SCIENCE & RESEARCH

Quantifying the Range of Variability in Wilderness Areas:

A Reference When Evaluating Wilderness Candidates

ABSTRACT The US Forest Service recently began revising forest management plans under the 2012 forest planning rule. The forest plan revision process includes a wilderness inventory and evaluation that can lead to some lands being recommended as wilderness. During this process, the Forest Service evaluates the wilderness character of candidate roadless lands. This evaluation can result in the disqualification of areas for wilderness recommendations based on degraded qualities of wilderness character. However, it is unknown how the wilderness character of candidate lands compares to conditions within the existing National Wilderness Preservation System (NWPS). Without such an evaluation and comparison, candidate areas for wilderness recommendation could be held to a higher standard of wilderness character than lands currently protected as wilderness. Here, four national mapped datasets representing qualities of wilderness character (human modification, distance to roads, light pollution, and noise pollution) of candidate roadless lands (also called wilderness candidates) were compared to the existing NWPS. The number of candidate areas that were more degraded than the most degraded wilderness area was counted. In addition, the distribution of values of wilderness candidates was compared with the distribution of values from areas of the NWPS. Data were analyzed at two scales: among all wilderness areas and within Forest Service regions. Among all wilderness areas, no wilderness candidate was more degraded than the range of conditions within the existing NWPS. Within regions, very few candidates were more degraded than current wilderness areas, irrespective of the metric evaluated. These results suggest that most candidates for wilderness recommendation fall within the range of conditions observed within the current NWPS. A similar approach to quantifying the range of conditions within existing wilderness could be used in local evaluations to ensure that candidates for wilderness are not held to a higher standard of wilderness character than that of the existing NWPS.



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Wilderness areas of the National Wilderness Preservation System (NWPS) serve as core units of a national system of conservation reserves in the United States (Aycrigg et al. 2013, 2016a; Belote et al. 2016). As important as the existing NWPS is, additional reserves are needed to better represent ecological diversity (Dietz et al. 2015) and establish an ecologically-connected network of protected areas (Aycrigg et al. 2016b, Belote et al. 2017). Fortunately, a process exists whereby lands can be recommended to the US Congress for inclusion as new legislated wilderness areas. For example, during land management planning under the 2012 Planning Rule of the National Forest Management Act (USDA 2012), the Forest Service evaluates wilderness character of lands under Chapter 70 of the planning rule directives. Through this local inventory and evaluation process, the agency determines which candidate roadless lands (generally greater than 2,023 ha/4,999 acres) on each national forest maintain outstanding wilderness character and which areas should be recommended as wilderness.

Wilderness character is based on concepts outlined in the Wilderness Act including naturalness, undeveloped condition, untrammeledness, and outstanding opportunities for solitude or primitive recreation (Landres et al. 2015). Wilderness character is associated with the concept of wildness (Aplet 1999) and generally describes ecological conditions (e.g., integrity) and the degree of control humans assert on natural processes (e.g., through fire suppression and plant and animal management). Quantifying and mapping wilderness character of existing wilderness areas has occurred throughout the country using spatial data representing human impacts to qualities of land (Tricker et al. 2012, 2013, 2016, 2017; Burrows et al. 2016). Datasets used in these analyses have included features that represent built structures, distance to roads, and sights and sounds that impact wilderness character. These qualities are also closely related to conditions outlined for assessment in the directives of the wilderness inventory and evaluation process. In developing forest plan revisions, such wilderness inventory and evaluation are usually conducted at local scales across a single (or several adjacent) national forests.

Such local evaluations in conservation planning are a critical step for determining high-priority lands to include in formal ecological reserves (Pressey and Bottrill 2009). Local evaluations provide data necessary for managers to identify lands suitable or unsuitable for wilderness recommendations. Data on local roads, trails, structures, historical timber management, the presence of nonnative species, and other qualities must be evaluated to identify and prioritize places with high wilderness character. The importance of local evaluations notwithstanding, mapped national and global datasets increasingly provide opportunities to evaluate the importance of land based on a national or global perspective (Pouzols et al. 2014; Belote and Irwin 2017).

In some instances, local evaluations may result in the national or global significance of areas being overlooked (sensu Noss et al. 2015). For instance, features that degrade wilderness character at a local level (e.g., an old cabin or a patch of invasive species) could result in managers downgrading or disqualifying areas for consideration as new wilderness areas. However, the same candidate lands – when compared to all other lands in the nation – may be of extremely

high value and represent some of the wildest remaining lands in the country. Only through a national or regional evaluation of candidates can such determination of relative quality be made (e.g., Belote and Irwin 2017).

Moreover, through the wilderness inventory and evaluation process some candidates for recommended wilderness may be downgraded because of features that reduce wilderness character (e.g., cabins, bridges), even though such features may occur in existing wilderness areas. The NWPS is widely regarded as a national and global treasure for maintaining America's remaining wildlands (Cordell et al. 2005). Yet, candidates for future consideration may be held to a higher standard than the lands that currently make up the NWPS. During local evaluations of wilderness character, it is critical to evaluate candidates for future wilderness recommendations at a national scale and compare wilderness character of candidates with that of the existing NWPS.

Candidates for future consideration may be held to a higher standard than the lands that currently make up the NWPS

With the above concepts in mind, two primary questions were asked: (1) What is the range of variability in various metrics of wilderness character within the NWPS? (2) How do candidates for recommended wilderness compare to this range of variability?

Methods

Four metrics that serve as proxies for wilderness character were evaluated: human modification (Theobald 2013); distance to roads (National Park Service 2013); light pollution (Monahan et al. 2012); and noise pollution (Mennitt et al. 2014). These four metrics (Figure 1) are among several national datasets that represent qualities associated with wilderness character and wildness (sensu Aplet 1999; Aplet et al. 2000; Watson et al. 2016). These metrics have been used to map wilderness character in several wilderness areas in the United States, generally provide estimates of gradients in wilderness character (Tricker et al. 2012, 2013, 2016, 2017; Burrows et al. 2016), and represent nationally mapped data of relatively high resolution. Other national mapped datasets representing estimates of biological diversity priorities are also available (Dietz et al. 2015; Jenkins et al. 2015; Belote et al. 2017) and could be used to evaluate the importance of these candidate lands as means of better representing biodiversity (Aycrigg et al. 2015; Belote and Irwin 2017). The intent here was to focus on nationally available mapped data representing four qualities closely associated with measures of wilderness character (Landres et al. 2015).

Human modification data is based on land cover, human population density, roads, and other mapped metrics of ecological condition (Theobald 2013). Data are scaled from 0 (no measured

human modification) to 1 (high degree of human modification). Distance to roads was calculated as the geographic distance (in meters) from all roads using Topologically Integrated Geographic Encoding and Referencing (TIGER) data available from the US Census (US Census Bureau 2015). This analysis was conducted with the EUCLIDEAN DISTANCE tool in ArcGIS 10.5, which resulted in gridded data where distance is assigned to each 90-meter resolution pixel for the contiguous US. Wilderness character is assumed to increase with distance from roads, although the decay of impact likely varies among ecosystems. Different types of roads are not differentiated here, as these differences are accounted for within the human modification data. Smaller distances are related to likely degraded wilderness character, based on increased human access, pervasive sights and sounds from the roads, and other ecological impacts associated with roads (Tricker et al. 2012; Burrows et al. 2016; Ibisch et al. 2016).

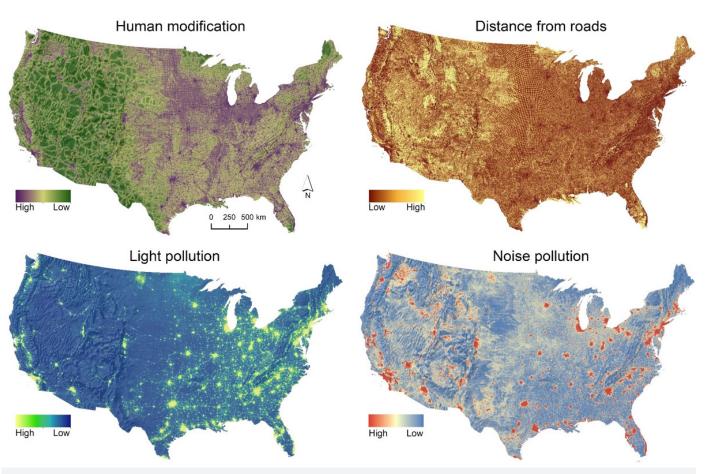


Figure 1 - Four datasets used as measures of wilderness character: human modification, distance to roads, light pollution, and noise pollution.

Light pollution represents satellite-measured light intensity during the night from the Visible Infrared Imaging Radiometer Suite (VIIRS) nighttime lights data (Nelson et al. 2015). This mapped dataset serves as a measure of the intactness of the night sky. Higher values represent more intense light pollution and thus lower wilderness character (Tricker et al. 2012). Similarly, mapped data of humangenerated noise pollution is based on field observations and a spatial model using landscape features that influence sound propagation (Mennitt et al. 2014; Nelson et al. 2015). Greater intensity of human noises (higher predicted dBA) is associated with reduced wilderness character. The Forest Service 2012 Planning Rule directives on wilderness evaluations suggests that "sights and sounds from outside the area" should be considered when evaluating wilderness suitability of candidates. Data on light and sound pollution provide a national dataset to evaluate these qualities of wilderness character.

For each of the four qualities, data were extracted for all 683 existing wilderness areas of the NWPS

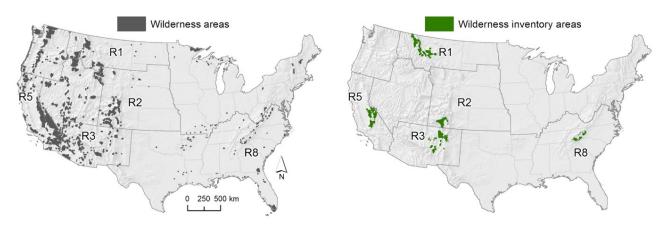


Figure 2 - The existing National Wilderness Preservation System and wilderness inventory areas (wilderness candidates) currently being evaluated among different Forest Service regions.

within the contiguous United States, along with 300 wilderness inventory areas among 9 national forests. Summary statistics were then calculated for each unit (Figure 2). Hereafter, wilderness inventory areas are referred to as wilderness candidates, as they are among a pool of areas currently being considered for wilderness recommendations in national forest planning. The nine national forests included the Flathead and Helena-Lewis and Clark from the Northern Region (R1); the Cibola and Santa Fe from the Southwestern Region (R3); the Rio Grande from the Rocky Mountain Region (R2); the Sierra, Sequoia, and Inyo from the Pacific Southwest Region (R5); and the Nantahala-Pisgah from the Southern Region (R8). These areas were chosen because the Forest Service had completed identification of their candidate wilderness areas in these national forests at the time of our analysis. Candidate wilderness boundaries were obtained from local Forest Service staff. The mean distribution of each quality from all NWPS units in the lower 48 states was plotted using kernel density plots from the ggplot2 package in R. In addition, values from individual units were added as "rug plots" to evaluate the range for each quality. Data were also stratified based on Forest Service regions so that existing wilderness in different regions of the country were compared to candidates from the roadless area inventories in those same regions.

Because these data represent a census of all areas, inferential statistics (e.g., using analysis of variance) were not conducted. Instead, visual comparisons were made of the distributions of data using the kernel density plots. The number of wilderness candidate units with characteristics more degraded than the range observed within the NWPS among and within regions were also evaluated. In other words, the number of wilderness candidates with greater human modification, were closer to roads, or were exposed to higher levels of light and noise pollution than existing wilderness areas were counted. Finally, as a post hoc analysis, mean elevation of wilderness areas and wilderness candidates was compared using a national 30-meter resolution digital elevation model to potentially explain observed patterns in wilderness character metrics.

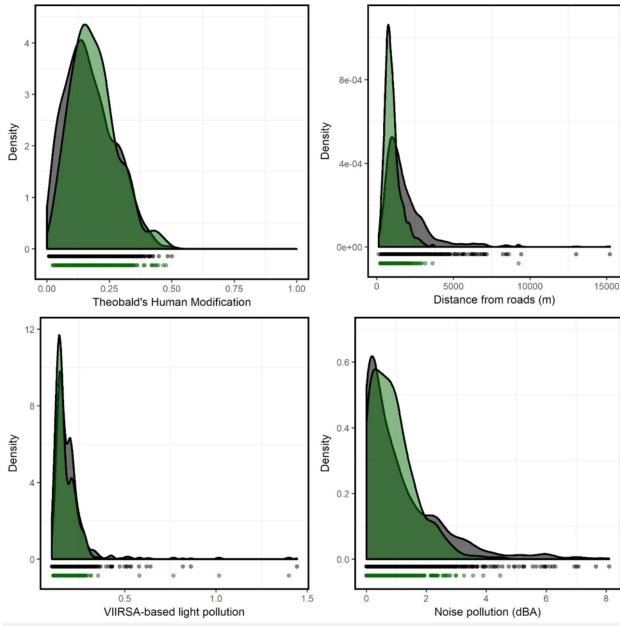


Figure 3 - Human modification, distance from roads, light pollution, and noise pollution for all wilderness areas (black) and all erness candidate areas to date (green). The overlap registers as dark green

Results

When compared across the lower 48 states, all candidates for recommended wilderness were within the range of values observed within existing wilderness areas of the NWPS (Figure 3: Table 1). The kernel density distribution of values for each quality varied little when comparing wilderness areas with wilderness candidate areas, although wilderness areas tended to be farther from roads than wilderness candidate areas (Figure 3).

Region	Number of NWPS areas	Number of wilderness candidate areas > 2023 hectares	Number of units more degraded with respect to human modification	Number of units more degraded with respect to distance to roads	Number of units more degraded with respect to light pollution	Number of units more degraded with respect to noise pollution
Across all regions	683	300	0	0	0	0
Northern (R1)	25	58	1	1	0	0
Rocky Mountain (R2)	62	46	0	1	0	1
Southwestern (R ₃)	117	92	4	21	4	0
Pacific Southwest (R5)	158	72	1	0	0	0
Southern (R8)	101	32	0	1	0	0

Table 1 – Number of wilderness candidates among five US Forest Service Regions and the number of those units that are more
 degraded compared to the range of values within existing wilderness areas of the NWPS.

When comparing human modification values within region, 6 (2% of total) wilderness candidate areas among all regions were outside the range of values observed within wilderness areas (Figure 5; Table 1). The distribution of human modification in wilderness candidate areas overlapped wilderness areas for nearly all regions. The wilderness candidate areas were slightly more modified than the NWPS units in R1, R3, and R5 (Figure 4). When comparing distance from roads within region, 24 (8% of total) wilderness candidate areas among all regions were outside the range of values observed within wilderness areas (Figure 5; Table 1). Based on the distribution of values, wilderness candidate areas tended to occur closer to roads compared to wilderness areas in nearly all regions.

When comparing light and noise pollution within region, 4 (1.3% of total) and 1 (<0.5%) of wilderness candidates among all regions, respectively, were outside the range of values observed within wilderness areas (Figure 5; Table 1). Based on the distribution of values of light pollution, wilderness candidate areas tended to be very similar to wilderness areas in nearly all regions (Figure 6). However, R2 wilderness candidate areas tended to experience less light pollution, whereas R8 wilderness candidate areas tended to experience more light pollution compared to wilderness in those regions (Figure 6). Based on the distribution of values of noise pollution, wilderness candidate areas tended to be very similar to wilderness areas in nearly all regions (Figure 7). Finally, average wilderness candidate areas were slightly higher in elevation (2,198 meters/7,211 ft. above sea level) than wilderness areas (1,413 meters/4,636 ft. asl) in the regions assessed here.

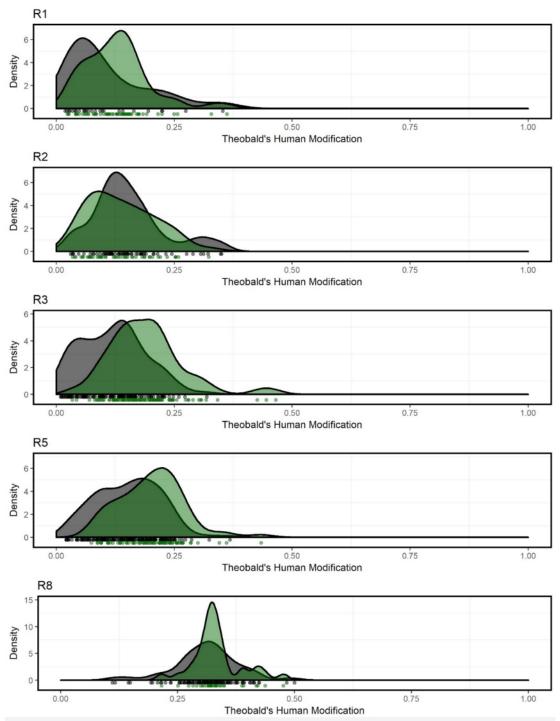


Figure 4 - Distribution of human modification by region within wilderness areas of the National Wilderness Preservation System (black) and wilderness candidate areas (green). Individual units are shown as a "rug plot" and used to count units outside the range of conditions within the NWPS.

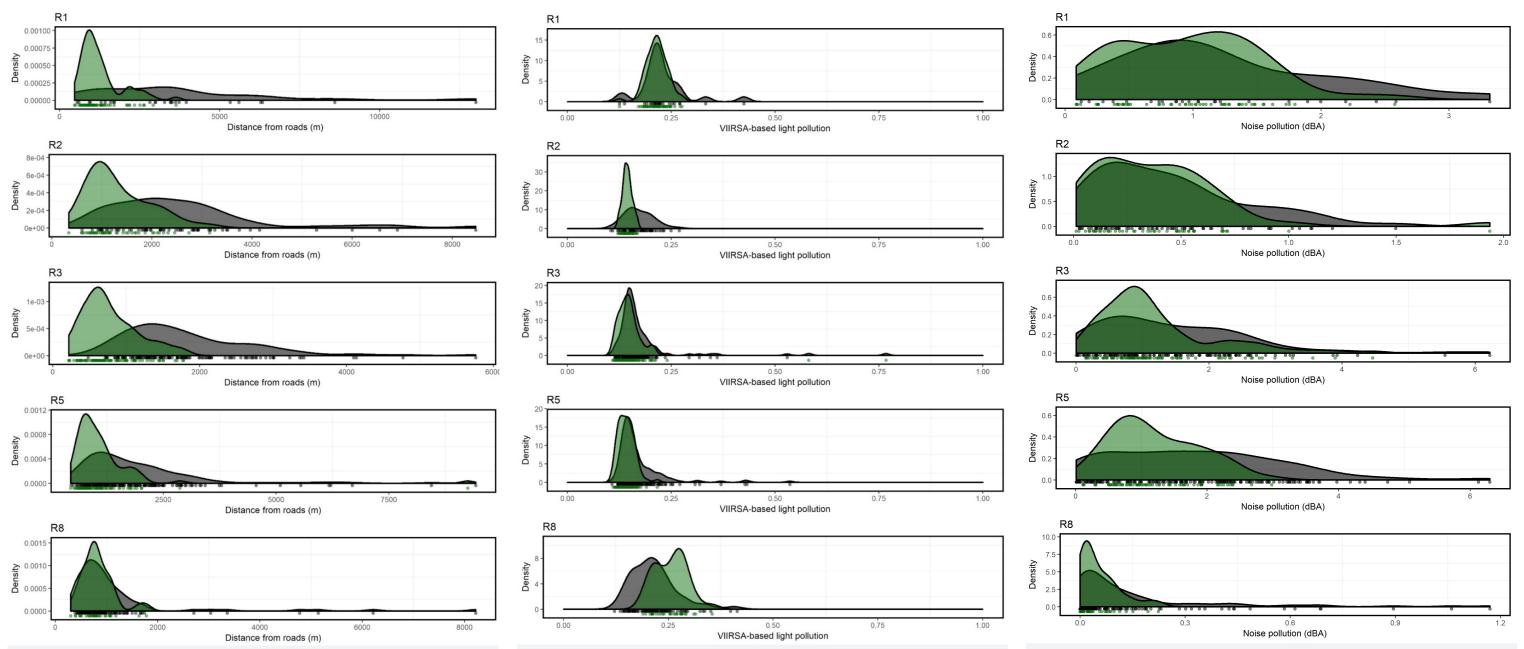


Figure 5 - Distance from roads by region within wilderness areas of the National Wilderness Preservation System (black) and wilderness candidate areas (green). Individual units are shown as a "rug plot" and used to count units outside the range of conditions within the NWPS.

Figure 6 – Light pollution by region within wilderness areas of the National Wilderness Preservation System (black) and wilderness candidate areas (green). Individual units are shown as a "rug plot" and used to count units outside the range of conditions within the NWPS.

Figure 7 - Noise pollution by region within wilderness areas of the National Wilderness Preservation System (black) and wilderness candidate areas (green). Individual units are shown as a "rug plot" and used to count units outside the range of conditions within the NWPS.

Discussion

The wilderness character of wilderness candidates was almost always within the range of the existing NWPS. As citizens, stakeholders, and agency personnel evaluate candidates for future wilderness recommendations, this kind of national assessment of wilderness character should be an important step to ensure that candidates for wilderness are not held to a higher standard than lands within the existing NWPS. In fact, when pooled nationally, all wilderness candidate areas were within the range of values observed in the NWPS for each of the four metrics.

As a sample of areas, wilderness candidates did tend to have higher degree of human modification and lower distance to roads compared to wilderness areas in some regions (e.g., R1, R3, and R5) based on the distributions of values. It was hypothesized that this was because wilderness candidates were lower in elevation than wilderness areas. Wilderness and other protected areas typically occur higher in elevation (Aycrigg et al. 2013) with steeper slopes compared to unprotected lands, which has provided easier access for building roads and harvesting timber (Belote and Aplet 2014), or otherwise converting land to agricultural commercial, or residential land uses. Contrary to expectations, wilderness candidates were slightly higher in elevation compared to existing wilderness among and within the regions studied here. Despite this pattern, wilderness candidates do tend to be closer to human development and roads compared to existing wilderness.

Human modification and distance to roads both serve as measures of ecological integrity, degree of trammeledness, and outstanding opportunities for solitude, all of which represent wilderness character (Aplet et al. 2000; Theobald 2013; Landres et al. 2015). Despite the general patterns between wilderness candidates and wilderness areas in these qualities, no individual wilderness candidate could be considered more degraded than the range of the existing NWPS, and only a few could be considered more degraded than the range of values within the region. Wilderness candidates in the Southwestern Region (R3), however, had the greatest number of areas (23% of units) outside of the range of existing wilderness in that region with respect to distance from roads.

Light and noise pollution varied little between wilderness candidates and wilderness areas. In fact, in the Rocky Mountain Region (R2), wilderness candidates were characterized by darker night skies (less light pollution) than existing wilderness. Like distance to roads, the largest number of wilderness candidates that had more light pollution than the existing NWPS occurred in the Southwestern Region (R3), which may reflect proximity to urban or developed areas around Santa Fe and Los Alamos, New Mexico, and the surrounding national forests. Light and noise pollution impact ecological systems (Longcore and Rich 2004; Mennitt et al. 2014; Shannon et al. 2016) and can erode wilderness character (Tricker et al. 2012). Dark night skies with intact star-viewing opportunities and quiet outdoor experiences free from human-generated noises all represent important qualities of wilderness character and wildness (Aplet et al. 2000).

Taken together, these results suggest that in most cases, candidates for recommended wilderness represent lands that are as wild as the existing NWPS. As human populations increase and land use expands (Sohl et al. 2014), protecting the remaining wildlands is increasingly recognized as a key global, national, and local conservation priority (Venter et al. 2016; Watson et al. 2016; Belote et al. 2017). Wilderness areas and the NWPS represent a critical tool used to protect the remaining wildlands. The process by which agencies evaluate lands for potential wilderness recommendations is central to adding lands to this system. Although local evaluations will continue to be essential to assessing wilderness character (sensu Landres et al. 2015), national and global datasets increasingly allow for broad-scale analyses to evaluate lands across larger areas (Belote and Irwin 2017).

Ultimately, only the US Congress has the authority to legislatively designate new wilderness areas, which requires social and political processes. Agency recommendations to Congress, however, are an important aspect of designating new wilderness areas, as well as administratively maintaining the wilderness character of lands classified as recommended wilderness. Given the loss of wildlands globally (Watson et al. 2016) and nationally (Theobald et al. 2016), it is imperative that a national context is applied to decisions of how wilderness character is protected and managed on federal lands.

In conclusion, four nationally available mapped datasets representing measures of wilderness character were used to compare wilderness candidates with existing wilderness areas. This analysis was used to identify whether and how many wilderness candidates fell outside the range of the existing NWPS. Local evaluations could use the same framework to compare wilderness character of candidates with the existing system. If local assessments measure features that erode wilderness character (e.g., old roads, cabins, historical timber harvests) within lands serving as candidate for wilderness recommendations, managers could compare these qualities to nearby wilderness areas. Although wilderness areas represent some of the wildest and most intact lands in the country, they are not without human impacts (Cole and Yung 2010). Candidates for future wilderness should not be held to a higher standard than the existing NWPS.

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