



How does the cost of homeowner associations (HOA) fees affect overall property value?

**DATASCI 203 Wed 4pm (PST), Fall 2022, Tanya Roosta
Jessica Stockham, Derrick Chan-Sew, Jammy (Chi Hung) Chan**

Intended Audience: Homeowners, homeowners associations and government officials who have a vested interest in homeowner association costs and market value of homes.

12/07/2022

Introduction



Home Owner Association (HOA) is an organization that makes and enforces rules and guidelines for a subdivision, planned community, or condominium building.

HOA Fees are collected from homeowners to pay for common area maintenance and shared services supports.

Research Question

*How does the cost of homeowner associations (HOA) fees affect **overall property value**?*

Data source and variables

US Census 2021 American Housing Survey study



64,141

Homeowners

8,010

Apartment/Single detached/attached homes

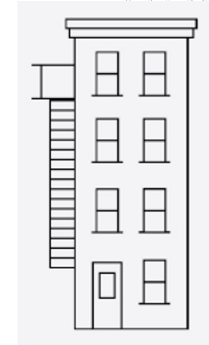
BASE MODEL (model 1)

Outcome: **log of Market Value of Home** (in dollars)

Key Independent Variable:

- **Log of HOA Amount** (in dollars) * House Type

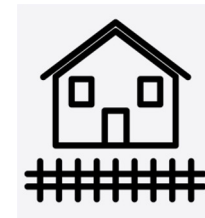
Reference Category



apartment

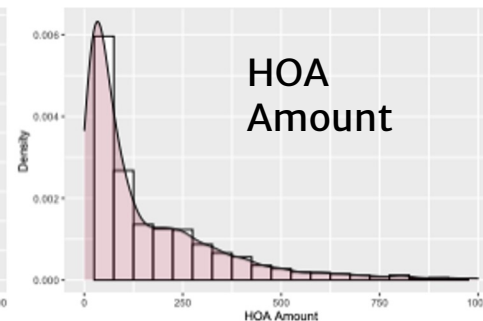
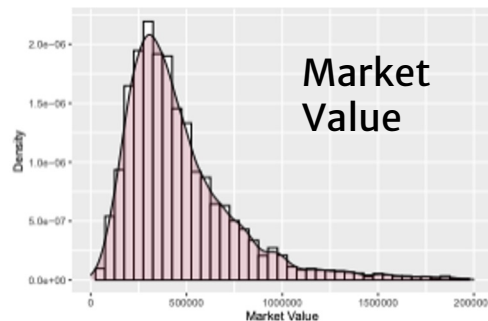


townhome/duplex



Single-family house

Image credit: noun project



Adding Predictors in Groups

MODELS 2-4:

- Considered groups of predictors in the following 3 batches.
- Goal: minimize omitted variable bias and account for geographic clustering

House Characteristics:

- Year Built
- Lot Size
- Unit Size
- Garage

Neighborhood Characteristics:

- Good schools
- Crime
- Disaster/flood zone
- Neighborhood rating

Geography:

- Metropolitan area code vs non-metropolitan area

Linear Regression Models Evaluations



Baseline
data model
(HOA + HouseType)
(model 1)

House
Characteristics
variables
(model 2)

Neighborhood
Characteristics
variables
(model 3)

Geographic
Location variables
(model 4)

Table 1: Estimated Regressions

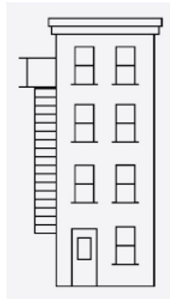
	Output Variable: Market Value			
	(1)	(2)	(3)	(4)
HOA Amount	0.28*** (0.06)	0.24*** (0.05)	0.24*** (0.05)	0.18*** (0.05)
Single-Family (D)	1.50*** (0.36)	0.79** (0.28)	0.80** (0.28)	0.64* (0.27)
Single-Family (A)	1.20** (0.39)	0.74* (0.30)	0.76* (0.30)	0.66* (0.29)
Garage - No		-0.23*** (0.04)	-0.22*** (0.04)	-0.18*** (0.04)
Near petty crime - No			-0.04 (0.03)	-0.04 (0.03)
Near serious crime - No			0.002 (0.10)	0.07 (0.09)
Near a disaster area - No			-0.13** (0.04)	-0.16*** (0.04)
HOAAmount · SingleFamily(D)	-0.15* (0.06)	-0.13** (0.05)	-0.13** (0.05)	-0.10* (0.05)
HOAAmount · SingleFamily(A)	-0.19** (0.07)	-0.14** (0.05)	-0.14** (0.05)	-0.12* (0.05)
Constant	11.00*** (0.36)	12.00*** (0.32)	11.00*** (0.39)	11.00*** (0.35)
Lot Size		✓	✓	✓
Square Footage		✓	✓	✓
Year Built		✓	✓	✓
Neighborhood Rating			✓	✓
School Rating			✓	✓
Metro Code				✓
Observations	5,580	5,580	5,580	5,580
R ²	0.12	0.33	0.34	0.48
Residual Std. Error	27.00 (df = 5574)	24.00 (df = 5548)	24.00 (df = 5534)	21.00 (df = 5518)

Note:

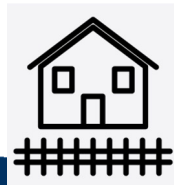
HC₁ robust standard errors in parentheses. HOA Amount is logged. D = Detached, A = Attached.

Key Findings

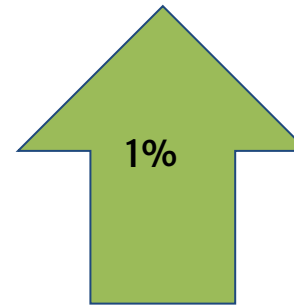
- For apartments, HOA fees are positively correlated with market value across all 4 models, a point estimate around .2



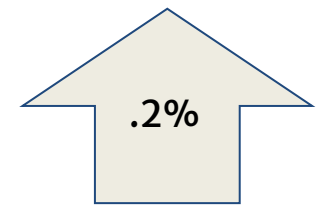
- Less clear is there is a relationship between HOA fees and the market value of single value homes (substantially dampened)



Log - Log model. Interpret coefficient as percentage change



HOA Amount



Market Value for Apartments

EXAMPLE

\$500 HOA

\$450,000 Apt

Raise by \$5

Increase value by
9,000

Limitations

This model is not causal

IID Assumption

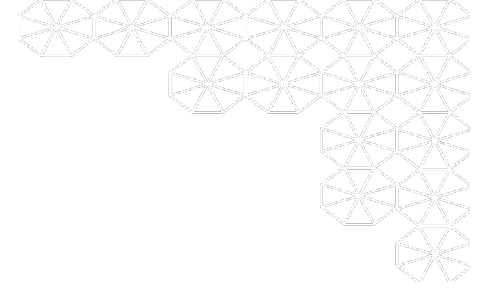
Spatial dependence of housing prices



Potential Biases

- **Omitted variable bias**
e.g., fancy amenities like a nice gym
- **Self-reported survey data**
- **Did not account for complex sample design of survey -> biased standard errors.**





BACKUP SLIDES

Data source and variables

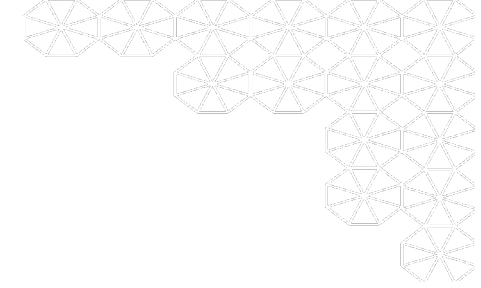
US Census 2021 American Housing Survey study



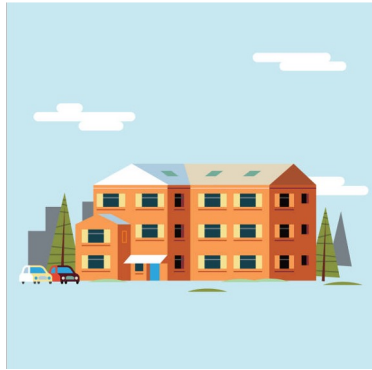
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8,010
Apartment/Single
detached/attached homes

Variable	Type	Description
marketval	Outcome (Y)	House market value
HOAamount	Independent (X)	HOA fees amount
HouseType	Variable has conditional effect with HOAamount (X_t)	House categories. Considering only Apartments, Single detached and attached houses.
YearBuilt, Lotsize, Unitsize, Parking	House characteristic omitted Variables (X_n)	Year built, House lot size, House size and parking space availability
Good School, Neighborhood rating, crime condition, disaster zone	Neighborhood characteristic omitted Variables (X_n)	Some boolean or ordinal ratings: School condition, neighborhood rating, crime condition, disaster status like flood zone.
Home city/county location	Geographic omitted Variables (X_g)	Code associated with metro cities.



Introduction - HOAs



**Managing Common
Areas**



**Providing Services to
Residents**



**Protecting Property
Values**



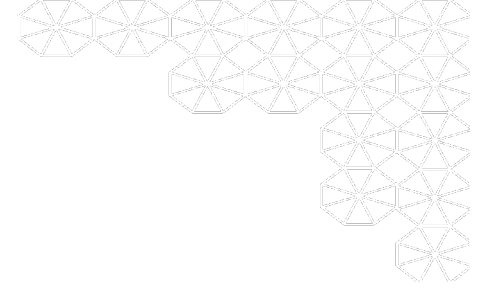
Summary



Citations

<https://www.census.gov/programs-surveys/ahs/data/2021/ahs-2021-public-use-file--puf-/ahs-2021-national-public-use-file--puf-.html>

Appendix



Data



64,141

Homeowners in the US Census 2021 American Housing Survey study

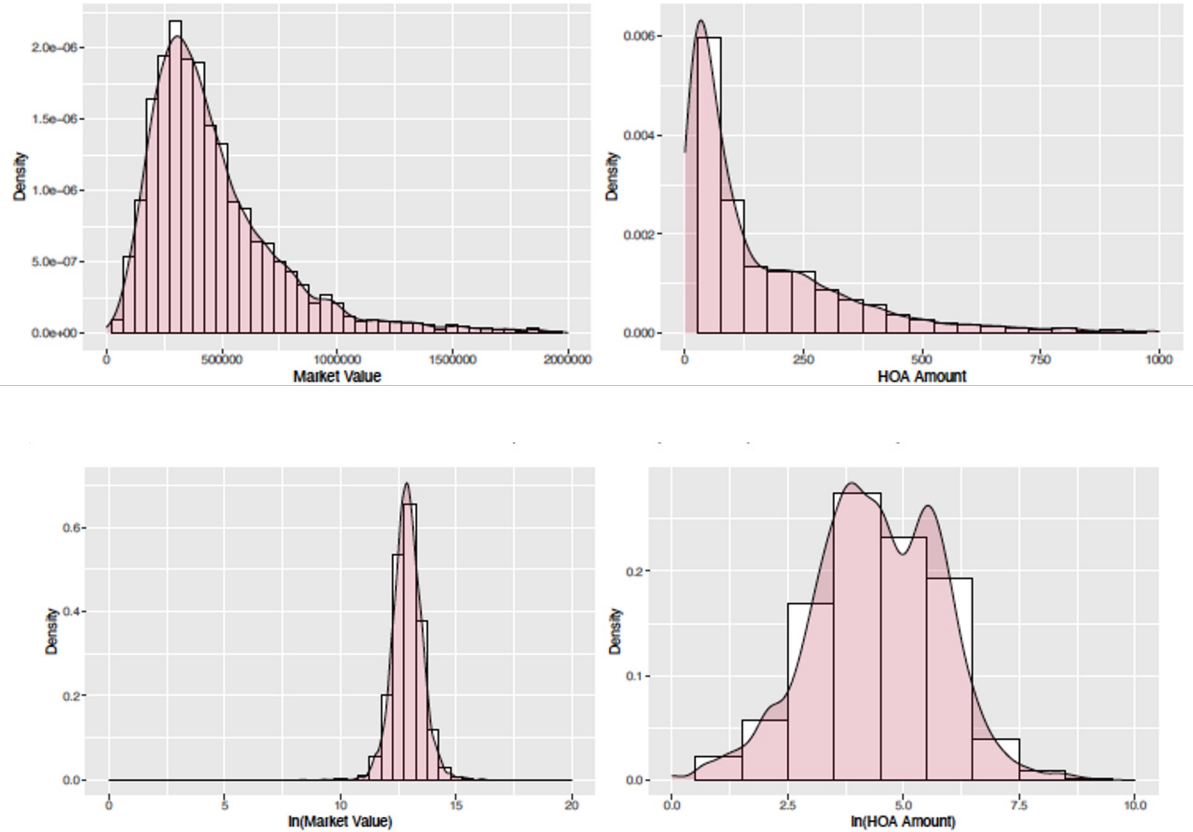
8,010

Homeowners of single-family detached homes, single-family attached homes or apartment structures

22

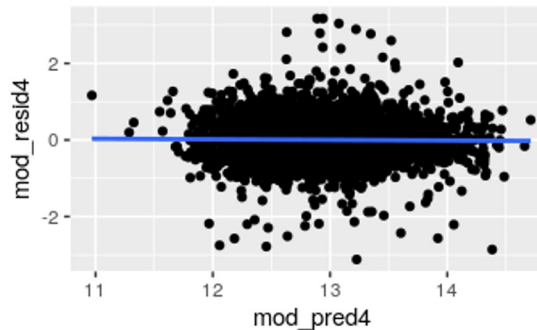
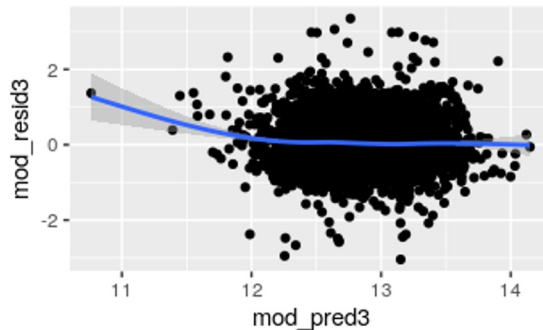
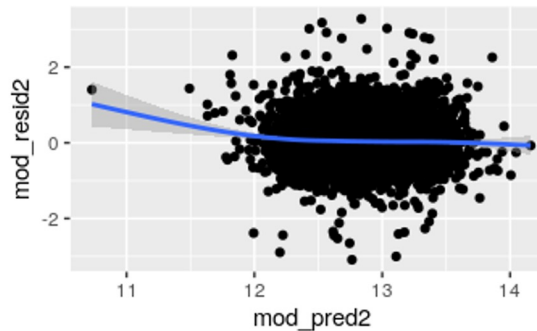
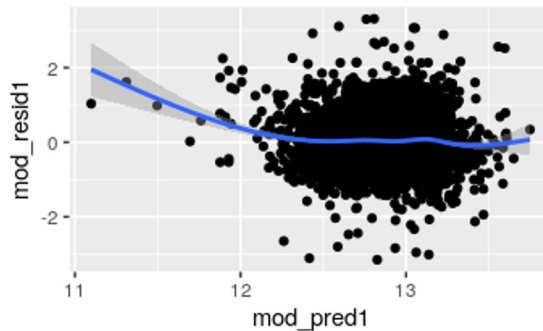
Variables of interest

Data Analysis - Transformations



Model building and evaluation

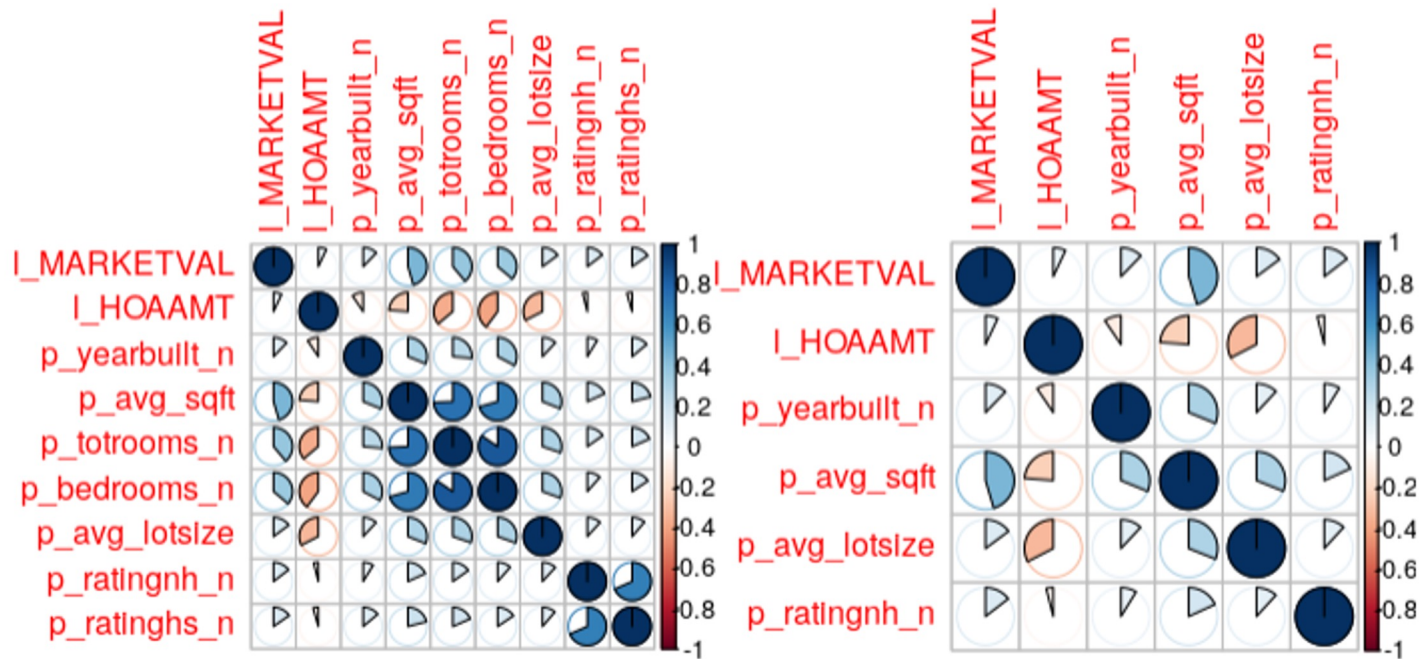
$$\begin{aligned} [Model_4] : \widehat{\log(\text{marketvalue})} = & \beta_0 + \beta_1 \cdot \log(\text{HOA amount}) \cdot \text{HouseType} \\ & + \beta_2 \cdot \text{Year Built} + \beta_3 \cdot \text{Lot Size} + \beta_4 \cdot \text{Number Of Bedrooms} \\ & + \beta_5 \cdot \text{Good School} + \beta_6 \cdot \text{Neighborhood Rating} \\ & + \beta_7 \cdot \text{Crime Condition} + \beta_8 \cdot \text{Diaster Zone} \\ & + \beta_9 \cdot \text{Geographic Location} \end{aligned}$$



Model accuracy testing



Correlation Analysis



Linear Regression Models Evaluations

```
> summary(model_4)
```

```
Call:
```

```
lm(formula = l_MARKETVAL ~ l_HOAAMT * p_housetype + p_yearbuilt +  
  p_lotsize + p_sqft + p_garage + p_nhqschool + p_nhqcrime +  
  p_nhqcrime_s + p_diaster + p_ratingnh + p_metro_code, data = ahs_m,  
  weights = WEIGHT, na.action = na.exclude)
```

```
Weighted Residuals:
```

```
      Min       1Q   Median       3Q      Max  
-162.24   -9.49    -0.06     9.12    154.71
```

```
Coefficients:
```

```
              Estimate Std. Error t value Pr(>|t|)  
(Intercept)  10.90802    0.25491   42.79 < 2e-16 ***  
l_HOAAMT      0.17894    0.01955    9.15 < 2e-16 ***  
p_housetype2   0.63556    0.12111    5.25 1.6e-07 ***  
p_housetype3   0.65545    0.14807    4.43 9.8e-06 ***  
p_yearbuilt1930 -0.66096    0.12059   -5.48 4.4e-08 ***  
p_yearbuilt1940 -0.49601    0.10178   -4.87 1.1e-06 ***  
p_yearbuilt1950 -0.59382    0.07109   -8.35 < 2e-16 ***  
p_yearbuilt1960 -0.58972    0.06153   -9.58 < 2e-16 ***  
p_yearbuilt1970 -0.55699    0.05561  -10.02 < 2e-16 ***  
p_yearbuilt1980 -0.50524    0.05440   -9.29 < 2e-16 ***  
p_yearbuilt1990 -0.52239    0.05437   -9.61 < 2e-16 ***  
p_yearbuilt2000 -0.53871    0.05378  -10.02 < 2e-16 ***  
p_yearbuilt2010 -0.53007    0.06757   -7.84 5.2e-15 ***  
p_yearbuilt2020 -0.44239    0.05483   -8.07 8.7e-16 ***  
p_lotsize1     0.10947    0.02792    3.92 8.9e-05 ***  
p_lotsize2     0.12084    0.02831    4.27 2.0e-05 ***  
p_lotsize3     0.13752    0.03051    4.51 6.7e-06 ***  
p_lotsize4     0.10984    0.03672    2.99 0.0028 **  
p_lotsize5     0.19531    0.03760    5.19 2.1e-07 ***  
p_lotsize6     0.41066    0.06829    6.01 1.9e-09 ***  
p_lotsize7     0.17094    0.08950    1.91 0.0562 .  
p_sqft2        -0.23223    0.12692   -1.83 0.0673 .  
p_sqft3        -0.10853    0.12170   -0.89 0.3725  
p_sqft4        -0.00696    0.11875   -0.06 0.9533  
p_sqft5        0.17965    0.11823    1.52 0.1287  
p_sqft6        0.37466    0.11850    3.16 0.0016 **  
p_sqft7        0.50554    0.11882    4.25 2.1e-05 ***  
p_sqft8        0.67992    0.11871    5.73 1.1e-08 ***  
p_sqft9        0.93591    0.12019    7.79 8.1e-15 ***  
p_garage1     -0.17921    0.02384   -7.52 6.5e-14 ***
```

```
p_nhqschool1   -0.05967    0.02741   -2.18 0.0295 *  
p_nhqschool-1  0.00875    0.02518    0.35 0.7283  
p_nhqcrime2    -0.03549    0.02275   -1.56 0.1189  
p_nhqcrime_s2  0.06706    0.04914    1.36 0.1724  
p_diaster2     -0.16467    0.02462   -6.69 2.5e-11  
***  
p_ratingnh2     1.07120    0.27567    3.89 0.0001  
***  
p_ratingnh3     0.41498    0.27469    1.51 0.1309  
p_ratingnh4     0.57510    0.22765    2.53 0.0116 *  
p_ratingnh5     0.76933    0.19581    3.93 8.6e-05  
***  
p_ratingnh6     0.82071    0.19191    4.28 1.9e-05  
***  
p_ratingnh7     0.94275    0.18930    4.98 6.5e-07  
***  
p_ratingnh8     0.94729    0.18883    5.02 5.4e-07  
***  
p_ratingnh9     0.99477    0.18902    5.26 1.5e-07  
***  
p_ratingnh10    0.99635    0.18880    5.28 1.4e-07  
***  
p_metro_code'14460' 0.70872    0.07061   10.04 < 2e-16  
***  
p_metro_code'16980' 0.08105    0.04791    1.69 0.0907 .  
p_metro_code'19100' 0.05393    0.04763    1.13 0.2576  
p_metro_code'19820' -0.01162    0.05676   -0.20 0.8378  
p_metro_code'26420' -0.18142    0.04385   -4.14 3.6e-05  
***  
p_metro_code'31080' 1.02134    0.04964   20.57 < 2e-16  
***  
p_metro_code'33100' 0.17371    0.04803    3.62 0.0003  
***  
p_metro_code'35620' 0.46845    0.05160    9.08 < 2e-16  
***  
p_metro_code'37980' 0.18937    0.05796    3.27 0.0011 **  
p_metro_code'38060' 0.30885    0.04666    6.62 3.9e-11  
***  
p_metro_code'40140' 0.38087    0.06435    5.92 3.4e-09  
***  
p_metro_code'41860' 1.22801    0.06104   20.12 < 2e-16  
***  
p_metro_code'42660' 0.78736    0.05871   13.41 < 2e-16  
***  
p_metro_code'47900' 0.49563    0.04591   10.80 < 2e-16  
***  
p_metro_code'99998' 0.15164    0.03435    4.41 1.0e-05  
***  
p_metro_code'99999' 0.21883    0.04646    4.71 2.5e-06  
***  
l_HOAAMT:p_housetype2 -0.09610    0.02039   -4.71 2.5e-06  
***  
l_HOAAMT:p_housetype3 -0.12361    0.02581   -4.79 1.7e-06  
***
```

```
---  
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
Residual standard error: 21 on 5518 degrees of freedom  
Multiple R-squared:  0.48,    Adjusted R-squared:  0.474
```

```
F-statistic: 83.4 on 61 and 5518 DF,  p-value: <2e-16
```

Linear Regression Models Evaluations

Table 1: Estimated Regressions

Output Variable: Market Value				
	(1)	(2)	(3)	(4)
HOA Amount	0.28*** (0.06)	0.24*** (0.05)	0.24*** (0.05)	0.18*** (0.05)
Single-Family (D)	1.50*** (0.36)	0.79*** (0.28)	0.80*** (0.28)	0.64* (0.27)
Single-Family (A)	1.20*** (0.39)	0.74* (0.30)	0.76* (0.30)	0.66* (0.29)
Garage - No		-0.71*** (0.16)	-0.68*** (0.16)	-0.66*** (0.14)
Near petty crime - No		-0.55** (0.18)	-0.54** (0.18)	-0.50** (0.17)
Near serious crime - No		-0.62*** (0.11)	-0.62*** (0.11)	-0.59*** (0.10)
Near a disaster area - No		-0.61*** (0.10)	-0.61*** (0.10)	-0.59*** (0.09)
HOAAmount · SingleFamily(D)		-0.63*** (0.10)	-0.62*** (0.09)	-0.56*** (0.09)
HOAAmount · SingleFamily(A)		-0.58*** (0.09)	-0.57*** (0.09)	-0.51*** (0.08)
Constant		-0.62*** (0.09)	-0.62*** (0.09)	-0.52*** (0.08)
p_yearbuilt2000		-0.66*** (0.09)	-0.65*** (0.09)	-0.54*** (0.08)
p_yearbuilt2010		-0.67*** (0.10)	-0.66*** (0.10)	-0.53*** (0.09)
p_yearbuilt2020		-0.57*** (0.09)	-0.56*** (0.09)	-0.44*** (0.08)
p_lotsize1		0.15*** (0.03)	0.16*** (0.03)	0.11*** (0.03)
p_lotsize2		0.08* (0.04)	0.08* (0.04)	0.12*** (0.03)
p_lotsize3		0.10** (0.04)	0.10* (0.04)	0.14*** (0.04)
p_lotsize4		0.09 (0.05)	0.08 (0.05)	0.11* (0.05)
p_lotsize5		0.17** (0.05)	0.16** (0.05)	0.20*** (0.05)
p_lotsize6		0.46*** (0.10)	0.45*** (0.10)	0.41*** (0.09)
p_lotsize7		0.17 (0.12)	0.15 (0.11)	0.17 (0.11)
p_sqft2		-0.32* (0.12)	-0.32* (0.13)	-0.23 (0.15)
p_sqft3		-0.20 (0.10)	-0.21 (0.11)	-0.11 (0.13)
p_sqft4		-0.11 (0.10)	-0.12 (0.11)	-0.01 (0.13)
p_sqft5		0.07 (0.10)	0.06 (0.11)	0.18 (0.12)
p_sqft6		0.27** (0.09)	0.26* (0.11)	0.37** (0.12)
p_sqft7		0.40*** (0.10)	0.38*** (0.11)	0.51*** (0.13)
p_sqft8		0.56*** (0.10)	0.55*** (0.11)	0.68*** (0.13)
p_sqft9		0.83*** (0.10)	0.82*** (0.11)	0.94*** (0.13)
p_garage1		-0.23*** (0.04)	-0.22*** (0.04)	-0.18*** (0.04)
p_nhqschool1			-0.02 (0.03)	-0.06 (0.03)
p_nhqschool-1			0.01 (0.04)	0.01 (0.03)
p_nhqcrime2			-0.04 (0.03)	-0.04 (0.03)
p_nhqcrime_s2			0.002 (0.10)	0.07 (0.09)
p_diaster2			-0.13** (0.04)	-0.16*** (0.04)
p_ratingnh2			1.00*** (0.29)	1.10*** (0.25)
p_ratingnh3			0.39 (0.30)	0.41 (0.23)
p_ratingnh4			0.54 (0.40)	0.58 (0.36)
p_ratingnh5			0.83*** (0.24)	0.77*** (0.19)
p_ratingnh6			0.90*** (0.24)	0.82*** (0.19)
p_ratingnh7			1.00*** (0.23)	0.94*** (0.18)
p_ratingnh8			0.99*** (0.23)	0.95*** (0.18)
p_ratingnh9			1.10*** (0.23)	0.99*** (0.18)
p_ratingnh10			1.00*** (0.23)	1.00*** (0.18)
p_metro_code'14460'				0.71*** (0.05)
p_metro_code'16980'				0.08 (0.04)
p_metro_code'19100'				0.05 (0.04)
p_metro_code'19820'				-0.01 (0.05)
p_metro_code'26420'				-0.18*** (0.04)
p_metro_code'31080'				1.00*** (0.05)
p_metro_code'33100'				0.17*** (0.04)
p_metro_code'35620'				0.47*** (0.07)
p_metro_code'37980'				0.19*** (0.04)
p_metro_code'38060'				0.31*** (0.03)
p_metro_code'40140'				0.38*** (0.04)
p_metro_code'41860'				1.20*** (0.05)
p_metro_code'42660'				0.79*** (0.04)
p_metro_code'47900'				0.50*** (0.04)
p_metro_code'99998'				0.15*** (0.03)
p_metro_code'99999'				0.22*** (0.06)
l_HOAAMT:p_housetype2	-0.15* (0.06)	-0.13** (0.05)	-0.13** (0.05)	-0.10* (0.05)
l_HOAAMT:p_housetype3	-0.19*** (0.07)	-0.14*** (0.05)	-0.14*** (0.05)	-0.12* (0.05)
Constant	11.00*** (0.36)	12.00*** (0.32)	11.00*** (0.39)	11.00*** (0.35)
Observations	5,580	5,580	5,580	5,580
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Residual Std. Error	27.00 (df = 5574)	24.00 (df = 5548)	24.00 (df = 5534)	21.00 (df = 5518)

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Linear Regression Models Evaluations

Baseline
data model
(HOA + HouseType)
(model 1)

House
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	(1)	(2)	(3)	(4)
HOA Amount	0.28*** (0.06)	0.24*** (0.05)	0.24*** (0.05)	0.18*** (0.05)
Single-Family (D)	1.50*** (0.36)	0.79** (0.28)	0.80** (0.28)	0.64* (0.27)
Single-Family (A)	1.20** (0.39)	0.74* (0.30)	0.76* (0.30)	0.66* (0.29)
Garage - No		-0.23*** (0.04)	-0.22*** (0.04)	-0.18*** (0.04)
Near petty crime - No			-0.04 (0.03)	-0.04 (0.03)
Near serious crime - No			0.002 (0.10)	0.07 (0.09)
Near a disaster area - No			-0.13** (0.04)	-0.16*** (0.04)
<i>HOAAmount · SingleFamily(D)</i>	-0.15* (0.06)	-0.13** (0.05)	-0.13** (0.05)	-0.10* (0.05)
<i>HOAAmount · SingleFamily(A)</i>	-0.19** (0.07)	-0.14** (0.05)	-0.14** (0.05)	-0.12* (0.05)
Constant	11.00*** (0.36)	12.00*** (0.32)	11.00*** (0.39)	11.00*** (0.35)
Lot Size		✓	✓	✓
Square Footage		✓	✓	✓
Year Built		✓	✓	✓
Neighborhood Rating			✓	✓
School Rating			✓	✓
Metro Code				✓
Observations	5,580	5,580	5,580	5,580
R ²	0.12	0.33	0.34	0.48
Residual Std. Error	27.00 (df = 5574)	24.00 (df = 5548)	24.00 (df = 5534)	21.00 (df = 5518)

Note:

HC₁ robust standard errors in parentheses. HOA Amount is logged. D = Detached, A = Attached.