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# KING COUNTY

# HOUSE PRICES ANALYSIS

Regression Analysis  
of house sales prices

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# TOPICS



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- EXAMINE NEIGHBOURHOODS
- REVEAL LOCATION PATTERNS

# AUDIENCE

## REAL ESTATE AGENCY



### HIGH PRICE SEGMENT

Operates for years in high price segment

Not specialized in luxury listings

No exclusive network or access to VIPs/celebrities



### DATA BASIS

Little to no digital documentation of customer data

Heavily dependent on expertise and knowledge of skilled realtors



### DATA SCIENCE

Want to get to know what data science is in order to evaluate if data science can be beneficial and/or reveal anything new to them

Propose an easy framework for sales predictions

# ANALYSIS OBJECTIVES



## FACTORS

What are the objective factors that determine sales prices in the high price real estate segment



## IMPACT

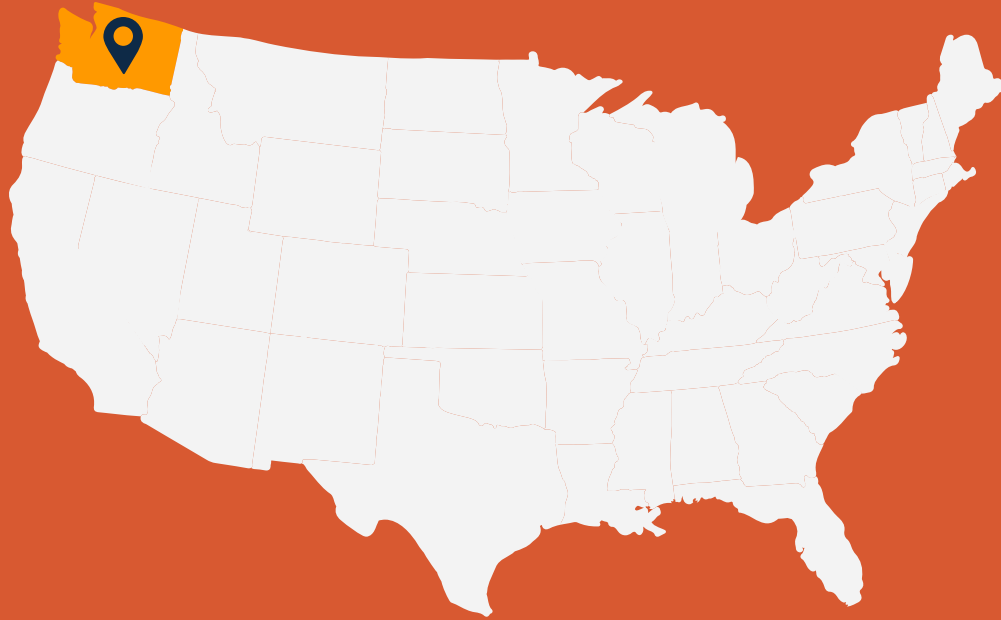
How and to which extent do these factors contribute to sales prices



## LOCATION

Which neighbourhoods and locations in King County should be focused on

## DATA BASIS



HOUSE SALE PRICES

MAY 2014 - MAY 2015

KING COUNTY, WA

21.613 OBSERVATIONS



# DISTRIBUTION OF PRICES

## DESCRIPTIVE STATISTICS HOUSE PRICES

Mean

**540.296 \$**

Median

**450.000 \$**

Minimum

**78.000 \$**

Maximum

**7.700.000 \$**

25 % of all prices are above  
**645.000 \$**



# FACTORS WHICH DETERMINE THE SALES PRICE



# REGRESSION ANALYSIS

**Linear regression** quantifies the relationship between one or more predictor variables and one outcome variable.

→ is used for **predictive analysis**

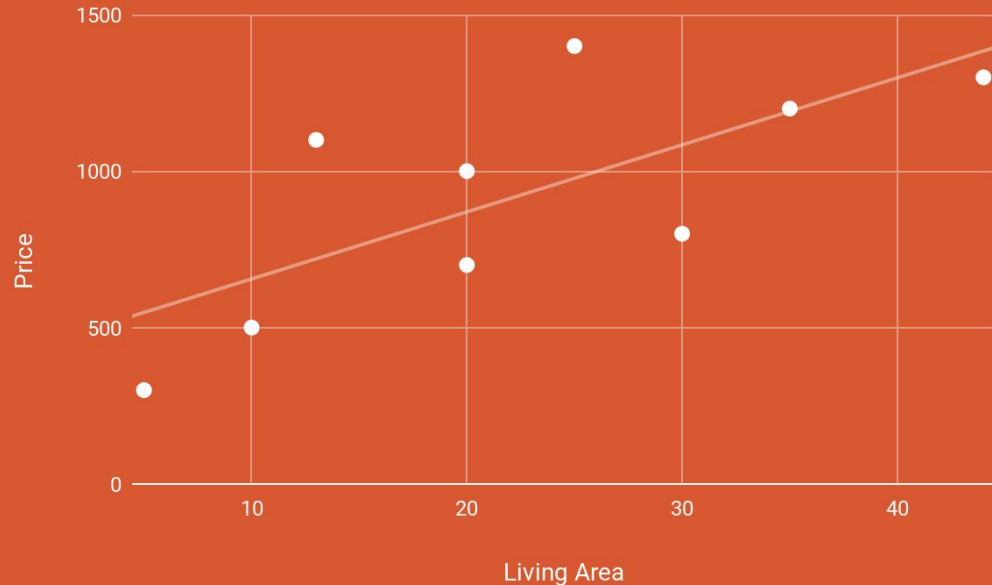
Our case:

Outcome variable = “Price”

Predictor variables = Factors  
(from previous slide)

Data Basis for Regression

→ all observations with sales prices ranging from **645.000 \$ to 1.100.000**  
(that way, unusual expensive houses, which we can't get access to will be excluded from the analysis)





## OUTCOMES OF MODEL ESTIMATION



### Factors **increasing** house sales prices



Every additional **square foot of total living area** of the house increases the sales price on average by **44 \$**



With **every year going backwards from now** the sales price increases on average by **619 \$**



Every additional **bathroom** in the house increases the sales price on average by **12.317 \$**



If the **house got renovated** the sales price increases on average by **55.240 \$**



If the **house got a good quality grade** the sales price increases on average by **33.747 \$**



If the **house has got a waterfront view** the sales price increases on average by **47.734 \$**



## EVALUATION OF MODEL



### Checking for **statistical significance** “Does my model make sense?”



The **overall Model** is **statistically significant**



The **model predictions deviate on average by 12%** in both directions from the average sales price  
→ in value terms approx. **by +/- 100.000 \$**



**All Factors are statistically significant, i.e. they contribute to predict the average sales price for houses**

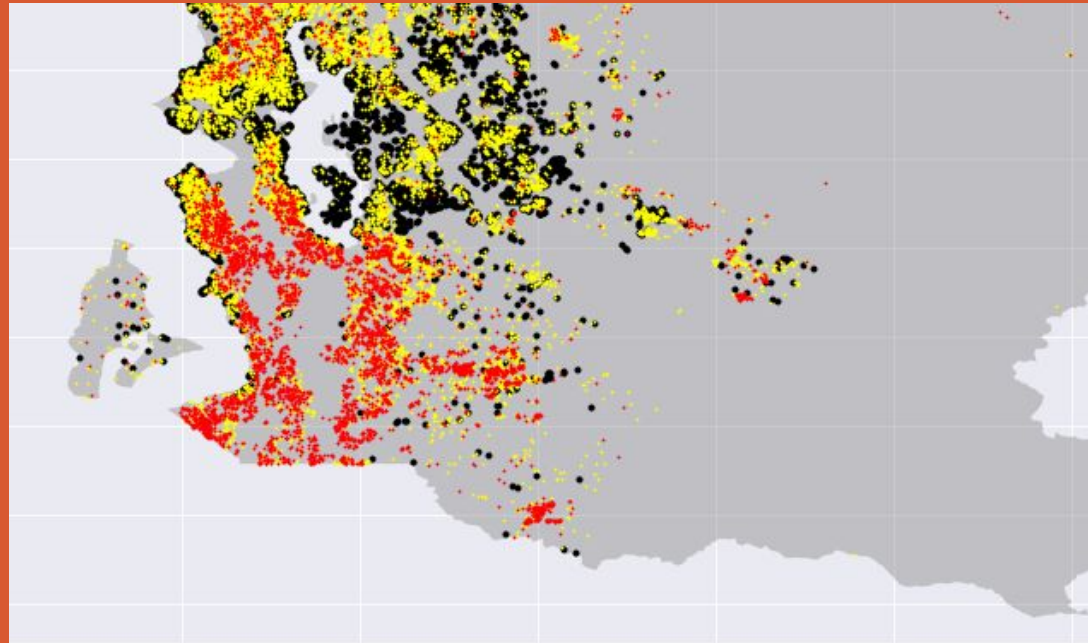
# GEO-MAPPING

**Visualization**, where houses in King County have been sold to **which price**

→ lots of houses sold in high price segment (black) are at the waterfront

→ certain areas with high average sales prices (all zipcodes in appendix<sup>2</sup>)

→ opportunity at Vashon Island



## Legend:

Black :	high price segment ( $645.000 < \text{price} < 1.100.000 \$$ )
Yellow:	medium price segment ( $322.000 \$ < \text{price} < 645.000 \$$ )
Red:	low price segment ( $\text{price} < 322.000 \$$ )

## IMPLICATIONS



**To sell high**  
(derived from regression)

**Houses in your portfolio should be in a good shape and/or renovated, which also lead to a good quality grade**



**To sell high**  
(derived from regression and geo-map)

**Houses in your portfolio should have a waterfront view**



**New opportunity**  
(derived from geo-map)

**Be the first and create a new exclusive neighbourhood on Vashon Island**

## FUTURE WORK



### **Variables weren't considered**

**Have a deeper look into the two "15"- variables**



### **Detailed feature engineering**

**Categories were made to dichotomize variables. Perhaps create several dummies from these variables**



### **Vashon Island**

**Further investigation, if this could be an actual opportunity, or if neighbourhood isn't that promising**





**THANK  
YOU!**

# Appendix

1: <https://info.kingcounty.gov/assessor/esales/Glossary.aspx?type=r#g> → under “GRADE”

2:

Average house sales prices (in \$) per Zipcode

