# The Value of Time-Varying Measures of Natural Capital in Coastal Housing Markets



#### Steven J. Dundas

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#### **Appointments**

- Associate Professor, Oregon State University
  - Department of Applied Economics
  - Coastal Oregon Marine Experiment Station
- Associate Editor, *Marine Resource Economics*

#### **Research Interests**

- Non-market valuation
- Environmental policy evaluation
- Economic impacts of climate change & coastal adaptation
- Recreation demand modeling
- Optimal provision of ecosystem services
- Interdisciplinary work on coastal ecosystem services and climate change adaptation





Oregon State University Coastal Oregon Marine Experiment Station





#### Steven J. Dundas Environmental and Natural Resource Economist Funding SNCCOS NATIONAL CENTERS FOR COASTAL OCEAN SCIENCE not partment nsportation Oregon Coastal Oregon Marine Experiment Station Advisory Roles PUGETSOUND OCEAN SCIENCE TRUST PARTNERSHIP Marine Resource CIMERS OREGON epartment of and Conservation relopment

#### **Coastal Housing & Climate Change**

40% of US population lives in coastal areas

Sea-level rise and changes to storm frequency and intensity accelerate erosion concerns

\$1 trillion dollars tied up in coastal real estate

# **Coastal Housing at Risk**

## Another house collapses into the sea as this N.C. town erodes The Washington Post : March 13, 2023

After major San Clemente landslide, officials warn next storm could force more evacuations

Los Angeles Times: March 16, 2023

The homeowners struggling to save their homes from plunging off a cliff The Daily Mail: March 4, 2023

## **Climate Change & Housing**

### 30% Of Americans Cite Climate Change As A Motivator To Move In 2023

Forbes: May 17, 2023

Where U.S. house prices may be most overvalued as climate change worsens

The Washington Post: Feb. 16, 2023

# \$35 Billion Worth of Real Estate Could Be Underwater by 2050

Scientific American: Sept. 9, 2022









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Given projected climate change impacts, how can we approach coastal land-use planning to maximize ecosystem service flows from beaches & dunes?

### **Research Questions**

- How do coastal housing markets capitalize coastal landscape features on a dynamic shoreline?
- Does the type and frequency of measurement of beach width affect valuation efforts?
- What are the spatial extent and temporal stability of these capitalization effects?



NATIONAL STRATEGY

TO DEVELOP STATISTIC FOR ENVIRONMENTAL-

ECONOMIC DECISIONS

A U.S. SYSTEM OF NATURAL CAPITAL ACCOUNTING AND ASSOCIATED ENVIRONMENTAL

ECONOMIC STATISTICS



## Prior Work Valuing Beach Width (10 studies)

| Study                           | State | N     | Sample         | Beach Width  | Measured  | Proximity                   | Marginal Value                                    | \$USD Year |
|---------------------------------|-------|-------|----------------|--|---|-----------------------------|---|------------|
| Pompe & Rinehart<br>(1995)      | SC    | 385   | 1983 -<br>1991 | 32 Survey markers  | Spring 1989   | Distance ×<br>BW            | \$1,831/m (OF)<br>\$833/m (> ½ mile)              | 1983       |
| Pompe & Rinehart<br>(1999)      | SC    | 238   | 1989 -<br>1994 | 11 Survey markers  | Annual<br>(5 yr avg.)   | Distance ×<br>BW            | \$2.087/m (OF)<br>\$797/m (non-OF)                | 1989       |
| Landry et al. (2003)            | GA    | 318   | 1990 -<br>1997 | Electronic range finder<br>at 32 transects w/<br>interpolation | Spring 1997   | No                          | \$233/m   | 1996       |
| Landry & Hindsley<br>(2011)     | GA    | 372   | 1990 -<br>1999 | Electronic range finder<br>at 32 transects w/<br>interpolation | Spring 1997<br>(adjusted w/<br>erosion rates,<br>beach<br>additions &<br>anecdotes) | BW*Bins (100<br>200; 300 m) | \$421 - 487/m<br>(close); \$71 -<br>\$196/m (all) | 1999       |
| Gopalakrishnan et<br>al. (2011) | NC    | 1,555 | 2005-<br>2007  | GPS & tape measures  | n/d   | Distance ×<br>BW            | OF \$4,724/m<br>(OLS)<br>(IV: \$28,871/m)         | n/d        |

## Prior Work Valuing Beach Width (10 studies)

| Study                | State  | N                 | Sample         | Beach Width  | Measured                 | Proximity        | Marginal Value  | \$USD Year |
|----------------------|--------|-------------------|----------------|--|--------------------------|------------------|---|------------|
| Dundas (2017)        | NJ     | 4,912             | 2001 -<br>2012 | Difference from public<br>access points to USGS<br>shoreline | 2002, 2007,<br>2012      | No               | \$925/m (all)<br>- \$2,162/m (post-<br>nourishment<br>policy) | 2012       |
| Catma (2020)         | SC     | 332               | 2011 -<br>2016 | Local Monitoring Report                                      | 2007, 2016               | Distance ×<br>BW | \$9,882/m for close;<br>\$5,387/m for 300ft                   | 2016       |
| Landry et al. (2022) | NC     | 1,986             | 1997-<br>1998  | Digitizing rectified aerial photographs                      | Spring 1997,<br>1998     | Multiple         | \$7,789/m (OF);<br>\$3,363/m (< 500ft);<br>\$433/m (<2500ft)  | 1999       |
| Addicott (2022)      | NC     | 3,155             | 2008 -<br>2017 | USGS Coastal LiDAR   | n/d, one-time<br>measure | No               | \$1,283/m (OLS)<br>\$18,675/m (IV)                            | 2016       |
| Addicott (2024)*     | CT; FL | 197,940;<br>3,249 | 2004 -<br>2022 | USGS Coastal LiDAR   | n/d, one-time<br>measure | No               | \$876/m (CT)<br>\$29,446/m (FL)                               | 2017       |

#### **Prior Results**

- Beach width estimates btw \$200/m to \$30,000/m
  - 10 Studies, mostly in Southeast (2 exceptions NJ & CT)
- Dunes even less prior work
  - Landry & Hindsley (2011): GA dune width btw \$212/m & \$383/m
  - Dundas (2017): federal policy in NJ to construct dunes produced annual average benefit of \$3,229/home
  - Addicott (2022) values dune height in NC ranging from -\$47,635/m to \$23,632/m.





# **Sales Data**

- ~13,100 sales on sandy beaches within 2.5km of shoreline sold between Jan.
   2005 & Feb. 2020
- CoreLogic data for singlefamily homes determined to be arms-length transactions



# Linked Data

- Oceanfront, dune-backed, armoring eligibility indicators
- Bedrooms, bathrooms, square footage, lot size, age of home, garage indicator
- Parcel elevation & distance to UGB
- Distances from building footprint to shoreline, beach access, shoreline armoring structures
- Density of neighboring structures
- Flood & Tsunami risk zones
- Long-term erosion rates



## Housing Summary Statistics

|                                 | Mean       | S.D.       | Min       | Max          |
|---------------------------------|------------|------------|-----------|--------------|
| Sale price (\$2018)             | 399,474.74 | 221,019.33 | 65,597.07 | 1,907,631.62 |
| Footprint to USGS shoreline (m) | 730.28     | 583.91     | 21.90     | 2,497.14     |
| Bldg sq. ft.                    | 2,049.46   | 865.85     | 147.00    | 8,673.00     |
| Lot sq. ft.                     | 10,976.76  | 15,360.30  | 648.00    | 217,800.00   |
| Ocean front                     | 0.07       | 0.25       | 0.00      | 1.00         |
| G18 eligibility                 | 0.05       | 0.21       | 0.00      | 1.00         |
| Bedrooms                        | 2.85       | 0.84       | 1.00      | 10.00        |
| Baths                           | 1.99       | 0.74       | 1.00      | 21.00        |
| Age sold                        | 28.60      | 22.85      | 0.00      | 206.00       |
| Mean footprint elevation        | 95.51      | 62.85      | 13.53     | 540.83       |
| Garage                          | 0.55       | 0.50       | 0.00      | 1.00         |
| Dist, to beach access (m)       | 447.86     | 366.93     | 0.00      | 2,275.13     |
| Intersects Tsunami XXL          | 0.58       | 0.49       | 0.00      | 1.00         |
| Dist. to armoring (m)           | 1,682.12   | 3,372.25   | 0.00      | 22,182.07    |
| Dune-backed                     | 0.45       | 0.50       | 0.00      | 1.00         |
| Neighbors in radius (100m)      | 33.43      | 16.38      | 1.00      | 90.00        |
| Obs.                            | 13,140     |            |           |              |



- One time exact measure: LiDAR flight of Oregon Coast in May 2016
- Many measurements: Probabilistic Climate Emulator (TESLA) produces hourly estimates across entire sample frame 2005 – 2020
- Spatial resolution along shoreline for both ~ 50m

**Gopalakrishnan et al. 2011 (p. 298)** "Researchers may measure the beach width without error at a point in time, but it is the expected path of beach width over the life of the property that influences the sale price. The hedonic price function more appropriately would associate the value of coastal property with a measure of the average beach width at the location where the property is situated, but this average is unavailable with fine spatial detail."

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Landry et al. (2003, p. 108) "To the extent that beach conditions in previous years ('90 to '96) were significantly different from the spring of '97, the hedonic price of beach width could be biased."

Landry and Hindsley (2011, p. 94) "... note the potential for mismeasurement of the beach width effect given the limited information on beach quality and relatively longer period of sales data."



#### Probabilistic Climate Emulator

- Time-varying Emulator for Short and Long-Term Analysis (TESLA; Anderson et al. 2019)
- Generates historical time series for entire Oregon coastline and able to generate future hourly max total water level (TWL) time series





#### TESLA Beach Width: Seasonal



## TESLA Beach Width: May 2016

744 hourly measurements Range: 0m to ~50m within 1 month





- Primary specification: Match each transaction to monthly average TESLA BW, 2 month prior to closing date
  - Oregon average from bid acceptance to closing date ~6 weeks
- Alternative specifications: Compare with capitalization effects found when using single LiDAR measurement or single TESLA monthly average. Estimate single-year models to test temporally stability of estimates

## **Dune Metrics**



**Dune Height** Mean: 4.3 m; Largest: 12.9 m



| Beach &    |
|------------|
| Dune       |
| Summary    |
| Statistics |

| Mean   | S.D.  | Min  | Max  |
|--------|---|--|--|
| 66.95  | 44.10   | 0.00   | 254.25   |
| 67.42  | 43.98   | 0.02   | 258.67   |
|        |   |  |  |
|        |   |  |  |
|        |   |  |  |
| 73.16  | 45.28   | 0.39   | 264.40   |
| 107.38 | 49.18   | 9.16   | 323.87   |
| 43.75  | 23.17   | 0.00   | 177.75   |
| 4.28   | 2.77  | 0.00   | 12.89  |
| 137.76 | 150.95  | 0.00   | 793.14   |
| -0.61  | 2.00  | -6.37  | 6.17   |
| 70.13  | 62.25   | -8.95  | 524.74   |
| 13,140 |   |  |  |
|        | Mean<br>66.95<br>67.42<br>66.07<br>75.84<br>55.51<br>73.16<br>107.38<br>43.75<br>4.28<br>137.76<br>-0.61<br>70.13<br>13,140 | Mean         S.D.           66.95         44.10           67.42         43.98           66.07         43.28           75.84         46.03           55.51         39.68           75.84         45.28           75.84         45.28           107.38         49.18           43.75         23.17           4.28         2.77           137.76         150.95           -0.61         2.00           70.13         62.25           13,140 | Mean         S.D.         Min           66.95         44.10         0.00           67.42         43.98         0.02           66.07         43.28         0.02           75.84         46.03         0.21           55.51         39.68         0.00           73.16         45.28         0.30           107.38         49.18         9.16           43.75         23.17         0.00           4.28         2.77         0.00           137.76         150.95         0.00           -0.61         2.00         -6.37           70.13         62.25         -8.95           13,140 |



# Average Sales Price (2018USD): **\$399,475**

Capitalization Effect: \$1,198/m BW Capitalization Effects: \$293/m BW \*\*\* \$14,179/m DH -\$1,197/m DW BW capitalization: \$4,531/m within 50 m ~\$2,000/m @ 100 m ~\$500/m @ 250 m \$0 @ > 600 m

## **Primary Results**

|   | (1)                  | (2)                         | (3)  |
|---|----------------------|-----------------------------|--|
| Beach width (m)   | 0.003** (0.001)      | 0.003** (0.001)             | -0.001***<br>(0.000)                               |
| Beach width (m) $\times$ Beach width (m)                  | -0.000***<br>(0.000) | -0.000****<br>(0.000)       |  |
| Dune height (m)   |                      | 0.054**<br>(0.025)          | 0.052**<br>(0.022)                                 |
| Dune height sq.   |                      | -0.004**                    | -0.004**   |
| Dune width (m)  |                      | -0.003**                    | -0.003**   |
| Dune width sq.  |                      | 0.001)                      | 0.001  |
| Dune width sq.<br>Shoreline proximity (1/m) × Beach width | (m)                  | (0.001)<br>0.000<br>(0.000) | (0.001)<br>0.000=<br>(0.000)<br>0.614==<br>(0.125) |



### **Dune Estimates**



#### **Dune Height**

- At very small dune heights, an extra meter is valued @ \$21,322.
- At the mean, dune height is valued @ 14,179\$/m
- With tall dunes, dune height is valued @ 176\$/m.

#### **Dune Width**

- Disamenity -\$1,197/m
- Doesn't vary with proximity or non-linearly

#### Alternative BW Measurements

|  | (TESLA)<br>2mo prior            | (TESLA)<br>12mo prior | (TESLA)<br>Avg. 6mo prior |
|--|---------------------------------|-----------------------|---------------------------|
| Beach width (TESLA, 2mo prior)                                     | -0.001***<br>(0.000)            |                       |                           |
| Shoreline proximity (1/m) $\times$ Beach width (TESLA, 2mo prior)  | 0.614 <sup>+++</sup><br>(0.135) |                       |                           |
| Beach width (TESLA, 12mo prior)                                    |                                 | -0.001***<br>(0.000)  |                           |
| Shoreline proximity $(1/m) \times$ Beach width (TESLA, 12mo prior) |                                 | 0.630***<br>(0.130)   |                           |
| Beach width (TESLA, 6mo avg)                                       |                                 |                       | -0.001***<br>(0.000)      |
| Shoreline proximity (1/m) $\times$ Beach width (TESLA, 6mo avg)    |                                 |                       | 0.640***<br>(0.137)       |

## Alternative BW Measurement



### Alternative BW Measurement

There are two potential reasons for this difference:

- 1) Differences in estimates between the use of LiDAR compared to TESLA data is driven the nature of the data (i.e., panel v. cross-sectional)
- 2) TESLA captures the observed beach width "better" than LiDAR because even single monthly measure captures average beach width (744 hourly measurements are used to calculated the average value for May 2016) compared to a single measurement with LiDAR.

|  | TESLA     | TESLA     | LIDAR     |
|--|-----------|-----------|-----------|
|  | Time-var. | May 2016  | May 2016  |
| Beach width (TESLA, 2mo prior)                             | -0.001*** |           |           |
|  | (0.000)   |           |           |
| Shoreline proximity (1/m) × Beach width (TESLA, 2mo prior) | 0.614***  |           |           |
|  | (0.135)   |           |           |
| Beach width (TESLA, May 2016)                              |           | -0.001*** |           |
|  |           | (0.000)   |           |
| Shoreline proximity (1/m) × Beach width (TESLA, May 2016)  |           | 0.621***  |           |
|  |           | (0.129)   |           |
| Beach width (LiDAR)  |           |           | -0.001*** |
|  |           |           | (0.000)   |
| Shoreline proximity (1/m) × Beach width (LiDAR)            |           |           | 0.190**   |
| n an na ana ang ang ang ang ang ang ang                    |           |           | (0.087)   |

 Differences in estimates between the use of LiDAR compared to TESLA data is driven the nature of the data (i.e., panel v. cross-sectional) 2) TESLA captures the observed beach width "better" than LiDAR because crosssectional monthly measure captures average beach width, compared to a single measurement with LiDAR which can be sensitive to time of day/day of measurement.

#### Alternative BW Measurement

|                                 | Mean   | S.D.  | Min  | Max    |
|---------------------------------|--------|-------|------|--------|
| Beach width (TESLA May 2016, m) | 73.16  | 45.28 | 0.39 | 264.40 |
| Beach width (Lidar May 2016, m) | 107.38 | 49.18 | 9.16 | 323.87 |

#### **RECALL:**

**Gopalakrishnan et al. 2011 (p. 298)** "The hedonic price function more appropriately would associate the value of coastal property with a measure of the average beach width at the location where the property is situated."









## Testing for Direction of Bias

Proximity: 100 m from shoreline



# Testing for Direction of Bias

Proximity: 100 m from shoreline





For Oregon: Capturing within-month variation with any average BW measure is more important than matching that measure temporally to sale date. This is likely true due to small amount of inter-annual variation in BW at any given location.

|                                 | Mean  | S.D. | Min   | Max  |
|---------------------------------|-------|------|-------|------|
| Shoreline change rate 2002-2016 | -0,61 | 2,00 | -6.37 | 6.17 |

#### Summary

- Value for beach width varies with proximity to shoreline
  - ~\$4,500/m for oceanfront homes
  - Value drops to \$0 for homes > 600/m away from the beach
- Dune height is valuable to all homes within 2.5 km
- Dune width is viewed as a disamenity



### Summary

- Value for beach width fluctuates w/ volatility in housing market
  - BW not valued 2008 2010 (Great Recession housing crash)
  - Very stable 2015 2019
- Multiple measurements to represent average conditions yields higher capitalization effects
- Combining hedonics with models like TESLA enable annual estimates to contribute to natural capital accounting efforts.



## Use of Estimates

- Estimates combined with another hedonic study, 2 stated preferences surveys, & dune blue carbon field measurements to estimate protection, recreation, habitat, and carbon storage values for the landscape
- Evolve coastal landscape over time with TESLA & other models with and w/o land-use policies (e.g., beach mgmt., retreat, armoring, etc.)
- Reassess ES flows, estimate tradeoffs, & make policy recs.



