



# INSIDE THE RENT ZESTIMATES

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UseR! 2016  
June 28, 2016

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# Flipping Houses

**Flip**



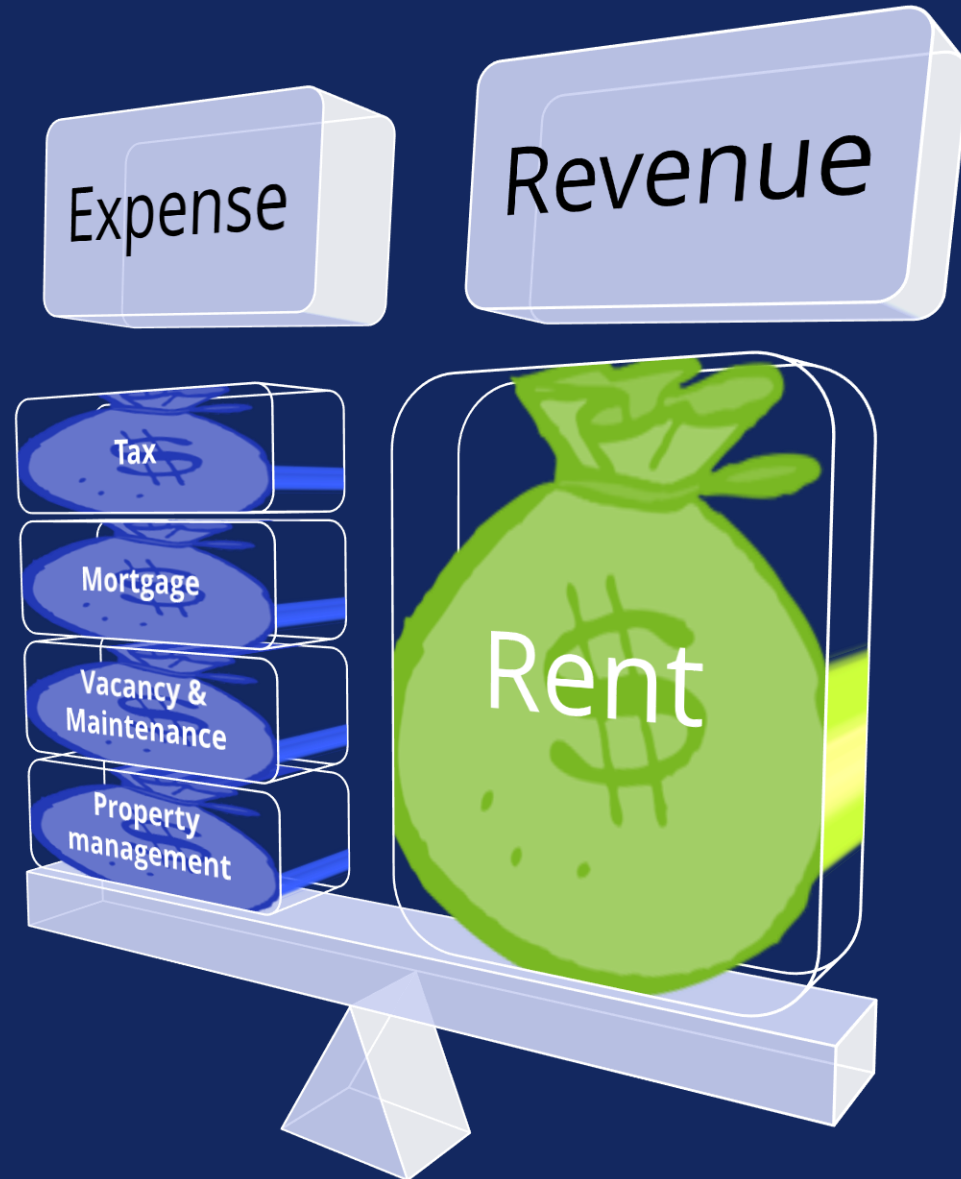


# Flipping Houses

**Flop**



# Land load



# What is the rental price?

## An Iterative Method

Percent higher than Rent Zestimate	Result
0%	• 3 applications on the first day of listing
5%	• 2 applications within 2 weeks
10%	• 1 application within 5 weeks
7%	• 1 application within 3 weeks

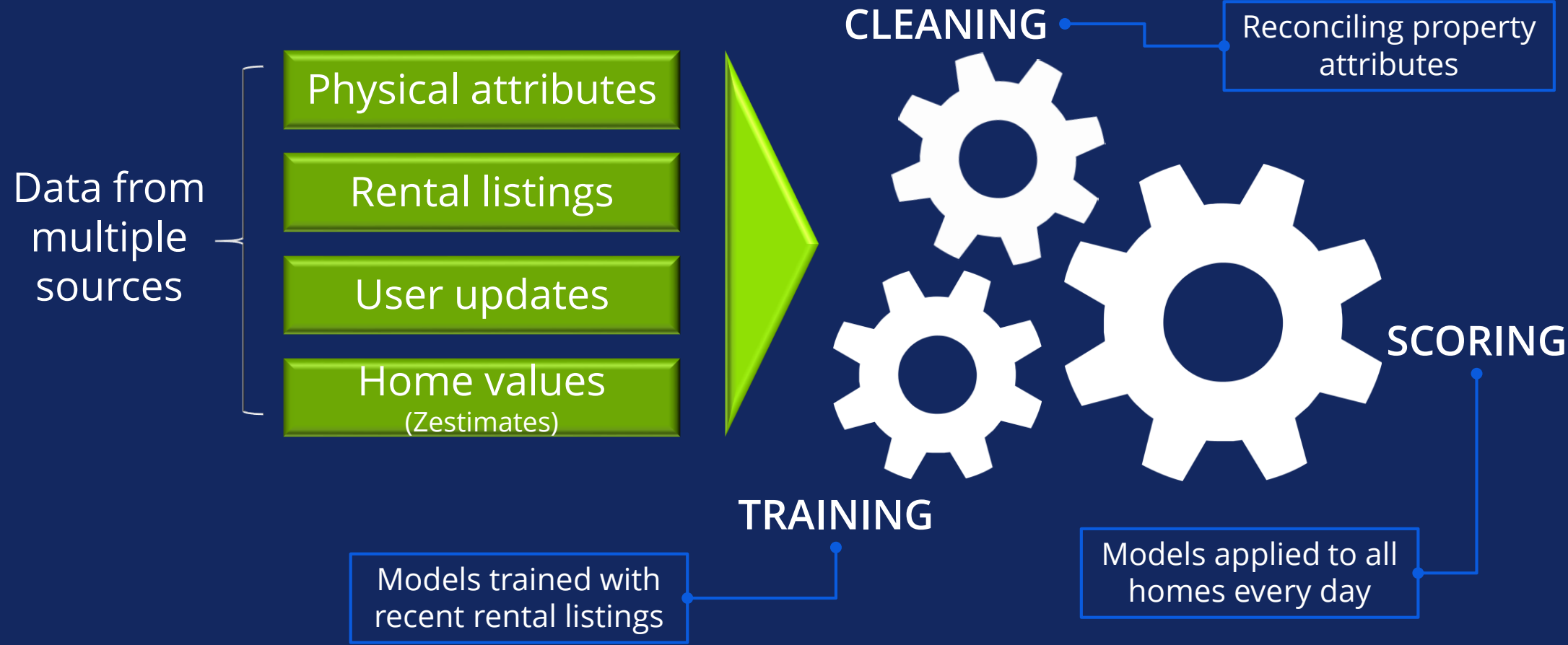
# Rental Price

$$\text{My Rental Estimate} = rz[t] * (1 + \varepsilon)$$

Where  $rz[t]$  is Rental Zestimate for a property at time  $t$   
and  $|\varepsilon| \ll 1$

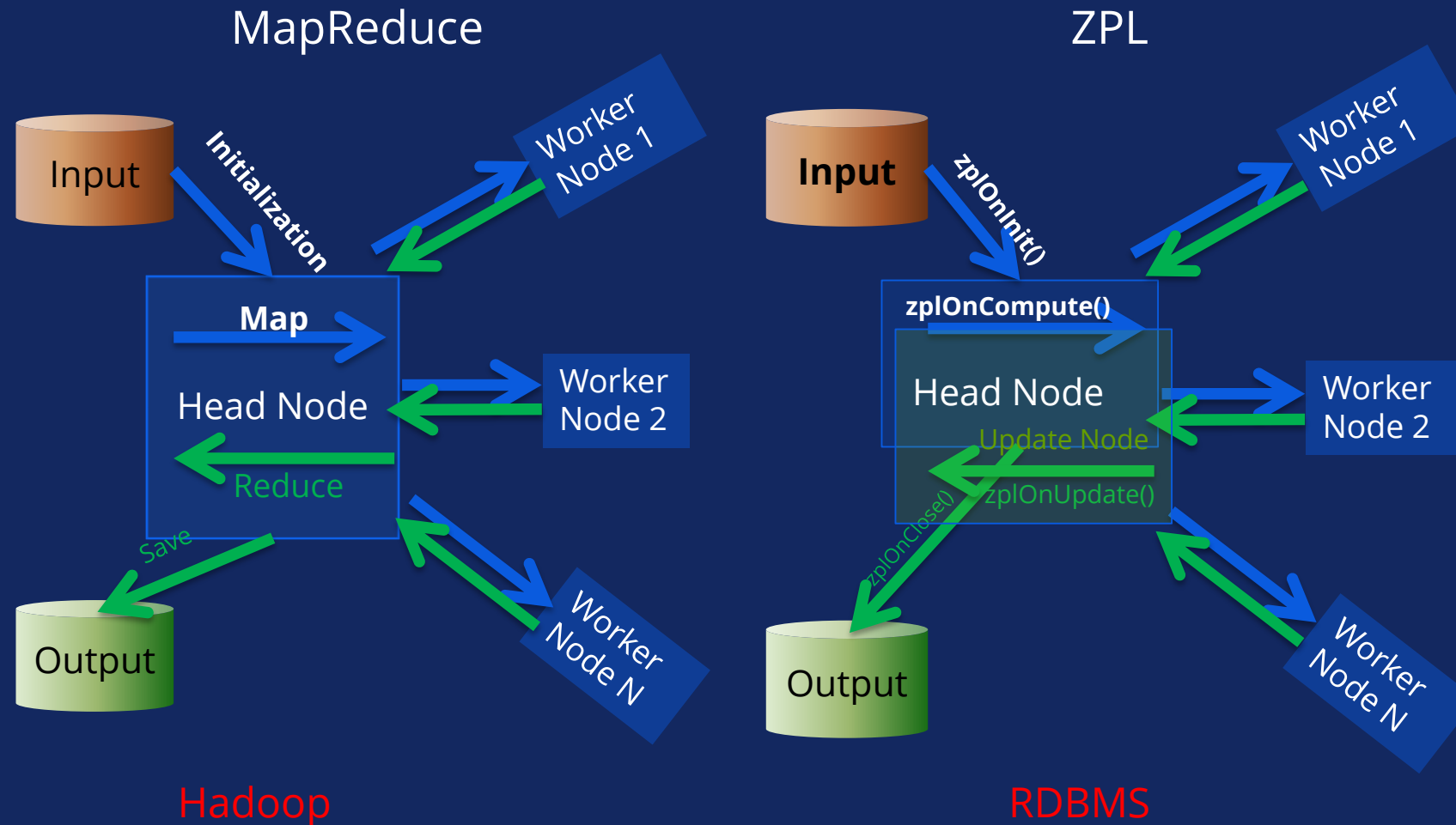
EX:  $\varepsilon = \text{median}(0.05, 0.10, 0.07) = 0.07$

# Rent Zestimate Engine



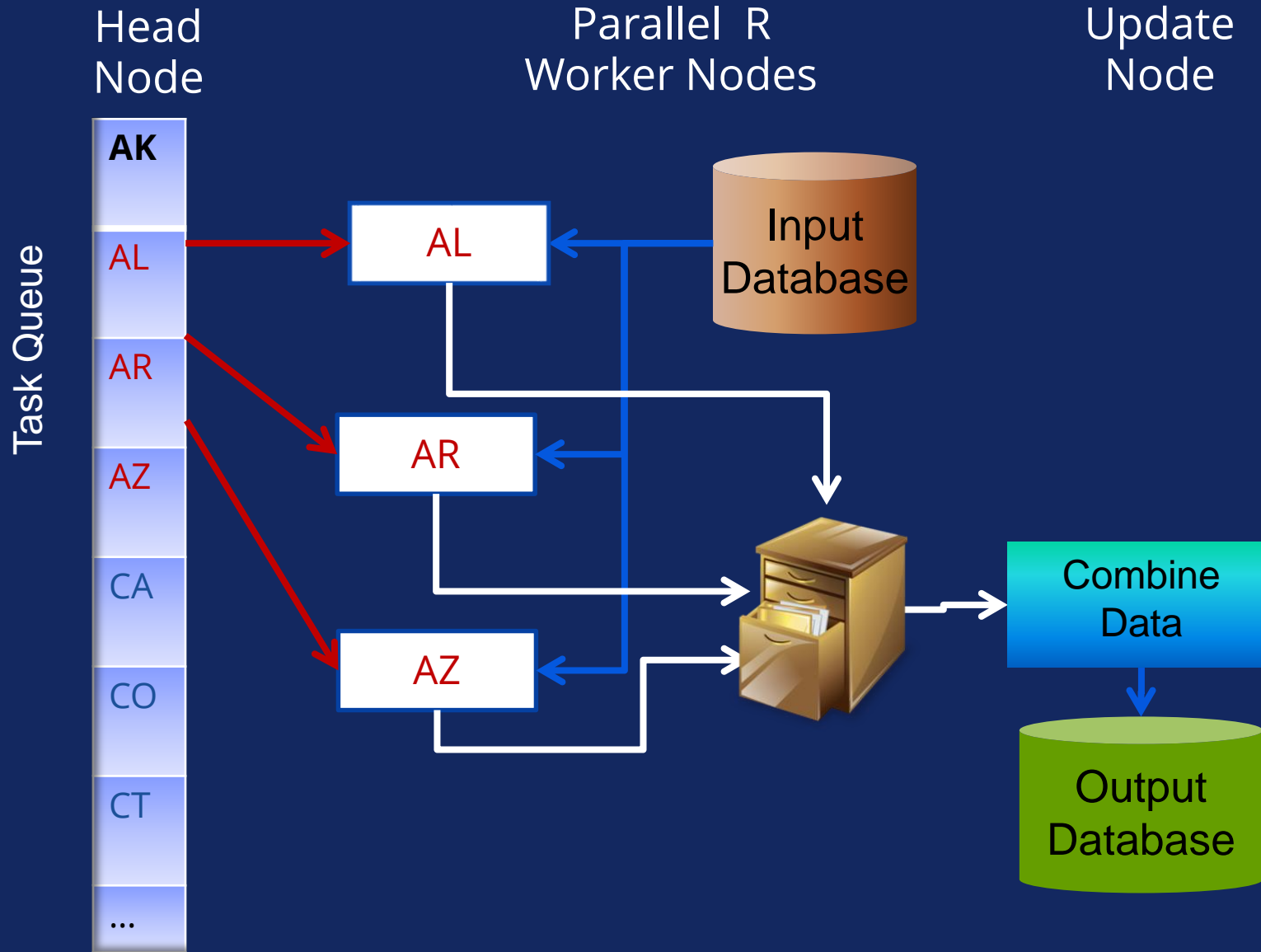
<b>RENT ZESTIMATE:</b>	Value:	Range:
	<b>\$1,450/mo</b>	\$1,300 - \$1,600K

# Map Reduce vs. Zillow Parallel Library (ZPL) for R

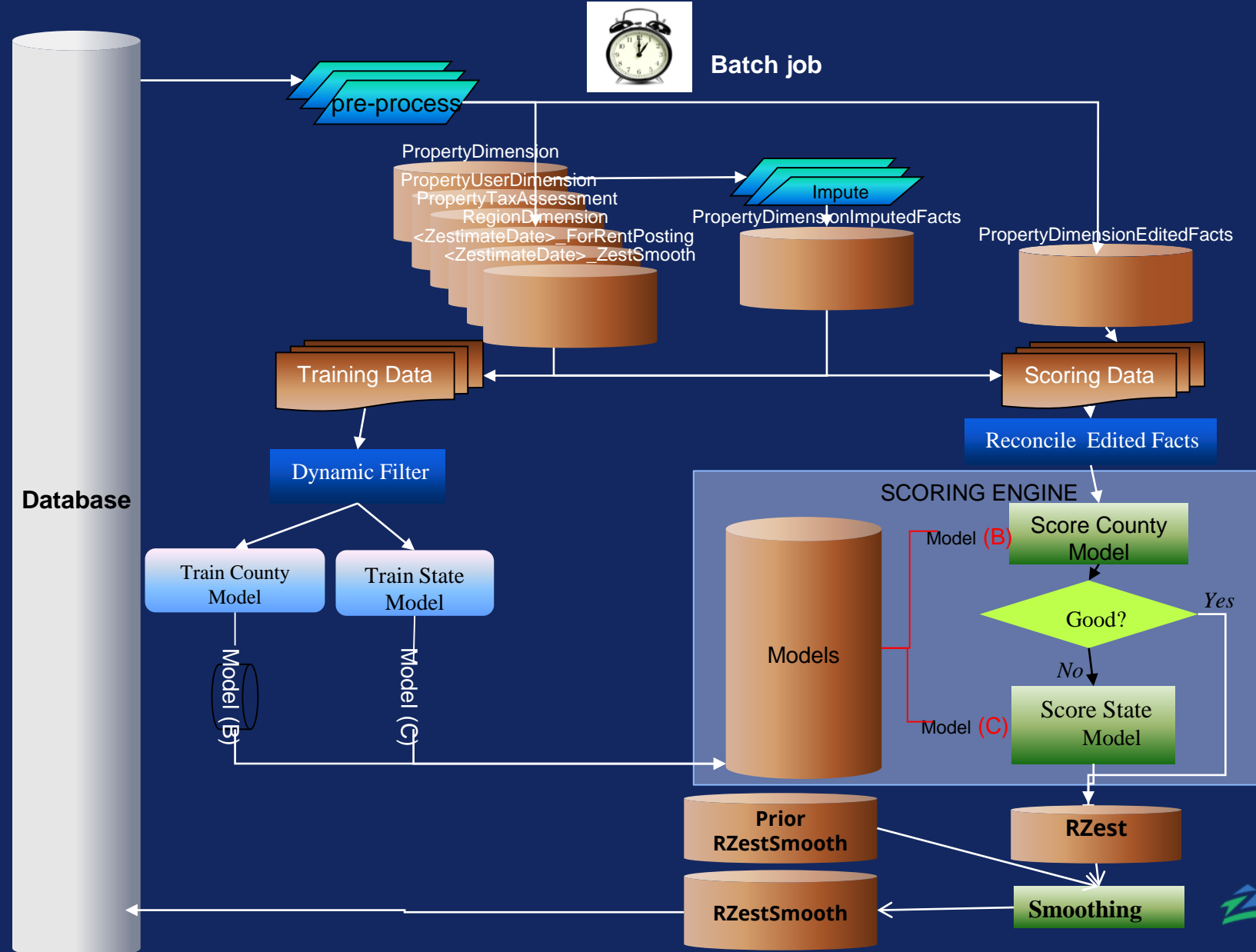




# Data Partitioning and Parallel Computing



# Under the hood



# Accuracy Measurement

Hold-out 30% of training data

If  $\underline{rz}$  are the Rent Zestimates for homes in the hold-out dataset, then the percent estimated errors are

$$\underline{e} = 100 * (\underline{rz} - \underline{r}) / \underline{r},$$

where  $\underline{r}$  are the actual rental listing prices.

## Key metrics :

Median ( $|\underline{e}|$ )

Percent of Rent Zestimates within  $x\%$  of rent price

$$\frac{100}{N} \sum_{i=1}^N ( |e_i| < x ),$$

where  $x\%$  : 5%, 10% and 20% and N is number properties in the hold-out set

# Commit to transparency

<http://www.zillow.com/howto/DataCoverageRentZestimateAccuracy.htm>

## Data Coverage and Rent Zestimate Accuracy Table

Choose a location type below to change data:

[Top Metro Areas](#)

[States/Counties\\*](#)

[National](#)

Portland, OR	★★★	812.4K	783.1K	35.7%	60.5%	82.5%	7.4%	▲
Riverside, CA	★★★★	1.6M	1.3M	39.3%	64.0%	83.4%	7.0%	
Sacramento, CA	★★★★	791.0K	708.9K	39.6%	65.7%	86.8%	6.5%	
San Antonio, TX	★★★★	827.7K	746.3K	40.2%	64.4%	85.3%	6.8%	
San Diego, CA	★★★	906.1K	874.4K	35.0%	58.4%	80.8%	7.9%	
San Francisco, CA	★★	1.3M	1.3M	31.0%	55.2%	78.2%	8.7%	
Seattle, WA	★★★	1.3M	1.2M	34.0%	58.4%	83.2%	8.1%	
St. Louis, MO	★★★	1.2M	1.1M	33.7%	56.1%	82.5%	8.3%	
Tampa, FL	★★★★	1.3M	1.2M	39.3%	63.3%	85.9%	7.0%	
Washington, DC	★★★★	1.9M	1.9M	42.4%	67.7%	87.7%	6.2%	▼

## Definitions

### ZESTIMATE ACCURACY/STAR RATING:

This rating is tied to the Median Error in an area.

The ratings are as follows:

★★★★★ = Best Rent Zestimate

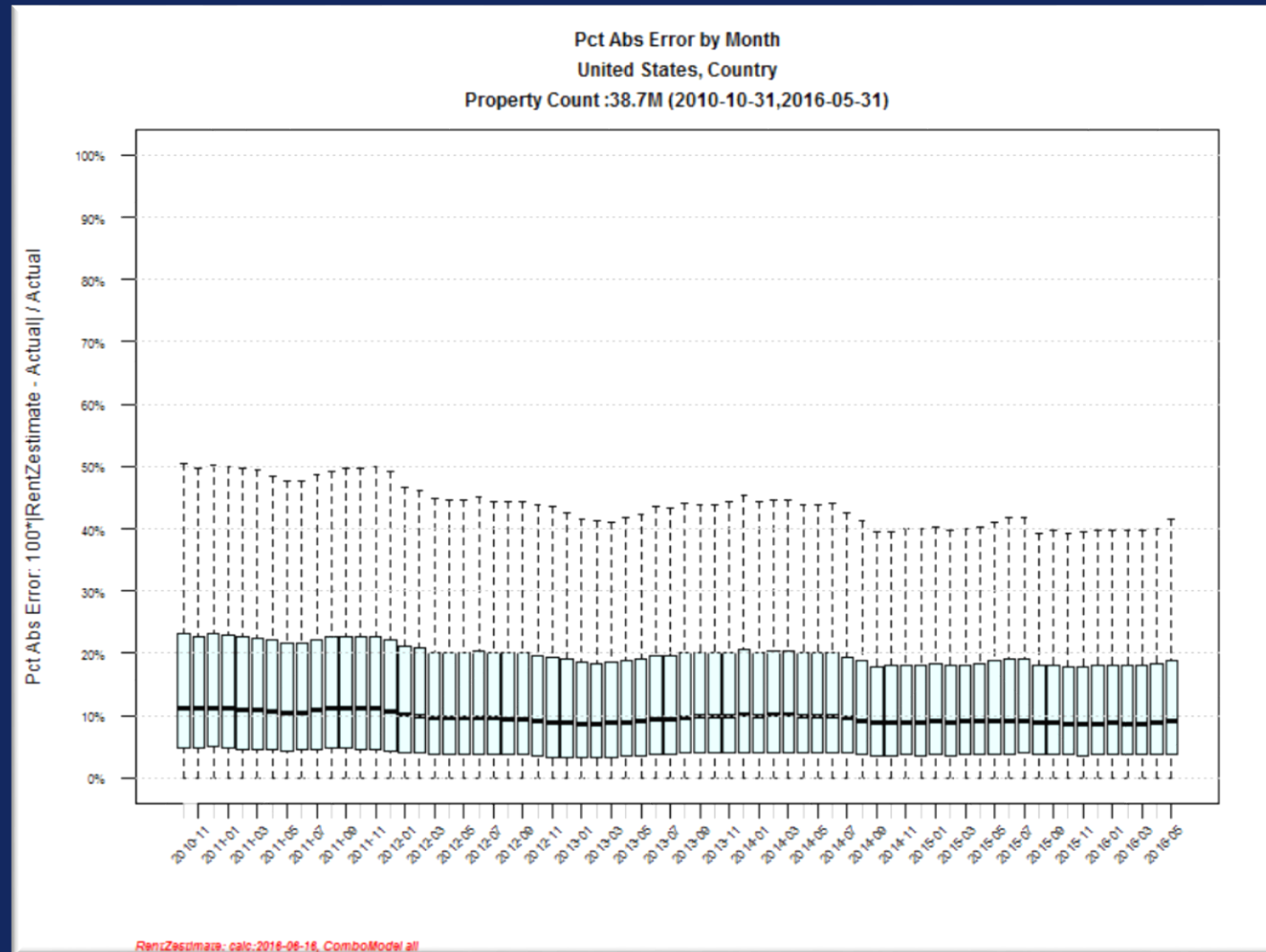
★★★★ = Good Rent Zestimate

★★★ = Fair Rent Zestimate

★ = Unable to compute Rent Zestimate accuracy

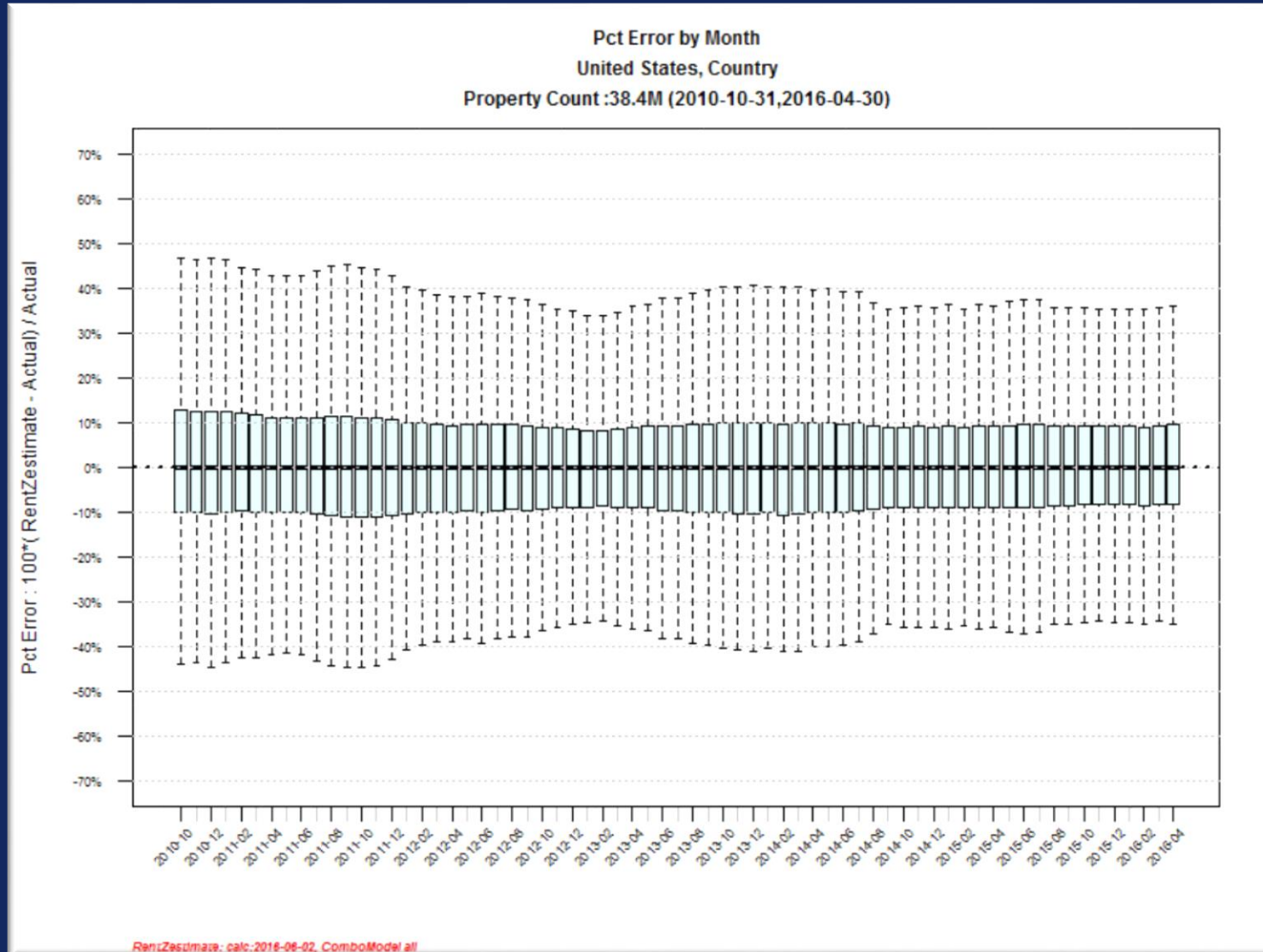
0 stars = No valuation

# Monthly Accuracy: box plot of |Pct Error| by month





# Systematic Error : box plot of Pct Error by month



# Key Takeaways

- **Rent Zestimate**
  - A starting point in determining the monthly rental price for a specific property.
  - Best tool for landlords, tenants, investors,...
- **Serious production software in R ?**
  - Yes

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