.

FACTS

- Lot: 0.36 acres
- Views since listing: 3,532
- Heating: Forced air, Radiant
- Single Family
- All time views: 4,222
- Last sold: Dec 2007 for
- Built in 2007

FOR SALE

\$3,995,000

Zestimate : \$3,866,511

EST. MORTGAGE

\$16,001/mo

[Get pre-qualified](#)

CONTACT AGENT

Your Name


Phone

Email

I am interested in 1045 91st Ave NE, Bellevue, WA 98004.

[Contact Agent](#)

☐ I want financing information




Team Foster

★★★★★ (67)

77 Recent sales

LISTING AGENT




Edward Chang

★★★★★ (65)

59 Recent sales (425) 374-1204


PREMIER AGENT



Denise Niles


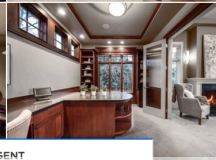
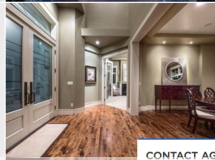



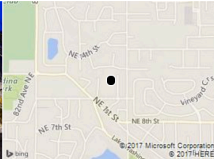

PREMIER AGENT

Zestimate tomorrow: What about image data?

[Buy](#) [Rent](#) [Sell](#) [Mortgages](#) [Agent finder](#) [Advice](#) [Home design](#) [More](#) [Advertise](#) [Sign in](#) or [Join](#)

[CONTACT AGENT](#) [SAVE](#) [HIDE](#) [GET UPDATES](#) [SHARE](#) [MORE](#)

[Public View](#) [Owner View](#) Washington · Bellevue · 98004 · Northwest Bellevue · 1045 91st Avenue Northeast



Is this your home?
Add a free video walkthrough to get three times more views!
[Learn more](#)

1045 91st Ave NE, Bellevue, WA 98004

5 beds · 5 baths · 5,700 sqft

Perfectly Placed in West Bellevue. This custom Lochwood-Lozier home is inspired by timeless style traditional charm. Enjoy the western views in both formal casual spaces. The epicurean kitchen opens to the family room and is great for gatherings. The luxurious view master suite is the perfect retreat. The lower level features rec room, theatre, exercise area wine cellar. Host friends in the private, fenced backyard. Just minutes to world-class shopping restaurants. Medina Elementary.

FACTS

- Lot: 0.36 acres
- Single Family
- Built in 2007
- Views since listing: 3,532
- All time views: 4,222
- Heating: Forced air, Radiant
- Last sold: Dec 2007 for

FOR SALE
\$3,995,000
Zestimate : \$3,866,511


EST. MORTGAGE
\$16,001/mo
[Get pre-qualified](#)

CONTACT AGENT

I am interested in 1045 91st Ave NE, Bellevue, WA 98004.


[Contact Agent](#)

☐ I want financing information




Team Foster
★★★★★ (67)
77 Recent sales

LISTING AGENT



Edward Chang
★★★★★ (65)
59 Recent sales
(425) 374-1204

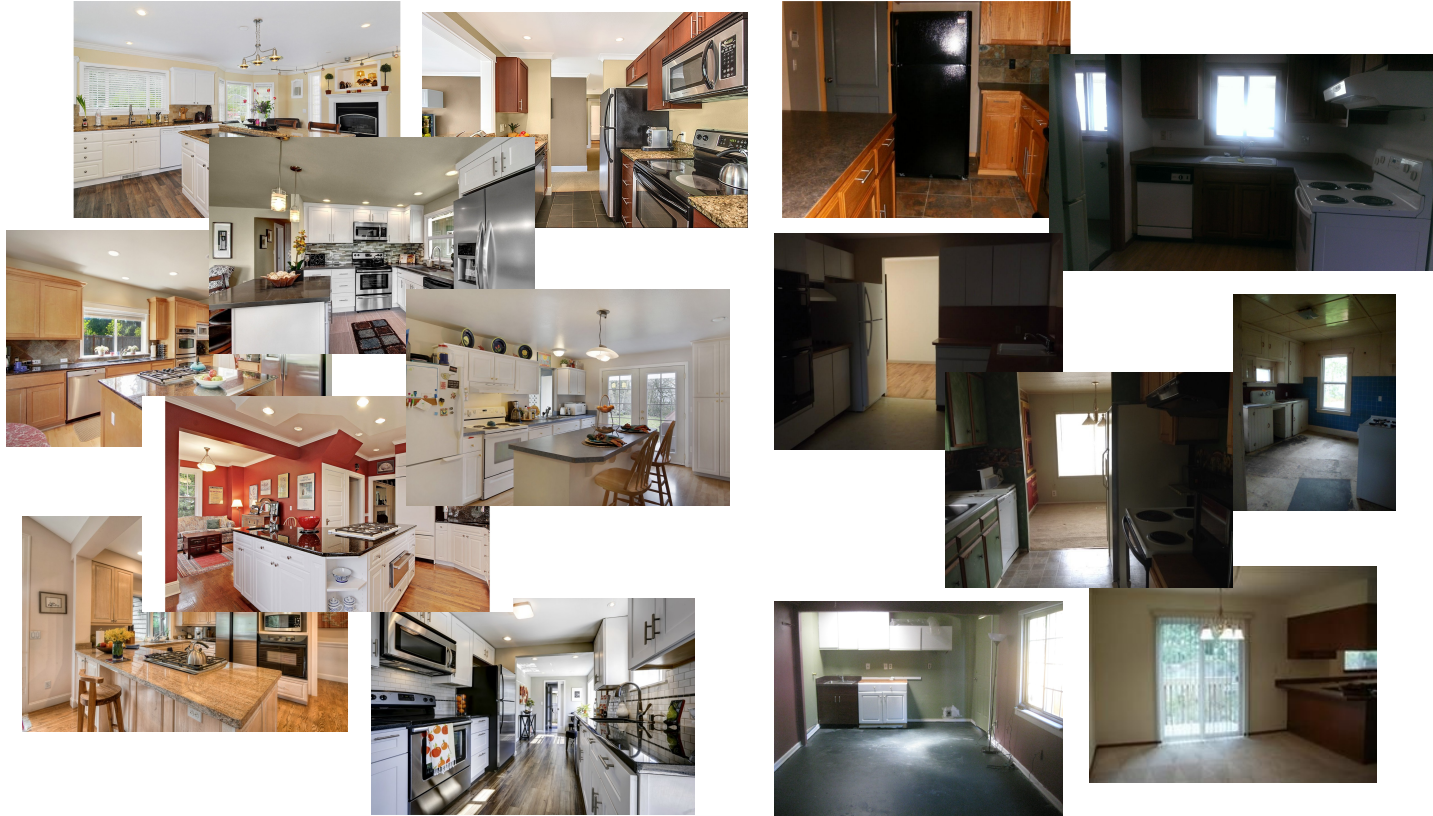
PREMIER AGENT



Denise Niles

PREMIER AGENT

Humans can discern pattern in where we over- or underestimate



Can we train a computer to do what humans intuitively do?

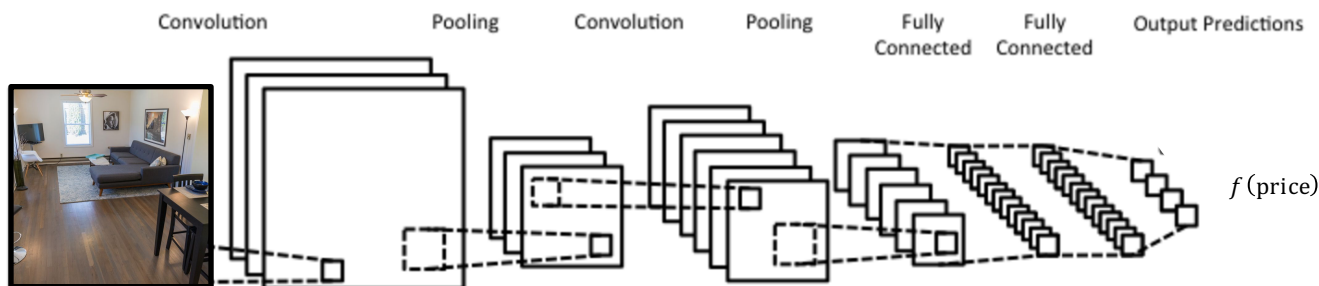


Image from <http://www.wildml.com/2015/11/understanding-convolutional-neural-networks-for-nlp/>

Using Analytics To Solve Real Estate Problems: Helping Builders Make Better Decisions



Introducing...

Zillow Group Builder Inform Beta

New data platform for builders

Make more informed decisions

Zillow Group Builder Inform, a new beta platform customized for the new construction industry, is designed to help builders make more informed decisions.

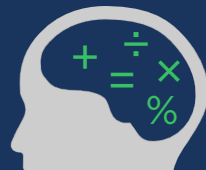
Unique data

This platform helps builders validate what to build based on proprietary data in three primary categories – market inventory, consumer behavior, and economics.

Exclusive access

Exclusive data platform presented in Tableau for customers of Promoted Communities.

Formula for success



Unique Data + Massive Amounts of Data + Brains =

Builder Inform

Unique data

Listing performance metrics:

- Page views per listing per month
- Saves per listings per month
- Days on the market

Home value metrics:

- Values per square foot
- Annual appreciation

Prevalence of each group:

- Percent of housing stock
- Percent of listings
- Percent of sales

Understand desirability of building locations



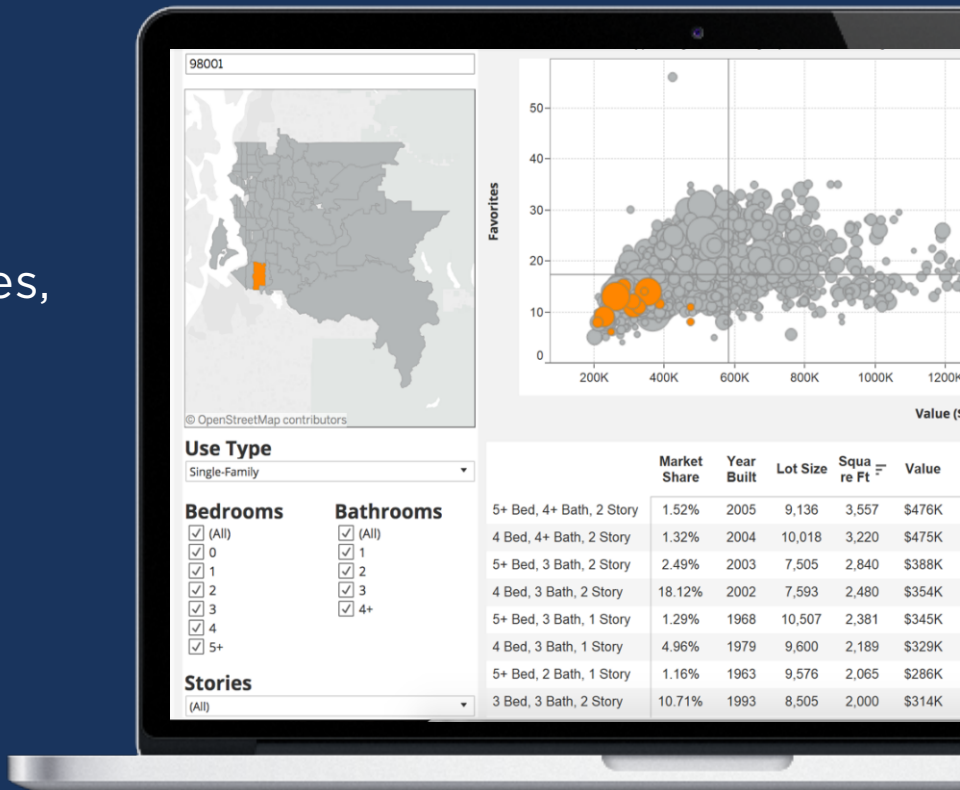
Question: Curious of home appeal by location?



Insight: Review traffic, favorites, and time to sell metrics in specific regions



Inform: Determine what zip codes are the best for future builds

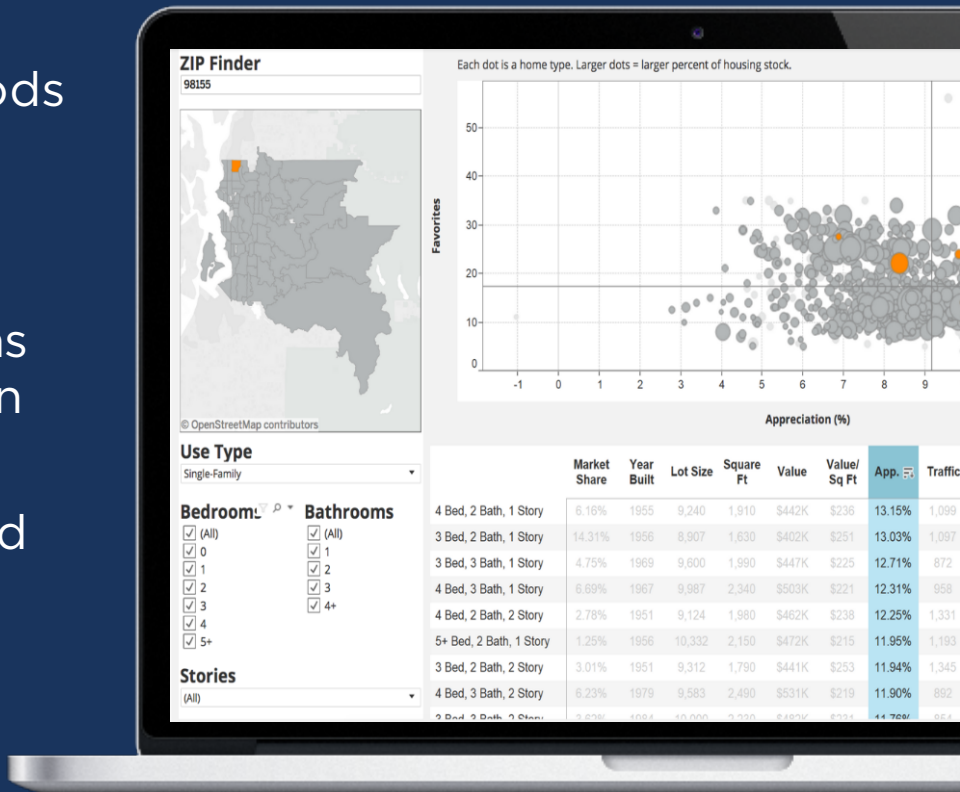


Identify gentrifying areas

? **Question:** Which neighborhoods are gentrifying faster than others?

💡 **Insight:** Review appreciation as a comparison metric by region

📍 **Inform:** Determine which could be the next hot market

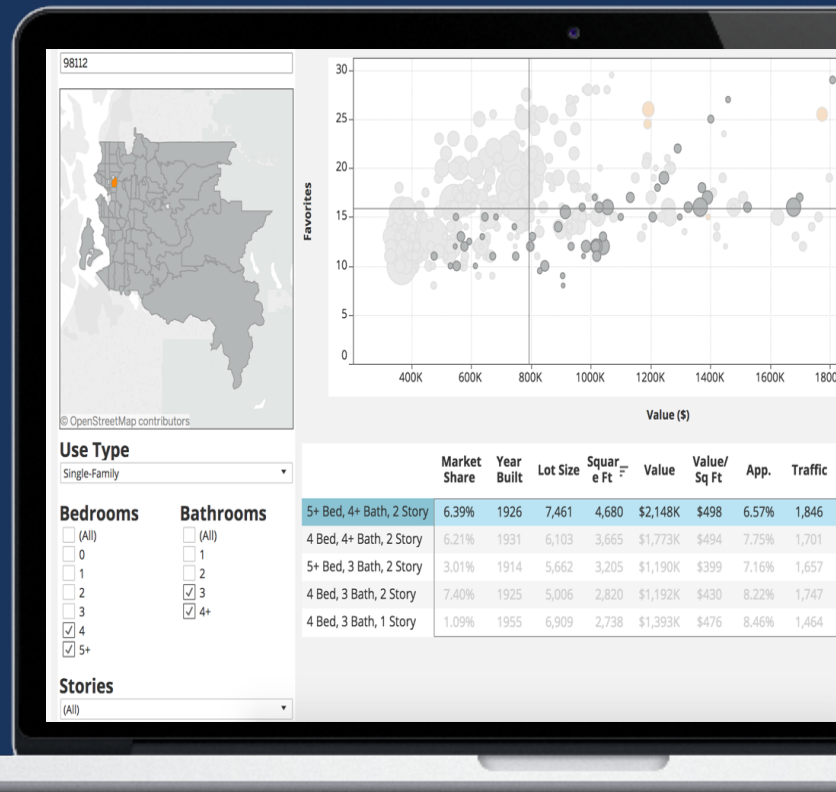


Find where to build specialized home types

? **Question:** What home types are more desirable by location?

💡 **Insight:** Review and compare ideal home types by ZIP codes

📍 **Inform:** Determine which home types consumers are most interested in your zip code



Quantify tradeoffs



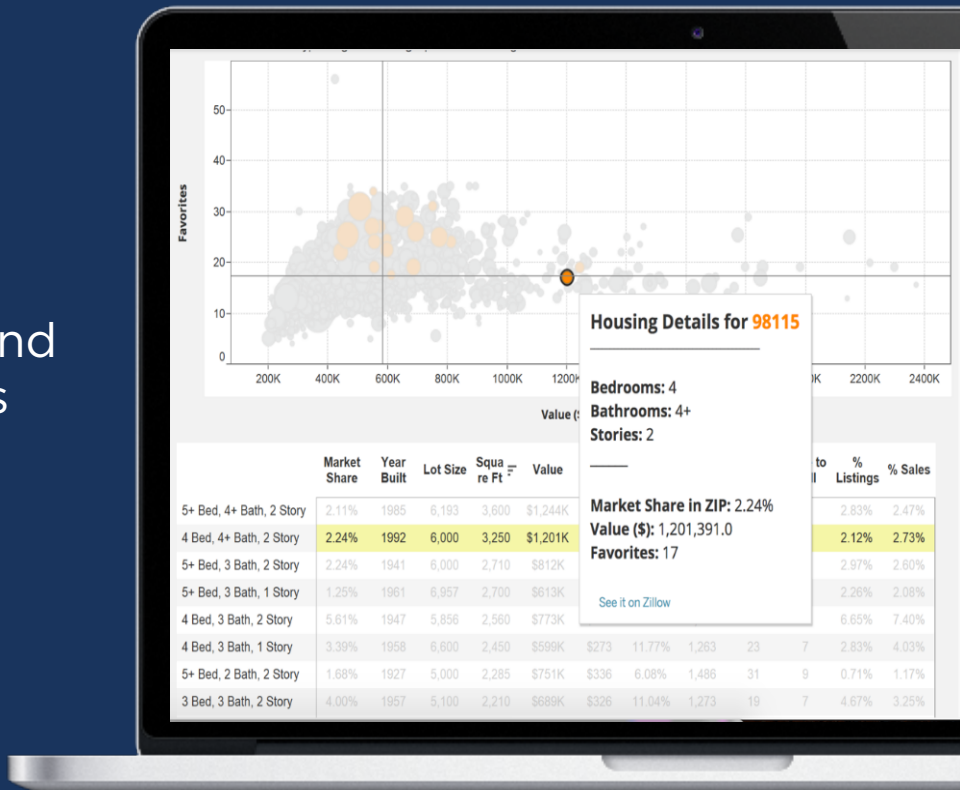
Question: Are we building homes that are affordable for the region?



Insight: Review listing views and search favorites to see what is most popular based on affordability



Inform: This data will help builders adequately price by region



Identify popular and profitable home types

? **Question:** Where are more expensive homes more desirable to build?

💡 **Insight:** Review listing views and search favorites to see what is in high demand

📍 **Inform:** This data will help builders adequately price by region

