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[Ankita Pokhrel](#) , [Ping Fang](#) ^{*} , [Gaurav Bastola](#)

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Article

Integrating Remote Sensing and Community Perceptions for Sustainable Climate Adaptation Strategies in Mountain Ecosystems

Ankita Pokhrel ¹, Ping Fang ^{1,2,*} and Gaurav Bastola ³

¹ United Nations Environment Program- Institute of Environment for Sustainable Development, College of Environment Science and Engineering, Tongji University

² Hunan Academy of Agricultural Sciences, Institute of Agricultural Environment and Ecology of Hunan Province, Changsha, China; Key Laboratory of Agricultural Environment in the Middle Yangtze River Plain, Ministry of Agriculture and Rural Affairs, Changsha, China; Engineering Technology Research Center for Agricultural Non-Point Source Pollution Control in Dongting Lake Basin, Hunan Province, Changsha, China

³ College of Civil Engineering, Tongji University

* Correspondence: fangping2000@tongji.edu.cn

Abstract: Mountain ecosystems, such as Nepal's Annapurna Conservation Area (ACA), are highly vulnerable to climate change, which threatens biodiversity, water resources, and livelihoods. This study examines Land Use Land Cover (LULC) changes, Normalized Difference Vegetation Index (NDVI) and Normalized Difference Snow Index (NDSI), climate variability, and community perception and adaptations over a 35-year period (1988–2023) using remote sensing, meteorological data, and community surveys. Vegetation expanded by 19,800 hectares, while barren land declined, reflecting afforestation and land reclamation efforts. NDVI showed improved vegetation health, while NDSI revealed significant snow cover losses, particularly after 1996. Meteorological analysis highlighted intensifying monsoonal rainfall and rising extreme precipitation events at lower elevations. Communities reported increased flooding, unpredictable rainfall, and reduced snowfall, driving adaptive responses such as water conservation, crop diversification, and rainwater harvesting. These findings demonstrate the value of integrating scientific data with local knowledge to inform sustainable adaptation strategies. Contributing to Sustainable Development Goals (SDGs) 6 and 13, the findings emphasize the importance of adaptive water management, resilient agriculture, and participatory conservation to enhance climate resilience in mountain ecosystems.

Keywords: climate adaptation; sustainable development; mountain ecosystem; community perceptions; annapurna conservation area

1. Introduction

1.1. Background

Climate change is profoundly affecting ecosystems globally, with mountain ecosystems being particularly vulnerable due to their unique climatic and ecological characteristics. The impacts of climate change on mountain ecosystems manifest through various mechanisms, including alterations in temperature, precipitation patterns, and the dynamics of glacial and permafrost environments. These ecosystems occupy small environmental niches at higher elevations, making them particularly sensitive to climatic changes, which can lead to the loss of biodiversity and habitat [1,2]. Mountains, often referred to as the planet's "water towers," supply freshwater to billions of people and host rich biodiversity. The Annapurna Conservation Area (ACA) in Nepal exemplifies this importance, spanning subtropical lowlands to high-altitude alpine regions [3–6]. Such ecological and elevational

diversity makes ACA an ideal setting to examine climate change impacts and develop sustainable adaptation strategies.

1.2. Literature Review

Over the past decade, numerous studies have explored climate adaptation strategies across various ecosystems, employing diverse methods to understand environmental changes [7–12]. Among these methods, remote sensing technologies have proven highly effective, offering detailed insights into Land Use/Land Cover (LULC) transformations and other key indicators of climate resilience [13–17]. Geospatial analyses, for example, have facilitated the tracking of deforestation, land degradation, and hydrological shifts in mountain regions, shedding light on spatial patterns of change [18–21]. Complementing these spatial assessments, time-series climate trend analyses using meteorological records have helped identify long-term shifts in temperature and precipitation regimes, revealing emerging anomalies and guiding adaptation efforts [14,22].

In addition to environmental indicators, recent research highlights the importance of local ecological knowledge and community perspectives [23]. Incorporating social dimensions into climate studies provides an understanding of how climatic changes are experienced, interpreted, and addressed at the grassroots level, thereby enriching the quantitative data derived from remote sensing and climate trend analyses [24,25]. Mountainous regions, including the ACA in Nepal, illustrate this complexity. Here, climatic changes influence biodiversity, including endangered species such as the snow leopard and red panda, and affect the livelihoods of communities who have long adapted to diverse environmental conditions [6].

While previous research in the ACA and similar mountainous ecosystems has generated valuable information—ranging from spatial LULC patterns to meteorological trends and community insights—many studies have focused primarily on one dimension of climate change [25–28]. This has left opportunities for more integrated approaches that combine these strands of knowledge. By drawing together remote sensing, long-term climate trend assessments, and local perceptions, there is the potential to form a more comprehensive understanding of climate resilience in vulnerable mountain ecosystems.

This study builds on existing foundations and advances the literature by integrating these three critical elements. Rather than addressing climate variability, LULC changes, or community perspectives independently, it synthesizes them into a single analytical framework. This integrated perspective not only enhances our understanding of climate resilience in the ACA but also provides policy-relevant insights that can guide sustainable resource management and conservation strategies in similar mountain regions worldwide.

1.3. Objective

This study adopts a socio-ecological systems framework to investigate the interplay between climatic changes, ecosystem dynamics, and community adaptive strategies in the ACA. By integrating remote sensing, climate time-series data, and community perceptions, this research provides a comprehensive understanding of climate resilience in mountain ecosystems over a 35-year period (1988–2023).

The study aims to detect patterns of LULC changes by analyzing shifts in vegetation, snow cover, barren land, and water bodies using high-resolution satellite imagery, enhanced through topographical correction to account for the complex mountainous terrain. Environmental changes are further assessed through vegetation health and snow cover trends using the Normalized Difference Vegetation Index (NDVI) and Normalized Difference Snow Index (NDSI). To analyze climate variability, long-term temperature and precipitation trends are examined using meteorological data. Additionally, this study gathers community insights to understand local perceptions of climate change impacts and the adaptive strategies employed by residents.

As shown in Figure 1, the study integrates three critical components—remote sensing, climate time series, and community perspectives—to conduct a synthesis of environmental, climatic, and socio-cultural data. This integrated analysis contributes to a holistic understanding of climate

resilience, informing evidence-based resource management and policy interventions. By aligning with the SDGs, particularly SDG 6 (Clean Water and Sanitation) and SDG 13 (Climate Action), the findings offer actionable insights for sustainable adaptation strategies in vulnerable mountain regions.

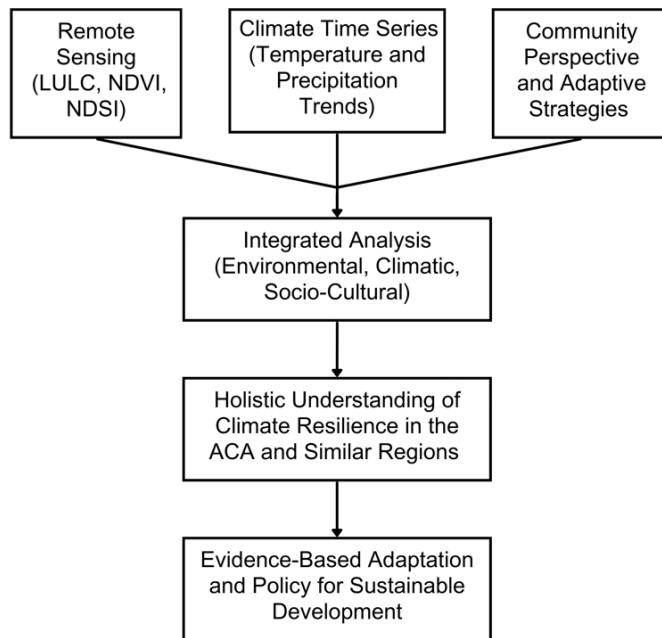


Figure 1. Conceptual Theoretical Framework of the Study.

2. Materials and Methods

2.1. Study Area

ACA is located in central Nepal, stretching from 28°13' N to 29°19' N latitude and 83°29' E to 84°53' E longitude (**Figure 2**). Encompassing an area of 7,629 square kilometers, the ACA exhibits a diverse range of ecosystems, from subtropical lowlands at elevations of about 1,000 meters to alpine regions exceeding 8,000 meters [6]. The region is characterized by significant climatic variation and supports a wide array of flora and fauna, including several endangered species. **Figure 2** illustrates the geographical extent of the ACA, highlighting selected villages that represent the diverse ecological and climatic conditions within the study region.

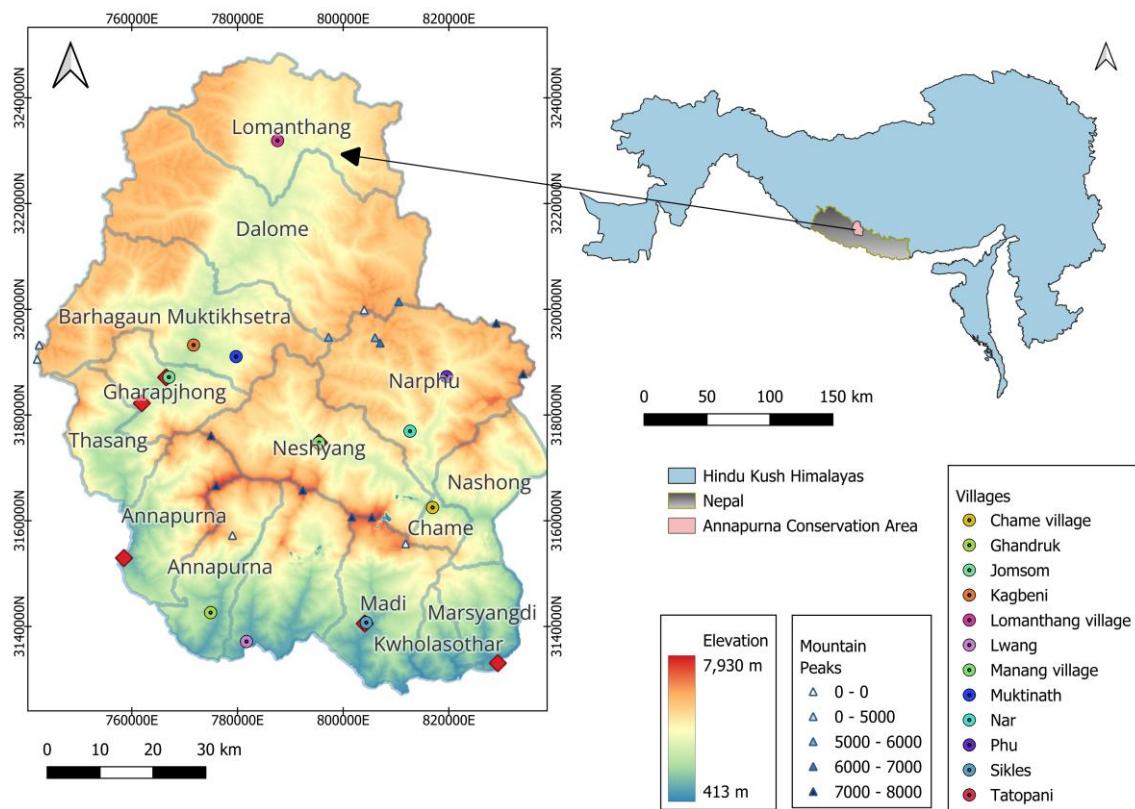


Figure 2. Map of the study area showing the Annapurna Conservation Area and selected villages.

2.2. Data Collection

2.2.1. Remote Sensing and GIS Analysis

Satellite Imagery Acquisition: Landsat satellite imagery from 1988 to 2023 was utilized to detect LULC changes in the ACA. Landsat Collection 2 Level-2 images were acquired from the United States Geological Survey (USGS) Earth Resources Observation and Science (EROS) Center Science Processing Architecture (ESPA) on-demand interface, which provides data preprocessed for atmospheric correction using the Landsat Ecosystem Disturbance Adaptive Processing System (LEDAPS) algorithm.

Table 1 outlines the key specifications of the Landsat satellite imagery utilized for this study, including acquisition dates, sensor types, and cloud cover. To ensure consistency, images were selected from the winter dry season months of November and December, minimizing the effects of cloud cover and seasonal vegetation changes.

Table 1. Landsat satellite imagery used in the study.

Date	Satellite/Sensor	Scene (Path/Row)	Sun Azimuth (°)	Sun Elevation	Cloud Coverage
1988-11-20	Landsat 5 TM	142/40	149.43	35.21	2%
1996-12-12	Landsat 5 TM	142/40	147.51	30.46	4%
2013-12-27	Landsat 8 OLI	142/40	155.30	33.57	1%
2023-11-21	Landsat 8 OLI	142/40	157.42	38.02	2%

2.2.2. Meteorological Data

Temperature and precipitation data were obtained from the Department of Hydrology and Meteorology (DHM) of Nepal for six meteorological stations within the ACA (**Table 2**). Data spanning from 1983 to 2023 were collected, allowing for a comprehensive analysis of climatic trends.

Table 2. Meteorological Stations and Available Data.

Station Index	Name	District	Latitude	Longitude	Elevation	Type of Station
0601	Jomsom	Mustang	28.7840111	83.7298167	2741	Temperature / Precipitation
0604	Thakmarpha	Mustang	28.740909	83.681614	2655	Temperature / Precipitation
0802	Khudi Bazar	Lamjung	28.28220833	84.35640278	838	Temperature / Precipitation
0820	Manang Bhot	Manang	28.66627083	84.02257194	3556	Precipitation
0824	Sikles	Kaski	28.355852	84.102068	1967	Precipitation
0606	Tatopani	Myagdi	28.477492	83.6404158	1161	Precipitation

2.2.3. Community Surveys

Structured interviews were conducted with residents from 11 villages within the ACA to understand local perceptions of climate change and adaptive strategies. A total of 110 respondents were surveyed, representing diverse demographics and occupations. The villages were selected to include wide range of ecosystem and climatic conditions within the ACA region.

The survey questionnaire included sections on:

- Observed climatic changes (temperature, precipitation, snowfall).
- Impacts on water resources and agriculture.
- Adaptive measures undertaken by the community.
- Awareness of government policies and support mechanisms.

2.3. Data Analysis

2.3.1. LULC Change Analysis

Topographic Correction: Given the mountainous terrain of the ACA, topographic effects were minimized using the Sun-Canopy-Sensor plus C (SCS+C) correction method [29]. This method accounts for the influence of terrain on illumination conditions, improving the accuracy of subsequent analyses[30]. **Equation 1** shows the SCS+C correction formula used to mitigate topographic influence and enhance the accuracy of reflectance in the Landsat images.

$$L_n = L \frac{\cos \alpha \cos \theta + C}{\cos i + C} \quad (1)$$

The method utilizes the solar zenith angle (θ), the terrain's slope (α), and the solar incidence angle (i) to normalize the reflectance values (L_n) from the uncorrected reflectance (L).

Land Cover Classification: Next, we employed a multi-class classification approach using a suite of supervised image classification algorithms within the SAGA GIS environment to the acquired Landsat images[31]. We used the Winner Takes All (WTA) method, which integrates the outputs of multiple classification algorithms. The WTA method assigns each pixel to the class with the highest confidence or probability score across all selected classifiers, ensuring a robust and accurate final classification. Specifically, we tested these classifiers within the WTA framework, including Binary Encoding, Parallelepiped, Minimum Distance, Mahalanobis Distance, Maximum Likelihood, and Spectral Angle Mapping. Each algorithm computes class membership differently, ranging from simple geometric thresholds (e.g., Parallelepiped) to probabilistic approaches (e.g., Maximum Likelihood) and spectral similarity measures (e.g., Spectral Angle Mapping), thereby providing a comprehensive set of classification outcomes.

Our final LULC scheme included four primary classes—Barren Land, Snow, Vegetation, and Water—selected based on their prevalence, ecological importance, and distinct spectral signatures in the study area. To ensure robust and unbiased results, the classification process was guided by a training dataset derived from a combination of in situ field observations, existing high-resolution

imagery, and ancillary GIS datasets. Representative training samples were carefully selected to capture the spectral variability within each class, and these samples were divided into training and validation subsets.

Supervised classification was performed using the Maximum Likelihood algorithm. Training samples were selected for four major LULC classes: Vegetation, Snow Cover, Barren Land, and Water Bodies. Classification accuracy was assessed using confusion matrices and overall accuracy metrics.

2.3.2. NDVI and NDSI Analysis

Spatial and temporal variations in NDVI and NDSI were assessed. Mean, maximum, and minimum values were calculated for each year. NDVI and NDSI were calculated to assess changes in vegetation health and snow cover, respectively, using **Equations (2)** and **(3)**, where B represents the band number:

For Landsat 5 TM:

$$NDVI = \frac{(B4-B3)}{(B4+B3)} \text{ and } NDSI = \frac{(B2-B5)}{(B2+B5)} \quad (2)$$

For Landsat 8 OLI:

$$NDVI = \frac{(B5-B4)}{(B5+B4)} \text{ and } NDSI = \frac{(B3-B6)}{(B3+B6)} \quad (3)$$

2.3.3. Climate Data Analysis

Temperature and precipitation trends were analyzed Mann-Kendall trend tests (**Equation 4**) [32,33] and Sen-Slope Estimators [34]. Anomalies and deviations from long-term averages were identified to assess climate variability and trends. Seasonal and annual variations were also examined to understand the impact on water resources and ecosystems.

$$S = \sum_{i=1}^{n-1} \sum_{j=i+1}^n \text{sgn}(x_j - x_i)$$

where:

$$\text{sgn}(x_j - x_i) = \begin{cases} +1 & \text{if } (x_j - x_i) > 0 \\ 0 & \text{if } (x_j - x_i) = 0 \\ -1 & \text{if } (x_j - x_i) < 0 \end{cases} \quad (4)$$

2.3.4. Community Survey Analysis

Survey responses were coded and entered into a database for quantitative analysis. Descriptive statistics were used to summarize the data. Qualitative responses were analyzed thematically to identify common perceptions and adaptive strategies.

2.4. Ethical Considerations

Informed consent was sought from all participants, ensuring confidentiality and adherence to ethical guidelines for research involving human subjects. The study was conducted following all applicable guidelines and with the approval of the Department of National Parks and Wildlife Conservation (DNPWC) and Annapurna Conservation Area Project (ACAP), ensuring that the study's design and execution complied with national conservation laws and respected the ecological and cultural integrity of the area.

3. Results

3.1. LULC Changes

The supervised classification of Landsat images for the years 1988, 1996, 2013, and 2023 revealed significant changes in the distribution of land cover classes as shown in **Figure 2**. **Table 3** provides a quantitative analysis of changes in LULC classes over the study period, revealing key trends such as the expansion of vegetation cover and reductions in barren land.

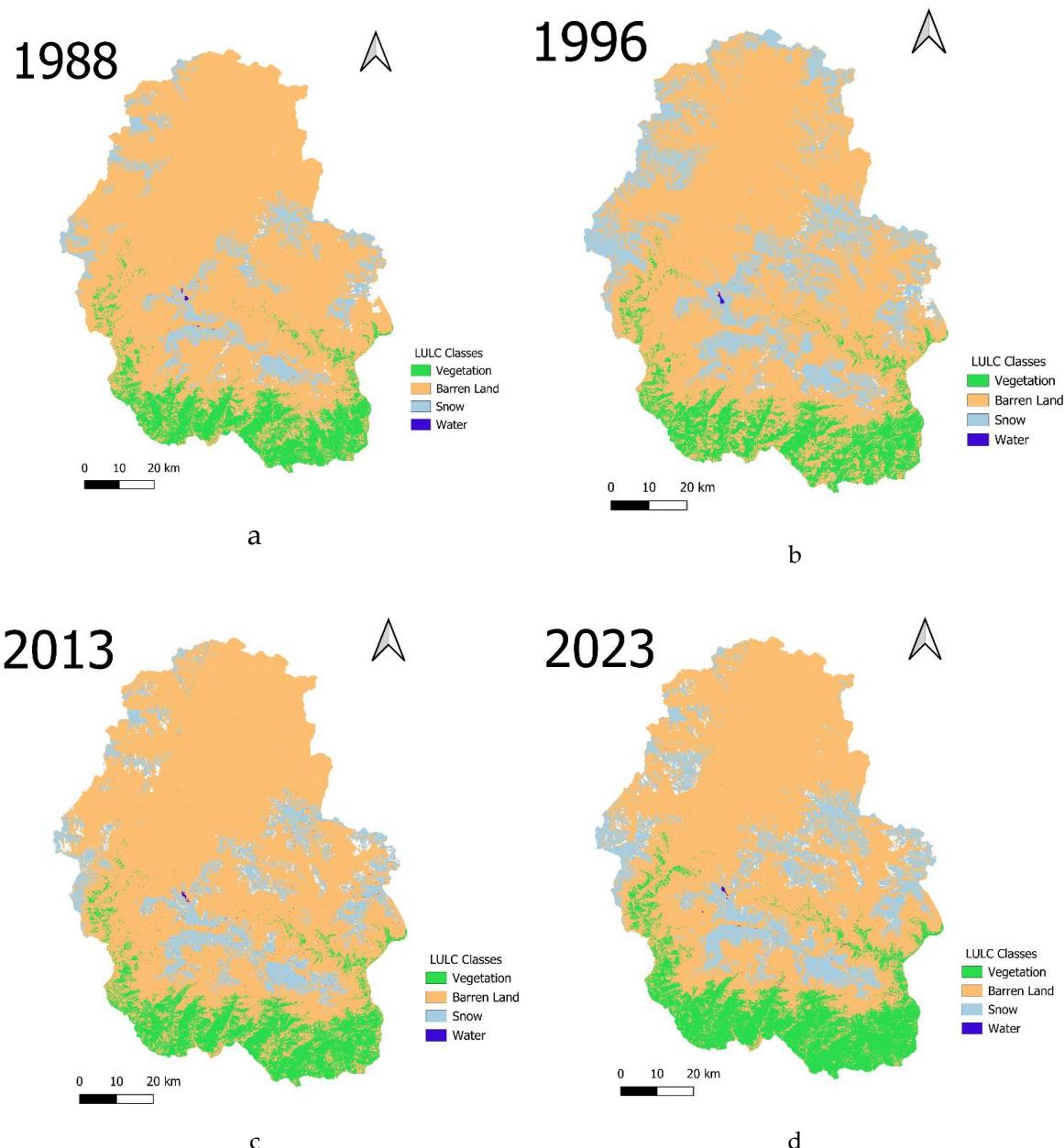


Figure 2. LULC classification maps of the ACA for the years (a) 1988, (b) 1996, (c) 2013, and (d) 2023.

Table 3. Area (in hectares) of different land cover classes from 1988 to 2023.

Year	Class	Name	Area(ha)
1988	1	Vegetation	57858.84
	2	Snow	49583.25
	3	Barren	389018.9
	4	Water	207.72
1996	1	Vegetation	54111.6
	2	Barren	346648.9
	3	Snow	95991.75
	4	Water	177.21
2013	1	Vegetation	57501.27
	2	Barren	369110.8
	3	Snow	62364.6

	4	Water	473.94
2023	1	Vegetation	77634.27
	2	Snow	80323.38
	3	Barren	331252.8
	4	Water	222.93

From 1988 to 2023, notable changes were observed across all land cover classes in the Annapurna region. Vegetation cover expanded significantly from 57,858.84 ha in 1988 to 77,634.27 ha in 2023, reflecting conservation efforts, afforestation programs, and the effects of climate-induced shifts in vegetation zones. Snow cover exhibited variability, peaking at 95,991.75 ha in 1996 but declining to 80,323.38 ha in 2023, indicating the impact of reduced snowfall and temperature increases. Barren land decreased consistently over the study period, from 389,018.9 ha in 1988 to 331,252.8 ha in 2023, driven by afforestation and land restoration efforts. Water bodies, while showing some fluctuations, remained relatively stable, increasing slightly from 207.72 ha in 1988 to 222.93 ha in 2023. These trends illustrate the interplay of conservation initiatives, climatic changes, and land use dynamics in shaping the region's landscape.

3.2. Vegetation Health and Snow Cover Trends

NDVI values increased significantly, with the highest values observed in 2023 (up to +0.98) compared to the lowest in 1988 (up to +0.46) as shown in **Table 4**. Areas with high NDVI values expanded over time.

For NDSI, the values in 2023 and 2013 averaged -0.109 and -0.094, respectively, suggesting a lower range of snow cover. The earlier years, 1996 and 1988, showed average values of 0.176 and 0.157, respectively, more than that of later years. For details, check **Appendix A in Supplementary**. **Table 4** presents the minimum, maximum, and average NDVI and NDSI values.

Table 4. NDVI and NDSI statistics from 1988 to 2023.

Years	NDVI min.	NDVI max.	NDVI avg.	NDSI min.	NDSI max.	NDSI avg.
1988	-0.324	0.461	0.069	-0.451	0.765	0.157
1996	-0.270	0.440	0.085	-0.440	0.791	0.176
2013	-0.331	0.989	0.329	-0.996	0.808	-0.094
2023	-0.304	0.983	0.340	-0.995	0.776	-0.109

3.3. Climate Variability Analysis

Temperature data from the meteorological stations were analyzed to identify trends in Tmax and Tmin temperatures. **Figure 3** visualizes the annual mean Tmax and Tmin temperatures from 1983 to 2023, capturing long-term climatic trends and variability across the ACA.

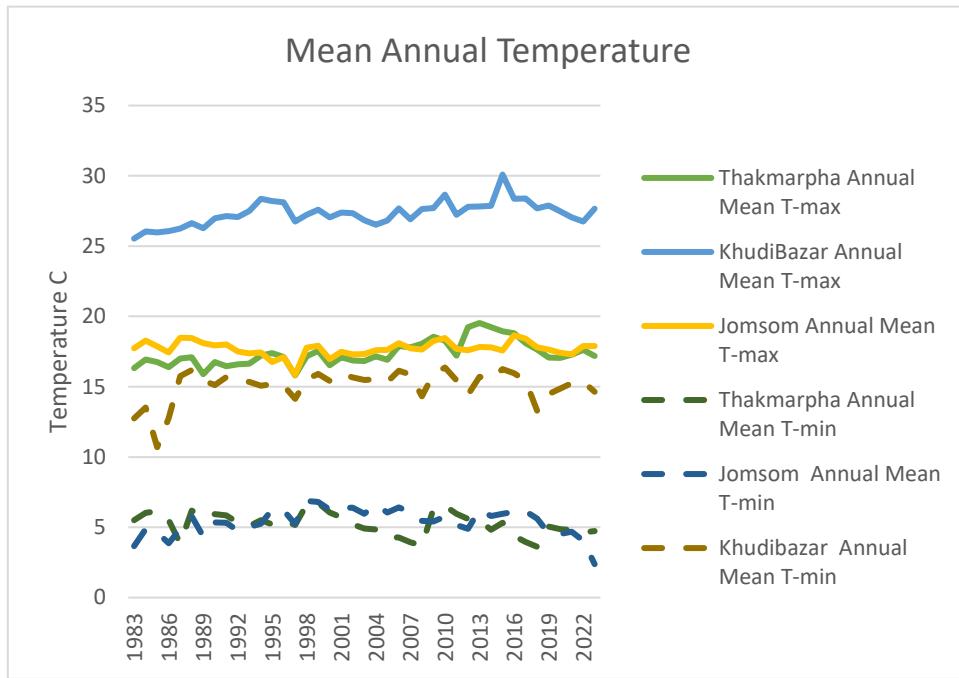


Figure 3. Annual mean Tmax and Tmin for Thakmarpha, Jomsom, and Khudi Bazar.

- **Warming Trend in Tmax:** All stations showed a positive trend in Tmax. Thakmarpha and Khudi Bazar exhibited statistically significant increases ($p < 0.001$).
- **Mixed Trends in Tmin:** Thakmarpha showed a significant negative trend in Tmin ($p = 0.001$), while Jomsom and Khudibazar had positive but non-significant trends. **Table 5** presents the results of the Mann-Kendall trend test for temperature data, indicating statistically significant trends in maximum and minimum temperatures. Check **Appendix B in Supplementary** for trend graphs.

Table 5. Mann-Kendall trend test and sen-slope estimator results for temperature data.

Stations		Tmax	Tmin
Thakmarpha	p-value	<0.0001	0.001
	sen-slope	0.040	-0.033
	Trend	Positive	Negative
Jomsom	p-value	0.866	0.745
	sen-slope	0.001	0.006
	Trend	Positive	Positive
Khudibazar	p-value	<0.0001	0.328
	sen-slope	0.040	0.010
	Trend	Positive	Positive

Similar to the temperature data, annual precipitation data were analyzed for trends using the Mann-Kendall test. **Figure 4** shows the annual precipitation trends for the stations.

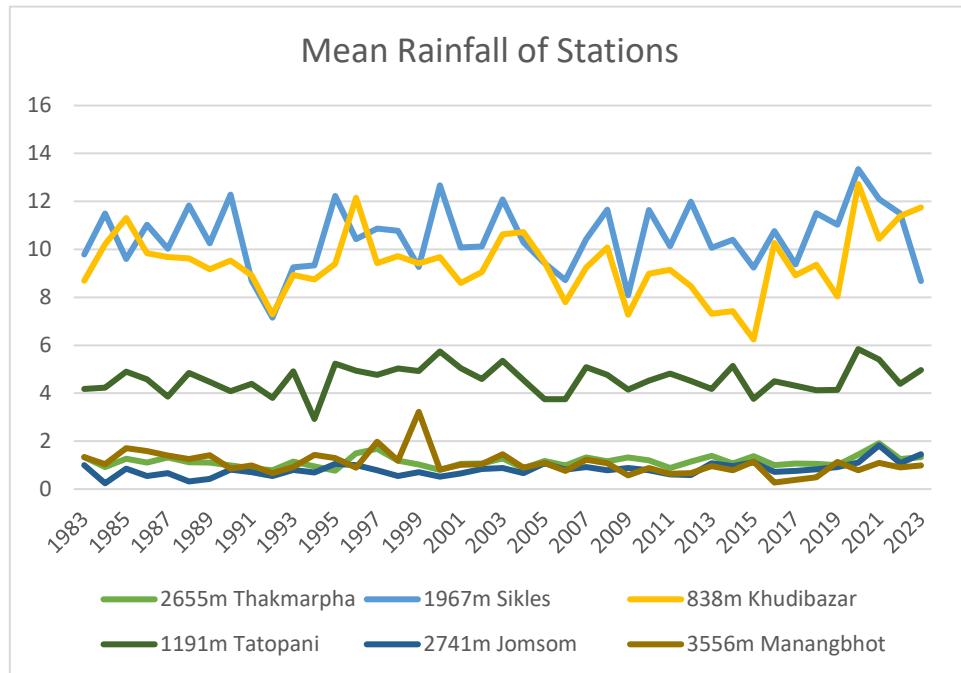


Figure 4. Annual precipitation for Thakmarpha, Jomsom, Khudi Bazar, Sikles, Manang Bhot, and Tatopani.

- **Positive Trends:** Thakmarpha and Jomsom exhibited positive trends in precipitation, with Jomsom's trend being statistically significant ($p < 0.001$).
- **Negative Trends:** Khudi Bazar showed a negative but non-significant trend. Manang Bhot displayed a significant negative trend ($p = 0.001$).
- **Variability:** Precipitation patterns were highly variable, with anomalies such as droughts and extreme rainfall events. **Table 6** provides the Mann-Kendall test results for precipitation.

Table 6. Mann-Kendall trend test and sen-slope estimator results for precipitation data.

Stations	Precipitation		
Thakmarpha	p-value	0.154	
	sen-slope	0.004	
	Trend	Positive	
Jomsom	p-value	0.000	
	sen-slope	0.012	
	Trend	Positive	
Khudibazar	p-value	0.661	
	sen-slope	-0.009	
	Trend	Negative	
Sikles	p-value	0.465	
	sen-slope	0.016	
	Trend	Positive	
Manang Bhot	p-value	0.001	
	sen-slope	-0.015	
	Trend	Negative	
Tatopani	p-value	0.582	
	sen-slope	0.004	
	Trend	Positive	

The frequency of extreme precipitation events in the Annapurna region has exhibited notable changes over the past four decades. An analysis of the data reveals that days with significant rainfall have generally increased across all stations. **Figure 5** illustrates the normalized frequency of extreme precipitation events over the past four decades, emphasizing changes in rainfall patterns that influence flood risk and water resource management.

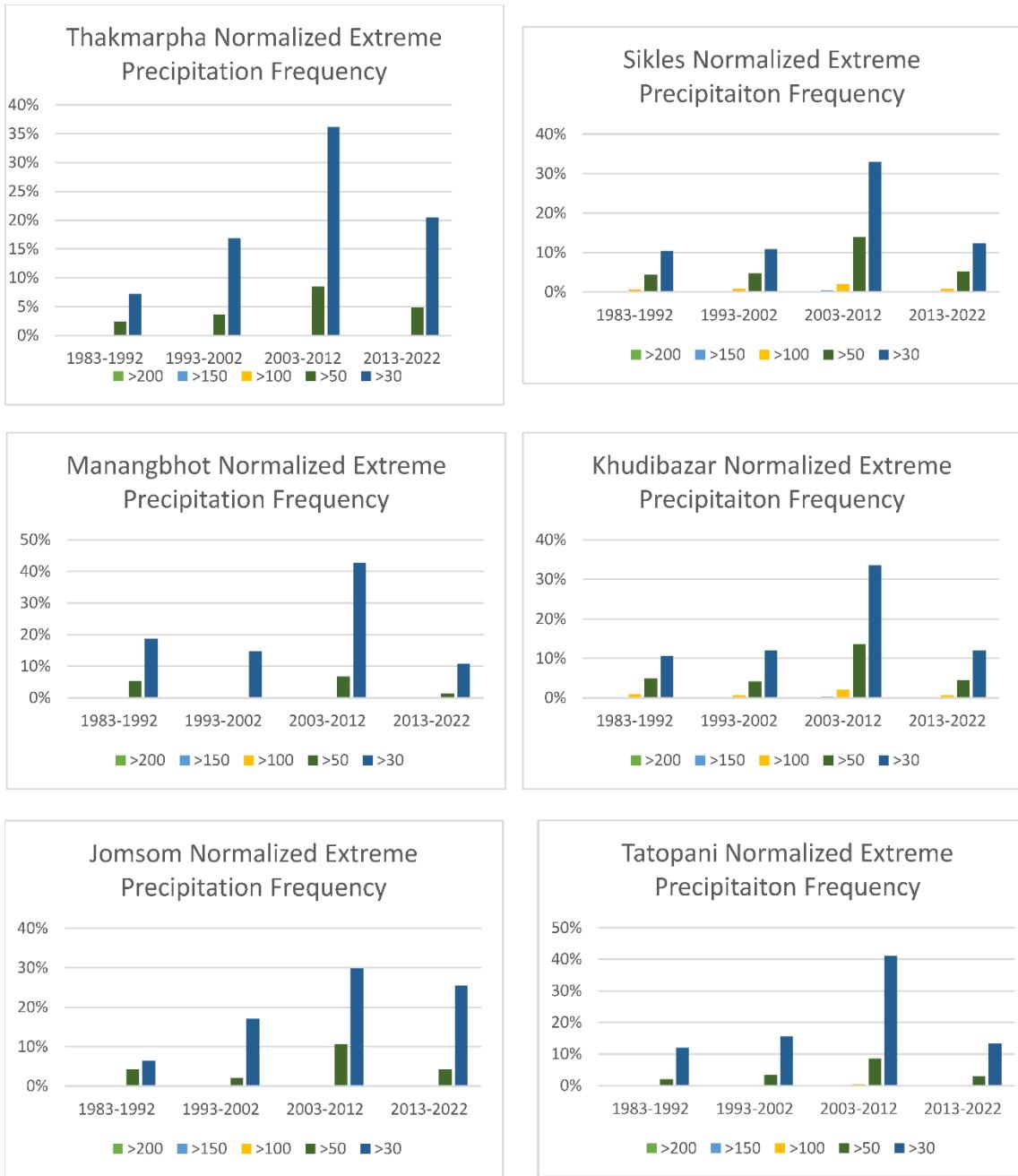


Figure 5. Normalized extreme precipitation frequency across stations.

Increase in Moderate Extreme Events: The percentage of days with rainfall exceeding 30 mm increased substantially over the decades. In 1983-1992, this percentage ranged from 6% to 12%, rising to 33% to 43% in 2003-2012. Days with rainfall over 50 mm also increased, from 2%–5% in 1983-1992 to 8%–14% in 2003-2012. Despite the increase in moderate extremes, occurrences of rainfall exceeding 100 mm remain relatively rare, with only a slight rise from 0%–1% in 1983-1992 to 2% in 2003-2012. The most recent decade (2013-2022) suggests a stabilization or slight decline in the frequency of these extreme events compared to the previous decade. The percentage of days with rainfall over 30 mm and 50 mm has not shown the same rate of increase as observed earlier.

An analysis of rainfall patterns across the Annapurna region reveals significant changes over the decades, with notable differences between higher elevation and lower elevation stations.

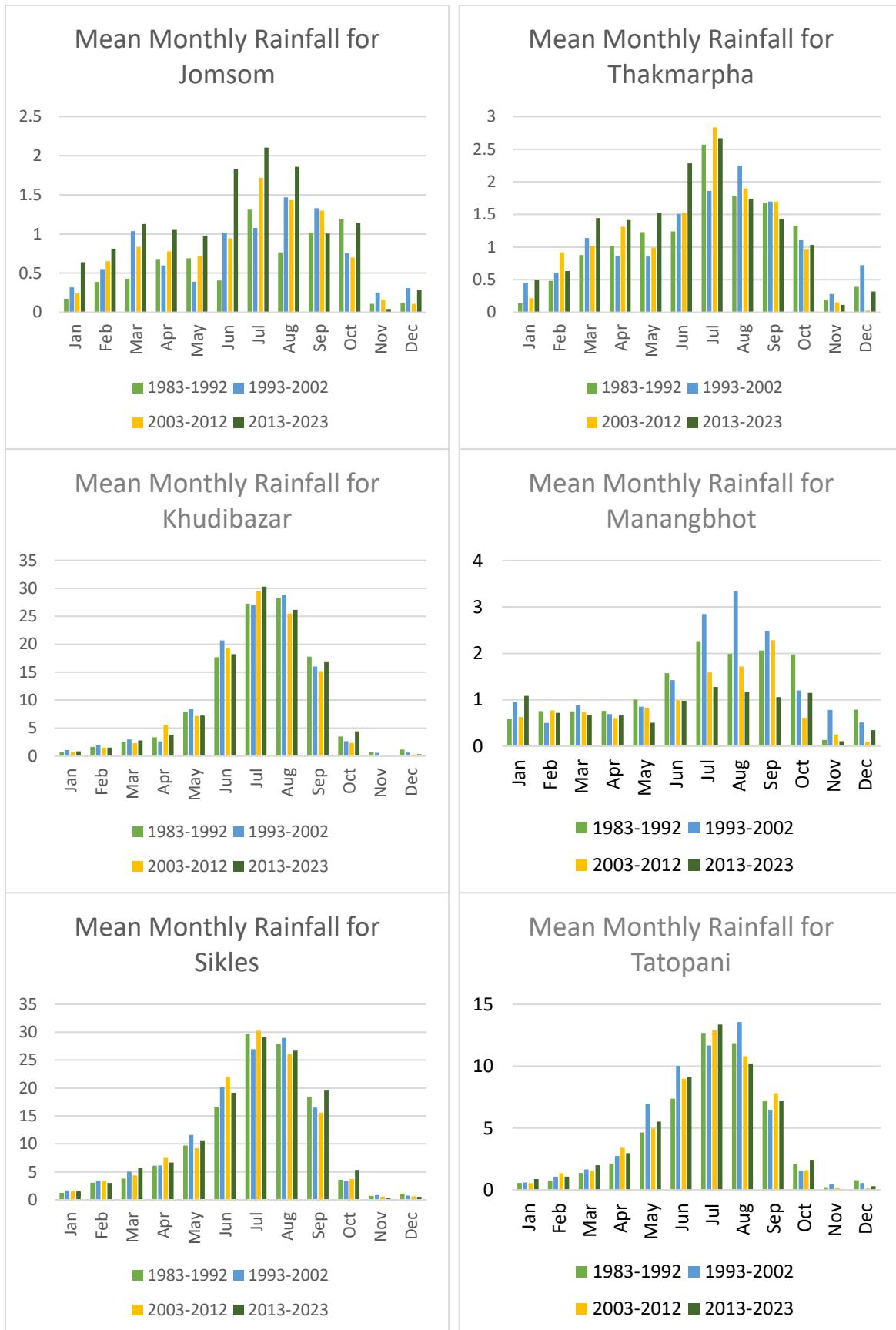


Figure 6. Decadal changes in precipitation pattern in given station.

Higher elevation stations such as Thakmarpha, Manang Bhot, and Jomsom exhibited a consistent increase in mean monthly rainfall during the monsoon months (July and August). Thakmarpha's July rainfall rose from 2.57 mm in 1983–1992 to 2.67 mm in 2013–2023. Jomsom's July rainfall increased from 1.31 mm to 2.10 mm over the same period.

Lower elevation stations like Sikles, Tatopani, and Khudi Bazar showed substantial increases in rainfall during the monsoon months. Sikles recorded July rainfall increases from 29.71 mm in 1983–1992 to 30.30 mm in 2013–2023. Khudi Bazar's July rainfall rose from 27.25 mm to 30.30 mm over the same period.

3.4. Community Perceptions and Adaptive Strategies

Appendix C in Supplementary includes the questionnaire and the demographic overview of the respondents.

Perception of Climate Change: Surveys conducted in 11 villages within the ACA indicate a high level of awareness regarding climate change among residents. A significant majority (85%) reported noticeable changes in climatic patterns, particularly a decrease in snowfall and alterations in precipitation. Approximately 70% of respondents noted changes in water availability, which they attributed to these climatic shifts. Residents observed that these changes directly impacted their agricultural practices, with shifts in crop types and growing seasons becoming necessary to adapt to the new conditions.

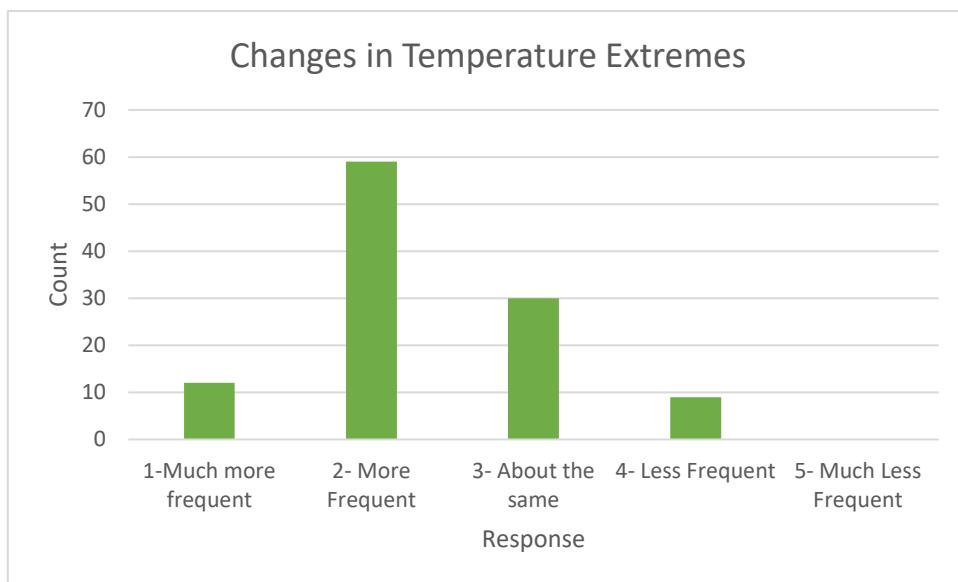


Figure 8. Responses for Changes in Temperature Extremes.

Temperature Extremes and Weather Patterns: The community's perception of climate change is notably well-informed, with a majority acknowledging its impacts on local ecosystems and livelihoods. Survey respondents have observed significant changes in local weather patterns, including more pronounced and frequent extreme weather events.

A significant number of respondents have observed changes in temperature extremes, with some noting that water now freezes less often, indicating milder winters. Rainfall patterns have been described as unpredictable, and several individuals have reported less snowfall, which aligns with the concerns about shorter winter seasons.

Water Availability and Infrastructure: The survey results present an encouraging trend in water availability and infrastructure within the community. Contrary to the challenges often faced in many regions, our data shows a marked improvement in access to water resources. Currently, all surveyed households report having access to piped water, a significant development compared to just a few years prior when such amenities were limited to a fraction of the population. It aligns with

the 2023 Joint Monitoring Program (JMP), National Water, Sanitation and Hygiene (NWASH) data, which is also on a positive trend in achieving SDG 6 [35].

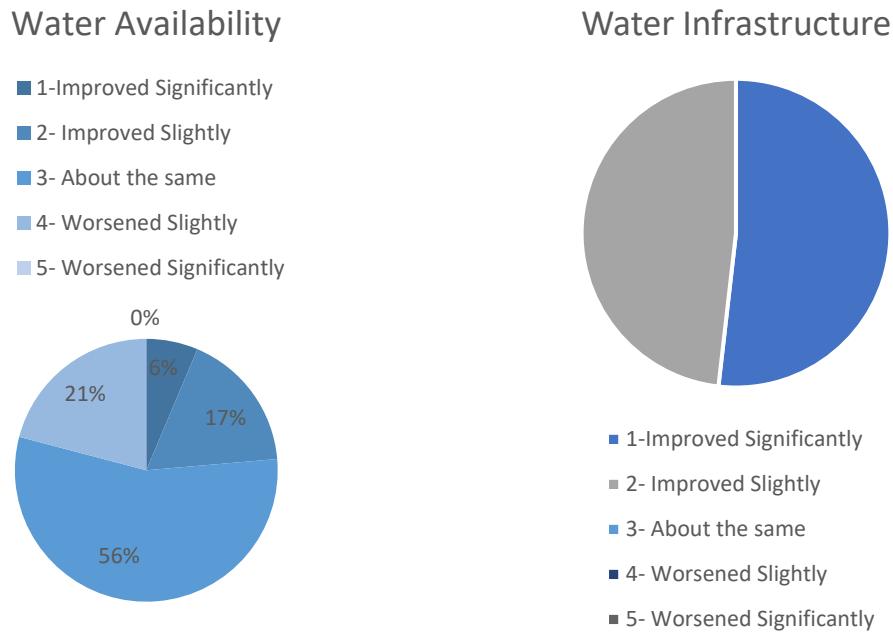


Figure 9. Responses on Water Availability and Infrastructure.

This progress in water infrastructure is a testament to successful policy implementation and investment in the community's essential services. The upgrade has likely contributed to the community's well-being, as reliable access to clean water is a cornerstone of public health, economic development, and environmental sustainability. This positive shift also reflects a growing recognition of the importance of water security in the face of climate change, prompting proactive measures to ensure resilience and adaptability in water management systems.

The improved infrastructure sets a solid foundation for future initiatives to manage water resources sustainably. It is also a crucial step toward achieving related SDGs, particularly SDG 6, which calls for clean water and sanitation for all. The survey's findings can thus be a springboard for discussions on maintaining and furthering these gains, ensuring that water security remains a priority in policy planning and community development efforts.

Community Involvement and Social Support: Community engagement in local water management groups is mixed, with a significant number of respondents indicating moderate to high levels of involvement. This engagement suggests a community that is somewhat active and potentially receptive to initiatives for improving local resilience to climate change. On the other hand, a portion of the population is less involved, which may reflect barriers to participation or differing priorities. Understanding the factors that drive or hinder community involvement can inform strategies to foster more significant collective action in response to environmental challenges.

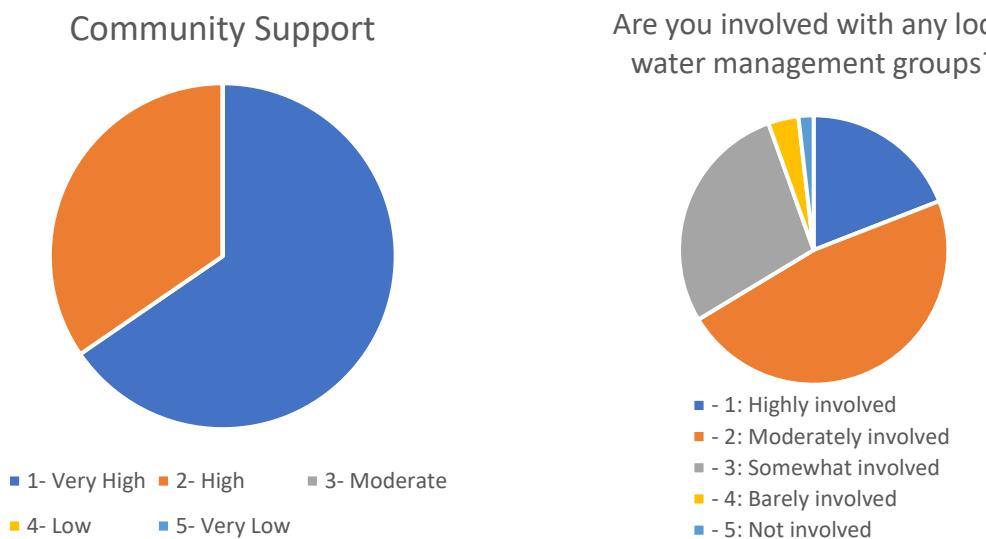


Figure 10. Responses on Social Support and Involvement.

Open-Ended Responses: Open-ended responses highlight specific incidents, such as floods and landslides, directly impacting businesses and agriculture. Concerns about the changing climate patterns affecting the availability and quality of water sources are evident, with some respondents attributing these changes to climate change, deforestation, and natural variations. The survey data analysis reveals a community experiencing and observing tangible environmental changes due to climate change. There is a clear indication of altered weather patterns, water scarcity issues, and shifts in agricultural practices. Despite these challenges, the community's solid social support network and involvement in local environmental management suggest a capacity for resilience and adaptation. The data underscores the need for continued monitoring, community engagement, and adaptive strategies to mitigate the impacts of climate change on these vulnerable mountain communities.

4. Discussion

4.1. LULC, Vegetation and Snow Cover Trends

The analysis of Landsat satellite imagery, corrected for topographical distortions, reveals significant land use and land cover (LULC) changes in the ACA over the 35-year period from 1988 to 2023. Vegetation cover increased substantially, expanding from 57,859 hectares in 1988 to 77,634 hectares in 2023, with a net gain of 19,775 hectares. This growth corresponds with a reduction in barren land, which decreased by 57,766 hectares, reflecting a shift toward afforestation and land reclamation. Snow cover displayed notable variability, peaking in 1996 before declining in subsequent years. Water bodies, meanwhile, exhibited relatively minor fluctuations over the study period. NDVI trends demonstrate a consistent improvement in vegetation health, with average NDVI values increasing from 0.069 in 1988 to 0.340 in 2023, and maximum values reaching 0.983, highlighting enhanced vegetation cover and a potential upward shift of vegetation zones into higher elevations due to warming temperatures.

The increase in vegetation cover aligns with regional findings by [26], who observed greening trends across the Central Himalayas due to warming-induced expansion of vegetation into higher elevations. Additionally, [17] documented a 28% reduction in areas devoid of vegetation (including glaciers) from 2000 to 2014, with these areas transitioning into vegetated land, particularly in the eastern Himalayas. Studies from other mountainous regions, such as the Scandinavian Mountain Range, have also documented increases in total tree canopy cover and field vegetation in alpine areas, while noting shifts in vegetation composition [36]. These findings further emphasize how regions

adjacent to retreating glaciers or with favorable climatic conditions are transforming into vegetated landscapes. Our study builds on these findings by providing a longer-term, temporally consistent analysis spanning 35 years while incorporating topographical corrections to improve classification accuracy—a crucial step in mountainous terrains.

The observed increase in vegetation can be linked to several mechanisms. First, the establishment of the ACA as a protected area has significantly reduced deforestation while promoting natural regeneration and afforestation through community-led conservation programs [6]. Second, warming temperatures over recent decades may have extended the growing season and enabled vegetation to establish in areas previously covered by snow or barren land. This trend aligns with studies not just in the Himalayas but also in other mountain areas, which highlight the upward shift of vegetation zones under climate warming. Furthermore, sustainable land management practices adopted by local communities have likely contributed to stabilizing degraded lands, as indicated by reduced barren areas. This trend highlights not only an expansion of vegetation cover but also a likely shift in vegetation zones toward higher elevations, as warming temperatures create favorable growing conditions in previously barren or snow-covered areas. This upward expansion, commonly observed in other mountainous regions worldwide, aligns with global findings on vegetation responses to climate change. For instance, similar trends have been reported in the Alps [37], Andes [38], and other regions of the Himalayas [21,39], where vegetation zones are migrating upward due to rising temperatures and extended growing seasons.

In contrast, the NDSI trends reveal a concerning pattern of declining snow cover over time, which aligns with broader global observations of shrinking cryospheric zones. Snow cover in the ACA showed significant seasonal fluctuations, with marked reductions during the winter months. Average NDSI values decreased from 0.157 in 1988 to -0.109 in 2023, reflecting a loss of snow cover extent and density. These trends are consistent with observations from similar mountain ecosystems.[37–39] The interplay between vegetation expansion and snow cover reduction underscores the complex ecological impacts of climate change in the ACA. On one hand, warmer temperatures and reduced snow cover provide opportunities for vegetation growth, particularly in alpine zones. On the other hand, the loss of snowpack has cascading effects on water availability, hydrological cycles, and habitat suitability for snow-dependent species. Declining snow cover also poses a threat to flagship species like the snow leopard in the ACA [40], which relies on snow-laden environments for prey availability and movement patterns. Moreover, communities downstream may experience altered water flow regimes due to changes in snowmelt timing and volume, emphasizing the critical need for adaptive water resource management.

The fluctuations in snow cover observed during the study period reflect the combined effects of rising temperatures and variable winter precipitation. While snow cover peaked in 1996, subsequent declines align with regional studies that attribute reduced snow accumulation to increased warming and melting in the Himalayas [17,41,42]. This loss of snowpack disrupts hydrological cycles, diminishing streamflow availability and impacting water-dependent agricultural and ecological systems. Snowpack reductions also pose risks to downstream ecosystems and communities, which rely on snowmelt during drier months. As snow serves as a critical natural reservoir, its loss could have far-reaching consequences for regional water security and ecological stability [41].

While these findings align with global trends, the ACA presents a unique case where both natural and anthropogenic factors interplay to drive ecological outcomes. The observed improvements in vegetation health suggest that conservation policies, such as afforestation and protection from deforestation, have effectively contributed to ecological resilience. However, the persistent loss of snow cover calls for urgent attention to mitigate its impacts on the region's hydrology and biodiversity. Further research should aim to disentangle the relative contributions of climate-driven changes and conservation measures, offering a more nuanced understanding of how to sustain these ecosystems under accelerating climatic pressures. By integrating scientific and local knowledge, future conservation strategies can better address these complex interactions and foster resilience in this vulnerable mountain ecosystem.

4.2. Climate Variables and Extremes

The analysis of temperature data across the ACA indicates a clear warming trend, particularly in maximum temperatures (Tmax). All meteorological stations showed positive trends in Tmax, with statistically significant increases observed at Thakmarpha and Khudi Bazar ($p < 0.001$). For example, Thakmarpha recorded a sen-slope of $+0.040^{\circ}\text{C}$ per year. These findings align with previous studies, which report similar warming trends across the Himalayan region [22]. In contrast, trends in minimum temperatures (Tmin) were more variable. Thakmarpha exhibited a significant decline in Tmin (sen-slope of -0.033°C per year, $p = 0.001$), while Jomsom and Khudi Bazar recorded positive but non-significant trends. These divergent patterns may reflect the influence of microclimatic conditions, such as local topography, elevation, and vegetation cover, as well as variations in nighttime cooling rates in mountainous terrain.

Precipitation trends exhibited significant spatial variability across the ACA. Stations such as Jomsom showed a statistically significant increase in annual precipitation ($p < 0.001$, sen-slope of $+0.012 \text{ mm/year}$), while Manang Bhot experienced a significant decline ($p = 0.001$, sen-slope of -0.015 mm/year). Thakmarpha and Sikles recorded positive but non-significant trends, whereas Khudi Bazar showed a non-significant negative trend. This spatial heterogeneity aligns with findings from [22], which emphasize the complex interactions between monsoonal dynamics and local topography in determining precipitation patterns in the Himalayas. An increasing frequency of extreme precipitation events was observed, particularly at lower elevation stations. Days with rainfall exceeding 30 mm increased significantly, rising from 6–12% in the 1983–1992 period to 33–43% in 2003–2012. Similarly, the frequency of days with rainfall exceeding 50 mm doubled, from 2–5% to 8–14% over the same period. However, rainfall exceeding 100 mm remained relatively rare, with only a slight increase from 0–1% to 2% during the study period. The most recent decade (2013–2023) suggested a stabilization or slight decline in the frequency of these extreme events, reflecting natural variability in precipitation patterns.

These trends are consistent with projections from global climate studies, which link warming-induced intensification of the hydrological cycle to an increased frequency of extreme rainfall events [43]. The spatial patterns observed in the ACA—greater intensification at lower elevations—may result from orographic effects and the enhanced capacity of warmer air to retain and release moisture during convective activity. Decadal analyses revealed contrasting trends between higher and lower elevations. At higher elevation stations, such as Thakmarpha and Jomsom, monsoonal rainfall during July and August showed consistent increases. For instance, Thakmarpha's mean July rainfall rose from 2.57 mm in 1983–1992 to 2.67 mm in 2013–2023. In contrast, lower elevation stations such as Sikles and Khudi Bazar exhibited more pronounced increases in monsoonal rainfall. Sikles recorded a July rainfall increase from 29.71 mm to 30.30 mm over the same period, reflecting the amplified impact of atmospheric warming and moisture availability at lower altitudes.

The observed climatic trends in the ACA can be attributed to a combination of global and regional mechanisms. Rising temperatures, driven by anthropogenic greenhouse gas emissions, are intensifying the hydrological cycle, leading to more frequent and intense rainfall events. The variability in precipitation trends across stations highlights the influence of local factors, including topography, vegetation cover, and proximity to moisture sources. At higher elevations, warming temperatures are likely accelerating glacial melt, contributing to altered streamflow regimes and seasonal water availability [44]. These dynamics are consistent with broader trends observed in other mountain regions.

The climatic changes observed in the ACA have profound implications for ecosystems, water resources, and human livelihoods. Increased Tmax and extreme precipitation events at lower elevations heighten the risks of flooding, soil erosion, and infrastructure damage. These changes pose challenges for agriculture, as altered rainfall patterns can disrupt planting schedules and reduce crop yields. At higher elevations, the retreat of glaciers and reductions in snow cover threaten water security for downstream communities, particularly during the dry season [41].

4.3. Community Perception and Adaptation

The perceptions of local communities in the ACA regarding climate change provide critical insights into how environmental shifts are experienced and managed on the ground. Surveys conducted across 11 villages revealed a high level of awareness of climatic changes, with 85% of respondents noting a decrease in snowfall and alterations in precipitation patterns. These observations align with the environmental trends documented in this study, suggesting that communities are attuned to the impacts of climate variability. A significant proportion (70%) of respondents reported changes in water availability, attributing these to climatic shifts. The impacts on agriculture were particularly pronounced, with residents adjusting crop types and growing seasons to adapt to unpredictable rainfall and shorter winters. These findings echo those of, who similarly identified water conservation and crop diversification as primary adaptive strategies among Himalayan communities [45].

The community's perception of changing temperature extremes further underscores their understanding of local climate dynamics. Many respondents observed milder winters, with water freezing less frequently, and described rainfall patterns as increasingly erratic. These observations align with our findings on temperature trends and precipitation variability, which indicate significant warming and an increase in extreme rainfall events. This alignment between observed climatic trends and community perceptions highlights the validity of local knowledge as a complement to scientific data in understanding climate change impacts.

Water availability and infrastructure improvements emerged as critical themes in the survey responses. Contrary to challenges often reported in other mountain regions, all surveyed households in the ACA now have access to piped water, reflecting significant progress in water infrastructure development. This improvement not only enhances community resilience to water scarcity but also aligns with global trends toward achieving SDG 6 (Clean Water and Sanitation). The community's proactive measures, such as rainwater harvesting and efficient irrigation practices, demonstrate their capacity to adapt to changing water dynamics. However, sustained efforts are needed to ensure that these gains are maintained and expanded to remote areas that may still face challenges in water access.

Community engagement in local water management and environmental initiatives shows a mixed picture. While many respondents reported moderate to high involvement, others highlighted barriers to participation, such as limited resources or competing priorities. This variation underscores the importance of fostering inclusive approaches to community engagement, with targeted support for vulnerable groups who may face greater barriers to participation. Strengthening local capacity and providing technical assistance can further enhance collective action in managing climate risks.

The survey also revealed the broader socio-economic implications of climate change. Respondents frequently mentioned floods and landslides as direct impacts on agriculture and livelihoods. These events, driven by increased extreme precipitation, exacerbate existing vulnerabilities in the region. Despite these challenges, the community's strong social support networks and active participation in conservation efforts reflect a capacity for resilience [46].

The adaptive strategies employed by the ACA communities are shaped by their direct experiences of climatic changes. Water conservation measures, adjustments in crop types and planting schedules, and participation in environmental initiatives highlight their resilience in the face of environmental challenges. These strategies, however, require further support to address emerging risks and ensure long-term sustainability. Enhanced policy frameworks, capacity-building initiatives, and investments in infrastructure are critical to strengthening adaptive capacities. For instance, integrating community-driven approaches into regional climate adaptation policies can ensure that strategies are both locally relevant and effective.

In conclusion, the alignment between community perceptions and observed climatic trends underscores the importance of integrating local knowledge into climate adaptation strategies. The proactive measures undertaken by the ACA communities provide valuable lessons for other mountain regions facing similar challenges. However, sustained policy support, capacity-building, and infrastructure investments are essential to build on these efforts and enhance the resilience of

vulnerable mountain communities. By fostering stronger connections between scientific research and community-based initiatives, we can develop more effective and sustainable responses to the complex challenges posed by climate change.

4.4. Policy Implications and Sustainable Adaptation Strategies

By integrating scientific data, including remote sensing and meteorological analyses, with community insights, this study identifies key areas for policy intervention that align with SDG 6 and 13. These implications emphasize the interconnected nature of ecological, climatic, and socio-economic challenges and offer a pathway toward sustainable adaptation strategies.

The observed improvements in vegetation cover and reductions in barren land highlight the success of conservation efforts, but also underscore the need for climate-smart resource management practices. Policies should prioritize initiatives such as promoting climate-resilient agriculture, including the introduction of drought-tolerant crop varieties and water-efficient irrigation systems, which can mitigate the risks posed by erratic rainfall patterns and water scarcity. Supporting agroforestry programs can enhance biodiversity, reduce soil erosion, and sequester carbon, offering both ecological and economic benefits. Moreover, addressing water resource challenges through the expansion of rainwater harvesting infrastructure and groundwater recharge systems is critical to ensuring year-round water availability for agriculture and household needs. Such measures will not only improve water security but also enhance resilience against seasonal variability and extreme weather events.

The findings related to snow cover fluctuations and the upward expansion of vegetation zones present unique challenges for biodiversity conservation. Cold-adapted species such as the snow leopard and red panda face shrinking habitats, while changes in snow cover threaten the hydrological cycles that sustain downstream ecosystems and communities. Conservation policies must incorporate measures to protect critical habitats, particularly in alpine and riparian zones, and promote the restoration of degraded ecosystems. Payment for Ecosystem Services (PES) programs could incentivize local communities to engage in conservation activities, such as afforestation, watershed management, and wildlife monitoring, ensuring both ecological preservation and community livelihoods.

Community perceptions of climate change impacts, such as reduced snowfall and changes in water availability, align closely with the scientific findings, reinforcing the importance of integrating local knowledge into policy frameworks. Strengthening the role of community-based water management groups through technical training and resource allocation can empower residents to manage water systems more effectively. Policymakers should also focus on enhancing the capacity of communities through education and training programs that promote awareness of climate adaptation strategies, such as sustainable farming practices and efficient water use. These initiatives should be designed to foster inclusivity, addressing barriers to participation faced by marginalized groups and ensuring that adaptation efforts are equitable.

The observed increase in extreme precipitation events, particularly at lower elevations, highlights the need for policies that address disaster risk reduction. Investments in resilient infrastructure, such as flood-resistant roads and bridges, are essential to mitigate the impacts of flooding and landslides on livelihoods and critical services. Early warning systems for extreme weather events, combined with localized emergency response plans, can enhance community preparedness and reduce vulnerabilities. The integration of these measures into national climate adaptation plans will ensure that they are implemented systematically and sustainably.

Effective governance frameworks are crucial for translating these findings into actionable policies. Collaborative governance models that bring together government agencies, conservation organizations, and local communities can ensure that interventions are both scientifically sound and culturally relevant. Strengthening communication channels between national policymakers and grassroots stakeholders will enable bottom-up feedback mechanisms, ensuring that local needs and priorities are reflected in broader climate adaptation strategies. Furthermore, scaling up education

campaigns on climate resilience can foster a deeper understanding of the challenges and solutions, empowering individuals and communities to contribute proactively to sustainability efforts.

In addition to local interventions, this study highlights the importance of leveraging technology and data integration to inform policy decisions. Expanding meteorological monitoring networks in high-altitude and remote areas can improve the resolution of climate trend analyses, while GIS-based tools can provide real-time data on land use changes, vegetation health, and snow cover dynamics. These advancements will support evidence-based policymaking and enable adaptive management strategies that respond to emerging challenges.

The alignment of the study's findings with SDGs 6 and 13 provides a clear framework for prioritizing policy actions. **Table 7** outlines how our study's outcomes align with specific targets under SDGs 6 and 13, along with tailored recommendations to enhance sustainability efforts. For SDG 6, expanding access to clean water in underserved areas, promoting efficient irrigation techniques, and safeguarding water-related ecosystems are critical steps. For SDG 13, integrating local adaptation measures into national climate policies and providing technical and financial support for community-driven initiatives will strengthen resilience to climate-related hazards. Policymakers must ensure that these actions are coordinated and mutually reinforcing, balancing ecological conservation with socio-economic development.

Table 7. Alignment of study findings with relevant United Nations Sustainable Development Goals (SDGs) 6 and 13. The colors represent the following: Green indicates good progress or positive outcomes with minor improvements needed, Orange denotes mixed results or moderate progress with significant room for enhancement, and Red reflects poor progress or major issues requiring immediate attention.

Relevant SDG Target	Indicator	Assessment	Recommendation
6.1 Achieve universal and equitable access to safe and affordable drinking water for all	Piped water access in surveyed households, higher than recent years	● High rate of access to piped water, indicating effective infrastructure improvements; however, ongoing maintenance and further expansion to remote areas is necessary	Continue infrastructure maintenance, expand piped water systems to underserved and remote areas, and monitor water quality regularly
6.4 Substantially increase water-use efficiency and ensure sustainable water withdrawals	Water availability and seasonal trends	● Survey data shows mixed trends in water availability, with some areas experiencing seasonal scarcity due to changing climate patterns	Foster cross-sectoral cooperation for water management, implement efficient irrigation techniques, and explore rainwater harvesting initiatives
6.6 By 2020, protect and restore water-related ecosystems, including mountains, forests, wetlands, rivers, aquifers and lakes	Increase in vegetation cover change analysis, Fluctuations in snow cover (1988-2023) from the LULC	● Positive ecosystem changes observed, attributed to conservation and reforestation efforts; snow cover fluctuations present challenges for hydrological cycles	Continue and expand conservation and reforestation efforts, integrate adaptive measures for snow cover management to balance hydrological needs
6.B Support and strengthen the participation of local communities	Involvement of locals in water management groups	● Moderate engagement observed; community-driven water management	Strengthen community participation in water governance through training, capacity building,

in improving water and sanitation management		initiatives show potential but require more structured support	and incentives for local leadership
13.1 Strengthen resilience and adaptive capacity to climate-related hazards and natural disasters in all countries	Community engagement in adaptation	High engagement among communities in adaptive measures, though limited by resource constraints	Expand resources and technical support for community-driven adaptation strategies, including early warning systems for extreme weather events
13.2 Integrate climate change measures into national policies, strategies and planning	Implementation of climate mitigation measures	Strong climate policies exist, but gaps remain in integrating local actions due to resource constraints and inconsistent support. Community initiatives often lack sufficient policy backing and technical resources.	Establish frameworks for effective collaboration between local communities and national governance structures, ensuring bottom-up communication channels will help reflect local needs in policy development and encourage broader community engagement in achieving national climate goals.
13.3 Improve education, awareness-raising and human and institutional capacity on climate change mitigation, adaptation, impact reduction and early warning	Awareness and adaptation actions	Moderate to high levels of climate awareness among surveyed populations; further outreach and resource allocation are needed	Develop comprehensive climate education programs, offer community workshops on climate adaptation, and strengthen local knowledge-sharing networks

4.5. Limitations and Future Research Directions

This study provides critical insights into climate resilience in the Annapurna region through an integrated approach involving remote sensing, meteorological analyses, and community surveys. However, several limitations must be acknowledged to contextualize the findings and guide future research. The use of Landsat imagery, while providing a long-term perspective on land use and land cover changes, is constrained by its moderate spatial resolution, which may overlook fine-scale variations in the heterogeneous terrain of the study area. Although topographical corrections enhanced the accuracy of classifications, residual errors in steep slopes and shadowed regions remain a challenge. Vegetation health and snow cover trends, analyzed using NDVI and NDSI, offered valuable insights but oversimplified ecological processes in areas where vegetation and snow overlap. Additional indices or ground-based validation could improve the precision of such analyses.

The sparse meteorological station network, particularly in remote high-altitude areas, limited the resolution of climate variability assessments. Gaps in temperature and precipitation data may have introduced uncertainties, necessitating the expansion of monitoring networks and the use of satellite-based climate datasets to address spatial and temporal gaps. Community surveys, while capturing diverse perceptions from multiple villages, were limited by their sample size and the inherent subjectivity of self-reported data, which may have emphasized recent climatic events.

Larger, more representative samples, combined with participatory research methods, could provide a deeper understanding of community-level responses.

Future research should prioritize higher-resolution satellite imagery and advanced machine learning techniques to capture fine-scale land cover dynamics more accurately. Investigating the interactions between vegetation expansion and snow cover loss using additional ecological indices and process-based models will deepen understanding of ecosystem responses to climate change. Expanding meteorological station coverage and integrating high-resolution climate models will provide more granular data to support localized adaptation strategies. Socio-economic studies tracking the long-term impacts of climate variability on livelihoods and adaptation strategies could inform more actionable policies, while research on extreme weather events like floods and landslides would enhance disaster preparedness.

Addressing these limitations through interdisciplinary approaches and integrating local knowledge with scientific data will not only refine future analyses but also strengthen the development of adaptive strategies for climate resilience. By building on these findings, future research can contribute to more effective policies and sustainable resource management, supporting both ecological integrity and community well-being in vulnerable mountain ecosystems. This comprehensive understanding will also enhance alignment with global sustainability goals, ensuring a balanced approach to conservation and adaptation.

5. Conclusions

This study provides a comprehensive assessment of climate change impacts in Nepal's ACA over the past 35 years (1988–2023) by integrating remote sensing, climate data analysis, and community perspectives. The findings reveal significant environmental transformations, including a 34% increase in vegetation cover from 57,858.84 ha in 1988 to 77,634.27 ha in 2023, driven by effective afforestation and conservation initiatives. Concurrently, barren land decreased by approximately 14.9%, from 389,018.9 ha to 331,252.8 ha, highlighting successful land restoration efforts. However, snow cover has declined by 16.7%, decreasing from a peak of 95,991.75 ha in 1996 to 80,323.38 ha in 2023, underscoring the adverse effects of rising temperatures and reduced snowfall. These environmental changes are further evidenced by the significant improvement in vegetation health, with NDVI increasing from an average of 0.069 in 1988 to 0.340 in 2023, while NDSI declined from 0.157 to -0.109 over the same period.

Climate variability analysis reveals a complex pattern of warming and precipitation changes across the ACA. Tmax has shown a consistent warming trend, particularly in Thakmarpha and Khudi Bazar, with statistically significant increases of $+0.040^{\circ}\text{C}$ per year ($p < 0.001$). Tmin exhibited mixed trends, including a significant decrease of -0.033°C per year in Thakmarpha ($p = 0.001$). Precipitation patterns have become increasingly variable, with Jomsom experiencing a significant annual increase of $+0.012 \text{ mm/year}$ ($p < 0.001$) and Manang Bhot facing a significant decrease of -0.015 mm/year ($p = 0.001$). The frequency of extreme rainfall events has surged, with days exceeding 30 mm of rainfall rising from 6–12% in the 1983–1992 decade to 33–43% in 2003–2012, and days exceeding 50 mm increasing from 2–5% to 8–14%. These changes heighten the risks of flooding and landslides, posing substantial threats to both ecosystems and local communities.

Community surveys conducted across 11 villages within the ACA reveal a high level of climate change awareness, with 85% of respondents observing significant climatic shifts such as decreased snowfall and altered precipitation patterns. Approximately 70% reported changes in water availability, directly linking these to climate variability. These perceptions are reflected in tangible adaptations, including crop diversification and altered growing seasons to accommodate new climatic conditions. Notably, all surveyed households now have access to piped water, a significant improvement that aligns with the 2023 Joint Monitoring Program (JMP) report [35], advancing progress toward SDG 6. Additionally, community engagement in water management groups is moderate to high, indicating a proactive stance towards enhancing resilience, although further efforts to increase participation could bolster collective adaptive capacity.

The integrated approach of this study—combining remote sensing, climate data, and community insights—provides a holistic understanding of the interplay between environmental changes and socio-economic impacts in the ACA. Quantitative data, such as the increase in NDVI and the significant rise in extreme rainfall events, align with global climate trends, reinforcing the study's broader relevance. The inclusion of community perceptions underscores the direct impacts of environmental changes on local livelihoods and highlights effective adaptive strategies. These insights inform actionable recommendations, including the expansion of rainwater harvesting systems, promotion of climate-resilient agricultural practices, and implementation of robust disaster risk reduction measures. By merging scientific monitoring with community-based adaptation strategies, the study advocates for policies that are both scientifically robust and culturally relevant, ensuring sustainable and effective climate resilience. The study stresses the importance of strengthening community-based adaptation efforts, improving disaster risk reduction strategies, and fostering inclusive, technology-driven governance models. Additionally, it highlights the need for policies that protect water-related ecosystems, support local communities, and integrate local climate adaptation actions into national strategies.

In summary, this research advances the understanding of climate change impacts in the ACA by offering a scalable framework applicable to other mountain regions. The significant environmental changes, coupled with high community awareness and adaptive responses, underscore both the challenges and the resilience of mountain ecosystems and their inhabitants. By leveraging an integrated methodological approach, the study delivers valuable insights and practical solutions essential for achieving sustainable development and enhancing climate resilience, directly supporting SDGs 6 and 13. The incorporation of detailed empirical data and community perspectives ensures that the recommendations are grounded in local realities, facilitating effective and sustainable policy and practice implementations.

Supplementary Materials: The following supporting information can be downloaded at the website of this paper posted on Preprints.org, Figure S1. NDVI imagery of the study area in the years 1988, 1996, 2013, and 2023, Figure S1. NDSI imagery of the study area in the years 1988, 1996, 2013, and 2023 Figure S3. Man-Kendell trend test and sen-slope estimator chart for precipitation., Figure S3. Man-Kendell trend test and sen-slope estimator chart for Tmin and Tmax Figure S5 Demographic of the Respondents S6. Household survey questionnaire

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