

MARCH 2022

Sea Level Rise and Impact on Home Prices in Coastal Florida

In the United States, 40% of the population resides in coastal counties.¹ When homebuyers shop for a house in these areas, they may receive information about the existing risk of flooding, such as whether the home is in a FEMA-designated floodplain and whether they must pay for flood insurance.² Beyond this existing flood risk, rising sea levels present major challenges for low-lying coastal areas, posing a significant long-term risk to coastal housing markets. In this Research Note, we assess whether primary homebuyers and residential market investors in coastal Florida consider the future risk of rising sea levels when making a home purchase decision and whether they pay less for homes they deem at risk.

Although the magnitude and timing of sea level rise (SLR) are uncertain, forward-looking homebuyers may perceive a property susceptible to the effects of SLR as a risky asset and reduce the amount they would be willing to pay. While demand remains strong for primary and vacation homes in coastal markets, previous studies have shown that real estate valuations take into account existing flood risk, with valuations being lower for affected homes. This is especially the case in the wake of a hurricane.³ Additionally, large share of investors look for investment or rental properties in coastal areas. Their understanding of the risk of SLR and whether they incorporate it into their purchase decisions will also affect how the housing markets in coastal areas evolve over time.

In our study, we focused on residential markets in coastal Florida, because the state has been considered at high risk from the effects of climate change.

KEY FINDINGS:

1. Homes exposed to the risk of rising seas levels are sold for less but the price discount is limited to homes also located in FEMA designated 100-year floodplains.
2. Both owner-occupied and non-owner-occupied homes are discounted in homes exposed to the risk of rising seas levels that are also located in FEMA-designated 100-year floodplains.
3. After Hurricane Irma in 2017, homes exposed to the risk of rising seas levels (both in and out of FEMA designated 100-year floodplain) were discounted significantly.*

*Homebuyers may pay less for homes damaged by hurricanes. Unfortunately, we do not have data on damages. However, we control for the condition of the house at the time of the purchase.

1 [Economics and Demographics \(noaa.gov\)](https://www.noaa.gov/economics-demographics)

2 Per NRDC ([Flood Disclosure Scorecard](https://www.nrdc.org/flood-disclosure-scorecard) | NRDC), Florida has no statutory or regulatory requirement that a seller must disclose a property's flood risk. However, flood insurance coverage is mandated if the home is on a 100-year floodplain and the mortgage is from a federally backed lender so the buyers will receive flood risk information at some point in the home buying process.

3 See Atreya et al. 2013 , Kousky 2010 , Bin and Landry 2012 for references



Low-lying and located in a tropical cyclone zone, Florida faces numerous climate hazards, including exposure to storm surge and tidal flooding. These existing natural disaster risks are exacerbated by future SLR risk.

Studies that examine the impact of SLR on home prices are limited but growing (See Appendix A1). Our study supplements previous studies in three ways:

1. Our study distinguished homes exposed to SLR risk (a measure of “future risk”) from homes located in FEMA-designated floodplains (a measure of “existing risk”).
2. Our study evaluated differences in prices for homes exposed to SLR risk across various types of homebuyers.
3. Our study tested the impact of the major 2017 Hurricane Irma on the prices of homes that are exposed to SLR risk in Florida.

It’s important to distinguish homes in SLR exposed areas from homes that further intersect with FEMA-designated 100-year floodplains. Previous studies have shown that buyers discount home prices in floodplains to offset future flood insurance premiums. Therefore, lower prices for homes located in both SLR-exposed areas and floodplains could be driven by flood insurance costs, rather than reflecting homebuyers’ understanding of future SLR risk.⁴ We expected that buyers who factor SLR risk into their decision-making would reduce the amount they are willing to pay for SLR-exposed homes, even if those homes are located outside of floodplains where flood insurance is not required. However, we did not find evidence of price discounts outside of floodplains.

Long-term SLR risk may not be affecting investors’ home purchase decisions because they hold their real estate for shorter periods.

Prices for homes exposed to SLR risk would likely vary based on buyers’ awareness of SLR risk, their risk appetite, and how long they expect to own the home. For investors, they may be more sophisticated in terms of their awareness of the future SLR risk (for example, see Bernstein et al. 2019), we expected that they may pay less for SLR-exposed homes, particularly those located outside of FEMA-designated floodplains. However, we found no evidence that investors paid less for homes exposed to SLR. Furthermore, as suggested by previous studies and our [Research Note](#) on flood risk in the wake of the 2017 hurricanes, we found that home prices were discounted in SLR-exposed areas after extreme weather events, due to heightened flood risk perception. And these discounts were not limited to homes located in FEMA-designated floodplains.

Building the Data

Our analysis combines five data sources merged at the property level:

1. Home sale prices and property characteristics from Public Records compiled by CoreLogic
2. Sea Level Rise (SLR) projections from the National Oceanic and Atmospheric Administration (NOAA);
3. Flood risk maps from FEMA using National Flood Hazard Layer (NFHL);
4. Elevation Data compiled by University of Florida Geo Planner Center; and

4 Freddie Mac requires all homes underlying single-family mortgages in our portfolio to have property insurance coverage throughout the life of the loan. For homes located in designated SFHAs, Freddie Mac also requires flood insurance coverage. Additionally, a mortgage is ineligible for sale to Freddie Mac if the mortgage is secured by property that is subject to coastal tideland, wetland or setback laws and/or regulations that prevent the rebuilding or maintenance of the property improvements if they are damaged or destroyed.



5. Coastline, highways, and school district data from Census Bureau. Appendix A.2 presents summary statistics of the data.

We start with almost 4.2 million single-family and condo/co-op sale transactions in 35 coastline counties in Florida (Appendix A.3) according to public records (see **Exhibit 1**). We include home sales from 2000 and 2020 with sale prices between \$10,000 and \$10 million (in inflation adjusted 2020 dollars). In addition to sale price and sale date, we consider additional information on several property characteristics, such as number of bedrooms, number of bathrooms, living area square footage, and year built. The data also includes information on buyer type which is discussed in detail below.

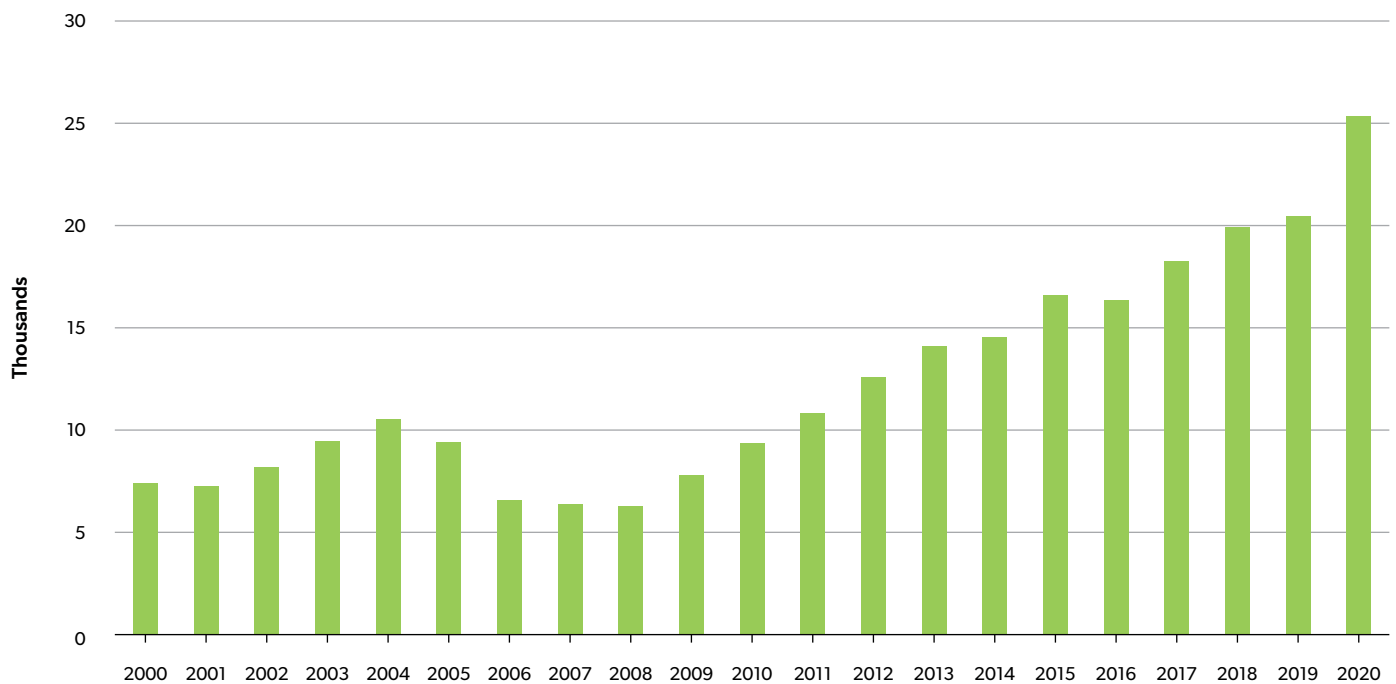
Next, for each property, we calculate the distance from the centroid of the property to the nearest coastline. We restrict our sample to transactions of properties located within a quarter mile of the coastline, since the impact of SLR decreases with increasing distance from the coastline.⁵ This restriction dropped our sample size to approximately 258,000 transactions. In this Note, we refer to these approximately 258,000 transactions as “sales of homes within a quarter mile of the coastline.” Exhibit 1 shows the sales of homes within a quarter mile of the coastline by year. Since 2000, demand for coastline properties has tripled.

Since 2000, demand for coastline properties has tripled.

EXHIBIT 1

Sales of homes within a quarter mile of the coastline by year

Roughly 258,000 of the 4.2 million homes sold in 35 coastline counties in Florida between 2000-2020 with sale prices between \$10,000 and \$10 million (in inflation adjusted 2020 dollars) are within a quarter mile of the coastline.



⁵ We restrict our sample to sales within a quarter-mile of the coast to include homes within a feasible walking distance to the coast which is a desirable attribute of coastal properties.



To determine existing flood risk for the 258,000 properties within a quarter mile of the coastline, we overlay FEMA flood maps on top of our sample and found that 56% of the sample fall in 100-year floodplains, which FEMA determines are exposed to a 1% annual chance of getting flooded. To capture the elevation of these properties relative to the sea level, we extract data from the Florida Digital Elevation Model. On average, these homes were 9.5 feet above sea level.

Understanding sea level rise risk in Florida and buyer types

Sea level rise risk in Florida

Florida, with a large population located at low elevations, is vulnerable to the impacts of SLR. There are several SLR projections under different scenarios for the state of Florida, which estimate SLR of several feet over the next few decades. For example, NOAA's intermediate high scenario predicts that under fast rise scenario the sea level will rise by 6.3 feet in Florida by the end of the century (2100). Under a scenario of low sea level rise and one major flood, the sea level in Florida is projected to rise to around 6.4 feet by 2050.⁶ In our sample, 37% of the homes in Florida within one-quarter mile of the coastline fall in the area exposed to this projected 6 feet SLR (referred to in this Note as "SLR exposed areas"). However, the SLR exposed areas are not mutually exclusive from FEMA-designated 100-year floodplains; 87% of properties in SLR exposed areas are also located in FEMA-designated 100-year floodplains (see **Exhibit 2**). FEMA floodplain designation is a measure of current risk of flooding and are determinants of flood insurance premiums under the National Flood Insurance Program (NFIP). To evaluate the price variations across different FEMA floodplains and SLR exposed areas, we divide the homes in our sample into three mutually exclusive groups:

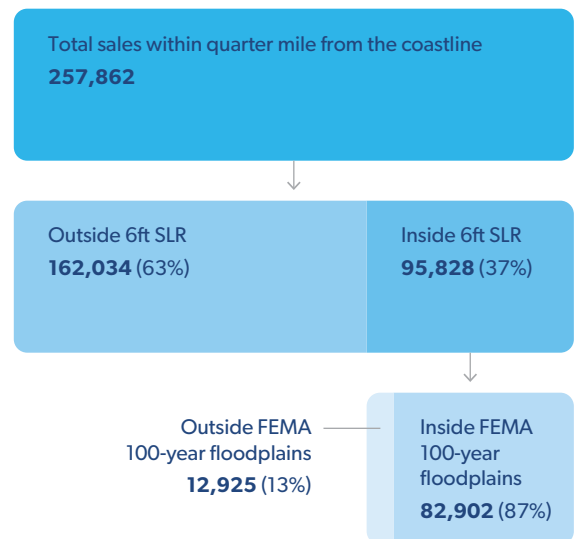
1. Inside of SLR exposed areas and FEMA-designated 100-year floodplains
2. Inside of SLR exposed areas but outside of FEMA-designated 100-year floodplains
3. Outside of SLR exposed area

In our sample, almost 13,000 homes are located in SLR exposed areas but outside of FEMA-designated 100-year floodplains. If buyers factor SLR risk into their pricing decisions, all else equal, the prices of these homes should be lower than the prices of homes outside of SLR exposed areas.

EXHIBIT 2

Total sales of homes within a quarter mile of the coastline

87% of homes in the SLR exposed areas are also located in FEMA-designated 100-year floodplains.



⁶ According to [climate central](#). Scenario details in NOAA technical report 2017, intended for the 2018 U.S. National Climate Assessment. Sea level rise is relative to 1992 baseline. We chose [fast rise](#) as sea levels are projected to rise at a faster pace than in the last 100 years.



Buyer types

Many buyers buy a home as a primary residence (owner-occupied). There are also buyers who buy a home as an investment or rental property (non-owner-occupied). Those buying an investment property can be individual investors or institutional investors. Public records data includes information on whether a unit sold is owner-occupied or non-owner occupied following the sale. For sales of homes within a quarter mile of the coastline, 33.1% were for owner- occupancy and 66.9% were for non-owner occupancy. For non-owner- occupied homes, 56.1% were purchased by individual buyers and 10.8% by institutional investors. Among the institutional investors, most were small investors (who purchase 1-9 homes per year); followed by medium investors (who purchase 10-99 homes per year). **See Exhibit 3.**

Results

We employ a hedonic regression model (details in Appendix) to gauge the effect being in the SLR exposed area has on price. The regression analysis proceeds in several steps. First, we examine the overall discount for homes located in SLR exposed areas with and without including FEMA flood risk designations. Second, we differentiate between purchases for owner-occupied and non-owner-occupied homes and run separate regressions for each buyer type to evaluate the differing price effects. Third, we test the impact of the 2017 hurricanes and determine if there is any price adjustment pre- and post-hurricanes in SLR exposed areas using a diff-in-diff regression analysis which is a widely used approach to study changes in outcomes over time (see Appendix for diff-in-diff equation used). The key findings are summarized below:

FINDING 1:

Homes located in SLR exposed areas are sold at a discount compared to observably equivalent homes outside of SLR exposed areas, but only if these homes are also located in FEMA-designated 100-year floodplains.

Our regression results suggest that homes in all SLR exposed areas, both inside and outside of a FEMA-designated 100-year floodplain and without, sell for 2.8% less than observably equivalent homes located outside of SLR exposed areas. This means that if an average priced home (\$845,000 in our sample) located

EXHIBIT 3

Investors purchased two-thirds of the homes within a quarter mile of the coastline.

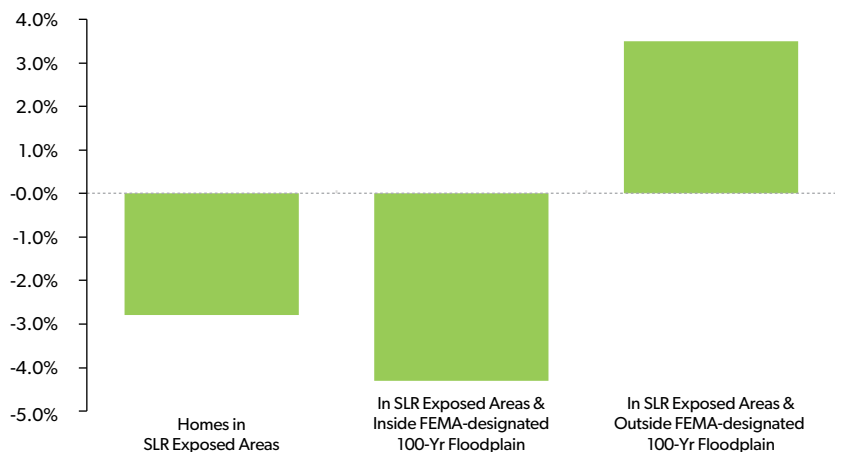
	Share	Sales
Owner occupied	33.1%	85,296
Non-owner occupied	66.9%	172,556
Individual buyer	56.1%	3,765
Institutional buyer (investor)	10.8%	27,791
Large investor (100+buys/year)	0.4%	923
Medium investor (10-99 buys/year)	2.0%	5,175
Small investor (1-9 buys/year)	8.4%	21,693

Note: We use "non-owner occupied" and "investor" interchangeably in this Note but "nonowner-occupied" may include a small share of second homes.

EXHIBIT 4

Home price discount/premium*

Homes in SLR exposed areas sold for less than homes outside of SLR exposed areas, but the price discount was limited to homes also located in FEMA-designated 100-year floodplains.



*Compared to homes located outside of SLR exposed areas, all else equal.

Note: The price discounts and premiums in the chart are based on two separate OLS regressions. In regression 1, sale price is regressed on location within SLR exposed areas, and in regression 2, sale price is regressed on the location within SLR exposed areas in and out of FEMA-designated 100-year floodplains. In both models, we accounted for observable characteristics, such as distance to coastline, views of the coast and other amenities, number of beds and baths, and distance to highways, that could also influence home prices.



within a quarter mile of the coastline is in SLR exposed areas, then the home would be sold for \$23,000 less than a home outside of SLR exposed areas. Does this negative impact on home prices mean buyers are aware of SLR risk and are pricing that risk into their purchase decision? Maybe not, and here’s why.

As reflected in Exhibit 2, most homes located in SLR exposed areas are also located in FEMA-designated 100-year floodplains where flood insurance is required. As a result, price discounts for these homes can stem from flood insurance cost being capitalized in home prices.⁷ Consistent with previous studies, we find that homes in FEMA-designated 100-year floodplains sell for 4.3% less than an equivalent home outside of SLR exposed areas. If buyers consider SLR risk, we should see a price discount for homes that are in SLR exposed areas but outside of FEMA-designated 100-year floodplains.

However, we find a price premium of 3.5% for these homes, indicating that SLR risk is *not* affecting current home prices after controlling for the amenities.

FINDING 2:

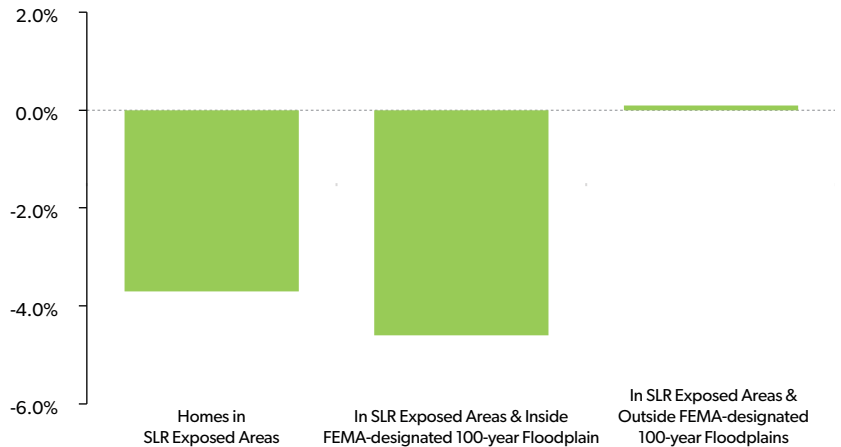
Non-owner occupiers pay less for homes in SLR exposed areas but only if the homes are also located in FEMA-designated 100-year floodplains.

Overall, non-owner occupiers, that include investors could be aware of SLR risk and could be pricing SLR risk into their purchase decisions. To test whether non-owner occupiers pay less for homes exposed to future SLR risk, we ran separate regressions for non-owner-occupied homes (includes institutional investors). Like overall results, we find that homes in SLR exposed areas that are also located in FEMA 100-year floodplains sell for 4.6% less. However, for homes outside of FEMA-designated 100-year floodplains, there was no significant difference in price paid for homes inside and outside of SLR exposed areas.⁸

EXHIBIT 5

Home price discount/premium (non-owner occupied)*

Non-owner occupiers paid less for homes located in SLR exposed areas, but the price discount was limited to homes that were also in the FEMA designated 100-year floodplain.



*Compared to homes located outside of SLR exposed areas, all else equal.

Note: The price discounts and premiums in the chart are based on two separate OLS regressions for purchases of non-owner-occupied homes. In regression 1, sale price is regressed on location within SLR exposed areas, and in regression 2, sale price is regressed on the location within SLR exposed areas in and out of FEMA-designated 100-year floodplains. In both models, we accounted for observable characteristics, such as distance to coastline, views of the coast and other amenities, number of beds and baths, and distance to highways, that could also influence home prices.

7 For example, see Bin and Landry, 2012; Kousky, 2010, Atreya et al. 2013

8 There is an insignificant difference in price variation for homes located in SLR exposed areas that are in and outside of FEMA-designated 100-year floodplains for institutional investors when separate regressions are run for those groups.



FINDING 3:

After Hurricane Irma in 2017, homes in SLR exposed areas were discounted significantly.

Several previous studies have shown that there is a price adjustment in the wake of flooding caused by hurricanes as buyers rely upon knowledge that is recent and readily available when making purchasing decisions due to the “availability heuristic” (Tversky and Kahneman 1973).⁹ Consistent with previous studies, we find a discount in SLR exposed areas, both inside and outside of FEMA-designated 100-year floodplains, following Hurricane Irma in 2017 as the flooding caused by Irma acted as a source of new information about flood risk. For example, all else equal, after Hurricane Irma, homes that were in SLR exposed areas and FEMA-designated 100-year floodplains sold for 5.4% less than homes outside of SLR exposed areas. Similarly, homes that were in SLR exposed areas but outside of FEMA-designated 100-year floodplains sold for 3.8% less. Consistent with prior studies, these discounts appear to be driven by heightened flood risk perception, rather than perceived SLR risk. Unfortunately, we do not have detailed information on whether and to what extent properties in our dataset were damaged by the flood which is a caveat of our finding that the discount is solely driven by heightened flood risk perception and not the damages to the properties.

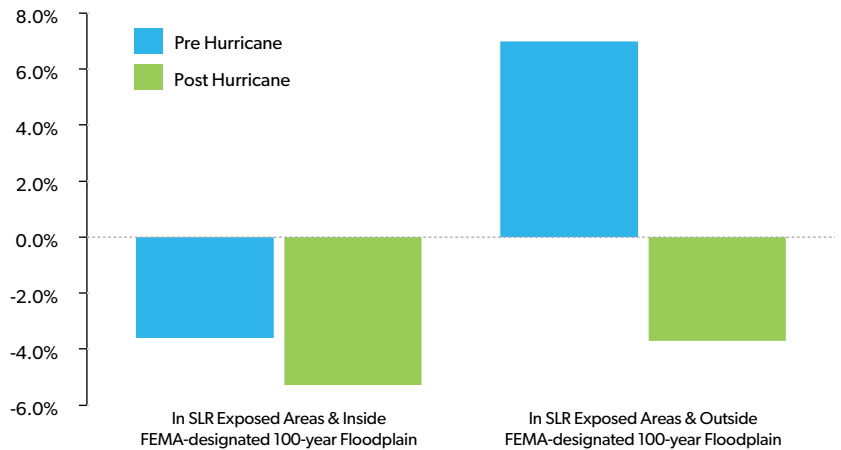
Other notable findings

In our analysis, there are a few other noteworthy findings. In terms of how much of a premium people paid for the view, we find that ocean views, golf course views, and water views (e.g., pond, bay, and lake) command a price premium of 36%, 35%, and 11%, respectively. Furthermore, we find that there is a premium for higher elevation. Homes that are at or below sea level are sold for less than homes that are above sea level. We also find that cash buyers pay 2.9% less than buyers with mortgages, and out of state buyers pay 2.5% more than local buyers.

EXHIBIT 6

Home price discount/premium before and after Hurricane Irma*

Homes in SLR exposed areas (both inside and outside of the FEMA-designated 100-year floodplains) were discounted after Hurricane Irma.



*Compared to homes located outside of SLR exposed areas, all else equal.

Note: Includes data post 2010 to include only one significant hurricane, i.e., Hurricane Irma; the post-hurricane period is October 2017 through December 2020.

9 Some previous studies include but are not limited to Bin and Landry, 2012; Kousky, 2010, Atreya et al. 2013



Conclusion

SLR risk poses long-term challenges for the housing market and adds another layer of risk to existing flood risk. However, our research shows no evidence that SLR risk is affecting current home prices. Homes in SLR-exposed areas that did have price discounts were also located in FEMA-designated 100-year floodplains, where discounts are typical because of the flood insurance requirement, rather than in consideration of future SLR risk. These findings are consistent with several previous studies which show that the discounts for homes located in 100-year floodplain as a result of flood insurance payment being capitalized into home prices.

From our analysis, we conclude either that there is a lack of awareness about SLR risk or that SLR risk may not be factored into pricing decisions because it is a long-term risk and buyers are more focused on the short-term, not intending to own the home long enough for SLR to have an effect.

The absence of price adjustments now could mean decreases in home prices later, as sea levels rise or FEMA flood maps reflect SLR. In the last couple years, home prices have increased significantly, and a 4-5% discount for homes in FEMA-designated floodplains may seem trivial at a macro level, but that can add up quickly. Especially in Florida communities where a large share of homes is in SLR-exposed areas and floodplains, this would have a significant impact on local housing markets.



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Appendix

APPENDIX A.1

Literature review

Author/Journal	Study Area	Data	Major Findings
Baldauf, Garlappi & Yannelis 2021 <i>Review of Financial Studies</i>	All U.S. sale transactions within 50km (31 miles) from coast 1997-2017	Zillow ZTRAX , SLR from NOAA / Yale Climate Opinion Map 2016 Climate	Negative (-2.8%) relationship between home prices and homes being projected as underwater due to 6ft SLR only in areas with above median climate change believers
Bernstein, Gustafson & Lewis 2019 <i>Journal of Financial Economics</i>	All coastal counties (within .25 miles from coast) 2007-2016	Zillow ZTRAX, SLR from NOAA / All property types	Approx. 7% discount in SLR projected area in non-owner-occupied housing segment
Fu & Nijman 2021 <i>The Professional Geographer</i>	Miami Dade and Pinellas (within 5000ft(0.8 mile) from coast) 2004-2019	Property appraiser office / detached SF homes	~No substantial discount for 6ft SLR; higher discounts (up to 12%) for more exposed properties (<2ft) ~Discounts higher for primary owners in Miami but higher for non-primary owners in Pinellas
Keenan, Hill & Gumber 2018 <i>Environmental Research Letters</i>	Miami Dade County 1971-2017	Single family homes	High elevation homes appreciate more than low elevation
Keys & Mulder 2020 NBER Working Paper	Coastal Florida 2001-2020	Residential properties at census tract level	From 2013-2018, home sales volumes in the most-SLR-exposed communities declined 16-20% relative to less-SLR-exposed areas, even as their sale prices grew in lockstep. Between 2018-2020, relative prices in the most-SLR exposed areas declined by roughly 5% from their peak.
Murfin & Spiegel 2019 <i>Review of Financial Studies</i>	All coastal states (within 30km of the shoreline (18 miles) 2012-2017	CoreLogic; Local tidally adjusted elevation and local RSLR trend to calculate SLR risk /single family homes and duplexes CoreLogic; Local tidally adjusted elevation and local RSLR trend to calculate SLR risk /single family homes and duplexes	No significant price effect of SLR location even within 1.68km (1.04 miles) of shoreline and 2015-2017 sample



APPENDIX A.2

Summary statistics of variables used in the analysis (within a quarter mile of the coastline)

		All	Non-Owner Occupiers
sale price 2020\$	Sale price in \$2020	\$845,750	\$ 816,304
coast_mile	Distance to coast (miles)	0.11	0.11
oceanview	Have ocean view	2.0%	2.2%
waterview	Have water view (bay, pond, lake)	1.4%	1.4%
golfview	Have golf course view	8.7%	11%
Elevation (feet)	Elevation above Sea Level Rise	9.5	9.8
hwy_dist (mile)	Distance to nearest highway (mile)	.56	0.59
cashsales	Transacted in all cash	56%	59%
oos_buyer	Out of State buyer	42%	64%
new_cons	New construction	8%	9%
con_coop	Condo/co-op	72%	74%
manuf_home	Manufactured Home	1%	1%
bdrms	Number of bedrooms	3.2	2.3
fullbath	Number of bathrooms	2.3	2.3
livingsqft	Living sq feet	1,637	1,573
pool	Have an indoor pool	11%	10%
central_heat	Have Central Heating	6%	6.9%
cons_Lux	Construction is deemed luxury	1.2%	1.1%



Methodology

We employ hedonic model which is commonly used to tease out the value of environmental amenity or disamenity using property transaction data (Equation 1 and 2). To compare the before and after hurricane Irma prices of observably equivalent homes we use a diff-in-diff framework (Equation 3). Our hedonic models take the following form:

Equation 1

$$\log(P_{it}) = \beta_o + \sum_{j=1}^J \beta_j S_{ijt} + \sum_{k=1}^K \beta_k L_{ik} + \sum_{m=1}^M \beta_m C_{im} + \sum_{p=1}^P \beta_p O_{ip} + \beta_n(\text{slr_6ft})_i + \beta_l(\text{slr}_{OFF})_i + \gamma_i + \delta_t + \varepsilon_{it}$$

Equation 2

$$\log(P_{it}) = \beta_o + \sum_{j=1}^J \beta_j S_{ij} + \sum_{k=1}^K \beta_k L_{ik} + \sum_{m=1}^M \beta_m C_{im} + \sum_{p=1}^P \beta_p O_{ip} + \beta_n(\text{slr_100yrFP})_i + \beta_l(\text{slr}_{OFF})_i + \gamma_i + \delta_t + \varepsilon_{it}$$

Equation 3

$$\begin{aligned} \log(P_{it}) = & \beta_o + \sum_{j=1}^J \beta_j S_{ij} + \sum_{k=1}^K \beta_k L_{ik} + \sum_{m=1}^M \beta_m C_{im} + \sum_{p=1}^P \beta_p O_{ip} + \beta_q(\text{PostIrma})_i + \beta_n(\text{slr_100yrFP})_i \\ & + \beta_r(\text{slr_100yrFP})_i * \text{PostIrma} + \beta_l(\text{slr}_{OFF})_i + \beta_s(\text{slr}_{OFF})_i * \text{PostIrma} + \gamma_i + \delta_t + \varepsilon_{it} \end{aligned}$$

Where,

S: Structural Attributes (# of baths, # of beds, lot size, pool availability, roof type, foundation type etc.)

L: Locational Attributes (location attributes such distance to nearest highways, view of golf course, view of waterbodies)

C: Distance to Coastline

O: Other controls such as type of home (condo co-op vs. single-family), type of sales (cash/mortgage), out of state buyer etc.

slr_6ft: Dummy=1 if Inside SLR exposed areas

slr_100yrFP: Dummy=1 if Inside SLR exposed areas & Inside FEMA-designated 100-year floodplains

slr_OFF: Inside SLR exposed areas & Outside FEMA-designated 100-year floodplains

PostIrma: Dummy=1 if the home was sold after Hurricane Irma

Y_i is the school district fixed effect and **δ_t** is the year fixed effect and **ε_{it}** is the error term



APPENDIX A.5

Results

TABLE A.5.1

OLS regression estimates

Variables – (Dependent variable = ln (sale price))	(1) Without FEMA Zones	(2) With FEMA Zones
slr_6ft	-0.028*** (0.003)	
slr_100yrFP		-0.043*** (0.003)
slr_OFF		0.035*** (0.005)
Coast_500ft (dummy=1 if within 0 to 500 feet from coast)	0.308*** (0.005)	0.307*** (0.005)
Coast_500to1Kft (dummy=1 if 500 to 1000 feet from coast)	0.116*** (0.004)	0.114*** (0.004)
Elevation (dummy=1 if below sea level)	-0.294*** (0.023)	-0.291*** (0.023)
Oceanview (dummy=1 if has ocean view)	0.363*** (0.010)	0.366*** (0.010)
Waterview (dummy=1 if has water view)	0.112*** (0.011)	0.110*** (0.011)
Golfview (dummy=1 if has gulf course view)	0.350*** (0.006)	0.349*** (0.006)
Lnhwydist (distance to highway)	0.037*** (0.001)	0.037*** (0.001)
Cashsales (dummy=1 if cash sale)	-0.029*** (0.003)	-0.029*** (0.003)
new_cons (dummy=1 if new construction)	0.030*** (0.006)	0.030*** (0.006)
con_coop (dummy=1 if condo/coop)	-0.028*** (0.007)	-0.028*** (0.007)
manuf_home (dummy=1 if manufactured homes)	-0.649*** (0.021)	-0.648*** (0.021)
oos_buyer (dummy=1 if out of state buyer)	0.025*** (0.003)	0.025*** (0.003)
Bedrooms (# of bedrooms)	0.311*** (0.011)	0.311*** (0.011)
Bedroom sq (bedrooms squared)	-0.035*** (0.001)	-0.035*** (0.001)
Full bath (# of fullbath)	0.333*** (0.008)	0.331*** (0.008)
fullbath_sq (fullbath squared)	-0.022*** (0.002)	-0.022*** (0.002)
Living sqft (total living squarefoot)	0.000*** (0.000)	0.000*** (0.000)
Livingsqft sq (total living squarefoot squared)	-0.000*** (0.000)	-0.000*** (0.000)
Pool (dummy=1 if pool available)	0.160*** (0.013)	0.160*** (0.013)
Noparking (dummy=1 if no parking)	-0.051*** (0.015)	-0.053*** (0.015)
Condition (dummy= 1 if very good /excellent)	-0.150*** (0.015)	-0.147*** (0.015)
blt_yr (built year)	0.007*** (0.000)	0.007*** (0.000)
Foundation type	-0.049* (0.026)	-0.049* (0.026)
Roofcover type	0.088*** (0.011)	0.089*** (0.011)
Central heat (dummy=1 if central heat available)	0.107*** (0.025)	0.107*** (0.025)



cons_Lux (dummy=1 if deemed luxury construction)	0.137*** (0.017)	0.138*** (0.017)
Ln (median income) at tract level	0.382*** (0.009)	0.387*** (0.009)
% Owner occupied home at tract level	-0.030** (0.015)	-0.042*** (0.015)
Constant	5.422*** (0.121)	5.382*** (0.121)
Observations	257,862	257,862
R-squared	0.594	0.595
School District FE	Yes	Yes
Year FE	Yes	Yes

Robust standard errors in parentheses

*** p<0.01, ** p<0.05, * p<0.1

TABLE A.5.2

Regression results restricting samples to non-owner occupied homes

Variables	(1) Without FEMA Zones	(2) With FEMA Zones
slr_100yrFP		-0.046*** (0.005)
slr_OFP		0.010 (0.007)
slr6ft	-0.037*** (0.004)	
Constant	5.357*** (0.148)	5.339*** (0.148)
Observations	172,566	172,566
R-squared	0.556	0.556
All other controls	Yes	Yes
School District FE	Yes	Yes
Year FE	Yes	Yes

Robust standard errors in parentheses

*** p<0.01, ** p<0.05, * p<0.1



TABLE A.5.3

Regression results showing the impact of Hurricane Irma on home prices using Diff-in-Diff framework

Variables	(1) All
slr_100yrFP	-0.036*** (0.005)
postIrma (dummy=1 if sold post Sept 2017)	-0.002 (0.010)
slr_100yrFP X PostIrma	-0.017** (0.007)
slr_OFF	0.070*** (0.008)
slr_OFF X PostIrma	-0.107*** (0.013)
Constant	5.454*** (0.151)
Observations	153,138
R-squared	0.587
All controls	Yes

Robust standard errors in parentheses

*** p<0.01, ** p<0.05, * p<0.1



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