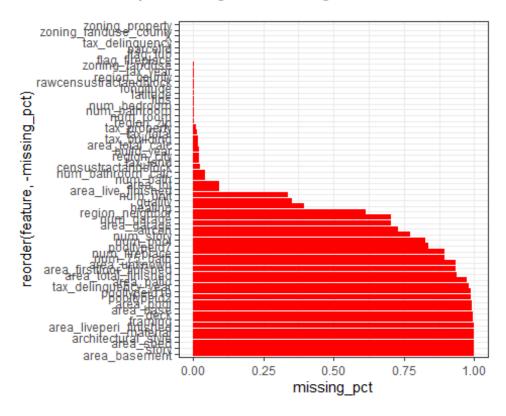
Data Preparation

Features with percentage of missing values



Selected features

X, parcelid, aircon, num_bathroom, num_bedroom, quality, num_bathroom_calc, area_total_calc, area_live_finished, fips, num_bath, num_garage, area_garage, flag_tub, heating, latitude, longitude, area_lot, zoning_landuse_county, zoning_landuse, zoning_property, rawcensustractandblock, region_city, region_county, region_neighbor, region_zip, num_room, num_unit, build_year, flag_fireplace, tax_building, tax_total, tax_year, tax_land, tax_property, tax_delinquency, censustractandblock

Data set info

Summary of transactions data set

```
parcelid
##
                           logerror
                                                    date
##
   Min.
           : 10711738
                        Min.
                                :-4.60500
                                            2016-07-29:
                                                         910
    1st Qu.: 11559500
                        1st Qu.:-0.02530
                                            2016-04-29:
                                                         902
##
   Median : 12547337
                        Median : 0.00600
                                            2016-09-30:
                                                         894
   Mean
           : 12984656
                        Mean
                               : 0.01146
                                            2016-06-30:
                                                         874
   3rd Qu.: 14227552
                        3rd Qu.: 0.03920
                                           2016-05-27:
                                                         863
```

```
## Max. :162960842 Max. : 4.73700 2016-08-31: 737 (Other) :85095
```

head of transactions data set

```
## parcelid logerror date
## 1 11016594    0.0276 2016-01-01
## 2 14366692    -0.1684 2016-01-01
## 3 12098116    -0.0040 2016-01-01
## 4 12643413    0.0218 2016-01-02
## 5 14432541    -0.0050 2016-01-02
## 6 11509835    -0.2705 2016-01-02
```

head of properties data set

ileau o	i biobeiti	es uata	361					
##			con arch	nitectural_sty	/le ar	rea_ba	asement n	um_bathroom
## 1 234	12182 12484	350	1	_	NA		NA	4
## 2 54	11880 12181	530	NA		NA		NA	1
## 3 161	17969 14222	705	NA		NA		NA	0
## 4 172	29095 11467	838	NA		NA		NA	2
## 5 8	34189 13015	665	NA		NA		NA	1
## 6 157	70086 12633	721	NA		NA		NA	4
## nun	_bedroom f	raming o	quality	num_bathroom	calc	deck	area_fir	stfloor_finis
hed	_				_		_	_
## 1	6	NA	4		4	NA		
NA								
## 2	2	NA	7		1	NA		
NA								
## 3	0	NA	NA		NA	NA		
NA								
## 4	3	NA	7		2	NA		
NA								
## 5	2	NA	7		1	NA		
NA								
## 6	6	NA	7		4	NA		
NA								
## are	ea_total_ca	lc area_	_live_fi	inished area_1	livepe	eri_fi	inished a	rea_total_fin
ished								
## 1	33	15		3315			NA	
NA								
## 2	10	88		1088			NA	
NA								
## 3	42	31		NA			NA	
NA								
## 4	13	27		1327			NA	
NA								
## 5	9	76		976			NA	
NA								
## 6	30	30		NA			NA	
3030								
## are	ea_unknown	area_bas	se fips	num_fireplace	e num_	_bath	num_gara	ge area_garag

e									
##	1	NA	NA	6037		NA	4	NA	N
A ##	2	NA	NA	6037		NA	1	NA	N
Α									
## 0	3	NA	4231	6059		NA	NA	0	
##	4	NA	NA	6037		NA	2	NA	N
A ##	5	NA	NA	6037		NA	1	NA	N
A ##	6	NA	NΔ	6037		NA	4	NA	N
Α									
## eid		heating	latitu	ıde lor	ngitude	area_lot	num_pool	area_pool	pooltyp
##		2	338523	329 -118	8125098	6548	NA	NA	
NA ##	2	NA	339869	932 -118	8297793	6008	NA	NA	
NA ##	3	NΔ	338194	170 -11	7832954	9118	NA	NA	
NA									
## NA	4	7	339587	756 -118	8398254	5145	NA	NA	
##	5	7	341383	321 -117	7908275	7000	NA	NA	
NA ##	6	NA	337825	87 -118	8251435	7000	NA	NA	
NA									
## ert		id2 pool	typeid	⁷ zoning	g_landus	se_county	zoning_la	anduse zoni	ing_prop
##	-	NA	N/	4		0100		261	LK
R1									
## LAF		NA	N/	4		0100		261	
##		NA	N.A	1		96		248	
##		NA	N/			0100		261	
LAF		147.	147	•		0100		201	
##		NA	N/	١		0100		261	AZ
R10	<u></u> *								
##		NA	N/	4		0200		246	
LAF		tnactan	dhlock	negion	city no	agion cour	nty negio	n_neighbor	negion
zip		o ci ac cain	JUTUCK	r egion_	_crty it	egion_cour	icy region	II_IIEIgIIDOI	region_
##		603	375708	1	12292	31	L01	NA	96
212	2								
## 025		603	372372	1	12447	31	101	118208	96
##		60!	590758	3	33252	12	286	NA	97
063			77770		10447	2.4	101	7077	06
## 026		60.	372780	-	12447	31	L01	7877	96

## 5 464		6	60374006		37015	31	01	NA	96
## 6		6	0372947		12447	31	01	48516	96
228			10372347		1277/	31	01	40310	50
##	num_room	story	num_75_ba	ath ma	aterial n	um_unit a	rea_patio	area_shed	build_
year									
## 1	0	NA		NA	NA	1	NA	NA	
1950									
## 2	0	NA		NA	NA	1	NA	NA	
1940						_			
## 3	0	NA		NA	NA	4	NA	NA	
1973	0	NIA		NI A	NI A	4	NIA	NA	
## 4	0	NA		NA	NA	1	NA	NA	
1944 ## 5	0	NA		NA	NA	1	NA	NA	
1921	V	IVA		INA	IVA	1	INA	IVA	
## 6	0	NA		NA	NA	2	NA	NA	
1921	Ŭ	IVA		IVA	IVA	_	I W/A	IVA	
##	num storv	/ flag	fireplace	e tax	building	tax tota	l tax_year	tax land	
## 1	NA		. - r	-	255065	_			
## 2	N/	4			22500	17256	8 2015	150068	
## 3	2	2			212125	35355	0 2015	141425	
## 4	N/	4			97880	37069	5 2015	272815	
## 5	N/	4			94231	26269	8 2015	168467	
## 6	N/				225985				
##		-	ıx_delinqı	uency	tax_deli	nquency_y	ear census	tractandb]	lock
## 1	3766	5.44					NA	6.0375716	
## 2	2186						NA	6.0372376	
## 3	4655						NA	6.059076	
## 4	4616						NA	6.0372786	
## 5	3303						NA	6.037401	
## 6	3144	1.99					NA	6.037295	+13

Column names

properties

X, parcelid, aircon, architectural_style, area_basement, num_bathroom, num_bedroom, framing, quality, num_bathroom_calc, deck, area_firstfloor_finished, area_total_calc, area_live_finished, area_liveperi_finished, area_total_finished, area_unknown, area_base, fips, num_fireplace, num_bath, num_garage, area_garage, flag_tub, heating, latitude, longitude, area_lot, num_pool, area_pool, pooltypeid10, pooltypeid2, pooltypeid7, zoning_landuse_county, zoning_landuse, zoning_property, rawcensustractandblock, region_city, region_county, region_neighbor, region_zip, num_room, story, num_75_bath, material, num_unit, area_patio, area_shed, build_year, num_story, flag_fireplace, tax_building, tax_total, tax_year, tax_land, tax_property, tax_delinquency, tax_delinquency_year, censustractandblock

transactions

parcelid, logerror, date

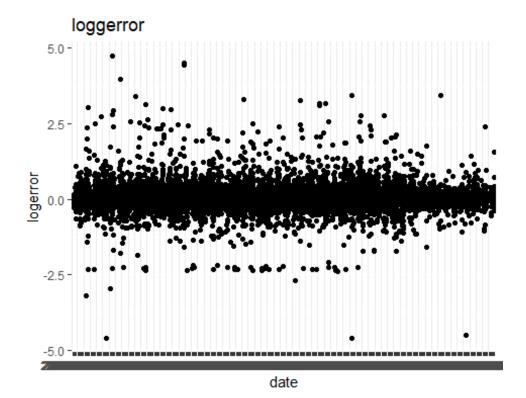
statistics of logerror in transactions

Mean: 0.0114572median: 0.006std: '0.1610788

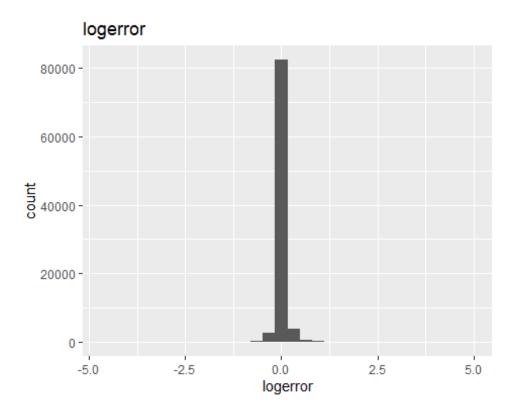
Max: 4.737Min: -4.605

Data exploration

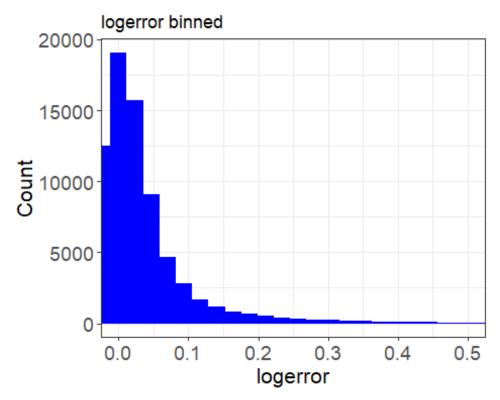
Scatter plot of logerror



histogram of logerror

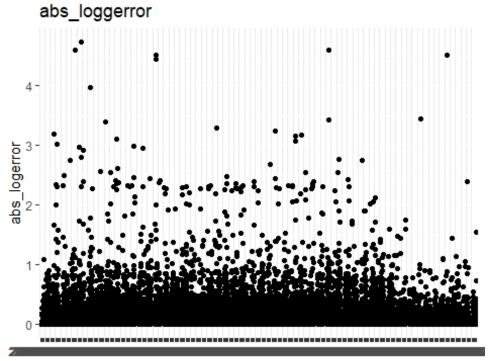


histogram of logerror binned



```
parcelid logerror
                             date year_month abs_logerror
##
## 1 11016594
                0.0276 2016-01-01 2016-01-01
                                                   0.0276
## 2 14366692 -0.1684 2016-01-01 2016-01-01
                                                   0.1684
## 3 12098116 -0.0040 2016-01-01 2016-01-01
                                                   0.0040
## 4 12643413
              0.0218 2016-01-02 2016-01-01
                                                   0.0218
## 5 14432541 -0.0050 2016-01-02 2016-01-01
                                                   0.0050
## 6 11509835 -0.2705 2016-01-02 2016-01-01
                                                   0.2705
```

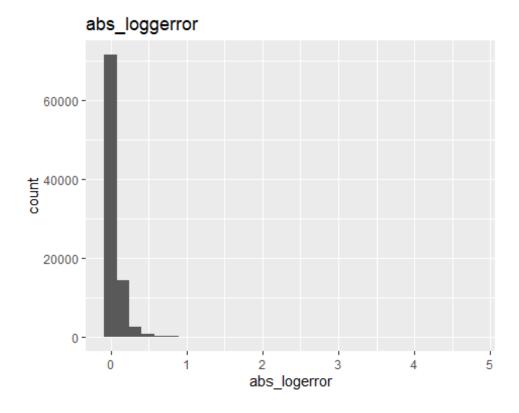
Scatter plot of abs_loggerror



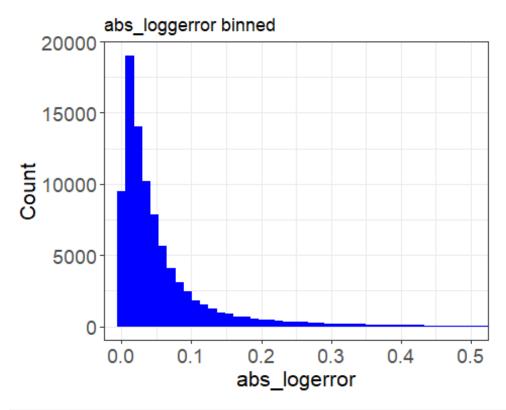
date

```
parcelid logerror
                            date year_month abs_logerror
##
## 1 11016594
               0.0276 2016-01-01 2016-01-01
                                                 0.0276
## 2 14366692 -0.1684 2016-01-01 2016-01-01
                                                 0.1684
## 3 12098116 -0.0040 2016-01-01 2016-01-01
                                                 0.0040
## 4 12643413 0.0218 2016-01-02 2016-01-01
                                                 0.0218
## 5 14432541 -0.0050 2016-01-02 2016-01-01
                                                 0.0050
## 6 11509835 -0.2705 2016-01-02 2016-01-01
                                                 0.2705
```

Histogram of abs_loggerror

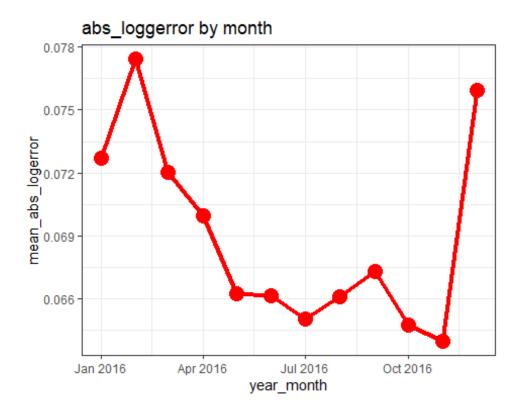


Histogram of abs_loggerror binned

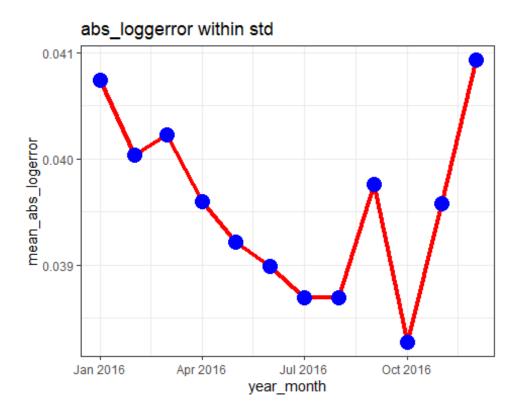


```
## geom_bar: na.rm = FALSE
## stat_bin: binwidth = NULL, bins = NULL, na.rm = FALSE, pad = FALSE
## position_stack
```

graph of abs_logerror groupped by month of year



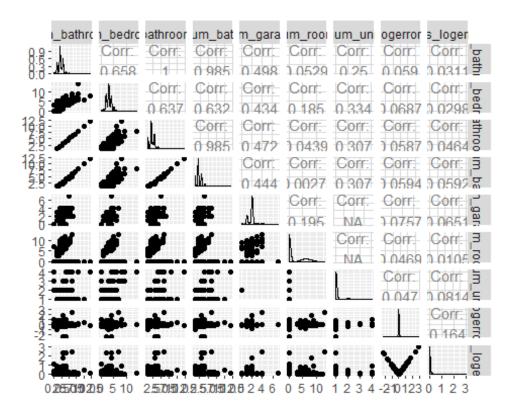
graph of abs_logerror within strandard deviation



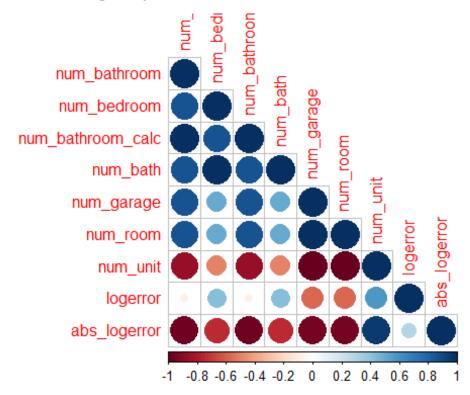
Correlations

##		num_bathr	room	num_b	edroom	num_	_bathroom_	calc	num_	bath	num_	garage	num_	room
##	1		NA		NA			NA		NA		NA		NA
##	2		NA		NA			NA		NA		NA		NA
##	3		3		2			3		3		NA		0
##	4		NA		NA			NA		NA		NA		NA
##	5		NA		NA			NA		NA		NA		NA
##	6		4		4			4		4		NA		0
##		num_unit	loge	rror	abs_log	gerro	or							
##	1	NA	0.	0276	(0.027	76							
##	2	NA	-0.	1684	(3.1 68	34							
##	3	1	-0.	0040	(0.004	10							
##	4	NA	0.	0218	(0.021	L8							
##	5	NA	-0.	0050	(0.005	50							
##	6	1	-0.	2705	(270	95							

correlation using ggpairs using a subset of data(~10%)

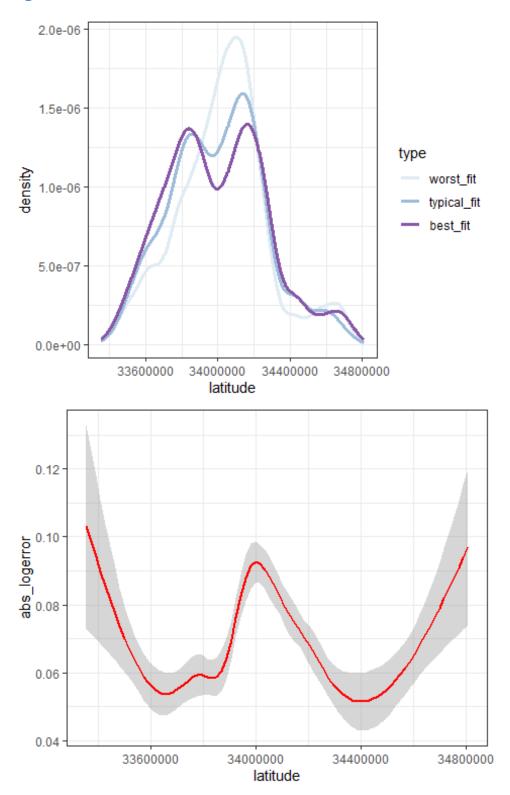


correlation using corrplot

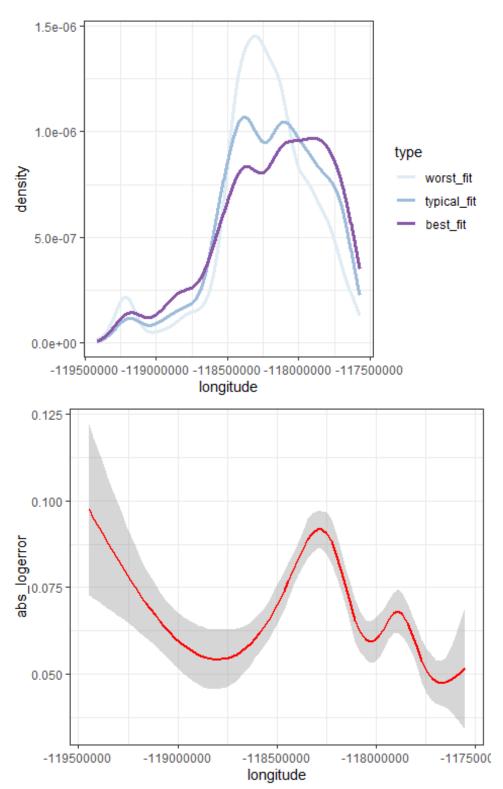


##	parcelid	logerror	date	year_month	abs_logerror	percentile
## 1	11016594	0.0276	2016-01-01	2016-01-01	0.0276	3
## 2	14366692	-0.1684	2016-01-01	2016-01-01	0.1684	5
## 3	12098116	-0.0040	2016-01-01	2016-01-01	0.0040	1
## 4	12643413	0.0218	2016-01-02	2016-01-01	0.0218	3
## 5	14432541	-0.0050	2016-01-02	2016-01-01	0.0050	1
## 6	11509835	-0.2705	2016-01-02	2016-01-01	0.2705	5

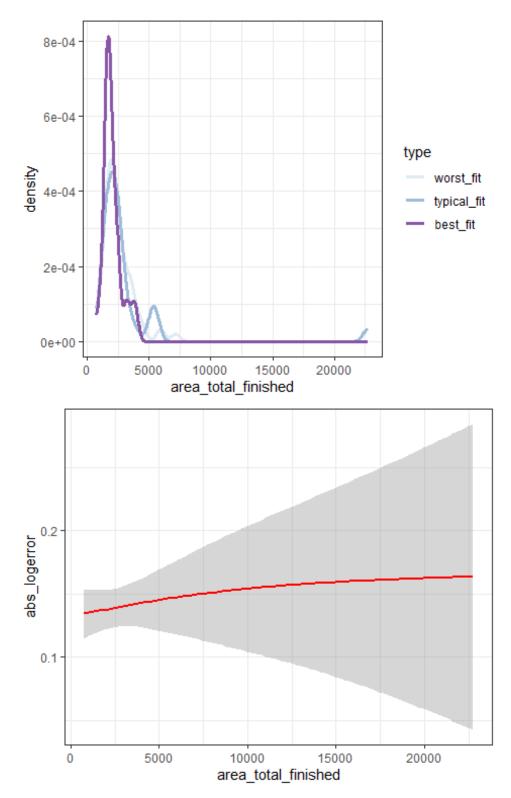
Density plot shows density of worst predicitons is lower in lower latitudes, but higher in median lattitude and lowwer around and above 34400000.



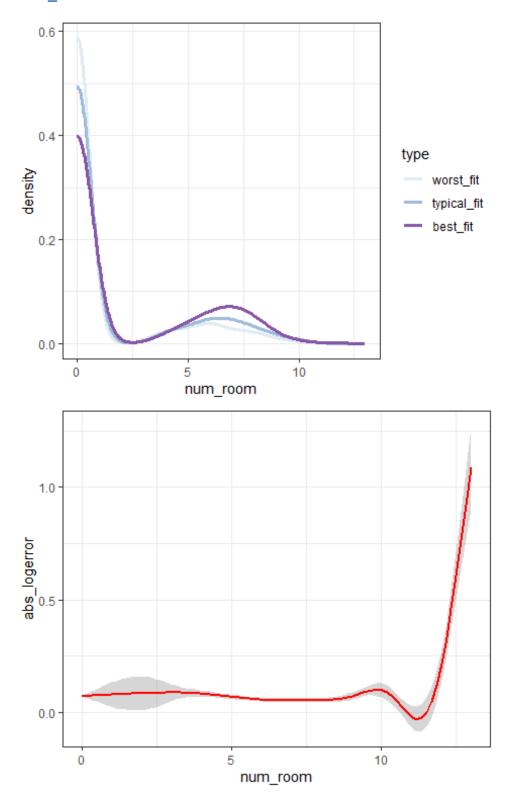
denisity of longitude. Worst predictions are in the -118500000 and -118000000



area_total_finished

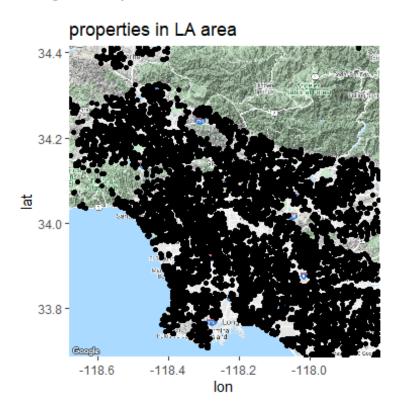


num_room

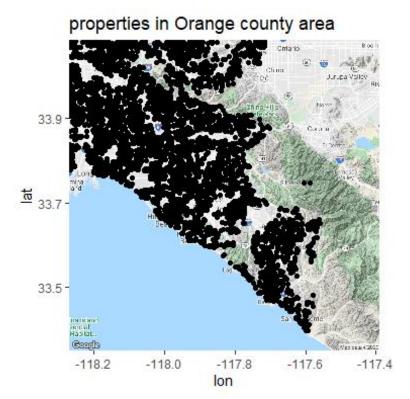


maps based on a sampling of 10000 properties

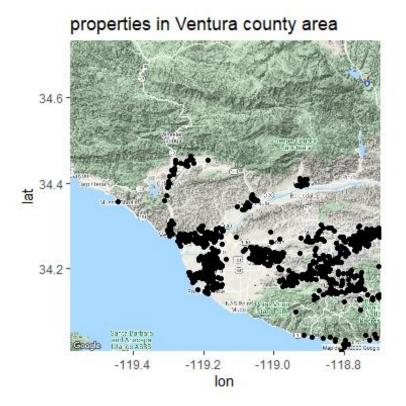
Map of Los Angels county



Map of Orange County



Map of Ventura County



Absolute log error based on location

