THE UNIVERSITY OF RHODE ISLAND

University of Rhode Island

DigitalCommons@URI

Environmental and Natural Resource Economics Faculty Publications Environmental and Natural Resource Economics

1-2023

A Hedonic Study of New England Dam Removals

Todd Guilfoos University of Rhode Island, guilfoos@uri.edu

Jason Walsh University of Rhode Island

Follow this and additional works at: https://digitalcommons.uri.edu/enre_facpubs

Citation/Publisher Attribution

Guilfoos, T. and J. Walsh. (2023). "A hedonic study of New England dam removals." *Ecological Economics*, 203. https://doi.org/10.1016/j.ecolecon.2022.107624

This Article is brought to you by the University of Rhode Island. It has been accepted for inclusion in Environmental and Natural Resource Economics Faculty Publications by an authorized administrator of DigitalCommons@URI. For more information, please contact digitalcommons-group@uri.edu. For permission to reuse copyrighted content, contact the author directly.

A Hedonic Study of New England Dam Removals

The University of Rhode Island Faculty have made this article openly available. Please let us know how Open Access to this research benefits you.

This is a pre-publication author manuscript of the final, published article.

Terms of Use

This article is made available under the terms and conditions applicable towards Open Access Policy Articles, as set forth in our Terms of Use.

2

3

A Hedonic Study of New England Dam Removals

Todd Guilfoos^{*} and Jason Walsh[†]

February 7, 2023

Abstract

There are over fourteen thousand dams in the New England region. Recent efforts to remove dams to return rivers back to their natural orientations in the United States have increased, though a host of potential externalities exist to nearby communities. We compile 75 removed dams in the New England region to estimate the aggregate treatment effect of dam removal on nearby properties. We employ a repeat sales sample with property fixed effects and a difference-in-differences strategy to estimate proximity effects of dam removal. We cannot reject the null hypothesis that dam removals having no effect on proximity properties.

^{*}Department of Environmental and Natural Resource Economics, University of Rhode Island, 219 Coastal Institute, 1 Greenhouse Road, Kingston, RI 02881. Email: guilfoos@uri.edu

[†]Department of Environmental and Natural Resource Economics, University of Rhode Island, 219 Coastal Institute, 1 Greenhouse Road, Kingston, RI 02881. This work is supported by the National Science Foundation EPSCoR award #IIA-1539071. We thank Leah Palm-Forster for helpful comments.

14 1 Introduction

Dams play an important role in water storage, flood protection, and hydropower 15 (Jeuland, 2020; Duflo and Pande, 2007; Kotchen et al., 2006). There are over 16 90,000 dams in the United States, and many are old, block fish passage, and no 17 longer serve their original purpose. For instance, there are many old mill dams 18 in New England that no longer provide power to mill sites. Due to their age, 19 many of these dams have fallen into disrepair causing potential hazards. Dam 20 removal can also provide significant benefits for the ecosystem by improving 21 habitat for fish and animals. While existing dams may block fish passage or 22 pose a hazard to the public, they can also play a part of the historical identity 23 or provide value for recreation to residents. The existing academic literature 24 on dam removals lacks strong evidence on how proximate properties to a dam 25 removal are affected by a dam removal and what drives these values. 26

Dam removals are complex in that their removals can impact many different 27 facets of a community. They can change recreation opportunities, community 28 identity, the natural landscape, and flood risks. When a dam removal is pro-29 posed the community may have an opportunity to voice their opinion on the 30 project in a public forum (Magilligan, 2017). Despite community input, dam 31 removals are rarely blocked by the community if the dam owner is in favor of 32 the removal and there is funding for the project. Communities that are ex-33 ploring a dam removal have expressed concern that their home values could be 34 impacted by the removal of the dam especially when there is an impoundment 35 (Born and White, 1998). Sensitivity to flood zones have been found to have a 36 significant effect on housing prices (Pope, 2008; Bin and Polasky, 2004; Gibson 37 and Mullins, 2020). Further, the change in hydrology can cause homes to lose 38 access to groundwater from a dam removal. We expect that only some of these 39 values would be capitalized into home prices (e.g. risk of flooding, groundwater 40

⁴¹ loss, value of impoundment, construction externalities, viewscape, risk of dam
⁴² failure). Our study helps clarify the extent of aggregate external impacts of
⁴³ dam removals on housing.

We estimate the impact of dam removals on housing prices in New England 44 using a repeat sales sample with property level fixed effects and a difference in 45 difference econometric identification strategy. We cannot reject the null of dam 46 removals having no effect on proximity properties. We do not find statistically 47 significant heterogeneous effects of our average treatment effect by the length 48 of dam, height of dam, or upstream or downstream location of the property. 49 Dams that are designated as high hazard dams or have impoundments may have 50 impacts, though we cannot reject the null hypothesis that these dam removals 51 change the average treatment effect of removal. Our results do inform dam 52 removal management that most properties likely do not have a significant change 53 in housing prices due to a removed dam. 54

There is a small literature on the valuation of dam removals (Provencher 55 al., 2008a; Lewis et al., 2008; Bohlen and Lewis, 2009a; Loomis, 1996). et 56 Provencher et al. (2008a) find no benefit of living upstream from a dam on 57 a basin compared to living downstream from the dam on a meandering stream. 58 They find that living proximate to, but not on, a meandering stream increases 59 property value compared to similar properties living proximate to an impound-60 ment. Lewis et al. (2008) finds a positive impact of removing dams on property 61 values. The authors argue that their study area, the Kennebec River in Maine, 62 was a highly polluted waterway until recently and the negative correlation be-63 tween proximity to water and housing values is reflective of changes in pollution 64 levels. Bohlen and Lewis (2009a) find a small premium of living next to a hydro-65 electric dam and observe a similar disamenity to living on the Penobscot river, 66 which is also a polluted waterway in Maine. Loomis (1996) finds that residents 67

are willing to pay between \$58 and \$73 to remove two dams on the Olympic Peninsula in Washington State to restore fisheries and ecosystem services in that area. We build on this literature by looking at a greater number of dam removals across the New England region.

Free flowing rivers also hold value to the public. Dam removal can return 72 a stream back into a free flowing state and allow fish passage as well as op-73 portunities for recreational fishing at that site and above stream. Bergstrom 74 and Loomis (2017) conduct a meta analysis of the valuation of river restoration. 75 They find, mostly through stated preference methods, that willingness to pay 76 is positively related to the number of miles restored. Jarrad et al. (2018) find 77 restoration projects that include permanent protection of land increase prop-78 erty values, while projects that maintain restoration temporarily or use heavy 79 machinery decrease property values. In the case of the Edwards Dam on the 80 Kennebec River in Maine, anglers are willing to spend more time to get to the 81 river and are willing to pay more for opportunities to fish the flowing river (Rob-82 bins and Lewis, 2008). Fishing and hiking can generate significant value along 83 free flowing rivers. (Getzner, 2015) study the River Mur in Styria, Austria, and 84 find visitors are willing to pay a premium to walk and hike free flowing sections 85 compared to the sections that are dammed. Null et al. (2014) and Null and 86 Lund (2006) look at the water scarce region of California's central valley. They 87 find dams used for storage are not very beneficial and gains from habitat may 88 be larger (Null et al., 2014). Bin et al. (2009) find a significant housing price 89 premium for riparian properties. 90

⁹¹ 2 Dam Removal Process

The differences in timing and process are highly variable by dam, based on the
conditions and issues faced by the particular dam. The dam removal process

is variable across states but has common elements. The process of dam re-94 moval generally includes inspection and planning, permitting, fundraising, and 95 deconstruction of the dam regardless of state. Permits must be approved from 96 the state's environmental management department, often by a state's council 97 in charge of coastal resources, and finally by the U.S. Army Corp of Engi-98 neers¹. To help communities with the dam removal process American Rivers, 99 The Executive Office of Energy and Environmental Affairs (EOEEA), the River-100 ways Program in the Department of Fish and Game, and others provide several 101 guidebooks. Here we briefly review the common elements of dam removal in 102 New England. 103

All dams must go through the federal, state, and in some cases munici-104 pal permitting process. Timing and costs associated with each permit vary 105 between dams². Dam removals must abide by the Clean Water Act (CWA) 106 and pass a series of consultations and certifications. Dam hazard status is de-107 termined through inspections; municipality or state regulations determine the 108 frequency of inspections. High hazard dams have more frequent inspections as 109 they pose a greater risk of failure without remediation. The state agency will 110 often recommend actions to address deficiencies at the dam and forward that 111 to the owner. 112

Planning and inspection involve assessment of ownership, functionality, and the state of repair the dam is in. Dams are designated by functionality: power generation, flood control, recreation, water supply or irrigation, transportation, or historical benefits. If the dam does not provide any of the services or if the

¹New Hampshire has streamlined to be housed by one department, the New Hampshire Department of Environmental Services Wetlands Bureau. ²The federal permitting process consists of multiple permits, three consultations and two

²The federal permitting process consists of multiple permits, three consultations and two certifications. To abide by the Clean Water Act (CWA), a CWA section 404 permit must be sent to the U.S. Army Corps of Engineers (Corps). In the case that the dam produces hydropower the dam owner would need to apply for surrender of the Federal Energy Regulatory Commission (FERC) license. Historic preservation officers are consulted if the dam is on the National Register of Historic Places.

dam owner would like to remove the dam, the state may designate the proposed 117 dam as a potential candidate for removal. Certain dams are extremely unlikely 118 to be removed, such as if they currently provide flood protection. The most 119 important and possibly prohibitive attribute to removing a dam is ownership. 120 If the dam owner can be identified and is not willing to participate in the 121 removal, the process will not be pursued unless the dam is under a repair or a 122 remove order. Ownership of dams can be the state, the local municipality, a 123 company, or a homeowner in close to equal parts. A review of high hazard dams 124 in Rhode Island suggests that the state, local municipalities, and private land 125 owners make up ownership of high risk dams. If the targeted dams have support 126 by the owner to be removed then permits for removal and impact assessments 127 are needed. 128

Dams targeted for removal will be assessed for the impact to the habitat 129 for endangered species or impact to infrastructure. If the dam is found to be 130 in or around such habitats, it must be closely monitored by state and federal 131 biologists as a part of the planning. As a part of the planning phase a feasibility 132 study is designed to summarize all environmental and engineering information 133 needed approve or deny the proposal for removal. The cost of feasibility studies 134 vary by dam but are generally between \$50,000 and \$250,000 American Rivers 135 (2015). Finally, the funding needs to be secured before removal is finalized. 136 Funding is often supplemented by state or federal grants as the cost of removal 137 can be significant. 138

The dam removal process may require public hearings based on the dam being removed, which is highly dam specific. Dams on historic properties are required to have public hearings by National Historic Preservation Act. Further, if the dam is in a wetland there must be a public hearings based on the Wetlands Protection Act. For large impoundments there may be requirements

to notify the municipality before a draw down occurs. After all permitting and 144 assessments are made and approved, construction can start on the project. Con-145 struction can vary in cost but is often between \$50,000 and \$500,000 American 146 Rivers (2015). Removal costs are not limited to this cost but often fall within 147 this range. The timing of construction for small dams is usually within a year. 148 The entire process can take three to five years to complete, and the construc-149 tion phase of dam removal can be a small fraction of that time. The process 150 also lacks a formal avenue to assess external costs of removal, which means that 151 nearby property owners may not be provided an opportunity to oppose or sup-152 port a dam removal, excepting for large impoundments. Further, factors that 153 relate to the process of dam removal may impact the capitalization of removal 154 in property prices, though we are unable to identify them in our study which is 155 a limitation of this study. These factors include the time to removal from when 156 the dam was first considered, changes in viewscapes, or historical importance of 157 the dam. 158

159 **3 Data**

There are 1,403 removed dams in the national American Rivers database as 160 of 2017 (American Rivers, 2017). We use removed dams in our analysis that 161 traverse our period of study, 1998 to 2016, have information on the existence 162 of an impoundment, exact coordinates, and year of removal. In addition some 163 dams have hazard designations, with high hazard being a designation that the 164 dam is in danger of failing. We compile 75 dams removed in New Hampshire, 165 Massachusetts, Rhode Island, and Connecticut. The removed dams are illus-166 trated in Figure 1. Appendix A lists the years and frequency of dam removals. 167 In almost all cases we do not have a starting date of removal and exclude hous-168 ing transactions during the year of the dam removal. Summer in New England 169

is the most realistic time for removals because Spring receives too much rain and snow thaw, Fall is more susceptible to nor'easter and hurricane storms, and Winter is too cold and the ground is frozen. The exclusion of the year of removal may exclude identifying any effect of short term disruption of construction at the dam site.

Many removed dams' attributes are not well documented. We lack precise 175 dates on the process of removal, if soil remediation was required, what type of 176 recreation is available at the dam site, and the construction material of the dam. 177 Any of these variables could play a role in the capitalization of dam removals in 178 property prices. There is only partial information on the height and length of 179 the dam before removal, though we do not exclude dams in the analysis based 180 on missing height or length information. We explore heterogeneity of results to 181 the size of the dam in the appendix. 182

We use deed and assessment data from Connecticut, Massachusetts, New 183 Hampshire, and Rhode Island to construct our property data³. Each state's data 184 is in a different format with slightly different housing attribute variables which 185 limits the availability of common attributes. We retain date sold, sale price, 186 number of bedrooms, building area in square feet, number of full bathrooms, 187 age, and lot size in acres. We also calculate the distance of a property to the 188 closest dam, the distance to the closest stream, the distance to the nearest major 189 road, and if the property is upstream of the removed dam by calculating the 190 watershed upstream of the removed dam. 191

We initially limit our housing sales to be within five kilometers of dams to look at the localized impact of dam removals. To normalize prices into 2010 dollars we use the Bureau of Labor Statistics CPI. We choose to deflate prices by the CPI as a measure of purchasing power by households. We excluded those homes with a sale price less than \$1,000 to eliminate homes not at arms length.

³This data was purchased from First American Data Tree and the Warren Group.

Once those sales were omitted we further excluded the top and bottom 5% of sales. We eliminate transactions with a living area greater than 6,000sq feet, and sold prior to ten years before the removal of the closest dam. Transactions that occur further than 10 years from a dam removal are also excluded. We retain 59,315 transactions after these procedures.

In the repeat sales sample we retain properties that sell more than once across the entire study period. A property could be only included in the period prior to dam removal if sold more than once during the pre dam removal years. The mean number of times a property sells in our sample is 2.61. 81.4% of the properties are both in the pre and post period of dam removal. The median number of times a property was sold in this sample is 2.

The benefits of a repeat sales sample with property fixed effects are that it controls for property specific unobservables that are constant over time. This method is especially useful when there is a scarcity of data on the attributes of the properties. The weaknesses of the repeat sales sample are that it reduces the sample of observations for analysis and may include systematic differences from the entire housing market sample.

To check for this systemic difference, we calculate the difference of means of variables across the repeat sales sample and the full sample shown in Table 5. Of the variables we have data for, we observe a statistical difference in lot size of approximately 0.12 acres between the two samples. We do not observe statistical difference in any other house variable means. Though we do not observe difference in our observable variables, our observed house characteristics is small and there could be differences across the samples that we do not observe.

221 3.1 Repeat Sales Comparison

In this section we compare the repeat sample of properties sold to the full sample 222 of properties sold in Table 2. Differences between the samples may indicate that 223 repeat sales differ significantly from single sales and may indicate that results 224 could be sensitive to sub-sample choices of the researcher. We investigate the 225 statistical differences in the sample by running a regression on the variable of 226 interest (each housing attribute) with a binary control for the "repeat" sample 227 and use year and census tract fixed effects. We find that lot size in the repeat 228 sample is smaller than in the full sample, but that all other variables are not 229 statistically difference between samples. 230

231 4 Methods

²³² 4.1 Model and Identification

We rely on a repeat sales sample with property level fixed effects and a Differencein-Differences (DiD) hedonic model to identify average treatment effects of dam removals on housing prices in New England. The hedonic model decomposes property prices to value attributes that are otherwise unobservable as they don't have independent markets (Rosen, 1974).

²³⁸ The difference-in-differences specification is given in equation 1.

$$P_{it} = \beta_0 + \beta_1 * Post_{it} + \beta_2 * Treat_i * Post_{it} + X'_{it}\delta + \alpha + \epsilon_{it}$$
(1)

The subscript *i* indicates property and *t* indicates time. A home within the treatment buffer is assigned a binary indicator of treatment, $Treat_{tk} = 1$. Similarly, there will be a binary variable dedicated to identify if a home was sold after a dam removal, indicated by $Post_{itk}$. β_2 is the average treatment effect of removal of a dam on a treated property. $X_i t$ is a vector of temporal controls. α are fixed effects by property. The property level fixed effects control for time invariant aspects of the property (ex. distances to city, bedrooms, basement).

DiD relies on the common trends assumption for identification and compares pre-removal to post-removal prices to identify the effect of treatment. The common trends assumption requires that treated and control home prices would follow the same trajectory in the pre-treatment period for valid inference.

We have multiple hypotheses from this identification. First, we expect that 250 the average treatment effect of removal of a dam on treated properties could be 251 either positive or negative and represent the aggregate impact of dam removals 252 on nearby properties. The negative effects may be driven by the loss of the sense 253 of place from the dam, the changing of recreation, or the loss of an impound-254 ment. Yet, positive effects may be accrued by different increased recreational 255 opportunities (like canoing or kayaking) or reduced risk of failure in some dams. 256 Some of these effects we can identify and others we are not able to. We know 257 which dams have impoundments so can specifically identify the effect of the loss 258 of impound compared to dams without an impoundment. To the extent that 259 the sense of place and recreation does not differ between dams with and without 260 an impoundment, we hypothesize the loss of an impoundment would generate a 261 negative effect on treated properties. We also know the risk designation of dams 262 (hazard designation), and can identify if high hazard dams generate a positive 263 price change on houses due to the removal of risk. We hypothesize that the 264 removal of high risk dams would generate a positive effect on treated properties 265 due to the lower risk of dam failure to nearby properties. 266

²⁶⁷ 4.2 Defining Treatment

To find the definition of treatment in our data we use a non-parametric model of distance ("bins") and the repeat sales sample to identify if and when effects dissipate with distance to a removed dam. Figure 2 shows the results a regression with distance bins at every 200 meters interacted with the binary variable 'Post' to illustrate the effect of treatment across distance from the dam. The regression used to produce this figure includes property fixed effects, year by state fixed effects, and controls for age of the property at the time of sale.

We find some evidence that treatment should be defined at 200 meters distance with a significant attenuation further than 200 meters. We define properties as treated that are closer than 200 meters in the remaining analysis.

We have selected a control group of properties between 200 meters and 500 278 meters, which reduces our preferred sample in our analysis to 1,430 property 279 sales. There are 645 individual properties in the repeat sales sample and 128 280 properties are within 200 meters of a removed dam. This sample selection was 281 282 decided based on two measures, how well the common trends assumption held and the balance of observable attributes between treatment and control proper-283 ties. The summary statistics of the repeat sales sample by treatment status is 284 provided in Table 1 to assess the appropriateness of our control group as a coun-285 terfactual. Table 1 Column 1 reports the sample of properties within 500 meters 286 of the dam site. Column 2 reports the control properties during the pretreat-287 ment period. Column 3 reports the treated properties during the pretreatment 288 period. Column 4 reports the mean differences between control and treatment 289 through a regression of each characteristic on treatment definition with controls 290 for year fixed effects and census tract fixed effects. We find some differences in 291 bedrooms and lot size between control and treatment. The differences suggest 292 that houses closer to dams are slightly smaller and have a lower base level of 293

price. As would be expected, when we expand the distance from the dam for the control group we introduce bigger differences in the observable attributes. Next, we look at the pre-treatment trends in Figure 3, which presents the residuals of the regression that only includes property by dam fixed effects and controls for housing characteristics. On visual inspection the trends of the error term in a model seem to be parallel across time in the pre-treatment time period and assumptions of parallel trends seems to hold.

301 5 DiD Results

Table 3 reports the primary coefficient of interest and interactions with treat-302 ment and pond, high hazard dams, and upstream designation. Column 1 reports 303 a model with year fixed effects. Column 2 adds an additional temporal control, 304 year trend for each dam. Column 3 uses a state by year fixed effect control. 305 Column 4 expands the sample to include properties sold once in addition to the 306 repeat sales sample and includes controls for housing attributes. Column 5 uses 307 a dam by year fixed effect. Column 6 includes an interaction with a binary if 308 the removed dam was designated as high hazard, had an impoundment, or if 309 the property was upstream of a dam, using a triple DiD framework. There is 310 a consistent negative average treatment effect of removal of a dam between 4 311 to 9%. None of the estimates are statistically significant, therefore we cannot 312 reject the null hypothesis that there is no effect of dam removal on nearby prop-313 erties. We find this to be an imprecise null finding and recognize the statistical 314 insignificance is statistically weak with a p-value of 0.187, and is lower than is 315 typically accepted as statistically significant. 316

The interaction of treatment with a binary indicator for pond post removal shows an insignificant effect larger than the average treatment effect. The direction of the coefficient is expected as the loss of an impoundment is thought to

be a loss of an amenity to home owners. A difficulty in identification of the loss 320 of impoundments is that many of the impoundments are also high hazard dams, 321 making the separation of the effect of high hazard status and impoundments 322 difficult. Seven removed dams have impoundments and six have high hazard 323 designations. Three of the dams are both high hazard and have impound-324 ments. Properties around these three dams make up approximately 80% of the 325 properties around all impoundments. We find a negative though statistically 326 insignificant effect of the dam removal on upstream properties, compared to 327 downstream properties. Hazard status has a potentially mitigating effect on the 328 negative effect of dam removal, though the estimated coefficient is statistically 329 insignificant. As expected the coefficient is positive which suggests there may 330 be a benefit of removing high hazard dams through improved safety, though it 331 is statistically insignificant. 332

We also assess the effects of size of the dam in Appendix B. We find little 333 statistical evidence that the size of the dam changes the average treatment effect 334 significantly. One concern about identification of heterogeneity based on the size 335 of the dam is that our sample of dams is smaller leading to less statistical power. 336 While we attempt to control for the size of the dams, we lack information that 337 may be relevant to recreation and other complexities of how dams relate to the 338 value we recover. So, we are hesitant to claim the exact mechanisms for the 339 change in value due to dam removal. 340

Our findings differ from other studies in the direction of effects. Other hedonic studies find weak positive effects of removal with distance to a dam removal (Bohlen and Lewis, 2009b; Lewis et al., 2008; Provencher et al., 2008b), where we find a null result with a negative sign of effects of dam removal. One concern in our result, and in the other studies, is that there is a small number of individual homes that are very close to the removed dam. Small sample sizes reduce the power in any study and investigation of proximity effects closer than
200 meters may have large effects, but those effects cannot be differentiated from
other idiosyncratic shocks to housing price changes without more observations.
We emphasize again that we cannot reject the null of there being no effect.

351 5.1 Discussion

When considering dam removal the cost benefit analysis should incorporate 352 external effects to nearby properties. The net value of a dam removal often as-353 sumes that local communities are either not affected or only the direct property 354 owner needs to be indemnified. We cannot statistically reject that there is no 355 effect on properties of a dam removal. A surprising finding is that the removal 356 of impoundments did not generate a more statistically significant negative effect 357 on communities. Perhaps the impoundments were so small it didn't really have 358 an impact on surrounding homes. 359

This study is the most expansive hedonic valuation of dam removals to date. 360 though it has some weaknesses. The extremely proximate effects reduce the 361 power of statistical inference, even with 75 removed dams. The lack of informa-362 tion about each dam removal obfuscates the exact mechanisms for any potential 363 changes in valuation due to dam removals. Better data on dam characteristics 364 are needed to address these weaknesses in a hedonic study. It is worth noting 365 that in most cases dams do not have a house within 100 meters sold over our 366 study period in our data. In this case with a small dam there is not much ev-367 idence that externalities exist for nearby homeowners in a hedonic study. The 368 lack of response to housing prices could indicate that changes in environmental 369 factors in the waterway are not capitalized in housing prices. More research is 370 required in the hedonic and dam removal literature to identify dam removal im-371 pacts to communities. Other methods, such as choice experiments, may bring to 372

³⁷³ light the specific concerns to property owners when a dam removal is proposed
³⁷⁴ and may be needed to supplement hedonic work in this area.

These findings are important for policy because of the potential externali-375 ties imposed on property owners near removed dams but lack ownership over 376 the dam. It suggests that dam removal does not produce large externalities 377 on nearby homes in aggregate. Even a null effect is important for policy as it 378 alleviates the concern that homeowners not immediately next to a dam will be 379 affected and should be compensated. It is also unclear if a bargaining solution 380 is likely to succeed in a dam removal case, putting a burden on dam removal 381 management to incorporate external costs of removal. Another important as-382 pect about hedonic studies which is policy relevant is that larger scale ecological 383 benefits are also not captured in the studies. This would include any improve-384 ments in the regional health of the ecosystem that wouldn't be capitalized into 385 housing prices. 386

We cannot say that there is no effect for homes closer than 100 meters, 387 as there are so few homes in this proximity to dams, and that in our data 388 we cannot reject the null that there is no aggregate effect. In planning dam 389 removals a broadened community involvement of the closest homes should be 390 conducted to gauge concerns that might lead to property value loss. This study 391 could be referenced in those conversations to help alleviate concerns expressed 392 by property owners. However, we do not think our results are transferable 393 to large high profile dams that offer additional amenities. Each dam removal 394 should be inspected independently. Our study should be used as a reference 395 and not as a rule when evaluating impacts of discrete dam removals. In the 396 case of high hazard dams where there is significant public risk unless some sort 397 of remediation is accomplished, removal or updating the dam, we don't find 398 evidence that loss of property prices is significant enough to weigh against the 399

400 concern of public safety.

401 6 Conclusion

Many dams in New England are aging and need to either be removed or repaired.
Our study helps to inform homeowners and policy makers how removals impact
the local communities. We find a null result and cannot statistically reject
that dam removal does not have an impact on housing prices. As dam removal
has become more prevalent across the United States, this suggests that in most
cases home price loss can assumed to be minimal for all but extremely proximate
properties to the removed dam.

We are limited in our ability to discuss all potential effects that dams have 409 based on this hedonic analysis. The benefit in this study is to systematically 410 look across many dams to understand average aggregate treatment effects over 411 New England dams where previous studies have focused on a smaller set of 412 dams or case studies. A further benefit is to alleviate concerns that homeowners 413 face large negative externalities from dam removals in close proximity of their 414 homes. As more rivers are shifting into free flowing rivers and dams are removed 415 the value of fish passage and recreational fishing may be enhanced without 416 significant effects on home owners. Larger or more urban dams may also have 417 differing proximity effects than the ones found here; as this study relies on 418 smaller dams in rural dam locations. 419

420 References

- American Rivers (2015). Removing small dams: A basic guide for project managers. https://www.americanrivers.org/wpcontent/uploads/2015/06/NatlDamProjectManagerGuide_06112015.pdf.[Accessed on 5-5-2020].
- American Rivers (2017). American rivers dam removal database. figshare.
 https://doi.org/10.6084/m9.figshare.5234068.v2. [Accessed on 2-1-2018].
- ⁴²³ Bergstrom, J. C. and J. B. Loomis (2017). Economic valuation of river restora-

tion: An analysis of the valuation literature and its uses in decision-making.
Water Resources and Economics 17, 9–19.

- Bin, O., C. E. Landry, and G. F. Meyer (2009). Riparian buffers and hedonic
 prices: a quasi-experimental analysis of residential property values in the
 neuse river basin. American Journal of Agricultural Economics 91(4), 1067–
 1079.
- Bin, O. and S. Polasky (2004). Effects of flood hazards on property values:
 evidence before and after hurricane floyd. *Land Economics* 80(4), 490–500.
- Bohlen, C. and L. Y. Lewis (2009a). Examining the economic impacts of hydropower dams on property values using gis. *Journal of Environmental Man- agement 90*, S258–S269.
- Bohlen, C. and L. Y. Lewis (2009b, jul). Examining the economic impacts of
 hydropower dams on property values using GIS. *Journal of Environmental Management 90* (SUPPL. 3), S258–S269.
- 438 Born, S. M., G. K. D. F. T. L. H.-M. N. K. M. L. and K. A. White (1998).
- 439 Socioeconomic and institutional dimensions of dam removals: The wisconsin
- 440 experience. Environmental management 22(3), 359-370.

- ⁴⁴¹ Duflo, E. and R. Pande (2007). Dams. The Quarterly Journal of Eco ⁴⁴² nomics 122(2), 601–646.
- Getzner, M. (2015, feb). Importance of Free-Flowing Rivers for Recreation:
 Case Study of the River Mur in Styria, Austria. Journal of Water Resources
 Planning and Management 141(2), 04014050.
- Gibson, M. and J. T. Mullins (2020). Climate risk and beliefs in new york
 floodplains. Journal of the Association of Environmental and Resource
 Economists 7(6), 1069–1111.
- Jarrad, M., N. R. Netusil, K. Moeltner, A. T. Morzillo, and J. A. Yeakley (2018,
 jun). Urban stream restoration projects: Do project phase, distance, and type
 affect nearby property sale prices? *Land Economics 94* (3), 368–385.
- ⁴⁵² Jeuland, M. (2020). The economics of dams. Oxford Review of Economic Pol-⁴⁵³ $icy \ 36(1), 45-68.$
- Kotchen, M. J., M. R. Moore, F. Lupi, and E. S. Rutherford (2006). Environmental constraints on hydropower: an ex post benefit-cost analysis of dam
 relicensing in michigan. *Land Economics* 82(3), 384–403.
- Lewis, L. Y., C. Bohlen, and S. Wilson (2008). Dams, dam removal, and river
 restoration: A hedonic property value analysis. *Contemporary Economic Pol- icy* 26(2), 175–186.
- Loomis, J. B. (1996). Measuring the economic benefits of removing dams and
 restoring the elwha river: results of a contingent valuation survey. Water *Resources Research* 32(2), 441–447.
- Magilligan, FJ, S. C. F. C. (2017). The social, historical, and institutional
 contingencies of dam remova. *Environmental management 59*(6), 982–994.

- Null, S. E. and J. R. Lund (2006). Reassembling hetch hetchy: Water supply without o'shaughnessy dam 1. JAWRA Journal of the American Water *Resources Association* 42(2), 395–408.
- ⁴⁶⁸ Null, S. E., J. Medellín-Azuara, A. Escriva-Bou, M. Lent, and J. R. Lund (2014).
- ⁴⁶⁹ Optimizing the dammed: Water supply losses and fish habitat gains from dam
 ⁴⁷⁰ removal in california. *Journal of Environmental Management 136*, 121–131.
- ⁴⁷¹ Pope, J. C. (2008). Do seller disclosures affect property values? buyer informa⁴⁷² tion and the hedonic model. *Land Economics* 84(4), 551–572.
- ⁴⁷³ Provencher, B., H. Sarakinos, and T. Meyer (2008a). Does small dam removal
 ⁴⁷⁴ affect local property values? an empirical analysis. *Contemporary Economic*⁴⁷⁵ *Policy 26*(2), 187–197.
- ⁴⁷⁶ Provencher, B., H. Sarakinos, and T. Meyer (2008b). Does small dam removal
 ⁴⁷⁷ affect local property values? an empirical analysis. *Contemporary Economic*⁴⁷⁸ *Policy 26*(2), 187–197.
- ⁴⁷⁹ Robbins, J. L. and L. Y. Lewis (2008, dec). Demolish it and They Will
 ⁴⁸⁰ Come: Estimating the Economic Impacts of Restoring a Recreational Fishery
 ⁴⁸¹ isup;1i/sup;. JAWRA Journal of the American Water Resources Associa⁴⁸² tion 44 (6), 1488–1499.
- Rosen, S. (1974). Hedonic prices and implicit markets: product differentiation
 in pure competition. Journal of political economy 82(1), 34–55.

485 7 Tables

	Pre-treatment				
	Full sample means 200m-500m		0-200m	Differences	
	i un sample means	20011 00011	0 200111	in means	
	(std. dev.)	(std. dev.)		(std. errors)	
Log sales price (CPI adj)	12.080	12.159	11.961	-0.124*	
	(0.508)	(0.503)	(0.495)	(0.059)	
Distance to road (feet)	$7,\!679.378$	$7,\!252.389$	$10,\!284.740$	597.700	
	(11, 518.200)	(10,678.190)	(15, 286.460)	(575.400)	
Distance to city (feet)	$14,\!183.76$	$13,\!375.010$	$19,\!184.870$	1,056.00	
	(11,039.000)	(10, 444.070)	(11, 463.420)	(630.600)	
Distance to river (feet)	730.397	683.607	1,006.347	-13.650	
	(1, 422.437)	(1, 399.349)	(1,707.867)	(112.300)	
# of bedrooms	2.801	2.883	2.408	-0.333**	
	(0.908)	(0.856)	(1.117)	(0.121)	
# of bathrooms	1.395	1.392	1.223	-0.138	
	(0.577)	(0.578)	(0.532)	(0.087)	
Lotsize (acres)	0.390	0.399	0.205	-0.158*	
	(0.614)	(0.556)	(0.416)	(0.073)	
Age	65.989	65.651	60.783	-0.896	
	(42.977)	(39.815)	(44.864)	(8.293)	
N	1,430	691	184		

Table 1: Housing variables by treatment. Log sales prices are adjusted to 2013 levels using CPI. The differences in means in column 5 are generated by regressing each housing attribute on treatment and year and census fixed effects using pretreatment data. Standard errors are clustered at the census tract level. *, **, and *** indicate significance at 5%, 1%, and 0.1%, respectively.

	Full sample means Repeat Sample means		Differences
			in means
	(std. dev.)	(std. dev.)	(std. errors)
Log sales price (CPI adj)	12.159	12.095	-0.041
	(0.013)	(0.023)	(0.032)
Distance to road (feet)	$8,\!173.213$	8,286.285	-313.600
	(287.393)	(528.034)	(254.800)
Distance to city (feet)	$13,\!220.940$	13,304.890	-84.060
	(265.790)	(474.235)	(269.700)
Distance to river (feet)	730.405	802.123	-1.553
	(36.002)	(69.322)	(43.470)
# of bedrooms	2.941	2.859	-0.084
	(0.024)	(0.041)	(0.057)
# of bathrooms	1.461	1.400	-0.046
	(0.015)	(0.025)	(0.036)
Lotsize (acres)	0.524	0.415	-0.121**
	(0.021)	(0.030)	(0.044)
Age (years)	65.353	66.304	2.579
	(1.075)	(1.900)	(2.683)
N	2,879	1,430	

Table 2: Housing Variables by Sample Selection. Log sales prices are adjusted to 2013 levels using CPI. Standard errors are clustered at the census tract level. *, **, and *** indicate significance at 5%, 1%, and 0.1%, respectively.

	(1)	(2)	(3)	(4)	(5)	(6)
PostxTreated	-0.082	-0.080	-0.098	-0.091	-0.069	-0.048
	(0.075)	(0.089)	(0.073)	(0.148)	(0.060)	(0.239)
${\it Treated xPostxUpstream}$						-0.024
						(0.219)
TreatedxPostxHazard						0.154
						(0.190)
TreatedxPostxPond						-0.134
						(0.231)
Housing Attributes	Ν	Ν	Ν	Ν	Y	Ν
Year FE	Υ	Υ	Υ	Υ	Υ	Υ
Dam FE x Year FE	Ν	Ν	Ν	Υ	Υ	Υ
Dam FE x Year Trend	Ν	Υ	Ν	Ν	Ν	Ν
State FE x Year FE	Ν	Ν	Υ	Ν	Ν	Ν
Census FE	Ν	Ν	Ν	Ν	Υ	Ν
R^2	0.855	0.863	0.869	0.922	0.740	0.929
Ν	$1,\!430$	$1,\!430$	$1,\!430$	$2,\!879$	$1,\!430$	$1,\!430$

Table 3: Repeat Sales Results. *, **,and *** indicate significance at 5%, 1%, and 0.1%, respectively. Clustered standard errors by dam are in parentheses. All columns exclude the year of removal.

	(1)	(2)	(3)	(4)
PostxTreated	-0.098	-0.083	-0.075	-0.090
	(0.073)	(0.067)	(0.080)	(0.094)
State FE x Year FE	Y	Y	Y	Y
R^2	0.869	0.883	0.887	0.918
N	$1,\!430$	$1,\!178$	1,338	$1,\!099$

Table 4: Robustness Results. *, **, and *** indicate significance at 5%, 1%, and 0.1%, respectively. Robust standard errors are in parentheses. All columns exclude the year of removal and the year prior to removal. Columns 1 is our baseline result. Column 2 restricts repeat sales to less than four per property. Column 3 restricts repeat sales in the same year. Column 4 restricts repeat sales to be at least three years apart.

486 8 Figures



Figure 1: New England dams used in the analysis. Stars indicate the location of removed dams.



Figure 2: Non-parametric Distance to Removed Dam. This specification includes the repeat sales model with year FE and year trend by dam FE. 95% confidence intervals reported.



Figure 3: The error term for homes within 200m and homes within 200m and 500m of a removed dam over time. The error term is calculated from a model with only Year by Dam fixed effects.

Year Removed	# of Dams
1994	1
1995	1
1999	4
2000	1
2001	1
2002	2
2003	2
2004	2
2005	3
2006	3
2007	1
2008	4
2009	8
2010	10
2011	6
2012	13
2013	1
2014	7
2015	5

Table 5: Years the Dams Were Removed.

488 B Heterogeneity of Result

To assess any heterogeneity of our main result by the characteristics of the 489 dams. Table 6 reports the baseline result of average treatment effect in Col-490 umn 1. Column 2 interacts treatment with dam length. Column 3 interacts 491 treatment with dam height, Column 4 interacts treatment with both height and 492 length, and Column 5 uses the full sample of housing and not just the repeat 493 sales sample. The results suggest there are not statistically significant effects of 494 heterogeneity on the average treatment effects. The results become more impre-495 cise as we lose power as we must drop dams without information on dam length 496 and dam height. The direction of the coefficients suggest that larger dams have 497 larger effects on property prices, which is consistent with our intuition, but the 498 coefficients are statistically insignificant. 499

	(1)	(2)	(3)	(4)	(5)
PostxTreated	-0.098	0.077	0.083	0.022	-0.125
	(0.073)	(0.299)	(0.257)	(0.235)	(0.087)
DamHPostTreat	· /	-0.020	· · · ·		· · · ·
		(0.020)			
DamLPostTreat		· · · ·	-0.001		
			(0.001)		
DamSizePostTreat				-0.000	0.000
				(0.000)	(0.000)
Property FE	Y	Y	Y	Y	Ν
State FE x Year FE	Υ	Υ	Υ	Υ	Υ
Cenus FE	Ν	Ν	Ν	Ν	Υ
Housing Controls	Ν	Ν	Ν	Ν	Υ
R^2	0.869	0.890	0.901	0.901	0.659
N	$1,\!430$	816	741	735	1578

Table 6: Heterogeneity Results. *, **, and *** indicate significance at 5%, 1%, and 0.1%, respectively. Robust standard errors are in parentheses. All columns exclude the year of removal. Columns 1 is our baseline result. Column 2 includes an interaction with dam height and treatment. Column 3 includes an interaction with dam length and treatment. Column 4 includes an interaction with dam length, and treatment. Column 5 uses the full sample with controls for housing attributes.