

Avoided Deforestation

A CLIMATE MITIGATION OPPORTUNITY
IN NEW ENGLAND AND NEW YORK

CLARK
UNIVERSITY





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WE ARE IN THE MIDST OF A CLIMATE CRISIS. A steadily increasing excess of carbon dioxide and other greenhouse gases in the Earth's atmosphere, predominantly from fossil fuel use by humans, is driving rapid changes in the global climate system. To avoid catastrophic climate change, it is imperative that we bring atmospheric carbon dioxide levels back down to below 350 parts per million (ppm), yet in 2021, the amount of carbon dioxide in the atmosphere topped 420 ppm.



The most important way to address this climate crisis is to reduce greenhouse gas emissions to zero, principally by switching from fossil fuels to low-carbon alternatives such as renewable energies. Avoiding carbon emissions from deforestation is important as well. However emissions reductions alone will not be enough. We also need to remove excess carbon dioxide from the atmosphere with negative emissions technologies, several of which are provided by nature. Protecting and expanding the carbon stored in forests belongs to a suite of “natural climate solutions” — defined as protecting, restoring, and better managing forests, grasslands, farms and wetlands to reduce and remove carbon emissions and safeguard the climate system.

Deforestation — primarily for residential, commercial and infrastructural development — is a major threat to forests in the northeastern United States. Unlike many other threats to our forests, deforestation is almost always permanent. Deforestation is a direct source of carbon emissions, releasing the carbon stored in trees and roots into the atmosphere as carbon dioxide. It also negates one of the best tools we have for drawing carbon dioxide back out of the atmosphere (forest carbon sequestration). Thus, **slowing the pace of forest loss (avoiding deforestation) is an important instrument in the fight against climate change.**

The size of the avoided deforestation opportunity and its spatial distribution had previously been poorly quantified. This study fills that gap with detailed spatial analysis (30 m resolution) that shows where forests have been lost in recent decades, and the carbon impacts of that loss. We found that the states of **New England and New York are releasing 4.9 million metric tons of CO₂ equivalent into the atmosphere each year due to forest loss. And they are losing out on 1.2 million metric tons of CO₂ equivalent in carbon sequestration** each year due to that loss. This reduces the region's intact forest carbon sink by about 10%, or amounts to about 2% of the region's CO₂e emissions from fossil fuel combustion across all sectors in 2018 (EPA 2020).

In this report you will find detailed descriptions of the methods used, regional maps, and tables and summaries at the state level (informed by multiple meetings with state agency staff throughout the study). The data are free and available on the web (see links in the report) or by contacting the study's authors. Our intent is to deliver actionable information that can assist states with greenhouse gas emissions and removals inventories, as well as with actions that avoid deforestation as a possible component of climate mitigation. The details of forest carbon stocks and sequestration and of forest loss vary by state, but the necessary conclusions do not. **Every state stands to gain by reducing their rate of deforestation, and those benefits compound over time.**



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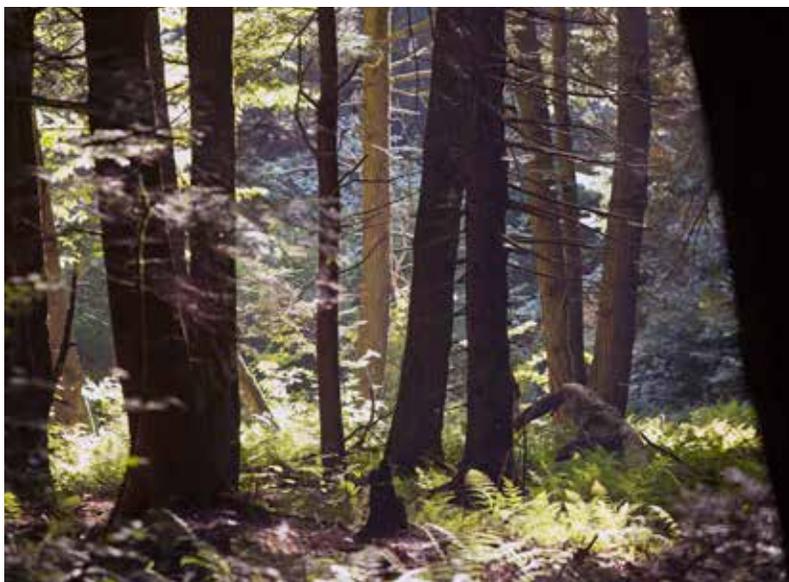
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INTRODUCTION

This study quantifies the climate mitigation that could be achieved by avoiding deforestation in seven states across the northeastern US. Forest losses to development, agriculture and other land uses release carbon to the atmosphere, contributing to greenhouse gas emissions and associated climate change. These forest to non-forest conversions also halt carbon sequestration that would have occurred if the forests had remained intact. Slowing the rate of forest loss presents a climate mitigation opportunity that is of interest to states in the region, and states are interested in more detailed quantification of this opportunity. This study aims to fill that gap by documenting the locations of forest loss in recent decades, assessing the associated carbon emissions and foregone carbon sequestration, and providing summaries at state and county levels along with statewide maps at a 30 m resolution. The intent is to provide actionable information that can inform the general public, and assist states with greenhouse gas emissions and removals inventories as well as with plans to explore avoided deforestation as a possible component of climate mitigation initiatives.



METHODOLOGY

In this study we estimate the *potential emissions* that would occur if areas of present-day forest were to be converted to non-forest, as well as the *actual emissions* associated with forested areas that were converted to non-forest during the 1990s and the 2000s. Also, we estimate the *potential foregone carbon sequestration* that would be lost if forestlands were to be converted in the future, as well as the *actual foregone carbon sequestration* associated with areas of deforestation in the 1990s and 2000s. The combination of greenhouse gas emissions that are avoided, and potential foregone carbon sequestration that is maintained, when deforestation is prevented is referred to here as the *climate mitigation opportunity*.

A number of spatially explicit datasets of land cover and forest carbon were developed for this study. Methods are described in detail below. Section 2.1 explains the combination of satellite and field plot data sets used to map **forest cover**, and to estimate forest **carbon stocks**. Section 2.2 details the equations that estimate the **carbon emissions** caused by conversion of a given forest. Section 2.3 explains how **wood products** were considered since some of the wood from land clearing for conversion is used in long-lived wood products. Section 2.4 covers the amount of **potential carbon sequestration**, or the carbon stock added each year that the forest remains forest and continues to grow without a natural disturbance or harvest. Section 2.5 shows how **actual forest conversion** was mapped using satellite data from two different points in time to look for forested areas that were converted to non-forest and stayed non-forest for at least a decade. Finally, Section 2.6 details the **cost per metric ton of carbon dioxide** if avoided deforestation is used as a climate mitigation strategy.

2.1 Forest Carbon Stocks

We use our National Forest Carbon Monitoring System (NFCMS) 30-m resolution dataset, published on Oak Ridge National Laboratory DAAC (<https://doi.org/10.3334/ORNLDAAC/1829>) (Williams et al. 2012, Williams et al. 2014, Gu et al. 2016, Gu et al. 2019a, Gu et al. 2019b, Williams et al. 2021b), as a base for estimating forest carbon stocks in 2010, and for any specific year from 1990 to 2010 for which a particular forest tract was marked as having been converted to non-forest. The NFCMS is a comprehensive dataset of pixel-level carbon stocks and fluxes derived from a combination of an inventory-constrained carbon cycle model, satellite-based aboveground biomass, satellite-based forest disturbance mapping, and a set of ancillary datasets characterizing additional forest attributes.

The essence of the NFCMS methodology involves training an ecosystem carbon cycle model, the Carnegie-Ames-Stanford Approach model (CASA, (Potter et al. 1993, Randerson et al. 1996)), to match forest biomass yield curves sampled from the Forest Inventory and Analysis (FIA) database to produce a suite of curves characterizing forest carbon stocks and fluxes with stand age that are uniquely defined for a range of forest type group and site productivity conditions. We then apply these curves to assign forest carbon values for each 30m pixel based on the pixel's attributes, most importantly forest type and stand age. An illustrative example of resulting curves is provided in Figure 1.

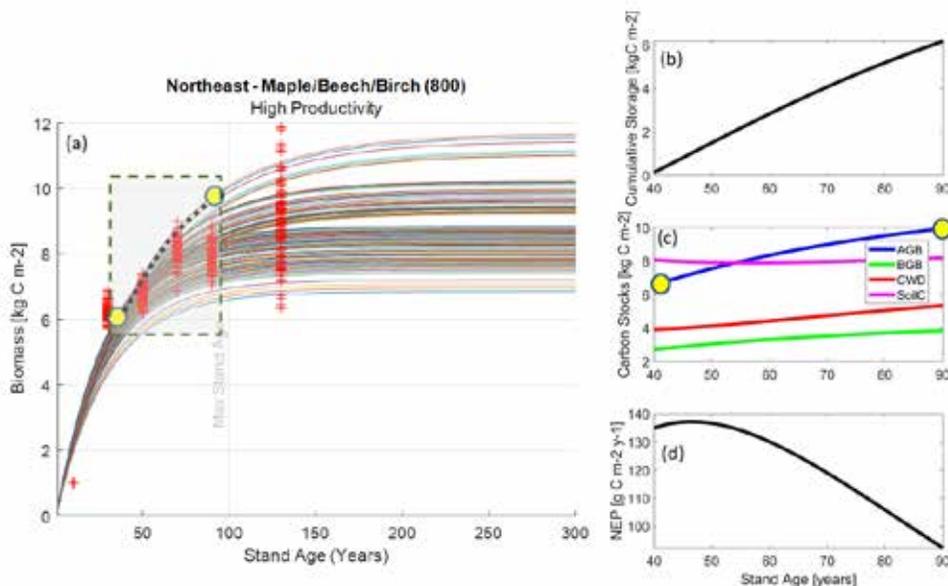


FIGURE 1. Carbon stocks with stand age shown for high productivity stands of the Maple / Beech / Birch forest type group in the northeastern U.S. shown with: (a) individual curves of stand-level aboveground biomass from the NFCMS trained to match statistical samples of FIA data (red plus signs); (b) cumulative carbon storage from 40 to 90 years; (c) carbon stock changes from 40 to 90 years for aboveground biomass (AGB), belowground biomass (BGB), coarse woody debris (CWD), and total soil carbon (SoilC); and (d) annual net ecosystem productivity (NEP) from 40 to 90 years with positive values representing net uptake of carbon from the atmosphere.

We assign forest type to pixels with a USFS dataset (Ruefenacht et al. 2008). We determine each pixel's stand age in the year 2000 with a look-up of the pixel's biomass indexed into the biomass versus stand age yield curve for the pixel's forest type and site productivity class. We define the pixel's biomass in 2000 with the National Biomass Carbon Dataset (NBCD) of Kellndorfer et al. (2013). We increment stand age backwards or forwards in time to represent any year from 1990 to 2010. We reset stand age to one year for all pixels identified as experiencing a stand-replacing disturbance in a given year from 1986 to 2010 according to the North American Forest Dynamics dataset (NAFD, (Goward et al. 2015b), (Zhao et al. 2018)). We also use NAFD to define forest areal extent at the 30 m pixel level. The forest conversion losses described in this work, as well as the results from our grow-only scenarios that are described in section 2.4, provide extensions to our published NFCMS datasets. Forest carbon stocks of present-day forests, as well as stocks expected by 2050 under a grow-only scenario, can be explored at the 30 m resolution in the interactive web-mapping interface of The Nature Conservancy's Resilient Land Mapping Tool (<http://maps.tnc.org/resilientland/>).

2.2 Emissions from Forest to Non-Forest Conversion

We estimate total carbon emissions that resulted from forest conversions that occurred from 1990 to 2010 conversion events, and the emissions that would result from conversion of lands that were forested in 2010 with the following procedure. Put into words, the amount of carbon emitted from forest conversion is composed of (1) a portion of the aboveground biomass carbon in the forest, which varies based on what percentage of the wood from land clearing is turned into wood products (and how long those products last) and what percentage of the wood is immediately emitted through decay or burning, plus (2) an estimate of the remaining carbon pools (belowground wood, coarse woody debris (downed trees), fine roots, and leaves and leaf litter), which are assumed to decay entirely within 20 years of forest loss. Estimates account for emissions from aboveground woody biomass carbon (AGB) removed from a forest stand as wood products (“removals”), emissions from all other AGB and belowground woody biomass carbon (BGB) that is not part of the wood product removals, and emissions from decomposition (or burning) of coarse woody debris (CWD – both above and below ground), fine roots (FR), and foliar plus litter carbon (L) within forestlands according to the following equation:

$$F_{CO_2e} = AGB * f_r * EF_{wp} + [AGB * (1 - f_r) + BGB + CWD + FR + L] * EF_{non-wp} \quad (1)$$

We assume that all of the biomass carbon not removed for wood products, plus all of the site’s coarse woody debris, root and litter carbon is emitted to the atmosphere as CO₂ within 20 years of conversion ($EF_{non-wp} = 100\%$). We assume that mineral soil carbon is not vulnerable to prompt emission as a result of forest to non-forest conversion, consistent with reports of equivocal findings for conversions to residential lands (Milesi et al. 2005, Campbell et al. 2014). We estimate the fraction of woody biomass removed for wood products (f_r , averaging 72% for hardwoods to about 74% for softwoods) for each specific forest type group using data from the USFS Timber Product Output (TPO) online database (USDA 2012).

We estimate the proportion (EF_{wp}) of biomass removals that is emitted from the wood products stream over time with methods detailed below (see section 2.3). This proportion varies by forest type as described in the timber products output tables of the US Forest Service combined with the WOODCARB2 model of the US Forest Service. We estimate the fraction emitted within 40 years as CO_{2e}, including accounting for the chemical nature of the emissions as either CO₂ or CH₄, and using a 100-year global warming potential (GWP-100) for CH₄ equal to 28 times that of CO₂ (Myhre et al. 2013). This corresponds to the timeframe of committed emissions commonly used in studies of the carbon consequences of land conversion.

Using equation 1 as above, emissions from forestlands are calculated for each pixel individually according to the ecosystem’s pre-conversion carbon pools (i.e. carbon stocks). For actual conversions detected with satellite data products, emissions from all pixels converted in the same decade are reported in a single map, i.e. emissions from forestlands converted from 1990 to 1999 are reported on the 1990s maps, emissions from forestlands converted from 2000 to 2009 are reported on the 2000s map, etc., regardless of the year of conversion within the decade. This approach estimates the actual emissions for each pixel accumulated for 40 years post-conversion, as described below, regardless of when that conversion occurred within the decadal interval. For emissions from potential future conversions, year 2010 carbon stocks are used as the baseline.

2.3 Emissions from Wood Harvested During Conversion

To calculate carbon emissions from biomass removals during conversion, we use the NFCMS-adapted version of the US Forest Service WOODCARB2 model (Skog 2008). This model tracks the fate of harvest removals with associated emissions for a range of wood products and including emissions that occur when wood products are discarded and enter the waste stream. A detailed description of the adapted version can be found in supplements of both Zhou et al. (2021) and Gu et al. (2019a). Briefly, we use data from the USDA Forest Service Timber Product Output (TPO) online database (USDA 2012) to estimate the forest-type-specific proportion of wood entering each Harvested Wood Product (HWP) category. For each year after harvest, the model uses exponential decay functions, with half-lives specific to each HWP category, to calculate the proportion of wood that remains in use. Portions no longer in use are either burned, composted or discarded in Solid Waste Disposal Sites (SWDS). Some of the carbon entering SWDS is stored indefinitely and some is decomposed and released to the atmosphere as either carbon dioxide (CO₂) or methane (CH₄). To account for methane, we use CO_{2e} units with a standard 100-years global warming potential of 28 (Myhre et al. 2013). We use WOODCARB2’s default assumption

that half of landfill emissions are released as methane. The disposition and fate of harvest removals varies by forest type as seen in Table 1, unfolds over time as seen in Table 2, and yields carbon storage distributions and cumulative emissions as characterized in Table 3.

TABLE 1. Percent of all NAFD disturbances in the northeast by forest type, as well as the initial (year 1) disposition of harvest removals into harvested wood products of various types, or emitted to the atmosphere from different processes as reported by the USFS Timber Products Output.

| | All Forests | Maple / Beech / Birch | Oak / Hickory | Spruce / Fir |
|---|-------------|-----------------------------|------------------|-----------------|
| Percent of all disturbance by forest type | 100 | 47 | 35 | 10 |
| Removals stored in HWPs (%) | | | | |
| Construction | 29 | 22 | 36 | 40 |
| Other wood uses | 14 | 11 | 16 | 17 |
| Paper | 19 | 24 | 7 | 28 |
| Wood in SWDS | 1 | 1 | 1 | 1 |
| Paper in SWDS | 4 | 5 | 1 | 5 |
| Total removals stored in HWPs (%) | 66 | 62 | 61 | 91 |
| Removals emitted to the atmosphere (%) | | | | |
| Burning | 33.5 | 36.9 | 38.5 | 7.8 |
| Composting | 0.7 | 0.9 | 0.4 | 1.1 |
| CO ₂ from Solid Waste Disposal Sites | 0.1 | 0.1 | 0.0 | 0.1 |
| CH ₄ from Solid Waste Disposal Sites | 0.0 | 0.1 | 0.0 | 0.1 |
| Total removals emitted to the atmosphere (%) | 34 | 38 | 39 | 9 |

TABLE 2. Fate of harvest removals over time including storage in harvested wood products (HWPs) and emissions to the atmosphere expressed as percent of total harvest removals. Results are from the average across all forest types weighted by their respective material contributions.

| | Years after harvest | | | | |
|---|---------------------|-----------|-----------|-----------|-----------|
| | 1 | 10 | 30 | 50 | 100 |
| Percent of removals stored in HWPs | | | | | |
| Construction | 29 | 25 | 19 | 15 | 9 |
| Other wood uses | 14 | 8 | 3 | 2 | 0 |
| Paper | 19 | 2 | 0 | 0 | 0 |
| Wood in SWDS | 1 | 8 | 15 | 18 | 21 |
| Paper in SWDS | 4 | 12 | 9 | 7 | 7 |
| Total of all HWPs | 66 | 54 | 46 | 42 | 37 |
| Percent of removals released in accumulated flux | | | | | |
| Burning & Composting | 34 | 43 | 46 | 48 | 50 |
| C fluxes from SWDS | 0 | 3 | 8 | 10 | 14 |
| Cumulative release of carbon to the atmosphere | 34 | 46 | 54 | 58 | 63 |

TABLE 3. Illustrative example of pre- and post-conversion carbon stocks and cumulative emissions to the atmosphere for a representative case in the northeastern U.S., including stocks and emissions within forests and within the wood products sector and reporting emissions in units of carbon mass and in CO₂ equivalents. The example assumes that 72% of aboveground biomass is removed from the forest and delivered to the wood products stream.

| | pre- conversion | Year 1 | Year 30 | Year 100 |
|---|--------------------|-------------|-------------|-------------|
| Forest Stocks [kg C m⁻²] | | | | |
| Aboveground Biomass Carbon (AGB) | 8.00 | | | |
| Other Forest Carbon (BGB + CWD + FR + L) | 7.92 | | | |
| Forest Cumulative Emissions [kg C m⁻²] | | | | |
| Aboveground Biomass Carbon (AGB) | | | 2.24 | 2.24 |
| Other Forest Carbon (BGB + CWD + FR + L) | | | 7.92 | 7.92 |
| HWP Stocks [kg C m⁻²] | | | | |
| AGB Removals | | 5.76 | | |
| Removals stored in HWPs [kg C m⁻²] | | | | |
| Construction | | 1.67 | 1.09 | 0.50 |
| Other wood uses | | 0.81 | 0.17 | 0.02 |
| Paper | | 1.09 | 0.00 | 0.00 |
| Wood in SWDS | | 0.06 | 0.86 | 1.22 |
| Paper in SWDS | | 0.23 | 0.52 | 0.38 |
| Total removals stored in HWPs | | 3.80 | 2.65 | 2.12 |
| HWP Cumulative Emissions | | | | |
| Removals emitted to the atmosphere C units [kg C m⁻²] | | | | |
| Burning & Composting | | 1.97 | 2.67 | 2.86 |
| C as CO ₂ from Solid Waste Disposal Sites | | 0.01 | 0.22 | 0.39 |
| C as CH ₄ from Solid Waste Disposal Sites | | 0.00 | 0.22 | 0.39 |
| Total removals emitted to the atmosphere | | 1.98 | 3.12 | 3.64 |
| Removals emitted to the atmosphere CO₂e units [kg CO₂e m⁻²] | | | | |
| Burning & Composting | | 7.22 | 9.80 | 10.49 |
| CO ₂ from Solid Waste Disposal Sites | | 0.02 | 0.81 | 1.43 |
| CH ₄ from Solid Waste Disposal Sites | | 0.00 | 8.27 | 14.58 |
| Total removals emitted to the atmosphere | | 7.24 | 18.88 | 26.50 |
| Total Emissions | | | | |
| Total Cumulative Emissions C units [kg C m ⁻²] | | | 13.25 | 13.80 |
| Total Cumulative Emissions CO ₂ e units [kg CO ₂ e m ⁻²] | | | 28.96 | 36.66 |

Though forest conversions are year-specific events, the resulting committed emissions legacy occurs over decades to centuries. We report the accumulated emission occurring within 40 years after conversion to represent the emissions impact of a conversion event that occurred within a given decade. This 40 year time horizon is long enough to capture the majority of emissions while being short enough to be relevant for climate and land use policies. When summarizing emissions over areas larger than a single pixel, we report the accumulated emissions over 40 years from conversions that occurred within a given decade, and averaged over years within that decade. Materially, the accumulated emissions represent the difference between the forest carbon in aboveground biomass that was removed as harvest during conversion and the proportion that remains stored either in long-term use as a wood product (e.g. in construction) or in solid waste disposal sites, while also accounting for the chemical nature of emissions as CO₂ or CH₄ and reported as CO₂e.

2.4 Foregone Carbon Sequestration

We estimate the carbon sequestration that would occur within 40 years in the absence of forest conversion assuming sustained forest growth and maturation consistent with the FIA yield curves. This “grow-only” scenario represents forest maturation in the absence of a stand-replacing disturbance during the 40 year timeframe, thus being free of forest harvest, forest conversion or a major natural disturbance from severe pest or pathogen attack. We base this on our group’s prior work that quantified the net ecosystem productivity and associated carbon storage for forestlands as they vary with a range of stand-level attributes, principally forest type group, site productivity class, and stand age. As described above, the technique first identifies carbon release or uptake as a function of stand age for a wide range of forest types unique to different regions of the US based on forest inventory and analysis (FIA) data combined with a carbon cycle model. We then map carbon stocks to forestlands at a 30 m resolution based on maps of forest type, and stand-level biomass and disturbance histories which are used together to approximate stand age. This well-published method (Williams et al. 2012, Gu et al. 2016, Williams et al. 2016, Gu et al. 2019a, Zhou et al. 2021) is applied here to estimate forest carbon stock accumulation with ensuing forest growth and maturation at an average rate representative for each forest type group and productivity class setting.



We estimate the potential foregone carbon sequestration for all present-day forestlands (forested in 2010) by calculating the difference between the current forest carbon stocks and the carbon stocks expected after 40 years. This quantifies the carbon uptake that would be lost, or foregone, if present-day forestland was to be converted accumulated over 40 years. Results of grow-only sequestration can be explored at the 30 m resolution in the interactive web-mapping interface of the TNC Resilient Land Mapping Tool (<http://maps.tnc.org/resilientland/>).

We estimate the foregone carbon sequestration for each location of actual forest to non-forest conversion during the 1990s and 2000s by calculating the difference between the total ecosystem carbon stocks prior to conversion and the total ecosystem carbon that the forest would have had 40 years later if the forest conversion had not occurred. The difference between the stocks 40 years after conversion and those pre-conversion quantifies the potential carbon sequestration that would occur with sustained forest growth and maturation. For sites of actual forest conversion, results for all pixels converted in the same decade are reported in a single dataset.

2.5 Mapping of Forest Conversions

We mapped areas of actual forest conversion with a forest disturbance data product filtered to retain only those pixels that persist as non-forest according to the 2016 NLCD (Homer et al. 2020), and restricted to select non-forest land cover classes that most confidently represent lasting forest loss (deforestation). We adopted the widely-used North American Forest Dynamics (NAFD, (Goward et al. 2015a, Zhao et al. 2018)) forest disturbance dataset to identify forested pixels that experienced a stand-replacing disturbance in a given year. The NAFD dataset reports annual forest disturbance and regrowth dynamics from 1986 to 2010 for the conterminous US at a 30 m resolution. It is based on a vegetation change detection algorithm applied to Landsat spectral data (Huang et al. 2009a, Huang et al. 2009b, Huang et al. 2010).



For forest pixels marked with a disturbance in NAFD either in the 1990s (1990 to 1999) or in the 2000s (2000 to 2009), we found the corresponding land cover class in the 2016 NLCD. We considered deforested pixels to be those with a NLCD land cover class of “developed” (NLCD classes 21-24) or “cultivated crops” (NLCD class 82). Restricting the deforestation mapping to only those areas classified as developed or agricultural leads to a conservative, and more confident mapping of forest conversions resulting from human action with a persistent, non-forest land cover. Results for other non-forest classes were recorded as well, such as pasture, grassland, shrubland, wetland, water or bare land, however we did not consider such cases to involve permanent conversion because they often involve either land cover class confusion (e.g. classification algorithms trained on Landsat spectral data often confuse forests with wetlands or woody wetlands) or ensuing forest regrowth (e.g. the land cover mapped for post-harvest forest regrowth often appears as pasture, grassland, savanna or shrubland for several years after harvest). Excluding apparent forest losses to these other classes is important in areas with an active forest harvest industry where disturbed forests often return to forest with ensuing regrowth over decades but that may appear in a satellite-based land cover classification dataset as a non-forest class for the intervening years. Careful filtering in this way is especially important for the most recent disturbances in the record because even when forests regrow after harvest clearing, it can take several years to even a decade for a land cover classification dataset to mark it as returning to forest.

2.6 Cost per Tonne of Mitigation

We estimate the cost of per tonne (metric ton) of CO₂e mitigation with a ratio of land values and the potential climate mitigation (emissions plus foregone sequestration) of avoided deforestation. We adopt the land values dataset of Nolte (2020), representing the cost of purchasing land for conservation interventions based upon the fair market value for all lands determined from analysis of 6 million actual land sales of properties greater than 1 acre from 2000 to 2019 across the contiguous United States. The computation is simply land cost per area divided by potential climate mitigation per area. We note that this analysis was outside the original grant scope and is presented as a courtesy to states, at their request, but may benefit from additional analysis and refinement.



RESULTS AND DISCUSSION

3.1 Findings in This Study

States in the region saw a combined forest loss averaging about 9,500 hectares (23,500 acres) per year in the early 2000s, committing 6 million metric tons of CO₂e to the atmosphere each year (Table 4). Foregone sequestration contributed about 20% of the total carbon burden from avoided deforestation, with the remainder (80%) contributed by carbon emissions. We emphasize in this section the results for the 2000s, being the more recent of the two decadal intervals that are studied, but note that results from the 1990s are very similar in magnitude.

Forest losses are most densely concentrated around urban centers and their suburban sprawl fronts (Figure 2). However, losses are widely spread, including across exurban landscapes where forests tend to have higher biomass (Figure 3) leading to larger CO₂e emissions impacts (Figure 4). Foregone sequestration is larger in areas with younger, lower biomass forests (Figure 5). However, the largest CO₂e mitigation opportunities are in areas with higher, present-day biomass (Figures 6 and 7). Carbon stocks are generally higher in older forests, while the amount of carbon stock added in a given year is higher in younger forests (see growth curves in Figure 1).

The CO₂e impact of forest conversions equates to 3% to 28% of the statewide carbon sequestration occurring within forestlands remaining forestlands (Table 5). Variation across states is related more to the proportion of forestland being converted than to the magnitude of carbon sequestration within forestlands.

The CO₂e impact of forest conversions equates to 9% to 151% of the harvested wood products emissions resulting from state-wide forest harvesting (Table 5). Variation across states is related to both the amount of forest harvesting in each state and the amount of forest conversion. We note that the emissions from harvest removals extracted in a particular state do not necessarily occur within that state given the way harvested materials and wood products cross state lines in response to the locations of mills, markets, and even landfills.

The CO₂e impact of forest conversions equates to about 2% of region-wide fossil fuel emissions across all sectors (Table 5), but is as high as 7% in Maine and 5% in New Hampshire.

The cost per ton of CO₂e associated with purchasing forestland to avoid deforestation varies widely (Figure 8), and is largely driven by the cost of land.

We note that our maps of potential emissions, potential foregone sequestration, and the cost of mitigation show results for the entire landscape, and that they do not account for things like protected lands or other lands that may not be at risk of deforestation.

State-specific summaries are provided in Appendix A.

TABLE 4. Carbon emissions, foregone carbon sequestration, and total carbon opportunity from avoided deforestation as well as the area of forest converted to developed or agricultural lands by state in the 1990s and 2000s. Emissions and foregone sequestration include 40 years of committed emissions or lost removals resulting from a single year of forestland conversion, including emissions from solid waste disposal sites.

| | Carbon Emissions | | Foregone Sequestration | | Total Opportunity | | Area Converted | |
|-----|----------------------------------|-------|----------------------------------|-------|----------------------------------|-------|----------------|-------|
| | [MMT CO ₂ e per year] | | [MMT CO ₂ e per year] | | [MMT CO ₂ e per year] | | [ha per year] | |
| | 1990s | 2000s | 1990s | 2000s | 1990s | 2000s | 1990s | 2000s |
| ME | 0.80 | 0.91 | 0.19 | 0.20 | 0.99 | 1.11 | 1,700 | 1,873 |
| NH | 0.46 | 0.59 | 0.10 | 0.12 | 0.56 | 0.71 | 825 | 1,041 |
| VT | 0.14 | 0.15 | 0.03 | 0.03 | 0.16 | 0.18 | 237 | 252 |
| NY | 1.67 | 1.70 | 0.42 | 0.42 | 2.09 | 2.12 | 3,180 | 3,227 |
| MA | 0.99 | 1.05 | 0.26 | 0.26 | 1.25 | 1.31 | 2,023 | 2,074 |
| CT | 0.35 | 0.42 | 0.08 | 0.09 | 0.43 | 0.51 | 675 | 782 |
| RI | 0.11 | 0.11 | 0.03 | 0.03 | 0.14 | 0.15 | 229 | 239 |
| All | 4.52 | 4.94 | 1.11 | 1.15 | 5.62 | 6.08 | 8,869 | 9,490 |

TABLE 5. State-level assessment of forest area, annual average disturbed or converted area, carbon stocks and carbon fluxes representative of the 2000s. Estimates are drawn from the NFCMS platform which serves as the base for this study, augmented by this study's estimation of the area and emissions associated with forest to non-forest conversions. Cumulative HWP emissions from total harvest and from conversion-derived harvest have the same assumptions regarding wood products fates and include the same 40 year time horizon.

| Area [thousands of hectares] | | | | | | | | |
|---|---------|---------|---------|---------|---------|---------|-------|----------|
| Forestland* | 7,469.9 | 2,141.8 | 2,004.1 | 8,825.0 | 1,631.0 | 1,005.5 | 199.2 | 23,276.5 |
| Annual Disturbed Forest* | 808.0 | 144.3 | 55.9 | 307.1 | 75.4 | 36.7 | 1.0 | 1,428.4 |
| Annual Conversion to Agri. or Devel. # | 1.9 | 1.0 | 0.2 | 3.2 | 2.1 | 0.8 | 0.2 | 9.4 |
| C Stocks in Forests [MMT C] | | | | | | | | |
| Live Biomass† | 558 | 215 | 201 | 851 | 164 | 103 | 18 | 2,110 |
| Forest Carbon† | 1,399 | 496 | 477 | 2,030 | 361 | 220 | 39 | 5,022 |
| C Fluxes [MMT CO ₂ e per year] | | | | | | | | |
| Carbon Sequestration in Forestlands† | -16.0 | -5.2 | -5.3 | -25.0 | -4.6 | -3.1 | -0.7 | -59.9 |
| Harvest Removals from Forests† | 11.0 | 2.4 | 0.9 | 4.4 | 0.9 | 0.5 | 0.1 | 20.2 |
| Harvest HWP Cumulative Emissions† | 11.8 | 2.5 | 1.0 | 4.7 | 0.9 | 0.4 | 0.1 | 21.4 |
| Conversion Cumulative Burden# | 1.1 | 0.7 | 0.2 | 2.1 | 1.3 | 0.5 | 0.2 | 6.1 |
| Fossil Fuel Emissions All Sectors§ | 15.3 | 14.5 | 6.2 | 172.2 | 64.7 | 38.2 | 11.7 | 322.8 |
| C Flux Ratios | | | | | | | | |
| Conversion Burden / C Sequestration | 7% | 14% | 3% | 8% | 28% | 16% | 22% | 10% |
| Conversion Burden / Harvest Emissions | 9% | 28% | 18% | 45% | 151% | 116% | 136% | 10% |
| Conversion Burden / Fossil Fuel Emissions | 7% | 5% | 3% | 1% | 2% | 1% | 1% | 28% |

Sources: *NAFD; †NFCMS; #this study; §EPA (2020) for the year 2018

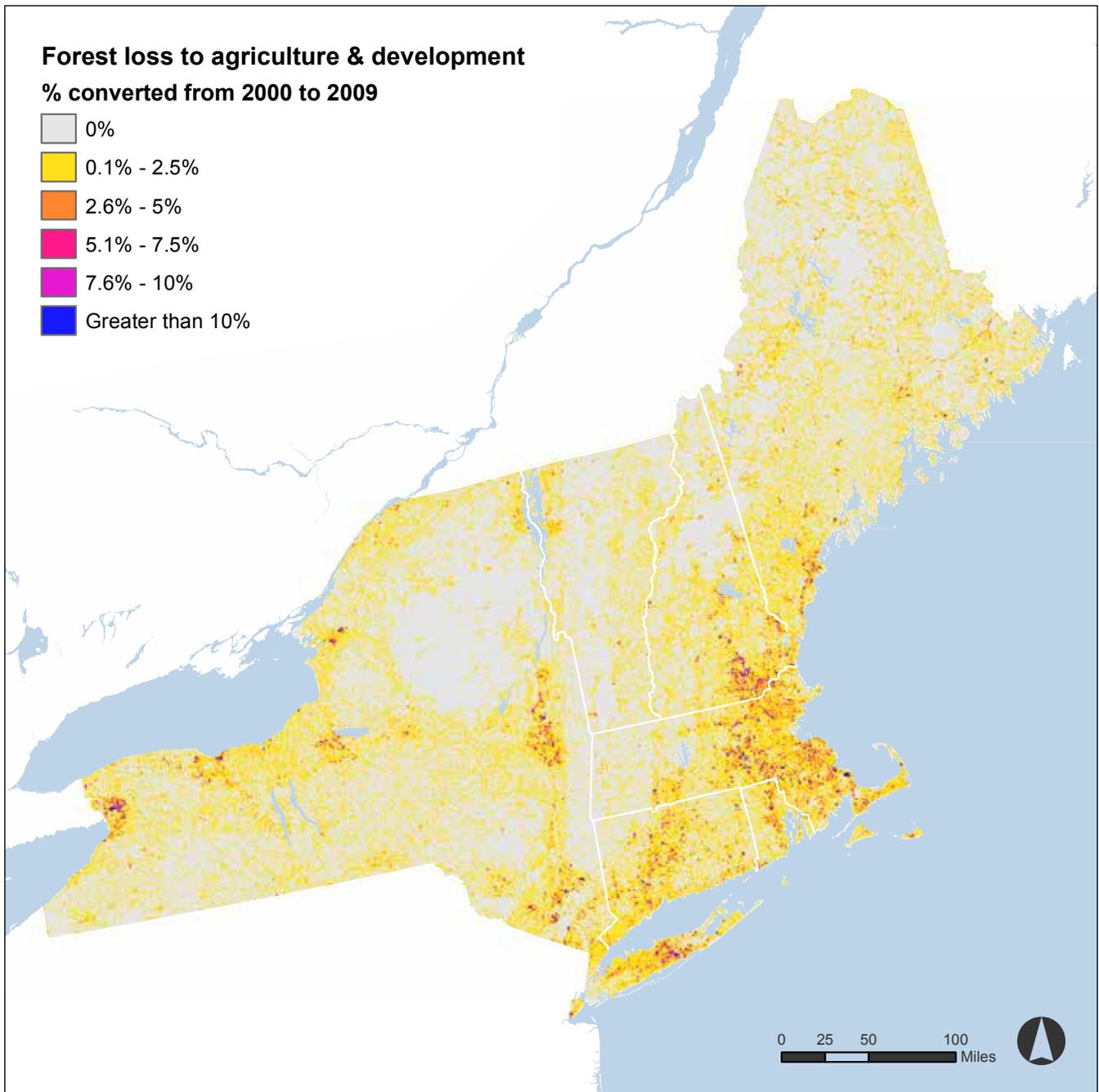


FIGURE 2. Forest loss to agriculture and development from 2000 to 2009 within 990 m x 990 m pixels as percent of total forest in 1999.

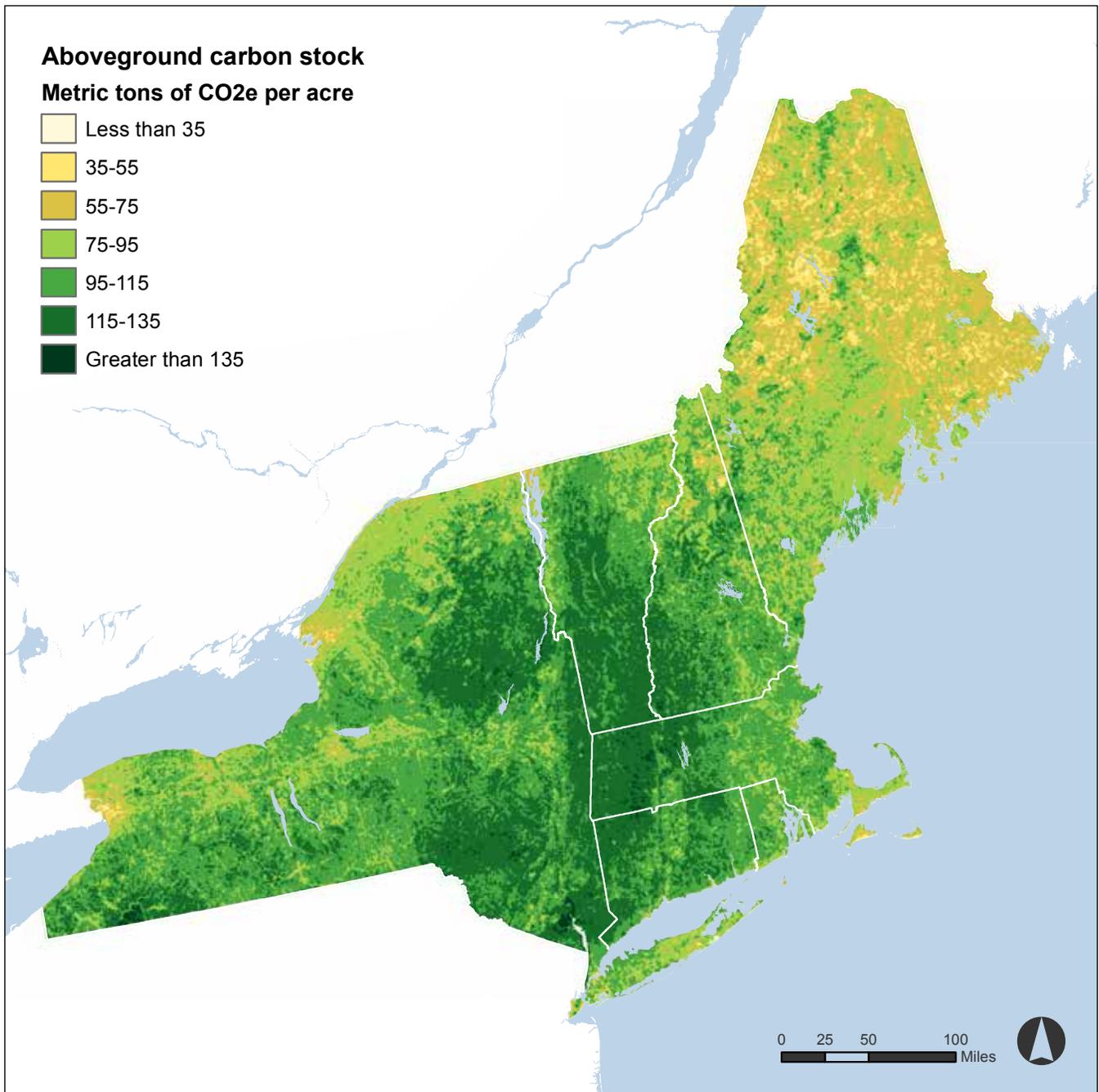


FIGURE 3. Above ground carbon stocks, expressed in metric tons of CO₂e per acre, smoothed from the original dataset with focal statistics that average over a 1 km x 1 km block. The highest value in the original, 30 m resolution map is 210 metric tons of CO₂e per acre.

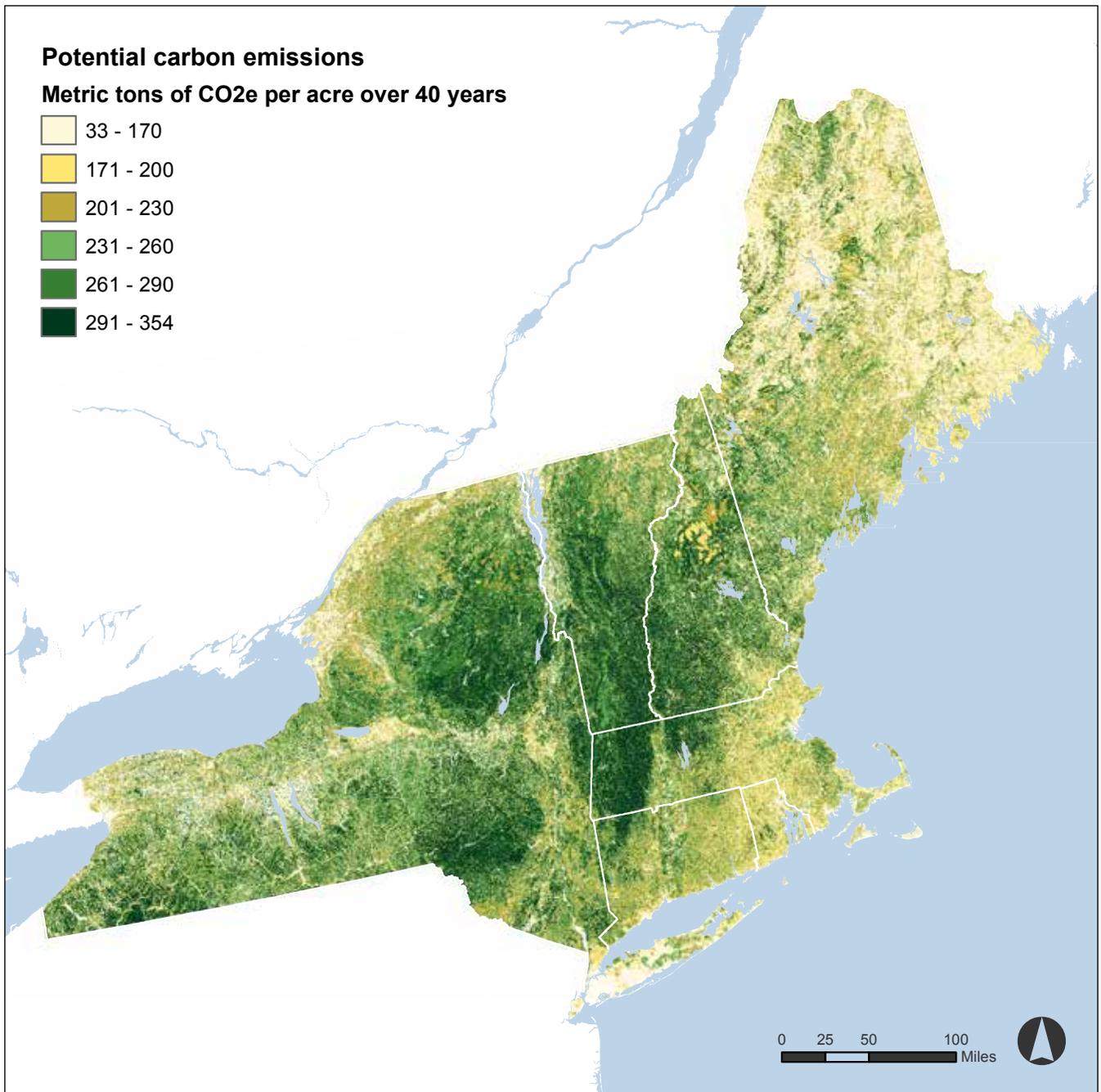


FIGURE 4. Potential CO₂e emissions from forest to non-forest conversion of present-day forestland.

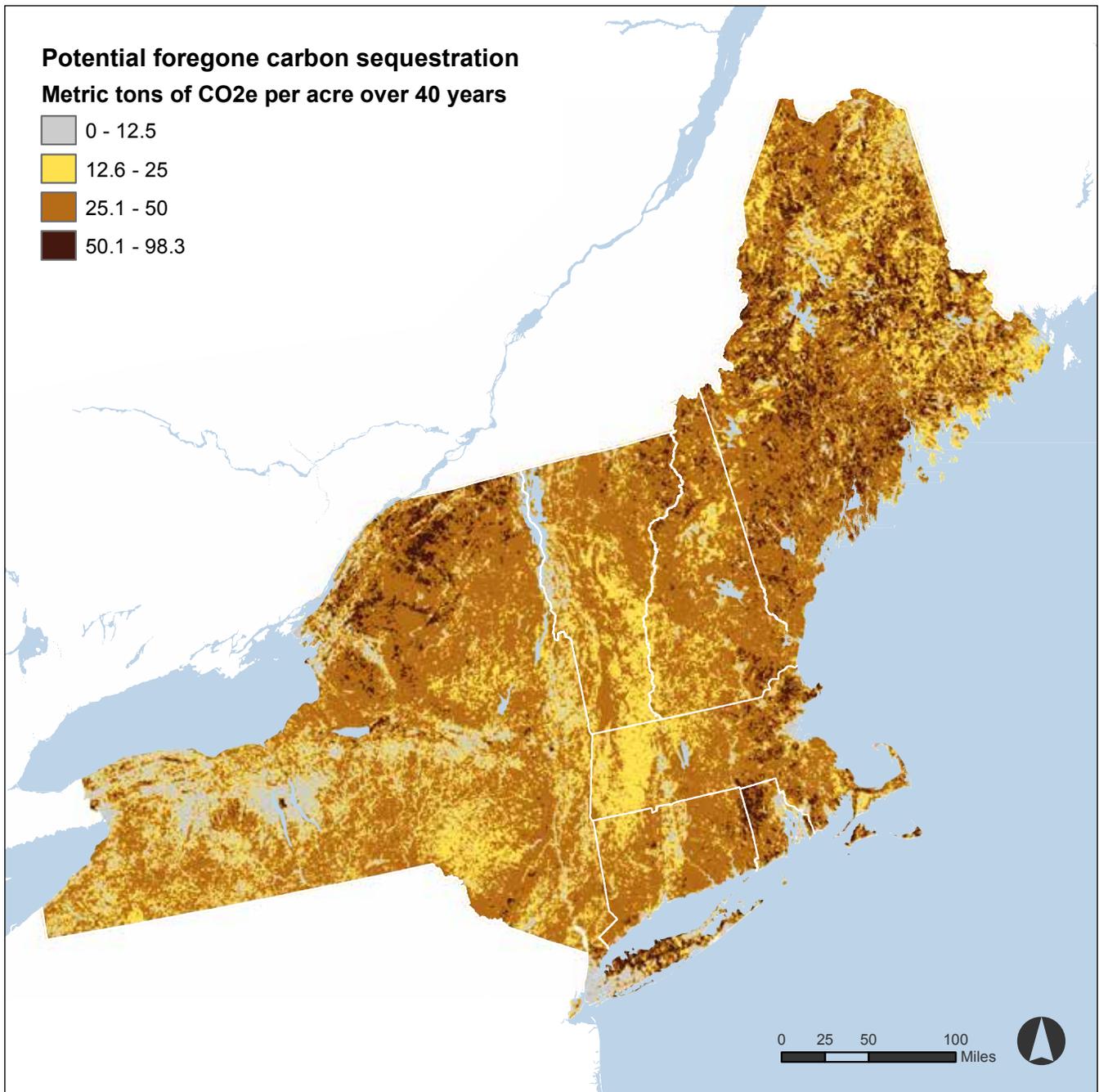


FIGURE 5. Potential foregone carbon sequestration from forest to non-forest conversion accumulated over 40 years from present-day conditions with a grow-only scenario, smoothed from the original dataset with focal statistics that average over a 1 km x 1 km block.

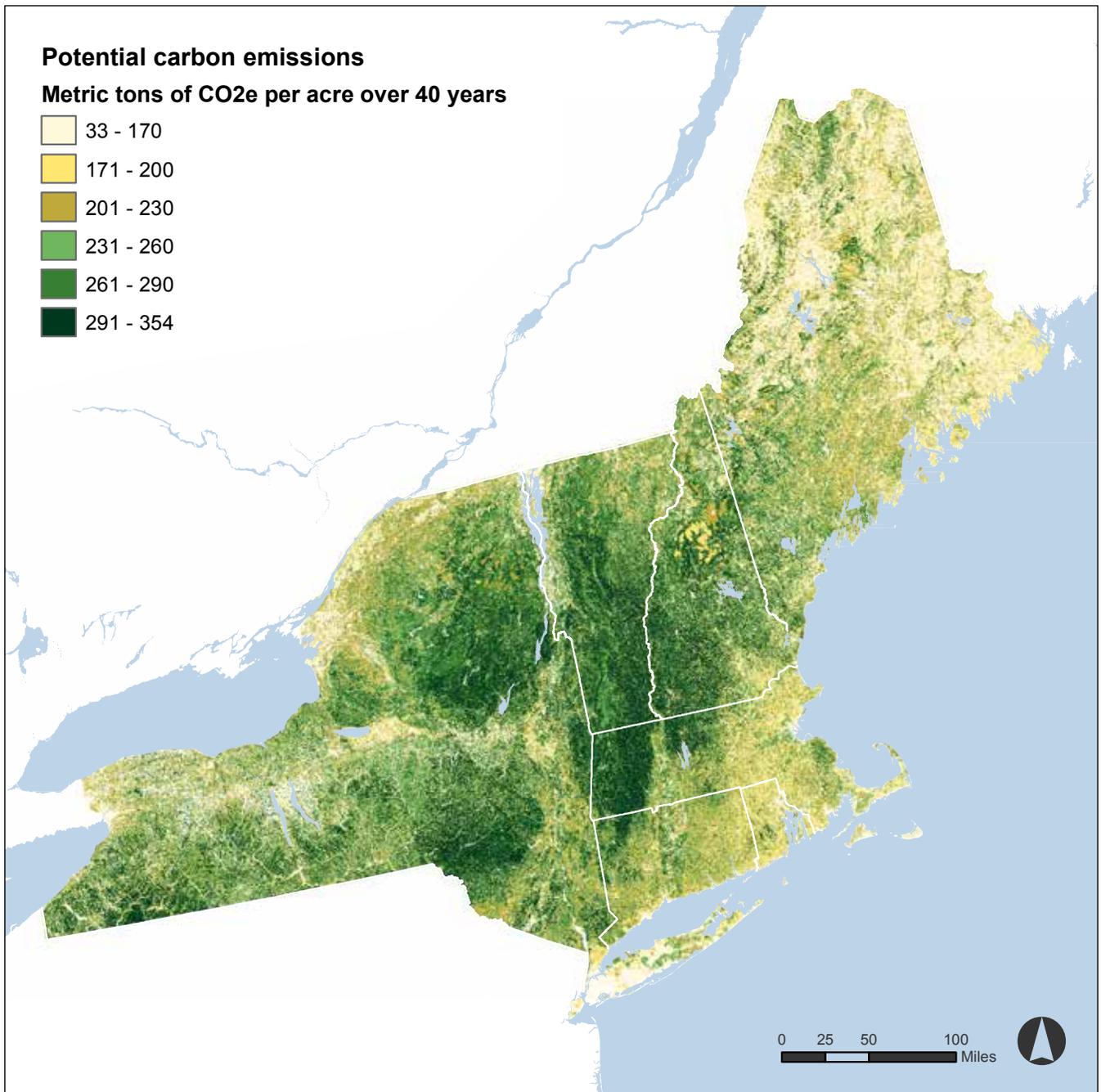


FIGURE 6. Total CO₂e burden from emissions and foregone sequestration that would result from forest to non-forest conversion and accumulated over 40 years.

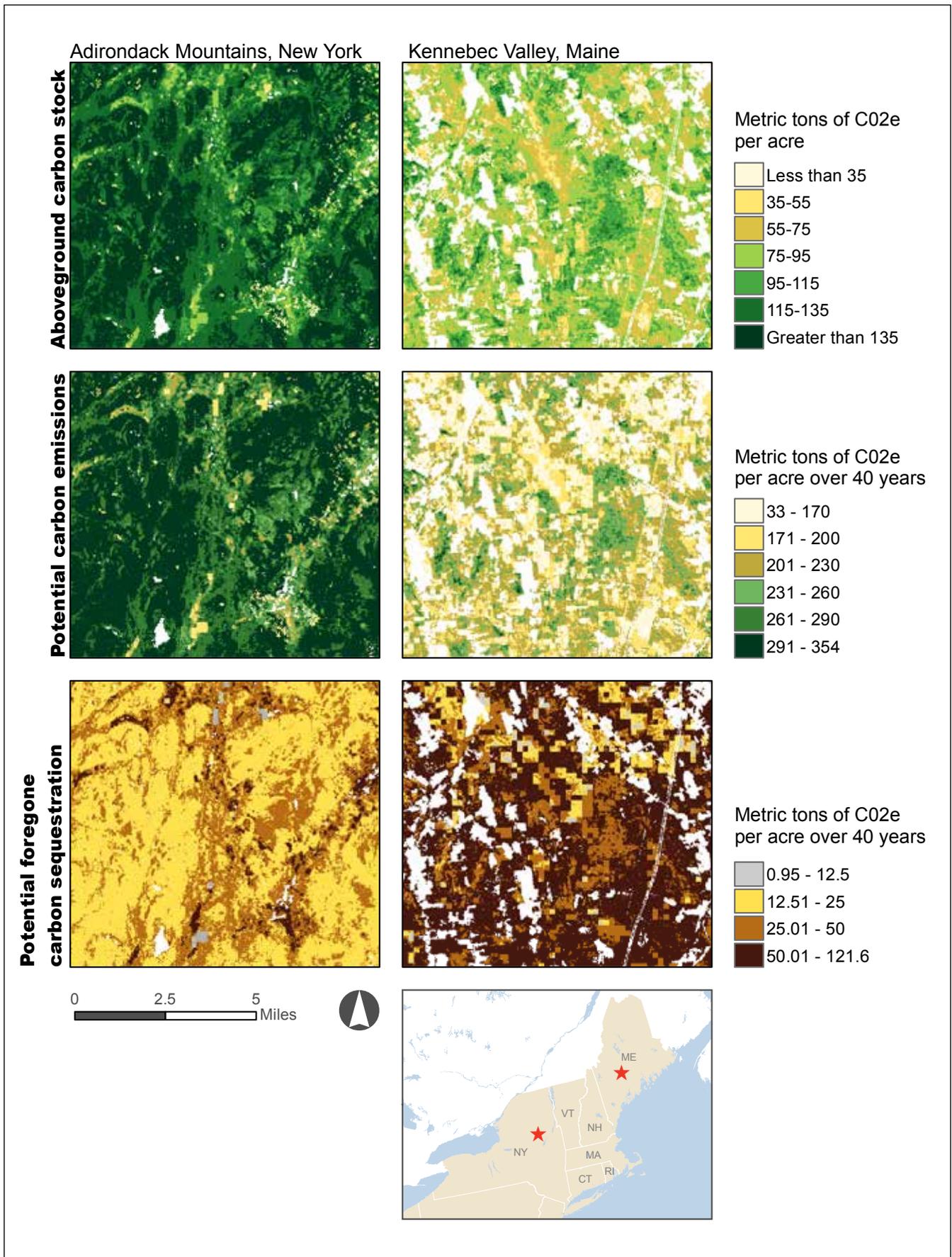


FIGURE 7. Example regions of interest displaying fine-scale detail and correspondences of carbon stocks, potential carbon emissions, and potential foregone sequestration.

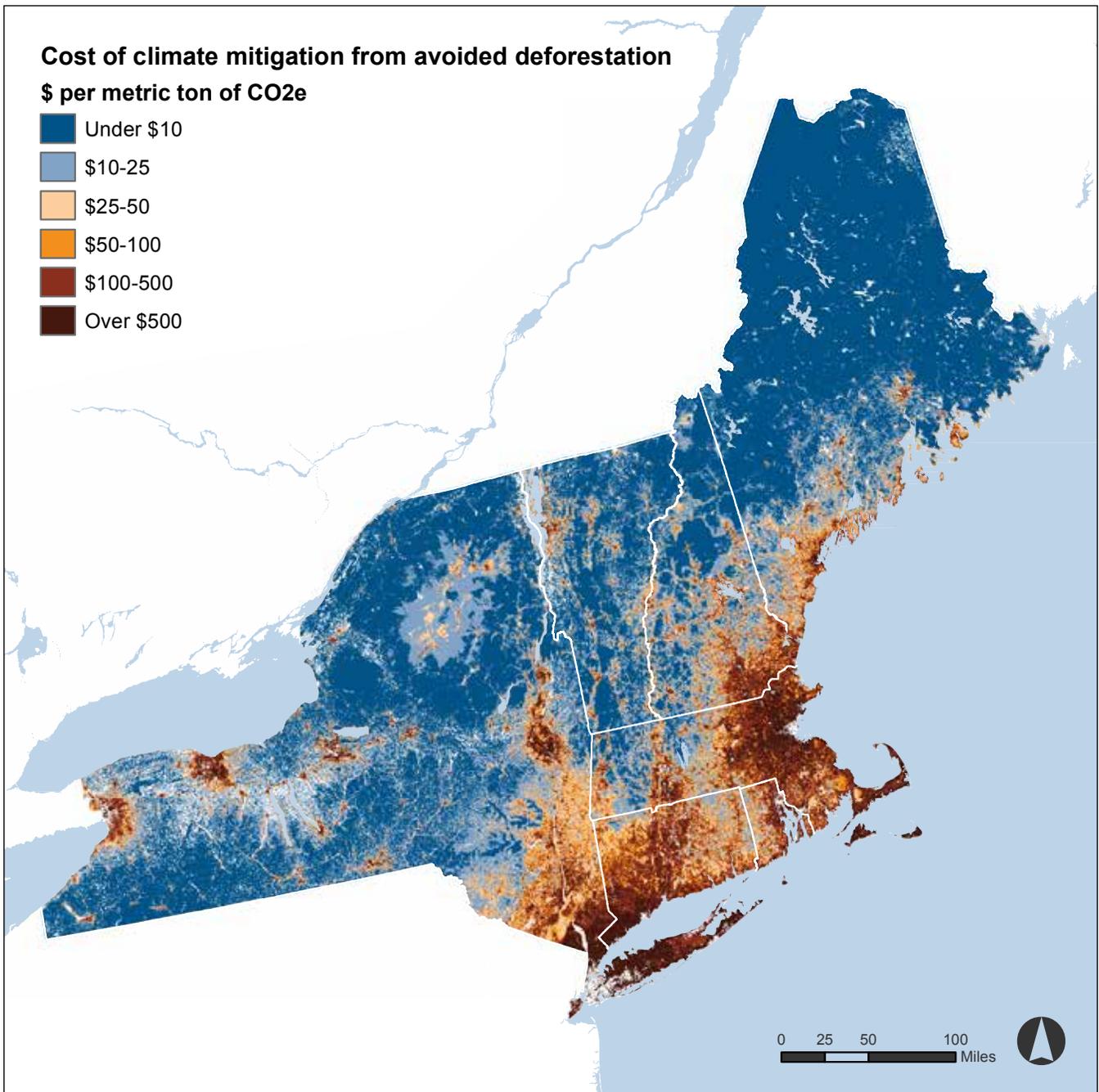


FIGURE 8. Cost of mitigation, in US Dollars per metric ton of CO₂e, that could be achieved by avoiding deforestation of present-day forestland. The cost per acre is derived from the detailed conservation land values described by Nolte (2020).

3.2 Comparisons to Other Estimates

The state-level forest conversion rates we estimate agree well with those obtained from the NLCD (Table 6), both on an area basis and as a percent of initial forested area. Disagreement is largest for Maine where active forest harvesting and, in some cases, slower forest regrowth, can make it challenging to confidently map forest losses. Conversion rates also agree well with the Losing Ground 6 (LG6) dataset for Massachusetts (Pasquarella and Holden 2019), a dataset that offers a powerful point of comparison because it has involved a sophisticated land cover change detection algorithm (Zhu and Woodcock 2014) as well as detailed training and validation. The LG6 dataset was obtained through our correspondences with the New England Landscape Futures (NELF) team centered at the Harvard Forest, who have provided valuable points of comparison throughout this study.

State-level forest area, forest carbon stocks, net CO₂ exchange with the atmosphere, harvest removals, and forest to non-forest conversion rates compare favorably between this report's results and those reported by the US Forest Service (Table 7). Our NFCMS estimates tended to be higher than for the USFS for forest area (5% to 37%), aboveground biomass (12% to 29%) and total ecosystem carbon (0% to 18%), but were generally lower for carbon sequestration (i.e. net CO₂ exchange with the atmosphere), though not for ME. Harvest removals are generally close in magnitude but somewhat higher than those reported by the USFS. Conversion emissions are also generally close in magnitude with a slight tendency for larger emissions estimated by the USFS. This high degree of agreement overall is almost surprising given widely differing methods, and we think this lends a certain degree of credibility to both.

TABLE 6. Average annual forest loss per year in the 1990s and 2000s by state, with estimates from a range of data products.

| | ME | NH | VT | NY | MA | CT | RI |
|---------------------------------|---------|---------|---------|---------|---------|---------|-------|
| Forestland [1000s of ha] | 7,469.9 | 2,141.8 | 2,004.1 | 8,825.0 | 1,631.0 | 1,005.5 | 199.2 |
| 1990 to 1999 | | | | | | | |
| hectares per year | | | | | | | |
| NAFD | 1,701 | 825 | 237 | 3,180 | 2,023 | 675 | 229 |
| LG6 | -- | -- | -- | -- | 1,388 | -- | -- |
| percent per year | | | | | | | |
| NAFD | 0.02 | 0.04 | 0.01 | 0.04 | 0.13 | 0.07 | 0.12 |
| LG6 | -- | -- | -- | -- | 0.10 | -- | -- |
| 2000 to 2009 | | | | | | | |
| hectares per year | | | | | | | |
| NAFD | 1,873 | 1,041 | 252 | 3,227 | 2,074 | 783 | 239 |
| NLCD | 371 | 716 | 110 | 2,093 | 2,132 | 1,011 | 242 |
| LG6 | -- | -- | -- | -- | 1,880 | -- | -- |
| percent per year | | | | | | | |
| NAFD | 0.03 | 0.05 | 0.01 | 0.04 | 0.14 | 0.08 | 0.13 |
| NLCD | 0.01 | 0.04 | 0.01 | 0.03 | 0.19 | 0.13 | 0.17 |
| LG6 | -- | -- | -- | -- | 0.14 | -- | -- |

Sources: NAFD is for this study, NLCD is estimated from conversion of any forest to the same agriculture and developed classes as used to filter and screen NAFD disturbances to select those involving conversion as described in the methods section.

TABLE 7. Comparison of NFCMS and USFS reported forest areas, carbon stocks, harvest removals, and conversion emissions by state and representative of 2010.

| | ME | NH | VT | NY | MA | CT | RI |
|---|-------|-------|-------|-------|-------|-------|------|
| Forested Area [1000s of hectares] | | | | | | | |
| This Report | 7,470 | 2,142 | 2,004 | 8,825 | 1,631 | 1,006 | 199 |
| USFS RU FS-227 | 7,114 | 1,925 | 1,826 | 7,643 | 1,224 | 732 | 150 |
| Live Biomass [MMT C] | | | | | | | |
| This Report | 563 | 216 | 209 | 891 | 170 | 107 | 19 |
| USFS RU FS-227 | 407 | 162 | 159 | 636 | 121 | 71 | 14 |
| Aboveground Biomass [MMT C] | | | | | | | |
| This Report | 383 | 151 | 149 | 640 | 121 | 77 | 13 |
| USFS RU FS-227 | 339 | 135 | 133 | 533 | 101 | 60 | 12 |
| Total Carbon [MMT C] | | | | | | | |
| This Report | 1,405 | 502 | 488 | 2,081 | 370 | 226 | 40 |
| USFS RU FS-227 | 1,399 | 468 | 460 | 1,853 | 313 | 183 | 37 |
| Carbon Sequestration [MMT CO₂e y⁻¹] | | | | | | | |
| This Report | 15.3 | 4.6 | 4.9 | 23.9 | 4.3 | 2.8 | 0.7 |
| USFS RU FS-227 | 11.7 | 5.5 | 5.9 | 24.2 | 4.8 | 2.9 | 0.4 |
| Harvest Removals during the 2000s [MMT CO₂e y⁻¹] | | | | | | | |
| This Report | 11.0 | 2.4 | 0.9 | 4.4 | 0.9 | 0.5 | 0.1 |
| USFS RPA 2001, 2006, 2011 average | 10.0 | 1.8 | 1.4 | 3.4 | 0.3 | 0.2 | 0.04 |
| Conversion Emissions during the 2000s [MMT CO₂e y⁻¹] | | | | | | | |
| This Report | 1.1 | 0.7 | 0.2 | 2.1 | 1.3 | 0.5 | 0.2 |
| USFS RU FS-227 | 1.5 | 0.8 | 0.9 | 3.1 | 0.7 | 0.4 | 0.1 |

Sources: USFS RU FS-2227 (Domke et al. 2020)

3.3 Additional Considerations Regarding Scope, Use and Reliability

This study did not consider the additional climate impacts caused by changes in surface albedo imposed by forest to non-forest conversion. The surface albedo effect tends to cause a net cooling that opposes the net warming effect from carbon emissions and foregone sequestration (Williams et al. 2021a). The magnitude of this cooling varies geographically depending on the local climate and the specific land cover conversion that occurred, but in the northeastern U.S. it typically amounts to about one quarter to one third of the net warming effect from the carbon burden ((Williams et al. 2021a) see supplement Figure S12).



This study does not explore how states, NGOs, or other agents might design policy, market or regulatory mechanisms to facilitate avoidance of forest loss in the region. The map we provide displaying the cost per tonne of CO₂ mitigation may provide useful information as context. We note, however, that there may be several additional considerations important to such a cost assessment. For example, it is conceivable that there would be costs associated with buying out land uses foregone due to land conservation. Also, there is the challenge of “leakage” whereby conservation in one area displaces property development or use to another area. Furthermore, there could be financial value associated with additional ecosystem service benefits of preserving forestland and its natural capital, including enhanced biodiversity, clean air, clean water, healthy soils, and others. These and other considerations are beyond the scope of the current study but surely relevant to associated decision making, land management, and policy design.

This study does not predict the locations of future forest conversions but rather uses the recent past as an indicator of the expected size of the climate mitigation opportunity from avoiding forest losses. The forest losses we detected for the 1990s and 2000s provide an initial baseline which serves as a useful reference point. While forests today are facing new threats from novel and expanding pests and pathogens (e.g. Williams et al. 2016), new centers of urban to exurban development, and new land uses such as solar farms, the baseline results presented in this study still provide a valuable benchmark for the size of the opportunity which seems poised to grow rather than shrink with these new threats. Users are encouraged to apply other sources of information about threats to forestland as available, for example from permitting and zoning databases. Our maps of the potential CO₂e emissions and foregone sequestration readily enable users to explore the climate impacts of future forest losses wherever they may occur. As a simplified example, our datasets and findings could be used as a look-up table for non-spatial accounting of potential emissions and foregone sequestration associated with deforestation in the region.

This study’s grow-only scenario estimates the potential sequestration within forests if they are able to continue to mature with tree-level but not stand-clearing disturbance events. While forests are of course vulnerable to a wide range of natural disturbances, such as windthrow and insect outbreaks, the impacts of these disturbances on stand-level biomass are partially embedded within the FIA yield curves used in this study to train the forest carbon cycle model. A trend of increasing natural disturbances would jeopardize not only the future sequestration but even the current carbon stocks contained within forests. This study did not attempt to assess the impacts of such a trend. Instead we simply underscore that this is an additional pathway by which contemporary carbon stocks and future carbon uptake could be impaired.

This study reports potential CO₂e emissions from biomass removed during forest conversion as it enters the harvested wood products stream, which we understand to be the typical fate. Some of the associated emissions will occur in other accounting sectors such as energy or waste, and users should think carefully about attribution to avoid double counting. We cannot make a general recommendation for how to address this because the design of a seamless solution will vary by application and accounting system. If desired, it should be possible to use the information provided in this report to parse the total emissions into portions occurring within forestlands, as fuelwood at wood processing facilities or elsewhere, and from landfills.

We note that our analysis is based on satellite imagery (such as NAFD, NBCD, NLCD) and field plot data (USFS FIA) that are updated consistently over time. The datasets and conclusions reported here can be validated and extended over time as more recent data on land use and cover change and on forest growth and carbon stocks become available. Similarly, for individual states or regions that have LiDAR or other satellite datasets, a new forest carbon stock (biomass) base layer can be substituted for our biomass layer to generate additional estimates.

Map outputs from this study may include pixels that are presently not forested, and users should consider filtering our datasets to remove such areas. This is particularly important in areas with significant recent development, as well as on forest edges adjacent to non-forest land cover types. Our NAFD-derived forest extent tends to over-estimate forested area, as we have shown in the report. This is partly because we include all 30 m pixels marked as forest in the year 1986 of the NAFD dataset as forested in 2010 without removal of forests that may have been lost. We recommend screening of our datasets with the NLCD 2016 or more recent land cover dataset for a more conservative filtering and removal of areas that may presently be non-forest.

Application of this study's maps represent an average expectation within strata of a given forest type group, site productivity class, and stand age. While the maps were initialized with information derived from satellite remote sensing with methodical training on in situ field data, there is inevitably a smoothing to the mean in such applications. Individual tracts of land may have more or less forest carbon or growth potential than can be captured with state-of-the-science methods applied over large areas such as in this study. Users are encouraged, whenever possible, to blend our data with local information, whether from the field, aerial photography, higher resolution remote sensing, or another source to spot-check and correct the estimates provided here.

While we hope that our data are useful to a range of audiences, the focus of the US Climate Alliance is on providing technical assistance and resources to states, and our primary audience in this work was state agency staff and decision-makers. We worked closely with staff from various states' natural resources and environmental agencies throughout the course of this grant, including by receiving support letters from six of the seven New England and New York states at the time of the grant application. States expressed a need for more accessible and customized presentations of forest carbon stock and sequestration data, and shared their frustration with the difficulty in comparing across data sets from different sources. We have included in Appendix A paraphrased excerpts from the support letters each state provided for this grant, as a starting point for how states might use the products of this report.

The questions from New England and New York echo those we have heard in work across the country, compiled into the six questions below. While this project does not provide answers to all of these questions, bold text indicates maps or data provided here that can provide partial answers.

1. What is the **current carbon stock**, how much is protected, and where would additional protection be most effective?
2. What is the current **rate of C sequestration**, how big is the **unfilled C stock potential**, and will it be sustained?
3. What is the **baseline rate of forest loss** and associated carbon emission?
4. What is the **cost of implementation** and are there significant savings from co-benefits?
5. How big are the risks from natural disturbances, leakage, etc.?
6. Can we **measure policy success** over time? How exactly?

We appreciate the time and thoughtful questions and suggestions from all of the New England and New York states, especially through meetings at the US Climate Alliance Regional Learning Lab in Rhode Island in 2019 and through the New England Landscape Futures Working Group meeting in 2020. The final maps, data tables, incorporation of a subset of our data into The Nature Conservancy Resilient Land Mapping Tool, and associated communications tools are better because of this collaboration, and we've worked to make them useable in informing future land use and climate change actions and programs. There will likely be continued needs for technical assistance, and we are looking forward to continuing to work to refine, update, and communicate our results as states' needs change over time.

SOURCE DATA SETS

FIA Forest Inventory and Analysis

<https://apps.fs.usda.gov/Evalidator/evaluator.jsp>

NAFD North American Forest Dynamics Project: Forest Disturbance and Regrowth Data

<http://dx.doi.org/10.3334/ORNLDAAC/1077>

NFCMS National Forests Carbon Monitoring System

<https://doi.org/10.3334/ORNLDAAC/1829>

NLCD National Land Cover Database

<https://www.mrlc.gov/>

TPO Timber Product Output

http://srsfia2.fs.fed.us/php/tpo_2009/tpo_rpa_int1.php

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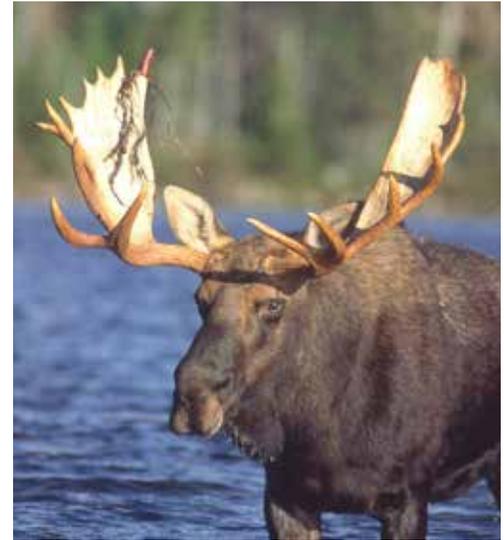
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MAINE

Deforestation (forest loss) is a direct source of carbon emissions, releasing the carbon stored in trees and roots into the atmosphere as carbon dioxide. It also removes one of the best tools we have for pulling carbon dioxide from the atmosphere (carbon sequestration). Thus, slowing the pace of forest loss (avoiding deforestation) is an opportunity to both reduce and remove carbon emissions in the fight against climate change.

A 2021 study by Clark University quantifies the size of the avoided deforestation opportunity and its spatial distribution in New England and New York. Collectively, these states are releasing 4.9 million metric tons of CO₂ equivalent into the atmosphere each year due to forest loss, and losing out on 1.2 million metric tons of CO₂ equivalent in carbon sequestration each year due to that loss. The numbers vary by state. However, every state stands to gain by reducing their rate of deforestation, and those benefits compound over time. Here are some of the study's conclusions for Maine:



1.1 MILLION
METRIC TONS OF CO₂e PER YEAR

Forest loss in Maine averaged about 1,873 hectares (4,628 acres) per year in the early 2000s, committing 1.1 million metric tons of CO₂e to the atmosphere as carbon emissions plus foregone sequestration each year.

80%
FROM CARBON
EMISSIONS

Foregone sequestration contributes about 20% of the total carbon burden from deforestation, while 80% comes from carbon emissions.

20%
FROM FOREGONE
SEQUESTRATION



THIS CO₂e IMPACT OF FOREST CONVERSIONS IS EQUAL TO:

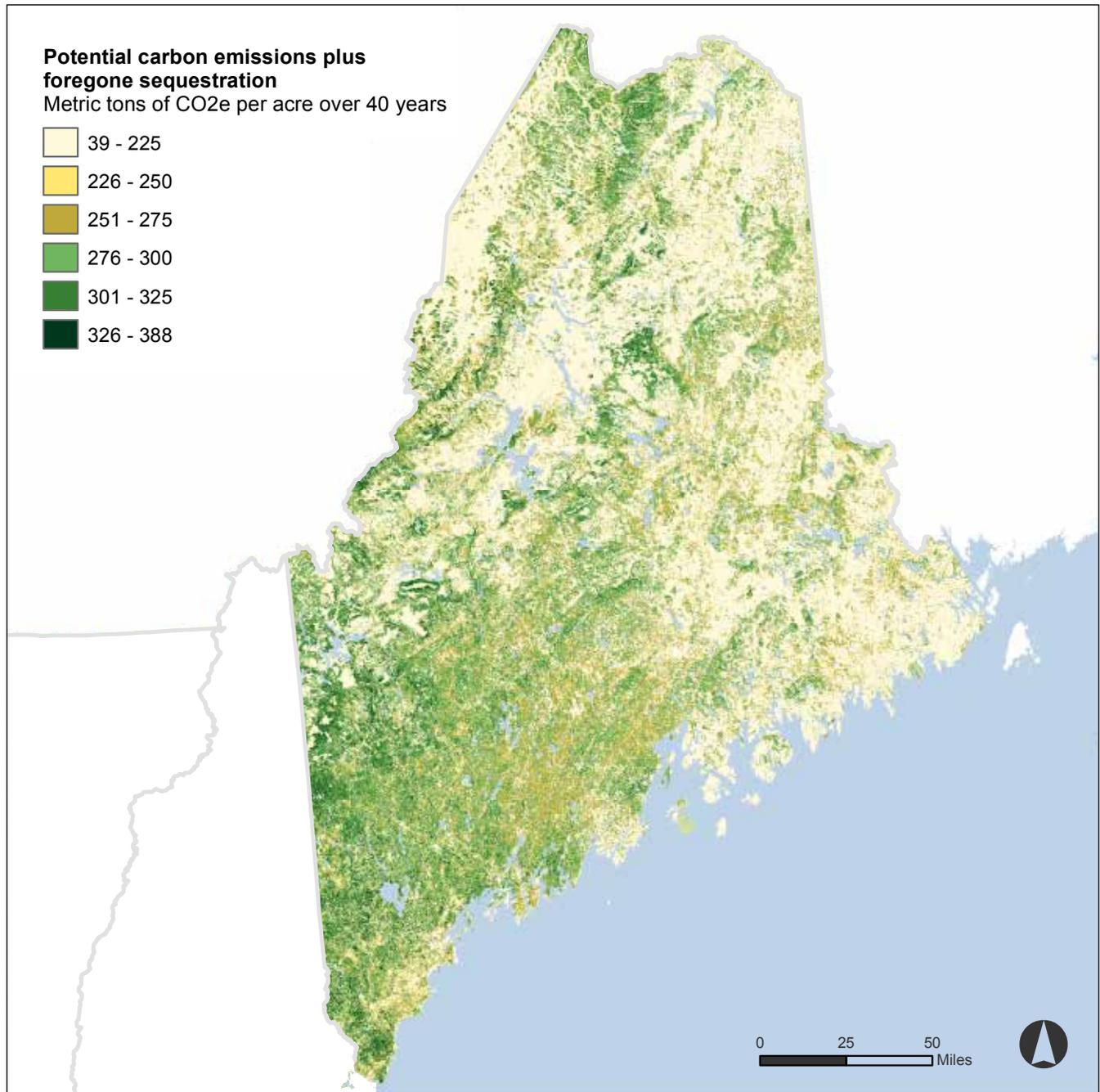
- 7%** of statewide carbon sequestration occurring within remaining forestlands
- 9%** of the harvested wood products emissions resulting from forest harvesting
- 7%** of the state's fossil fuel emissions across all sectors (2018)

There are many uses of these data, particularly in considering land use and climate change policies and actions. Maine state agencies wrote in their letter of support for this project that they “need updated and state-specific data on the size, location, and mechanics of natural climate solutions”, and that this project complements another US Climate Alliance grant project “which includes an array of management options in both forestry and agriculture.”

The full report, including a link to download the data, is here: <https://tnc.box.com/s/apncszy7yrsknlk0hix9n2bt7n6n3f9k> Many of these carbon data are also available in the interactive **Resilient Land Mapping Tool** from The Nature Conservancy.

An Opportunity in Maine

If any given point on the map is deforested, the carbon consequences are shown as the carbon that would be emitted plus foregone carbon sequestration, over 40 years. Conversely, this map shows the size of the opportunity represented by avoided deforestation.



NEW HAMPSHIRE

Deforestation (forest loss) is a direct source of carbon emissions, releasing the carbon stored in trees and roots into the atmosphere as carbon dioxide. It also removes one of the best tools we have for pulling carbon dioxide from the atmosphere (carbon sequestration). Thus, slowing the pace of forest loss (avoiding deforestation) is an opportunity to both reduce and remove carbon emissions in the fight against climate change.

A 2021 study by Clark University quantifies the size of the avoided deforestation opportunity and its spatial distribution in New England and New York. Collectively, these states are releasing 4.9 million metric tons of CO₂e into the atmosphere each year due to forest loss, and losing out on 1.2 million metric tons of CO₂e in carbon sequestration each year due to that loss. The numbers vary by state. However, every state stands to gain by reducing their rate of deforestation, and those benefits compound over time. Here are some of the study's conclusions for New Hampshire.



0.7 MILLION METRIC TONS OF CO₂e PER YEAR

Forest loss averaged about 1,041 hectares (2572 acres) per year in the early 2000s, committing 0.7 million metric tons of CO₂e to the atmosphere as carbon emissions plus foregone sequestration each year.

80% FROM CARBON EMISSIONS

Foregone sequestration contributes about 20% of the total carbon burden from deforestation, while 80% comes from carbon emissions.

20% FROM FOREGONE SEQUESTRATION



THIS CO₂e IMPACT OF FOREST CONVERSIONS IS EQUAL TO:

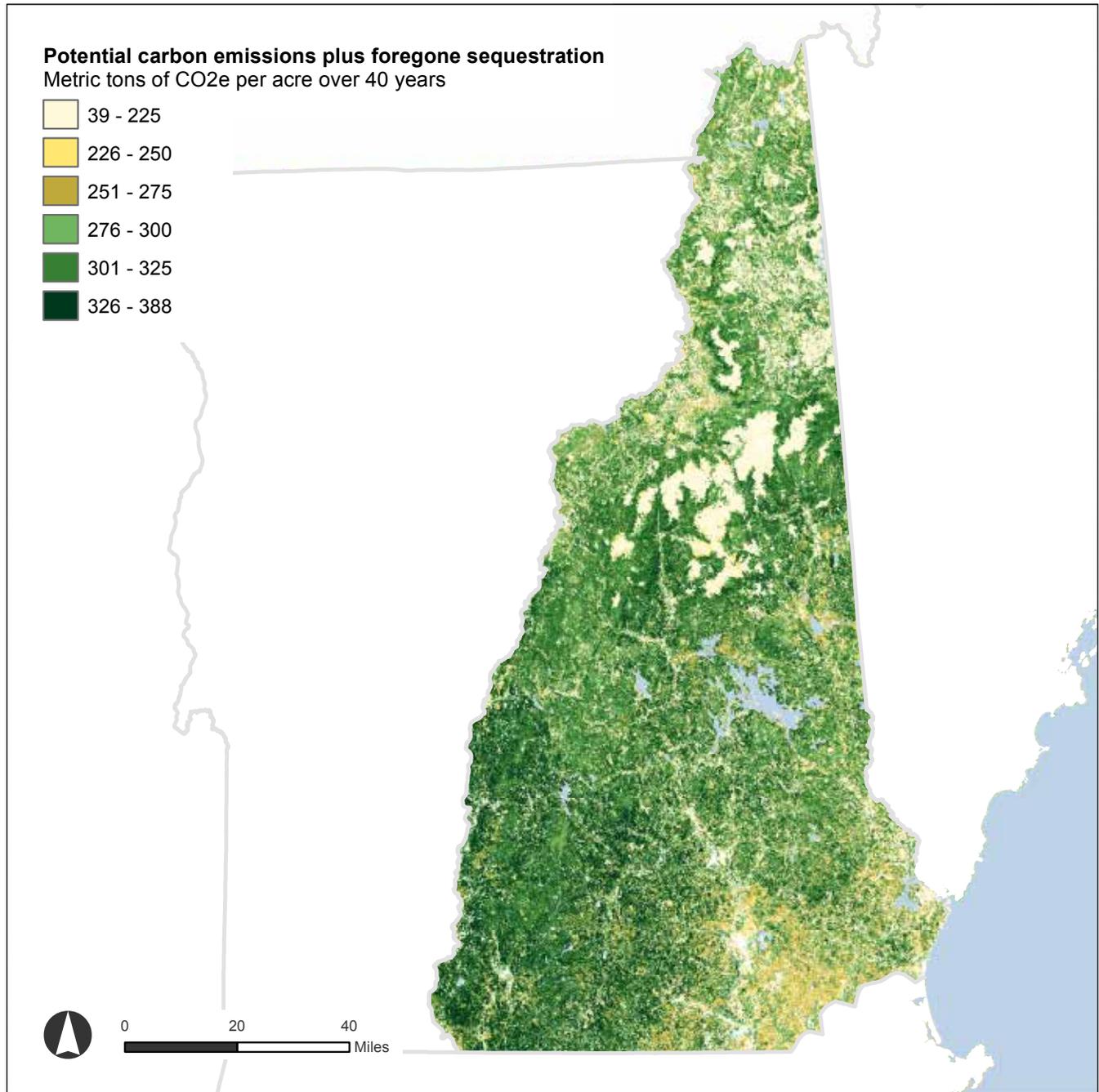
- 14%** of statewide carbon sequestration occurring within remaining forestlands
- 28%** of the harvested wood products emissions resulting from forest harvesting
- 5%** of the state's fossil fuel emissions across all sectors (2018)

There are many uses of these data, particularly in considering land use and climate change policies and actions.

The full report, including a link to download the data, is here: <https://tnc.box.com/s/apncszy7yrsknlk0hix9n2bt7n6n3f9k>
Many of these carbon data are also available in the interactive [Resilient Land Mapping Tool](#) from The Nature Conservancy.

An Opportunity in New Hampshire

If any given point on the map is deforested, the carbon consequences are shown as the carbon that would be emitted plus foregone carbon sequestration, over 40 years. Conversely, this map shows the size of the opportunity represented by avoided deforestation.



VERMONT

Deforestation (forest loss) is a direct source of carbon emissions, releasing the carbon stored in trees and roots into the atmosphere as carbon dioxide. It also removes one of the best tools we have for pulling carbon dioxide from the atmosphere (carbon sequestration). Thus, slowing the pace of forest loss (avoiding deforestation) is an opportunity to both reduce and remove carbon emissions in the fight against climate change.

A 2021 study by Clark University quantifies the size of the avoided deforestation opportunity and its spatial distribution in New England and New York. Collectively, these states are releasing 4.9 million metric tons of CO₂ equivalent into the atmosphere each year due to forest loss, and losing out on 1.2 million metric tons of CO₂ equivalent in carbon sequestration each year due to that loss. The numbers vary by state. However, every state stands to gain by reducing their rate of deforestation, and those benefits compound over time. Here are some of the study's conclusions for Vermont.



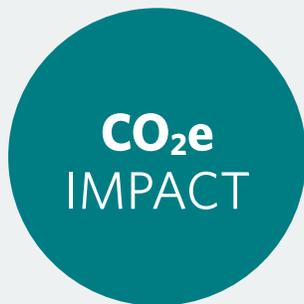
0.2 MILLION METRIC TONS OF CO₂e PER YEAR

Forest loss averaged about 252 hectares (623 acres) per year in the early 2000s, committing 0.2 million metric tons of CO₂e to the atmosphere as carbon emissions plus foregone sequestration each year

80% FROM CARBON EMISSIONS

Foregone sequestration contributes about 20% of the total carbon burden from deforestation, while 80% comes from carbon emissions.

20% FROM FOREGONE SEQUESTRATION



THIS CO₂e IMPACT OF FOREST CONVERSIONS IS EQUAL TO:

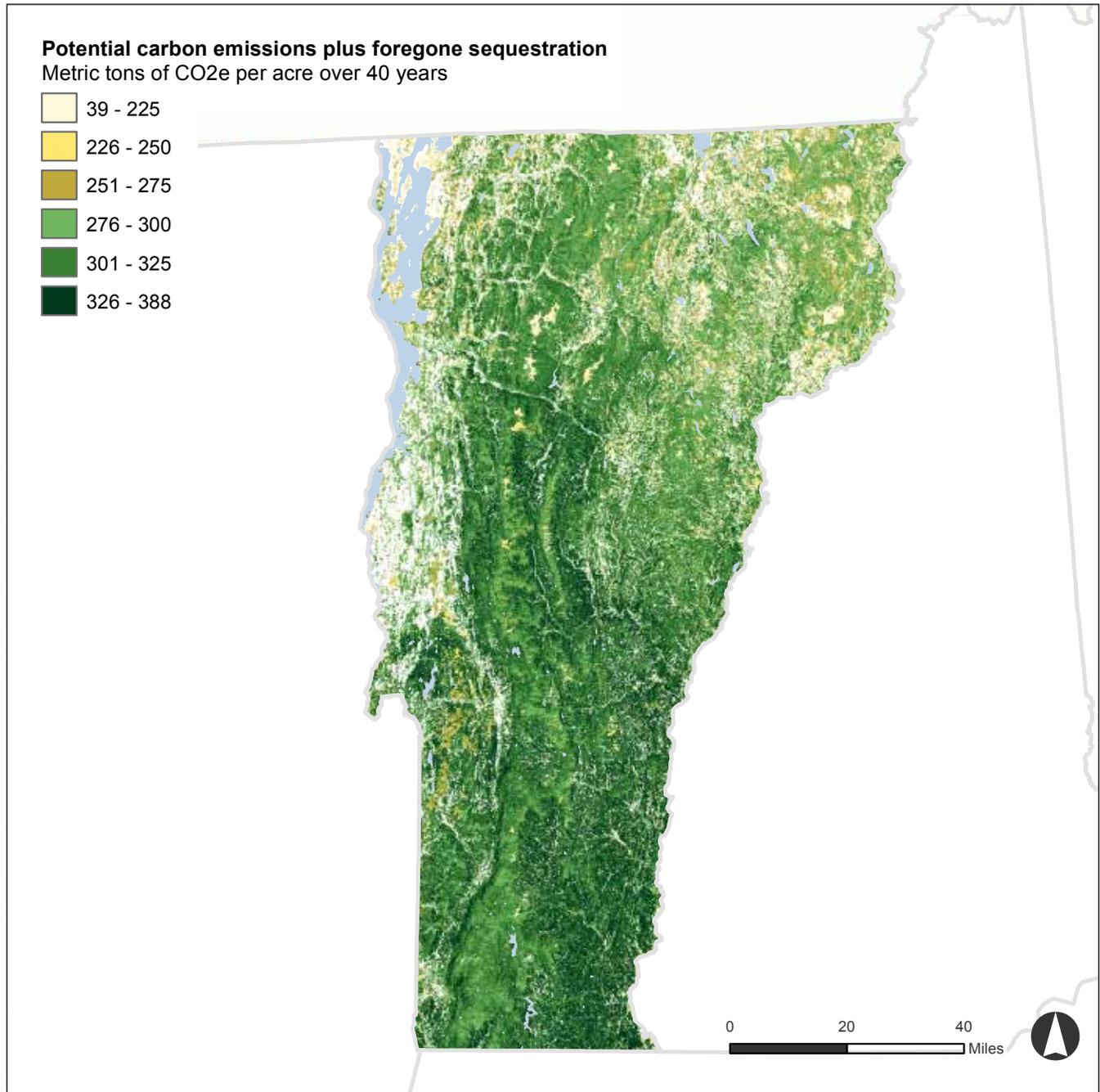
- 3%** of statewide carbon sequestration occurring within remaining forestlands
- 18%** of the harvested wood products emissions resulting from forest harvesting
- 3%** of the state's fossil fuel emissions across all sectors (2018)

There are many uses of these data, particularly in considering land use and climate change policies and actions. Vermont state agencies wrote in their letter of support for this project that "improved carbon maps and compatibility with emerging satellite data will help us improve our greenhouse gas accounting, identify priority landscapes, and increase support and funding for conservation."

The full report, including a link to download the data, is here: <https://tnc.box.com/s/apncszy7yrsknlk0hix9n2bt7n6n3f9k> Many of these carbon data are also available in the interactive **Resilient Land Mapping Tool** from The Nature Conservancy.

An Opportunity in Vermont

If any given point on the map is deforested, the carbon consequences are shown as the carbon that would be emitted plus foregone carbon sequestration, over 40 years. Conversely, this map shows the size of the opportunity represented by avoided deforestation.

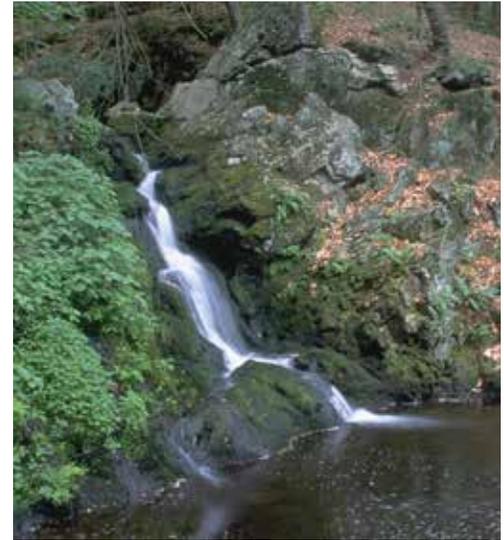




NEW YORK

Deforestation (forest loss) is a direct source of carbon emissions, releasing the carbon stored in trees and roots into the atmosphere as carbon dioxide. It also removes one of the best tools we have for pulling carbon dioxide from the atmosphere (carbon sequestration). Thus, slowing the pace of forest loss (avoiding deforestation) is an opportunity to both reduce and remove carbon emissions in the fight against climate change.

A 2021 study by Clark University quantifies the size of the avoided deforestation opportunity and its spatial distribution in New England and New York. Collectively, these states are releasing 4.9 million metric tons of CO₂ equivalent into the atmosphere each year due to forest loss, and losing out on 1.2 million metric tons of CO₂ equivalent in carbon sequestration each year due to that loss. The numbers vary by state. However, every state stands to gain by reducing their rate of deforestation, and those benefits compound over time. Here are some of the study's conclusions for New York.



2.1 MILLION
METRIC TONS OF CO₂e PER YEAR

Forest loss averaged about 3,227 hectares (7974 acres) per year in the early 2000s, committing 2.1 million metric tons of CO₂e to the atmosphere as carbon emissions plus foregone sequestration each year.

80%
FROM CARBON
EMISSIONS

Foregone sequestration contributes about 20% of the total carbon burden from deforestation, while 80% comes from carbon emissions.

20%
FROM FOREGONE
SEQUESTRATION



THIS CO₂e IMPACT OF FOREST CONVERSIONS IS EQUAL TO:

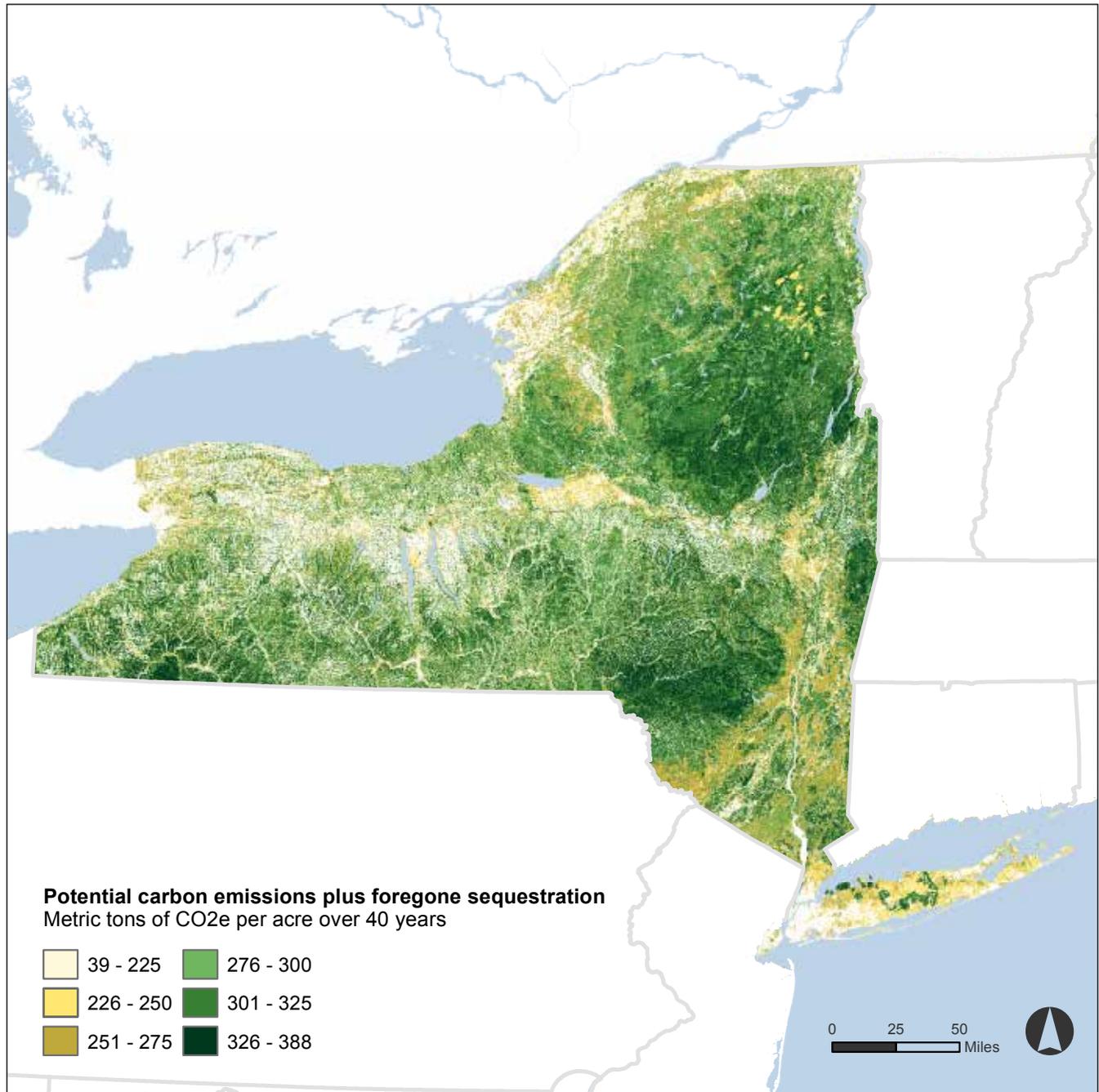
- 8%** of statewide carbon sequestration occurring within remaining forestlands
- 45%** of the harvested wood products emissions resulting from forest harvesting
- 1%** of the state's fossil fuel emissions across all sectors (2018)

There are many uses of these data, particularly in considering land use and climate change policies and actions. New York state agencies wrote in their letter of support for this project that they “need improved methodologies and estimates of forest cover and carbon sequestration, as well as insight into the trends of forest health in forest health, land cover change and land ownership that will determine the future of carbon sequestration in the region,” and “how land use change can affect the attributes of land cover that the State values, including carbon sequestration.”

The full report, including a link to download the data, is here: <https://tnc.box.com/s/apncszy7yrsknlk0hix9n2bt7n6n3f9k> Many of these carbon data are also available in the interactive **Resilient Land Mapping Tool** from The Nature Conservancy.

An Opportunity in New York

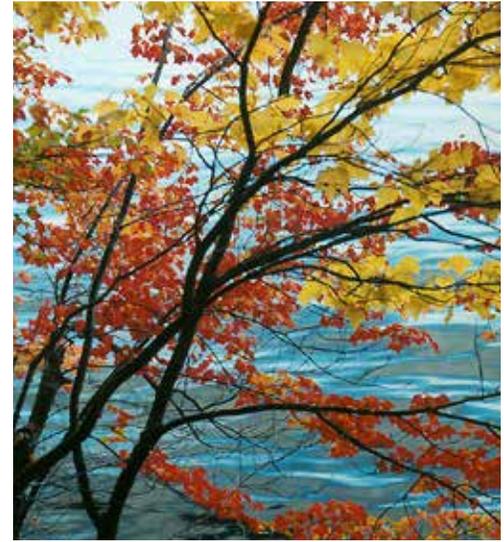
If any given point on the map is deforested, the carbon consequences are shown as the carbon that would be emitted plus foregone carbon sequestration, over 40 years. Conversely, this map shows the size of the opportunity represented by avoided deforestation.



MASSACHUSETTS

Deforestation (forest loss) is a direct source of carbon emissions, releasing the carbon stored in trees and roots into the atmosphere as carbon dioxide. It also removes one of the best tools we have for pulling carbon dioxide from the atmosphere (carbon sequestration). Thus, slowing the pace of forest loss (avoiding deforestation) is an opportunity to both reduce and remove carbon emissions in the fight against climate change.

A 2021 study by Clark University quantifies the size of the avoided deforestation opportunity and its spatial distribution in New England and New York. Collectively, these states are releasing 4.9 million metric tons of CO₂ equivalent into the atmosphere each year due to forest loss, and losing out on 1.2 million metric tons of CO₂ equivalent in carbon sequestration each year due to that loss. The numbers vary by state. However, every state stands to gain by reducing their rate of deforestation, and those benefits compound over time. Here are some of the study's conclusions for Massachusetts.



1.3 MILLION
METRIC TONS OF CO₂e PER YEAR

Forest loss averaged about 2,074 hectares (5,125 acres) per year in the early 2000s, committing 1.3 million metric tons of CO₂e to the atmosphere as carbon emissions plus foregone sequestration each year.

80%
FROM CARBON
EMISSIONS

Foregone sequestration contributes about 20% of the total carbon burden from deforestation, while 80% comes from carbon emissions.

20%
FROM FOREGONE
SEQUESTRATION



THIS CO₂e IMPACT OF FOREST CONVERSIONS IS EQUAL TO:

28% of statewide carbon sequestration occurring within remaining forestlands

150% of the harvested wood products emissions resulting from forest harvesting

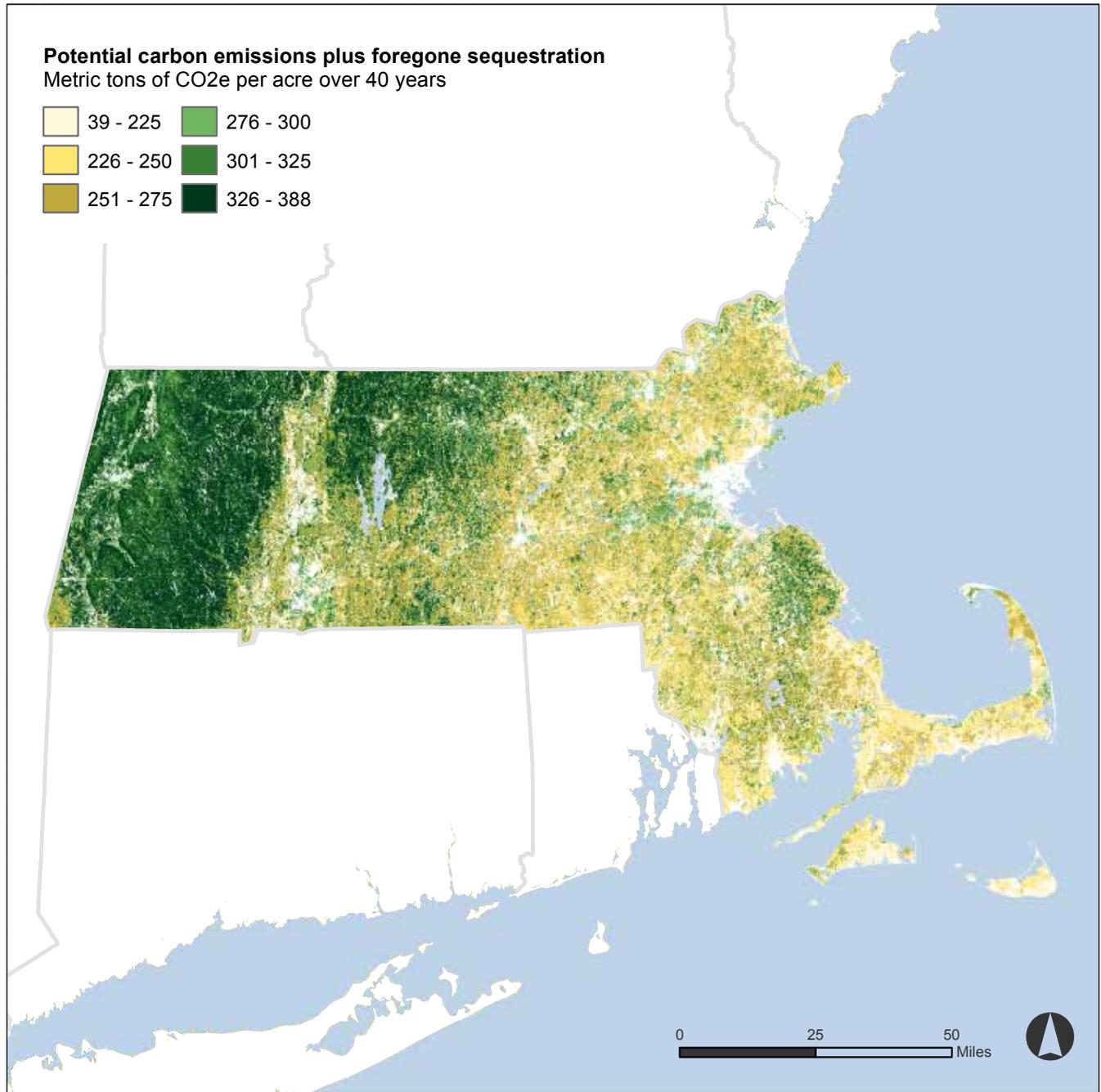
2% of the state's fossil fuel emissions across all sectors (2018)

There are many uses of these data, particularly in considering land use and climate change policies and actions. Massachusetts state agencies wrote in their letter of support for this project that this study would “complement and support several emerging state initiatives including: the launching of an extensive project to evaluate options for Massachusetts to meet its legally mandated goal of {a net zero} reduction in greenhouse gas emissions by 2050,” and “further expansion of climate mitigation and adaptation funding.”

The full report, including a link to download the data, is here: <https://tnc.box.com/s/apncszy7yrsknlk0hix9n2bt7n6n3f9k> Many of these carbon data are also available in the interactive **Resilient Land Mapping Tool** from The Nature Conservancy.

An Opportunity in Massachusetts

If any given point on the map is deforested, the carbon consequences are shown as the carbon that would be emitted plus foregone carbon sequestration, over 40 years. Conversely, this map shows the size of the opportunity represented by avoided deforestation.



CONNECTICUT

Deforestation (forest loss) is a direct source of carbon emissions, releasing the carbon stored in trees and roots into the atmosphere as carbon dioxide. It also removes one of the best tools we have for pulling carbon dioxide from the atmosphere (carbon sequestration). Thus, slowing the pace of forest loss (avoiding deforestation) is an opportunity to both reduce and remove carbon emissions in the fight against climate change.

A 2021 study by Clark University quantifies the size of the avoided deforestation opportunity and its spatial distribution in New England and New York. Collectively, these states are releasing 4.9 million metric tons of CO₂ equivalent into the atmosphere each year due to forest loss, and losing out on 1.2 million metric tons of CO₂ equivalent in carbon sequestration each year due to that loss. The numbers vary by state. However, every state stands to gain by reducing their rate of deforestation, and those benefits compound over time. Here are some of the study's conclusions for Connecticut.



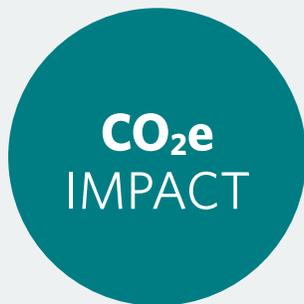
0.5 MILLION
METRIC TONS OF CO₂e PER YEAR

Forest loss averaged about 782 hectares (1,932 acres) per year in the early 2000s, committing 0.5 million metric tons of CO₂e to the atmosphere as carbon emissions plus foregone sequestration each year.

80%
FROM CARBON
EMISSIONS

Foregone sequestration contributes about 20% of the total carbon burden from deforestation, while 80% comes from carbon emissions.

20%
FROM FOREGONE
SEQUESTRATION



THIS CO₂e IMPACT OF FOREST CONVERSIONS IS EQUAL TO:

16% of statewide carbon sequestration occurring within remaining forestlands

116% of the harvested wood products emissions resulting from forest harvesting

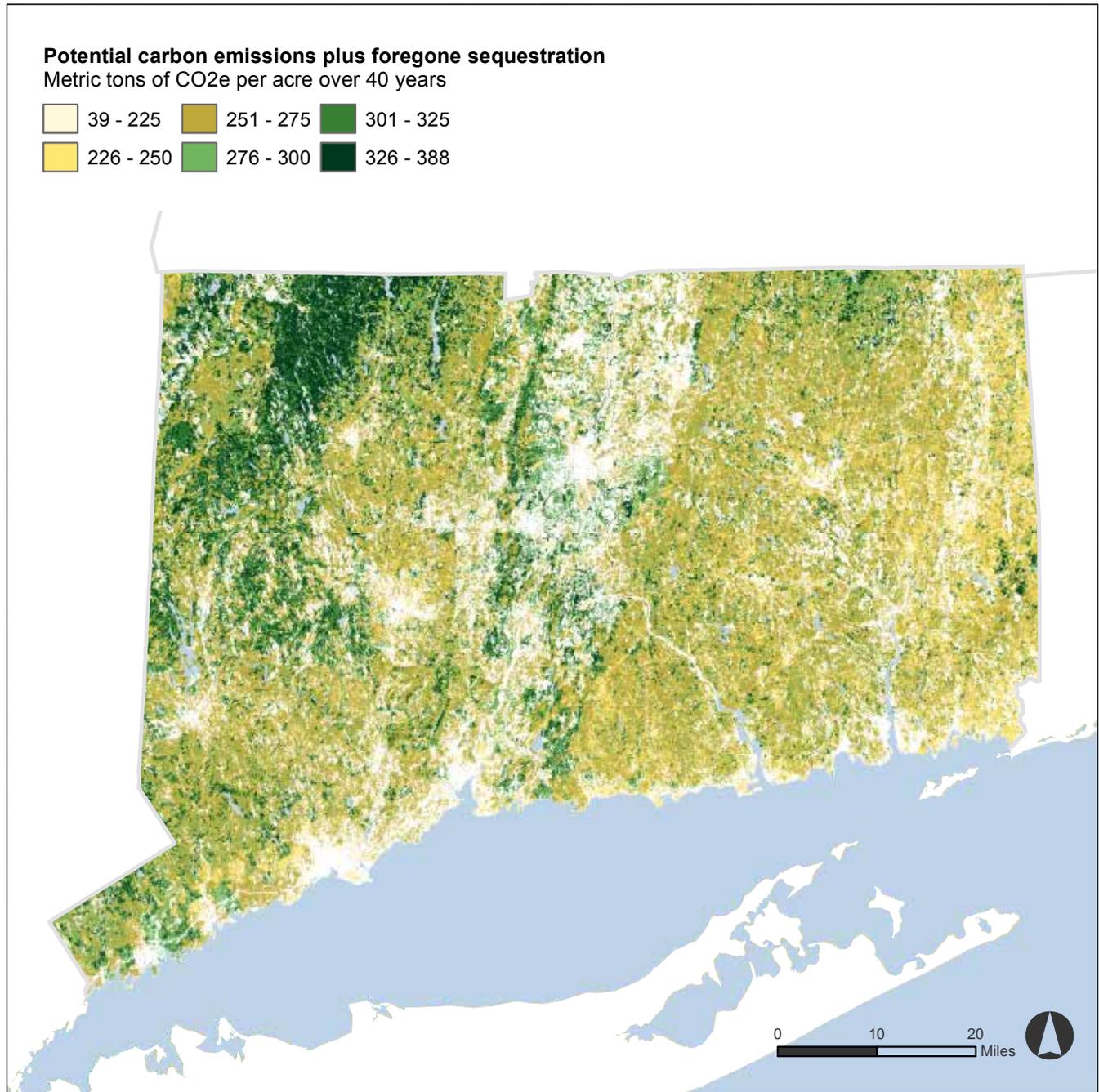
1% of the state's fossil fuel emissions across all sectors (2018)

There are many uses of these data, particularly in considering land use and climate change policies and actions. Connecticut state agencies wrote in their letter of support for this project that "improved data would help increase the focus on land protection/avoided conversion as a climate strategy as forest loss and fragmentation remain one of the highest concerns for residents regarding CT woodlands," and "improved data collection will complement state efforts to reduce emissions through energy policy with efforts to remove emissions through land policy."

The full report, including a link to download the data, is here: <https://tnc.box.com/s/apncszy7yrsknlk0hix9n2bt7n6n3f9k> Many of these carbon data are also available in the interactive **Resilient Land Mapping Tool** from The Nature Conservancy.

An Opportunity in Connecticut

If any given point on the map is deforested, the carbon consequences are shown as the carbon that would be emitted plus foregone carbon sequestration, over 40 years. Conversely, this map shows the size of the opportunity represented by avoided deforestation.





RHODE ISLAND

Deforestation (forest loss) is a direct source of carbon emissions, releasing the carbon stored in trees and roots into the atmosphere as carbon dioxide. It also removes one of the best tools we have for pulling carbon dioxide from the atmosphere (carbon sequestration). Thus, slowing the pace of forest loss (avoiding deforestation) is an opportunity to both reduce and remove carbon emissions in the fight against climate change.

A 2021 study by Clark University quantifies the size of the avoided deforestation opportunity and its spatial distribution in New England and New York. Collectively, these states are releasing 4.9 million metric tons of CO₂ equivalent into the atmosphere each year due to forest loss, and losing out on 1.2 million metric tons of CO₂ equivalent in carbon sequestration each year due to that loss. The numbers vary by state. However, every state stands to gain by reducing their rate of deforestation, and those benefits compound over time. Here are some of the study's conclusions for Connecticut.



0.15 MILLION
METRIC TONS OF CO₂e PER YEAR

Forest loss averaged about 239 hectares (591 acres) per year in the early 2000s, committing 0.15 million metric tons of CO₂e to the atmosphere as carbon emissions plus foregone sequestration each year.

80%
FROM CARBON
EMISSIONS

Foregone sequestration contributes about 20% of the total carbon burden from deforestation, while 80% comes from carbon emissions.

20%
FROM FOREGONE
SEQUESTRATION



THIS CO₂e IMPACT OF FOREST CONVERSIONS IS EQUAL TO:

22% of statewide carbon sequestration occurring within remaining forestlands

136% of the harvested wood products emissions resulting from forest harvesting

1% of the state's fossil fuel emissions across all sectors (2018)

There are many uses of these data, particularly in considering land use and climate change policies and actions. Rhode Island state agencies wrote in their letter of support for this project that “identifying forest carbon capture realities... will be used in discussions with communities in fully understanding their forest land carbon sequestration numbers. This data will be used to encourage the development of community climate resiliency plans.”

The full report, including a link to download the data, is here: <https://tnc.box.com/s/apncszy7yrsknlk0hix9n2bt7n6n3f9k> Many of these carbon data are also available in the interactive **Resilient Land Mapping Tool** from The Nature Conservancy.

An Opportunity in Rhode Island

If any given point on the map is deforested, the carbon consequences are shown as the carbon that would be emitted plus foregone carbon sequestration, over 40 years. Conversely, this map shows the size of the opportunity represented by avoided deforestation.

