



Case Report

Natural Capital Accounting for Land in Rwanda

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Abstract: Land, as a valuable natural resource, is an important pillar of Rwanda's sustainable development. The majority of Rwanda's 80% rural population rely on agriculture for their livelihood, and land is crucial for agriculture. However, since a high population density has made land a scarce commodity, growth in the agricultural sector and plans for rapid urbanisation are being constrained, and cross-sectoral trade-offs are becoming increasingly important, with a risk that long-term sustainability may be threatened if these trade-offs are not considered. To help track land value trends and assess trade-offs, and to help assess the sustainability of trends in land use and land cover, Rwanda has begun developing natural capital accounts for land in keeping with the United Nations' System of Environmental-Economic Accounting. This paper reports on Rwanda's progress with these accounts. The accounting approach adopted in our study measures changes in land use and land cover and quantifies stocks for the period under study (2014–2015). Rwanda is one of the first developing countries to develop natural capital accounts for land, but the wide range of possible uses in policy analysis suggests that such accounts could be useful for other countries as well.

Keywords: agriculture; land; natural capital accounts; Rwanda; system of environmental-economic accounting; wealth accounting and the valuation of ecosystem services

1. Introduction

This paper reports on Rwanda's ongoing work on compiling natural capital accounts for land use and land cover that are consistent with the United Nations' System of Environmental-Economic Accounting (SEEA) [1] and that help to identify links between economic, environmental, and social costs and benefits in land use and the relationships between land use and overall sustainability. Rwanda is the most densely populated country in Africa, and land is a key constraint to economic activity. When Rwanda began compiling natural capital accounts for its key natural resources in 2014 as part of its commitments under the Gaborone Declaration for Sustainability in Africa [2], land was rapidly identified as a priority sector for natural capital accounting (NCA) [3]. Work on compiling the land accounts began in earnest in 2015.

SEEA provides guidelines for countries setting up NCA. The SEEA is a guide to integrating economic, environmental, and social data into a single, coherent framework for holistic decision-making.

Sustainability **2020**, 12, 5070 2 of 22

The Rwandan effort is part of the World Bank-led global partnership, Wealth Accounting and the Valuation of Ecosystem Services (WAVES), which aims to promote sustainable development through the application of SEEA. SEEA and WAVES aim to go beyond the traditional use of gross domestic product (GDP) and traditional national accounts by also incorporating natural resource wealth and assets into national accounts [4]. WAVES was established in 2010 to promote sustainable development around the world through the implementation of SEEA-consistent NCA (natural capital accounts (NCAs) and natural resource accounts (a term frequently used in the 1990s and early 2000s) are subsets of the SEEA, which in turn are a subset of the broader term satellite accounts, but the terms are often used interchangeably in practice). Natural capital accounts (NCAs) focus on the value and role of natural resources in a country's development strategies, policies, and investment decisions. Numerous developing countries have already committed to setting up SEEA-compatible accounts, while academic research on compiling SEEA-consistent accounts and conducting analyses based on such accounts has increased (for recent examples, see [5–14]; for a recent review, see [15]).

A political interest in setting up environmental and other types of satellite accounts had already begun in the late 1990s and early 2000s. This included satellite accounting work in a number of African countries (for an overview of this early satellite accounting work, see, e.g., [16]; for reviews that note the intermittent character of this work, see [17,18]; for specific examples of SEEA compilation and related academic work, see [19–33]). However, most of these efforts have petered out over the years. In many countries, accounts were only compiled for a few years before such work was abandoned. These early satellite accounting efforts were usually based in environmental ministries or environmental research institutes, with limited political support from other parts of their countries' governments. Furthermore, the compilation of such accounts was frequently based on massive data collection exercises that were supported by donor funding but difficult to sustain in the longer term. Thus, due not only to poor NCA but also to poor national accounts overall, assessing how much of recent years' income growth in sub-Saharan Africa has been driven by the depletion of natural assets—rather than by sustainable growth in production capacity—is difficult [34,35]. It has also meant that much of the work done on environmental accounting in developing countries (see, e.g., [4]) has had to rely on externally available indicators rather than on countries' own national accounting agencies. It is important, therefore, that the current round of SEEA activities provides clear inputs to policy [36] and is solidly based on countries' own systems for regular statistics gathering. In this way, these accounts can be sustained by policy support—and can continue to help in assessing the sustainability of domestic economic trends—once initial donor support ends.

Rwanda was not part of these initial satellite accounting efforts in Africa at the turn of the last millennium; regular national accounting work was still being reconstructed following the Rwandan genocide against the Tutsi in 1994, and the few qualified economists in the country at the time had no experience in environmental economics. Nonetheless, minerals, water, and land—the priority sectors identified as candidates for Rwandan NCA work within WAVES [3]—have since attracted some sector-specific academic environmental economics research attention. Minerals have been explored in several sectoral studies [37–39]. Research on water [40–45] has looked at urban water pricing and availability, the use of water sources outside the piped water system in urban areas, the valuation of different uses of water in rural areas, and the implicit valuation of water availability in housing markets. While economic researchers have not focused on land accounting per se, they have dealt with various aspects of it, e.g., in relation to agriculture (see, e.g., [46–49]). As discussed in the next section, the academic interest in land issues is linked to the enormous economic importance of land in Rwanda.

In respect of the terminology adopted in this study, we employed the definitions of *land use* accounts (discussed in Section 3) and *land cover* accounts (discussed in Section 4) provided by the SEEA Central Framework [1], as follows:

5.246 Land use reflects both (i) the activities undertaken and (ii) the institutional arrangements put in place for a given area for the purposes of economic production, or the maintenance and restoration of environmental functions.

Sustainability **2020**, 12, 5070 3 of 22

5.256 Land cover refers to the observed physical and biological cover of the Earth's surface and includes natural vegetation and abiotic (non-living) surfaces.

Section 2 discusses the importance of land for the Rwandan economy and explains how SEEA-compatible land accounts can help integrate sustainability concerns into land use planning. Section 3, as mentioned above, reports on and discusses the land use accounts. Section 4, as also mentioned above, discusses the land cover accounts. Section 5 discusses the monetary asset accounts for land. Section 6 discusses various ways in which the land accounts can help contribute to strategic and operational decision making that considers the various economic, environmental, and social links between different land uses, and the sustainability of overall trends in land use and land cover changes, in a holistic fashion. Section 7 provides a concluding discussion.

2. Land in Rwanda

Land, as a valuable natural resource, is an important pillar of Rwanda's sustainable development because it is the basis for agriculture. Agriculture, the main land use, accounts for 31% of GDP and 75% of employment. As Rwanda develops, the industrial and service sectors of the economy have been growing. Despite this, the majority of Rwanda's 80% rural population continue to rely on agriculture for their livelihood.

Rwanda has a land surface area of 26,338 km² with a population of about 12 million. With over 450 inhabitants per square kilometre, therefore, the country is the most densely populated in sub-Saharan Africa. The high rate of population growth and inheritance practices, where land is commonly subdivided between multiple heirs, have led to land fragmentation [47]. The resulting reductions in plot size limit a farmer's chances of increasing the productivity of his/her land, although increased productivity is needed to achieve food security and boost rural incomes. Furthermore, as the economy becomes more industrialised and service-oriented, the demand for land for development continues to increase and become more diverse. In addition, Rwanda's rapid urbanisation and its plans to develop secondary cities require additional land, as do its policies to limit urban and peri-urban sprawl and establish green zones that improve quality of life. Thus, as a tool to support its implementation of a national policy to plan land use in a rational manner, the Rwandan Government decided to develop land accounts, guided by SEEA standards.

NCA for land can add value in planning for sustainable development by providing indicators and trend analyses which help to track performance toward sustainability, land allocation, service delivery, and productivity targets. Land accounts are relevant to policy because land availability and productivity are potential constraints to agricultural growth, which is key to Rwanda's development agenda. Additionally, land accounts will help Rwanda not only to account for trends in the economic value of land used for different purposes but also to assess potential trade-offs more systematically. Although sectoral level planning exists, better information (and coordination) could help to reduce the risk of individual sectoral targets leading to cross-sectoral tensions and could help to resolve situations when there are competing demands for the same land. Data on trends in land value on the one hand and changes in land use and land cover on the other, and their potential implications for water use, food production, and other ecosystem services could also inform policy and planning (see, e.g., [50–54]).

Most specifically, however, land accounts can help to clarify and the compare economic value generated by land in competing uses and can show how changes in land use can affect land value. Land accounts also help in analysing issues related to the impact of changes in land use on the productivity of key crops, the production of fuel wood, or (when linked to other accounts) pressure on water resources or other environmental resources. Thus, for instance, [55] describes how Czech land accounts were extended to form the basis for ecosystem asset accounting, and similar accounting work is now ongoing in many European countries (see [56]; for applications, see, e.g., [57], who use European ecosystem accounts, based on land accounts, to study nitrogen retention); [58,59] shows how studying landscape changes linked to agricultural change is crucial for understanding changes in water quality. In future, Rwandan land cover accounts could be expanded to permit similar analyses. Moreover,

Sustainability **2020**, 12, 5070 4 of 22

land accounts not only help in the comparison of market value for land in different regions or uses but they also contribute to explaining how sectors compare in terms of land use per value of output or intensity of use, they enable longer-term projections of productivity and resource use, and they identify potential bottlenecks in making land available to reach national development objectives. It is worth noting that this type of cross-sectoral analysis and comparison of land use is difficult to do without land accounts that link easily to other national accounts data and other economic statistics. While the sectoral analyses of Rwandan land use cited earlier provided an important explanation of the trends in agricultural land use, they did not permit the kind of cross-sectoral comparisons discussed here, and the same is generally true for studies of agricultural land use in other developing countries.

3. Physical Asset Accounts: Land Use Accounts

Thus far, land accounting has been a relatively unusual priority for NCA in developing countries. Therefore, the Rwandan experience has the potential to inform future work on land accounting elsewhere. That said, land accounting may be somewhat easier in Rwanda than in many other developing countries because of its already-established comprehensive database.

Rwandan policymakers have long been aware of the importance of good statistics as an input to policymaking on key issues. Thus, while land accounting may be a new activity, Rwanda's tenure policies are more systematic and predictable [48,49], and its statistics on land use are some way ahead of those in many other developing countries. In 2012, it established the Land Administration Information System (LAIS), a comprehensive database on land ownership and use. LAIS deals with the systematic registration of land and maintains up-to-date data and records on land parcels, land rights, and the owners of those rights, since land transactions cause such information to change regularly. By late 2013, the database had covered almost all the land in Rwanda—around 11 million plots. Although some land remains unclassified, LAIS still provides a far better starting point for land accounting in Rwanda than in many other developing countries. LAIS's geo-referenced data on land use in terms, for example, of ownership and economic activity provides a rich basis for the analysis and comparison of trends. By setting up land use accounts, information can be provided on the dynamics of land use in competing uses and, ultimately, on how changes in land use may affect land value.

Using data extracted from LAIS, we set up SEEA-style physical asset accounts for land use for the period 2014–2015 and analysed changes in land use in Rwanda for this period. LAIS data for the period 2012–2015 were examined in the development of these land use accounts. However, the data for 2012 and 2013 have numerous discrepancies and inconsistencies due to imprecision in the early records of LAIS's founding; between 2012 and 2013, although land was gradually being registered, most parcels had not yet been categorised into a specific land use. Nonetheless, by 2014, the data had been regularised and almost all land initially labelled as *Unclassified* in terms of its use had been duly categorised and allocated to more specific use categories in the database.

LAIS has 13 land use categories, including the one for unclassified areas (which will be gradually allocated to one of the 12 main land uses). This paper focuses on six categories that make up 97.8% of land use. The six in question are *Agriculture*, *Forestry*, *Industrial*, *Livestock*, *Residential*, and *Unclassified*. The remaining seven land uses, grouped together under *Other use*, are *Administrative*, *Commercial*, *Economic*, *Fishing*, *Research/Scientific*, *Social and Culture*, and *Tourism*. The categories discussed in this paper and their relation to the primary LAIS categories are summarised in Table 1, which also reveals the share each category makes up of the overall land available in Rwanda.

Sustainability **2020**, *12*, 5070 5 of 22

Land Administration Information System (LAIS) Land Use Categories	AIS) Share of Total Land Use (%			
Agriculture	60.6			
Forestry	9.3			
Industrial	0.2			
Livestock	5.7			
Residential	8.5			
Unclassified	13.5			
Other use *	2.2			

Table 1. Share of land use, 2015 (%).

Although the LAIS categories were not designed to be consistent with the SEEA classification for land use accounts, they are largely compatible with the main SEEA categories (for discussion of the SEEA categories and subcategories for land use accounts, see [1]). Thus, for instance, the LAIS land use categories *Agriculture* and *Livestock* are classified together under *Agriculture* in SEEA's land use categories, and *Forestry* is a separate category in both LAIS and SEEA, while the LAIS *Residential* category is part of the SEEA land use category entitled *Use of built up and related areas*. Thus, at the aggregate level, the compatibility between LAIS and SEEA is high, and all land that has been classified in LAIS can be assigned an aggregate SEEA category. However, as work on land accounts develops over time, compatibility at more detailed levels of classification will also need to be ensured in future LAIS work, and the more detailed LAIS classifications are now being revised to ensure future compatibility with more detailed SEEA classifications.

Tables 2 and 3 illustrate the land use change matrices for 2014 and 2015, respectively. The tabulated analyses are an important milestone in the development of Rwanda's land accounts, not only because they allow one to examine, in detail, the changes from one land use to another during the two years but also because they include the full set of land uses available in LAIS. All LAIS land use categories appear on the horizontal and vertical axes in both tables. Both tables also show the opening stock by land use category on the left. Beginning at the left-hand column, reading across the row from left to right, the tables show, for each land use category, shifts from that land use to some other land use. The final column records the net change. As an example, for *Agriculture*, the category begins 2014 with 1.2 million ha, loses 1251 ha to and gains 4 ha from *Forestry*, and loses land to and gains land from numerous other categories, for a total loss of 7377 ha, a total gain of 9501 ha, and a slight net increase of 2124 ha during the year.

The way in which the matrix is set up ensures that all land use changes come from some category and go to some category, so that the last entry in the *Net change* column shows a "0" for the whole country. As additional years are considered in the land use accounts, these tables will be an important analytical tool for examining the directions and dimensions of land use change in Rwanda.

Figure 1 shows the total land area in hectares recorded in LAIS for each category of land use at the end of 2015 for each Province as well as for Kigali City, the country's capital.

Agricultural land use dominates in all Provinces—and even in Kigali City. The Eastern Province is not only the largest of the Provinces, it also has the largest amount of land used for agriculture and livestock. The Southern and Western Provinces have more land allocated to forestry than the other two Provinces or Kigali City, while the Eastern Province has the largest amount of land allocated to livestock in comparison with the other three Provinces and Kigali City.

^{*} Combines the use categories Administrative, Commercial, Economic, Fishing, Research/Scientific, Social and Culture, and Tourism.

Sustainability **2020**, 12, 5070

Table 2. Matrix of net change in land use, 2014—national level (ha).

Land Use	Opening Stock, 2014	Administrative	Agriculture	Commercial	Economic	Fishing	Forestry	Industrial	Livestock	Research/Scientific	Residential	Social and Culture	Tourism	Unclassified	Closing Stock, 2014	Total Loss	Total Gain	Net Change
Administrative	6713.88			0.02			14.93				0.77	1.51			6908.08	17.24	211.44	194.20
Agriculture	1,242,362.94			29.37	1.85		1250.62	25.05	133.84	13.11	1362.22	31.73	1.80		1,251,180.76	2849.58	11,667.40	8817.82
Commercial	8311.50		31.71		0.02		3.94	5.47			19.49	8.87			8340.42	69.51	98.43	28.92
Economic	10,754.16	0.06	151.97	1.57				0.90			3.54	10.77	0.48		10,615.16	169.29	30.29	-139.00
Fishing	121.24													2.07	119.16	2.07	0.00	-2.07
Forestry	190,611.82		3.99	2.63	1.79			5.48	26.70		52.41	7.77			193,405.64	100.77	2894.59	2793.82
Industrial	3490.43		520.56								5.14				3370.23	525.70	405.50	-120.20
Livestock	120,444.78		30.23	9.95			0.21	5.44			30.24			2050.25	118,582.65	2126.33	264.20	-1862.13
Research/Scientific	10,689.80	11.22	89.21	0.26			1.48				2.36	2.46		207.42	10,412.55	314.41	37.16	-277.24
Residential	157,741.69	3.71	179.69	12.49	0.38		7.46	3.95	103.66	3.45		45.09	8.31		159,816.74	368.20	2443.25	2075.05
Social and Culture	8190.75	0.08	1.94	1.74			1.77			20.61	12.03				8360.58	38.17	208.00	169.83
Tourism	852.46		0.64				0.13				0.56	1.80			926.60	3.13	77.26	74.14
Unclassified	309,262.12	196.38	10,657.45	40.39	26.24		1614.05	359.21			954.50	98.00	66.67		297,508.99	14,012.88	2259.75	-11,753.13
Total Land Use (Demarcated)	2,069,547.58	211.44	11,667.40	98.43	30.29	-	2894.59	405.50	264.20	37.16	2443.25	208.00	77.26	2259.75	2,069,547.58	20,597.27	20,597.27	0.00

Table 3. Matrix of net change in land use, 2015—National level (ha).

Land Use	Opening Stock, 2015	Administrative	Agriculture	Commercial	Economic	Fishing	Forestry	Industrial	Livestock	Research/Scientific	Residential	Social and Culture	Tourism	Unclassified	Closing Stock, 2015	Total Loss	Total Gain	Net Change
Administrative	6908.08		0.40	1.84							8.00	0.22	68.30	315.44	6519.67	394.20	5.79	-388.41
Agriculture	1,251,180.76	3.80		24.33	2.03		40.90	56.49	328.44	19.34	6799.00	101.04	1.66		1,253,304.87	7377.03	9501.14	2124.11
Commercial	8340.42	0.60	19.87				0.26	2.74			72.98				8364.33	96.45	120.36	23.91
Economic	10,615.16		78.95	1.92			2.03				44.27	0.93			10,547.51	128.10	60.45	-67.65
Fishing	119.16														126.91	0.00	7.75	7.75
Forestry	193,405.64		16.05	2.50				0.51	26.70	4.64	838.73	7.59	2.43		193,428.68	899.15	922.19	23.04
Industrial	3370.23		318.98	0.45							19.64	2.08			3217.83	341.15	188.75	-152.40
Livestock	118,582.65		45.30	2.74			0.13	0.44			1262.90				118,578.73	1311.51	1307.59	-3.92
Research/Scientific	10,412.55							0.31			89.81	18.80			10,351.01	108.92	47.38	-61.54
Residential	159,816.74	0.52	220.51	18.96			23.28	4.70	46.05	13.71		132.43	1.26		176,012.64	461.42	16,657.32	16,195.90
Social and Culture	8360.58	0.11	3.43	1.92			0.15				54.72		0.37		8805.61	60.70	505.73	445.03
Tourism	926.60	0.76					3.32				2.65	1.45			1004.80	8.18	86.38	78.20
Unclassified	297,509.01		8797.65	65.70	58.42	7.75	852.12	123.56	906.40	9.69	7464.62	241.19	12.36		279,284.99	18,539.46	315.44	-18,224.02
Total Land Use (Demarcated)	2,069,547.58	5.79	9501.14	120.36	60.45	7.75	922.19	188.75	1307.59	47.38	16,657.32	505.73	86.38	315.44	2,069,547.58	29,726.27	29,726.27	0.00

Sustainability **2020**, 12, 5070 7 of 22

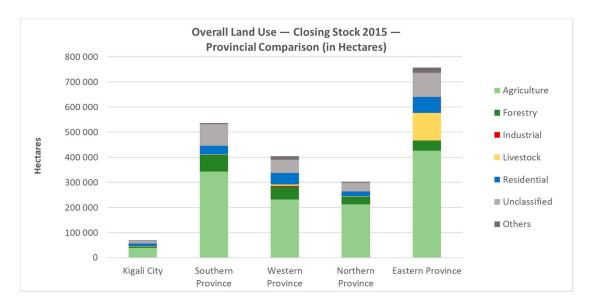


Figure 1. Comparison of provincial land use, 2015 (ha).

Figure 2 expresses the land use data per category as a percentage share. Not only does this offer a different perspective on the relative importance of different land uses in different parts of the country, it also sheds additional light on the situation in Kigali City, which constitutes a small land area compared with that in the Provinces. As expected, Kigali City has a greater share of residential area than the Provinces; however, it also has surprisingly large areas allocated to *Agriculture* and *Forestry*. The relatively small portions of land allocated to *Industrial* only reflects that these activities are more labour- or capital-intensive, rather than land-intensive, and do not need large areas of land. The light grey bar representing the land categorised as *Unclassified* signals that the use of 10–15% of the land registered in LAIS is still in the process of being clarified. Once these unclassified parcels have been assigned an appropriate category in LAIS, the understanding of land use across Rwanda will be more complete and this analysis can be updated.

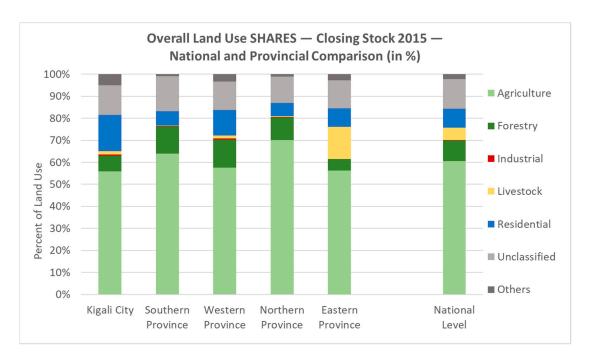


Figure 2. Share of national and provincial land use, 2015 (%).

Sustainability **2020**, 12, 5070 8 of 22

The *Unclassified* category is an important one when considering changes in land use as reported in these accounts. Most recorded changes are not physical shifts per se from one land use to another; rather, they reflect an administrative re-categorisation of a land parcel previously subsumed under the *Unclassified* label into a defined category after an examination of the case. Figure 3 shows, by Province and in the city of Kigali, where the land use shifts are coming from (negative numbers) and where they are moving to (positive numbers). The greatest degree of change is evident in the length of the grey bar for the *Unclassified* category. This shows that most changes in the land use designations in LAIS result from parcels being moved from an unclassified state into a known land use category. Thus, from the beginning of 2014 to the end of 2015, about 30,000 ha were moved out of the LAIS *Unclassified* category to a known land use designation. Of this amount, 25,500 ha (85%) were in the Southern Province. The reclassified land use parcels were mainly in *Agriculture* (65%), *Residential* (21%), and *Forestry* (11%). Thus, most of the net changes in land uses recorded in LAIS can be explained by the considerable effort undertaken in 2014 and 2015 to designate unclassified areas a known land use, particularly in the Southern Province. Other Provinces may have been relatively more complete in prior years.

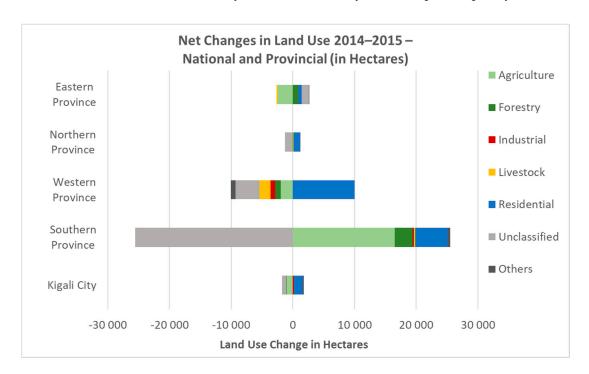


Figure 3. Net change in land use, 2014–2015 (ha).

4. Physical Asset Accounts: Land Cover Accounts

A second set of land accounts, land cover accounts, can offer an analysis of land cover such as vegetation, water, or artificial surfaces. Land cover data provide another angle from which to understand a country's land dynamics. Remote sensing allows one to measure changes from one type of land cover to another, which can be used, for example, to monitor deforestation/afforestation.

With reference to Rwanda in this regard, the Government worked with the Kenya-based Regional Centre for Mapping of Resources for Development (RCMRD) to create land cover maps for 1990, 2000, and 2010. These data are in the public domain and provide a useful resource for determining long-term trends and performing other types of analysis. For example, the data sets on land cover have been used by the Wildlife Conservation Society, the Science for Nature and People Partnership, and the United States' Geological Survey to develop experimental SEEA ecosystem accounts for Rwanda [60]. Rwanda has relied on these data sets to develop land cover accounts for the period 1990–2010 to monitor and analyse changes in land cover (and land use) and to support policies addressing existing

Sustainability **2020**, 12, 5070 9 of 22

issues, and one of the few other African examples of land cover accounts, the South African work [61], used similar data.

The Rwanda Land Management and Use Authority is currently in the process of improving its remote sensing analysis and mapping capacities. Thus, with WAVES support, the Rwandan Government has not only commissioned the RCMRD to update the country's land cover maps and their underlying data sets to 2015 but has also launched an internal capacity-building effort so that these mapping products, realised at various geographic scales, can be updated and improved regularly. This mapping capacity will be linked up with LAIS's comprehensive database.

Meanwhile, however, the only land cover maps available for our study were those that relate to the pre-LAIS periods (1990, 2000, and 2010) mentioned earlier. This section and its analysis of issues and trends is, therefore, based on those maps.

The land cover categories employed in remote sensing analysis differ from the administrative land use categories defined in LAIS. Land cover analysis is based on categories that can be identified (visually or through algorithms) using remote sensing. These categories are based on the biophysical properties of the land. By contrast, land use data in LAIS are classified according to location, ownership, value, size, and other variables that are important in land administration; however, certain variables (such as ownership or value) may not be directly observable. Thus, there is not complete congruence between the descriptions and categories for land use and land cover. These differences are illustrated in Figure 4, which shows the two different classifications of land, albeit for different years (2010 versus 2015).

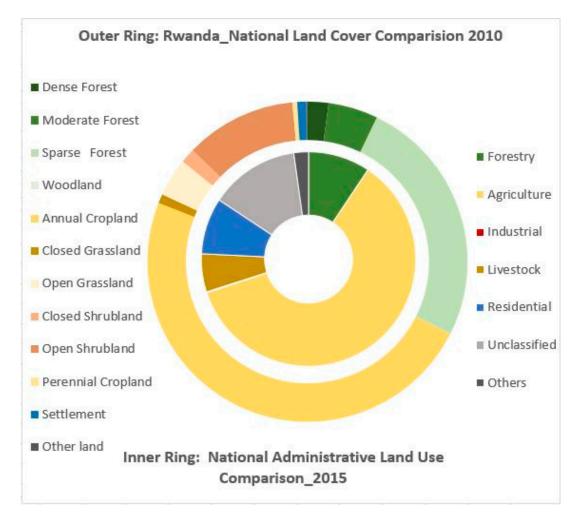


Figure 4. Land cover, 2010, compared with administrative land use classifications, 2015.

Sustainability **2020**, 12, 5070 10 of 22

Table 4 and Figure 5 show the areas in hectares for various types of land cover in Rwanda, such as *Moderate forest, Open grassland*, and *Wetland*. As with the land use accounts, the data sources used for land cover accounts were not designed with SEEA categories in mind, but the consistency with SEEA classification is nonetheless good at this level of detail. The land cover categories used in the remote sensing data can all be assigned to their respective SEEA categories with relative ease.

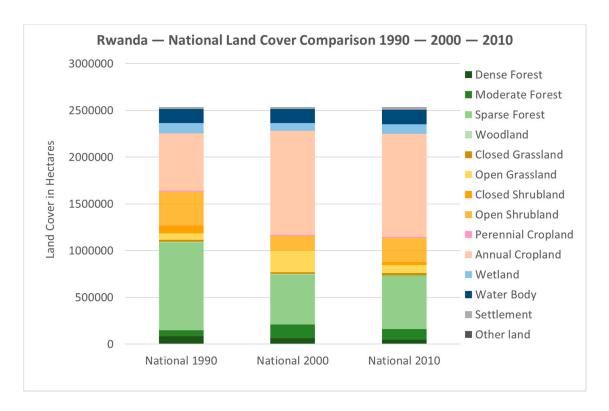


Figure 5. Comparison of national land cover, 1990–2010 (ha).

Table 4 and Figure 5 illustrate not only the physical changes in land cover over a relatively long timescale of 20 years but also developments in the country's specific social history. Generally, a decline in woodland and an increase in cropland are apparent. However, this decline is most noticeable in the period from 1990 to 2000, which includes the genocide events in 1994 and the land use changes associated with the displacement of people and, later, the repatriation of refugees.

Table 5 and Figures 6 and 7 reveal further detail and nuance of the national picture by illustrating the types of land cover that prevailed in the four Provinces and Kigali City for the 20-year period in question. While Table 5 and Figure 6 show the total amount in hectares for each land cover category for the four Provinces in the different years, Figure 7 shows the total shares of land in each Province for each land cover category.

Across all Provinces, the figures show an increasing share of land cover in cropland and grasslands, with a decline in moderate and sparse forests. This is very noticeable in the Northern and Eastern Provinces between 1990 and 2000, again reflecting the genocide against the Tutsi and the resettlement of people in those areas in the 1990s. The trends are relatively dramatic and uniform across the Southern, Western, and Eastern Provinces. In the Northern Province, there is a dramatic increase in annual cropland from 1990 to 2000 at the expense of forested land, somewhat reversed by 2010.

Sustainability **2020**, 12, 5070

Table 4. Comparison of national land cover, 1990–2010 (ha).

	Dense Forest	Moderate Forest	Sparse Forest	Wood -land	Closed Grassland	Open Grassland	Closed Shrubland	Open Shrubland	Perennial Cropland	Annual Cropland	Wetland	Water Body	Settle-ment	Other-land	Grand Total
National 1990	84,063	62,730	940,491	9888	16,850	70,935	83,196	361,905	10,679	612,391	109,334	153,317	11,606	3549	2,530,934
National 2000	63,005	148,701	534,047	7941	15,808	232,678	1894	153,996	11,019	1,112,865	80,600	153,375	13,812	1191	2,530,934
National 2010	48,237	114,472	574,757	470	20,883	87,781	34,306	255,054	10,978	1,103,399	102,234	154,960	20,898	2508	2,530,938

Table 5. Provincial land cover, 1990–2010 (ha).

Province Name	Dense Forest	Moderate Forest	Sparse Forest	Wood-land	Closed Grass-land	Open Grass-land	Closed Shrub-land	Open Shrub-land	Perennial Cropland	Annual Cropland	Wetland	Water Body	Settle-ment	Other Land
City of Kigali 1990		1012	31,835		1	30	5	7511		19,207	4481	776	8126	
City of Kigali 2000	10	2650	28,886	106		998		24		29,063	2385	569	8295	
City of Kigali 2010		1930	23,893	6	1	16	267	2335		31,819	3460	551	8709	
Southern 1990	33,617	6275	236,614		6798		18	15,391	2798	279,918	12,651	1212	984	
Southern 2000	28,346	40,206	142,308	65	2630	1932		17,514	3049	347,010	10,292	1465	1460	
Southern 2010	27,688	37,281	123,724		3577	652	488	25,281	3039	359,386	11,264	730	2815	353
Western 1990	50,446	22,138	269,812		9689	2	105	18,025	4716	110,643	166	101,701	590	
Western 2000	32,910	68,536	173,284		13,178	1693		3048	4754	186,857	114	102,598	1062	
Western 2010	20,409	42,013	185,900		16,144	298	128	15,812	4723	196,809	36	103,629	1996	137
Northern 1990		11,390	175,297		355	2	40	21,427	3166	101,457	6237	7973	184	
Northern 2000	1645	16,776	65,257	14		3633		104	3216	221,573	6168	8380	762	
Northern 2010	134	15,008	111,996			311	290	4866	3216	176,179	6196	8374	959	
Eastern 1990		21,913	226,933	9888	7	70,901	83,027	299,549		101,166	85,798	41,654	1722	3549
Eastern 2000	92	20,534	124,312	7757		224,422	1894	133,306		328,362	61,641	40,363	2234	1191
Eastern 2010	7	18,240	129,245	464	1161	86,503	33,133	206,760		339,206	81,278	41,677	6418	2018

Sustainability **2020**, 12, 5070

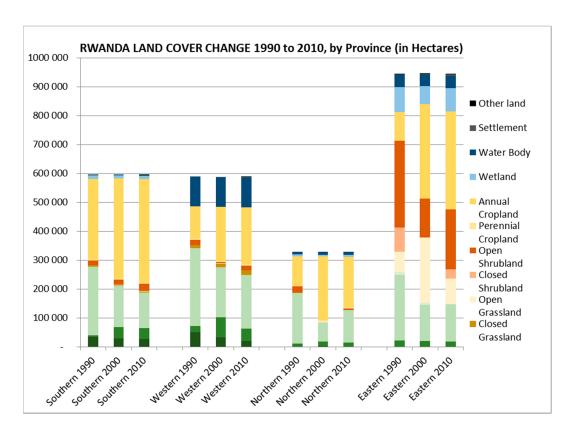


Figure 6. Provincial land cover, 1990–2010 (ha).

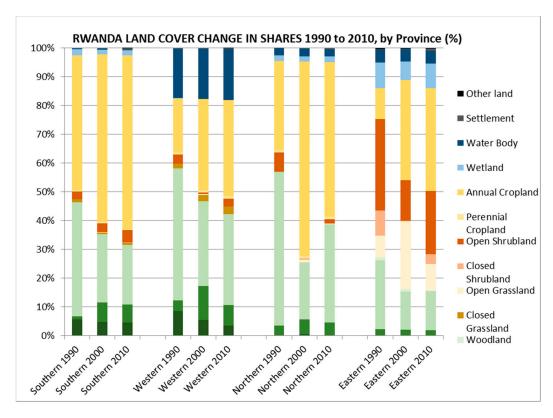


Figure 7. Shares of provincial land cover, 1990–2010 (%).

Sustainability **2020**, 12, 5070 13 of 22

5. Monetary Asset Accounts: The Value of Land

To calculate Rwanda's land transactions and value, we again consulted the rich LAIS database. For 2014, LAIS recorded 15,500 land transactions (actual sales and purchases, not including. e.g., the inheritance of land) involving a total land surface area of 4020 ha. These are summarised in Table 6. The average size of parcels involved in these transactions was about a quarter of a hectare, with a wide range of sizes across Provinces. Kigali City and the Western and Northern Provinces saw transactions involving quite small plots on average, i.e., about one tenth of a hectare, while transactions in the Eastern Province showed that the average plot was over four fifths of a hectare.

LOCATION	No of Parcels Transacted	% of Total	Total Area of Transactions (Ha)	% of Total	Total Area of Transactions (M Rwf)	% of Total	Province Average Transaction Size (Ha)	Province Average Value/Ha (M Rwf)
KIGALI CITY	6964	45%	677	17%	87,962	62%	0.10	130
SOUTHERN	2200	14%	446	11%	6508	5%	0.20	15
WESTERN	1549	10%	259	6%	8047	6%	0.17	31
NORTHERN	1857	12%	216	5%	4361	3%	0.12	20
EASTERN RWANDA	2950 15.520	19%	2421 4020	60%	34,948 141.825	25%	0.82 0.26	14 35

Table 6. Summary of Land Administration Information System (LAIS) data on parcel transactions, 2014.

It should be noted that the SEEA Central Framework recommends separating the value of buildings and improvements (a form of produced capital) from the value of the land itself (a form of natural capital); for a discussion and examples of some of the underlying valuation issues in natural capital accounting, see, e.g., [62–65]). However, the transactions reported in LAIS involve developed parcels that involve both land and buildings, as well as undeveloped parcels that only involve land. It stands to reason that developed parcels should have higher prices than their undeveloped counterparts.

The total value of transactions was 141.8 billion Rwandan Francs (RwF), with well over 60% of that value relating to parcels in Kigali City. Sixty per cent of the total area transacted was in the Eastern Province, while the highest number of parcel transactions, namely 45%, was for land in Kigali City.

The average value per hectare in respect of transactions overall was RWF 35 million per hectare. However, these values were five times higher for Kigali City than for the four Provinces. The Eastern Province had the lowest average transaction value per hectare, namely RWF 14 million per hectare.

5.1. High Variability of Transaction Value

An initial examination of the LAIS 2014 data on parcel transaction value revealed differences in orders of magnitude across parcels and Provinces. Table 7 provides descriptive statistics after standardisation on the value per hectare and shows the high variability in transaction value per hectare.

LOCATION	Parcel Ave Value/Ha (M RwF)	Min Parcel Value/Ha (M RwF)	Max Parcel Value/Ha (M RwF)	Std Deviation of Parcel Value/Ha
KIGALI CITY	214	0.10	33,916	643
SOUTHERN	47	0.12	3449	130
WESTERN	99	0.13	34,476	897
NORTHERN	48	0.14	2070	117
EASTERN	123	0.02	33,625	799
RWANDA	142	0.02	34,476	629

Table 7. LAIS statistical measures for parcel transactions, 2014.

For all of Rwanda, the maximum value per hectare (RWF 34,476 million) is almost 250 times greater than the average (RWF 142 million), while the minimum (RWF 0.02 million) is less than one-tenth of a percentage point of the average. Some of this variation can be explained by the fact that LAIS does not distinguish between developed land (including buildings) and undeveloped land. However, in a

Sustainability **2020**, *12*, 5070 14 of 22

market where most transactions yield values in the range of RWF 20–100 million (USD 25,000–125,000) per hectare, it is beyond surprising to see parcels being exchanged for only RWF 100,000 (USD 125) per hectare or even as little as RWF 20,000 (USD 25) per hectare. Of equal concern is that parcels in relatively rural areas are exchanged for more than RWF 30 billion per hectare. These extremely high and low values raise not only the suspicion of data entry errors but also the urgent need for cross-checking.

Figure 8 shows a histogram of the frequency (number) of transactions that occurred within the value range given on the horizontal axis. Most transactions occurred in the range of RWF 3–150 million/ha. Although the range is quite wide, it is probably realistic given the range of rural, town-based, and city-based transactions and the fact that developed and undeveloped (farming) parcels are grouped together here. However, there is also a small number of extreme values at the low and high ends. These extreme values skew the means and variances of the data set and raise the concern that they are due to data entry errors (e.g., dropped or added zeros) rather than realistic estimates of land value.

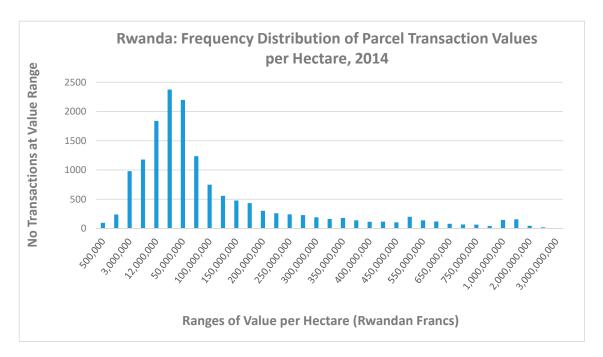


Figure 8. Frequency distribution of parcel transaction value per hectare, 2014 (RWF/ha).

Further analysis found that, indeed, a relatively small number of very erratic values may indicate errors in the underlying data, perhaps introduced during data entry from paper records. Because the data set has more than 15,000 records, it was assumed that most were not flawed and that some process could be developed to screen out extreme outliers. This would mean that the remaining records would still serve as a useful sample of land transaction value in Rwanda. One response would be to use a sampling approach and calculate averages with a substantial subset of the data. However, this would be relatively technical and less useful for regular replication in the future in terms of preparing natural capital accounts in a systematic manner.

As an alternative, the effect of omitting a small percentage of the data points from both the high and low ends of the distribution was tested. The resulting effect on the average and standard deviation of the *Value per hectare* variable is shown in Figure 9. Omitting 1% of the extreme low and high values (2% of the data set overall, or about 300 data points) results in a very substantial (60%) reduction in the variability of the data, with a much lower effect (about 10%) on the average. Furthermore, this procedure of omitting a small portion of the extreme values had no major or systematic effect on the values at Province or District level (see Section 5.2 below).

Sustainability 2020, 12, 5070 15 of 22

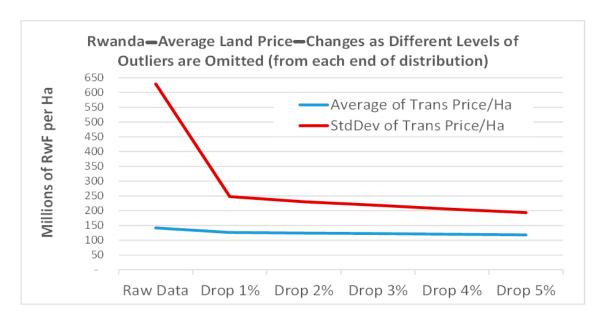


Figure 9. Changes in the average land price when outliers are omitted.

Based on the analysis discussed in the preceding paragraph, the remaining analyses for this paper proceed with 1% of the records dropped from each end of the value per hectare distribution.

5.2. Land Parcel Transaction Value by Province and District

Experience in other countries (see, e.g., [66,67]) have indicated that land accounts can become even more useful for analytical purposes when disaggregated to the regional and local levels, and as already shown, this is easy to do with the format that the Rwandan data are in. Table 8 summarises the number, area, and value of parcel transactions for 2014 at the national and provincial levels, while Table 9 provides the same information at the urban and rural District levels.

Table 8. Summary of number, area,	and value of parcel transac	tions by Province after removal of
outliers, 2014.		

Location	Number of Parcel Transactions	Total Area of Transactions (ha)	Average Value of Parcel Transactions (Million RWF/ha)
Rwanda (total)	15,184	3890	32.9
Kigali City	6839	639	125.0
Southern Province	2157	430	13.6
Western Province	1505	253	26.6
Northern Province	1845	214	19.6
Eastern Province	2838	2353	13.3

Notes: 1% of outliers were omitted from each end of the distribution as a way of dealing with possible data entry errors that may account for the high variance in the LAIS data. The omission of outliers explains the small differences between these data and the descriptive summary data in Section 5.1.

Not surprisingly, there are higher value land transactions in more urban districts than in rural districts. There is still quite a range of values between locations, but this may make sense if one compares the more rural and remote locations with urban centres. The largest changes occur in areas with the fewest transactions (because a small change in what is counted has more impact on the overall average).

Nonetheless, there are some interesting exceptions to these general patterns. A case in point involves Bugesera and Nyagatare in the Eastern Province. If one looks at the trend of "High value = Urban" versus "Low value = Rural" given in Tables 8 and 9, it would suggest that

Sustainability **2020**, 12, 5070 16 of 22

Nyagatare—which contains one of a handful of secondary cities—should have the highest transaction value in the Province; instead, Bugesera holds this position. This may be explained due to Bugesera's relative proximity to Kigali, such that parcel transaction value are higher to the north of Bugesera. Relationships such as these deserve further detailed study and should be compared with figures from 2015 onwards when such data become available.

Table 9. Summary of number, area, and value of parcel transactions by District after removal of outliers, 2014.

Location	Number of Parcel Transactions	Total Area of Transactions (ha)	Average Value of Parcel Transactions (Million RWF/ha)
	KIGALI (CITY	
1.1 Gasabo (urban)	2887	286	144.1
1.2 Kicukiro (urban)	3146	300	98.8
1.3 Nyarugenge (urban)	806	53	170.6
	SOUTHERN P	ROVINCE	
2.1 Gisagara (rural)	64	34	2.3
2.2 Huye (urban)	281	29	41.0
2.3 Kamonyi (rural)	683	82	26.7
2.4 Muhanga (urban)	268	25	46.4
2.5 Nyamagabe (rural)	396	130	3.2
2.6 Nyanza (rural)	180	29	11.0
2.7 Nyaruguru (rural)	91	65	1.9
2.8 Ruhango (rural)	194	36	9.8
	WESTERN PR	OVINCE	
3.1 Karongi (rural)	108	30	11.7
3.2 Ngororero (rural)	60	8	11.0
3.3 Nyabihu (rural)	181	26	8.4
3.4 Nyamasheke (rural)	128	59	8.1
3.5 Rubavu (urban)	642	57	72.4
3.6 Rusizi (urban)	250	29	46.2
3.7 Rutsiro (rural)	136	45	2.9
	NORTHERN P	ROVINCE	
4.1 Burera (rural)	284	31	14.2
4.2 Gakenke (rural)	48	10	5.3
4.3 Gicumbi (rural)	197	45	9.0
4.4 Musanze (urban)	1,203	110	27.9
4.5 Rulindo (rural)	113	19	12.7
	EASTERN PR	OVINCE	
5.1 Bugesera (rural)	840	332	78.4
5.2 Gatsibo (rural)	108	96	2.4
5.3 Kayonza (rural)	352	587	1.3
5.4 Kirehe (rural)	119	64	3.1
5.5 Ngoma (rural)	144	37	7.8
5.6 Nyagatare (urban)	432	1,025	1.3
5.7 Rwamagana (rural)	843	213	11.2

Notes: 1% of outliers were omitted from each end of the distribution as a way of dealing with possible data entry errors that may account for the high variance in the LAIS data.

Sustainability **2020**, 12, 5070 17 of 22

5.3. Land Parcel Transaction Value by Land Use

This section provides similar analyses and comparisons disaggregated by land use (see Section 3 for an introduction to LAIS land uses).

Table 10 summarises the LAIS 2014 data on the number, area, and value of parcel transactions according to land use. The data show that most transactions involved land uses for agricultural, livestock, and residential purposes. Transactions involving agriculture and livestock land uses were of a substantially lower value per hectare than commercial, residential, and industrial transactions. The results in Table 10 indicate logical patterns in the areas and value across sectors, some of which indicate high-value, concentrated economic activities, and others, less so.

LAIS Land Use	Total Area Transacted (ha)	Average Value of Parcels (Million RWF/ha)	Total Value Transacted (Million RWF)	Number of Transactions
Agriculture	1439	18.3	26,302	5812
Commercial	52	137.4	7151	207
Economic	5	11.3	56	33
Fishing	0	9.7	0	1
Forestry	263	3.6	958	691
Industrial	7	57.3	392	37
Livestock	1347	0.9	1172	178
Residential	769	119.0	91,516	8202
Social and Culture	8	36.3	280	20
Tourism	0	5.1	2	3
TOTAL	3890	32.9	127,831	15,184

Table 10. Summary of extent and value of parcel transactions by LAIS land use, 2014.

6. Use of Land Accounts for Other Analyses

A key use of national accounts, including the SEEA satellite accounts, is as a source of data for policy analysis and academic analysis [68]. The land accounts can be used to derive green indicators to monitor the Rwandan Government's Economic Development and Poverty Reduction Strategy (EDPRS) as well as indicators for the United Nations' Sustainable Development Goals (SDGs) aimed at monitoring the sustainable development of countries in a consistent and comparable manner. In particular, land accounts can inform SDG 15, stated as the following [69]:

Protect, restore, and promote the sustainable use of terrestrial ecosystems, sustainably manage forests, combat desertification, and halt and reverse land degradation and halt biodiversity loss.

Thus, for instance, [70] uses European land cover accounts to identify land cover types susceptible to change and soil resources that are at risk, and proceed to estimate the potential effects on carbon storage of these potential future changes in land cover and soil quality; [57] similarly uses European satellite accounts to study nitrogen retention. In years to come, Rwandan land cover accounts could provide data for similar analyses.

Rwanda also has several policies aimed at combating land fragmentation by means of maintaining or increasing average plot size, particularly in the agriculture sector. Although analysing the effects of these policies is not the main purpose of the work on NCA, the database lends itself to the analysis of a wide range of land-related questions, including land fragmentation. Thus, although the two-year period covered by the current research did not allow us to analyse long-term trends, we were able to study trends over the studied two-year period by plot location and type of land use. One such trend was that of land fragmentation. Our findings in this respect show that although land fragmentation increased during 2014 and 2015, it only did so by a relatively small margin. Thus, the average size

Sustainability **2020**, *12*, 5070 18 of 22

of plots in the *Agriculture* category declined by some 1.8% from the beginning of 2014 to the end of 2015. The average size of plots under *Livestock* declined by almost 10%, while the average size of plots classified as *Residential* declined by only 1.0%. Some of these declines in average plot sizes may be due to small, previously unclassified plots becoming classified, rather than by the continued fragmentation of already-classified plots. However, this assumption deserves further and more detailed analysis.

Table 11 shows that average parcel sizes are small across all parts of Rwanda, but plots in the Eastern Province are about twice as large as the national average, while plots in the Northern Province are the smallest, at only about 60% of the national average.

		2014			2015				
Location	Number of Parcels	Area (ha)	Average Parcel Size (ha)	Number of Parcels	Area (ha)	Average Parcel Size (ha)			
Rwanda (total)	11,121,853	2,045,643	0.184	11,420,044	2,066,577	0.181			
Kigali City	382,666	68,659	0.179	390,368	69,707	0.179			
Southern Province	2,957,960	506,693	0.171	3,217,749	536,529	0.167			
Western Province	3,163,374	400,037	0.126	3,157,138	400,783	0.127			
Northern Province	2,633,155	302,205	0.115	2,668,170	302,260	0.113			
Eastern Province	1,984,698	768,048	0.387	1,986,619	757,298	0.381			

Table 11. National and provincial average parcel size (ha), 2014–2015.

Results from the land accounts are expected to inform the Government regarding current physical and economic trends and, in doing so, enable policy analysts to deepen their investigation of the trade-offs between different land uses and thus inform rational land allocation.

7. Concluding Discussion

Very few developing countries have chosen to develop land accounts, and it is therefore worthwhile to discuss what potential benefits Rwanda can hope to achieve in the future by compiling land accounts per se in addition to the land statistics and agricultural statistics that it would be compiling in any case. Two points deserve to be highlighted; one is that the link to other economic data make land accounts more useful in the longer term than LAIS data compiled in isolation, and the other is that the link to other economic data make cross-sectoral comparisons possible in a way that agricultural statistics compiled in isolation do not. While much of this work is only starting out in Rwanda, we can already see some of the potential benefits from these links to other economic statistics materialising.

Land accounts can be used to inform land-use planning, including the distribution of land use not only at the Province and District level but also at lower levels of administrative organisation. Land accounts and the LAIS database also provide information on parcel size, ownership, and transaction value, and they enable one to track changes in these land-related aspects. Agencies and local government bodies involved in land-use planning will benefit from examining these data at a detailed level, including linking with geographic information systems and mapping that can show change over time at a precise level. Land accounts can also be used to examine how land use classifications conform to the recommendations in Rwanda's Land Use Development Master Plan, disaggregated to the District level. Specific areas of rapid change or land uses that are not aligned with the Master Plan can be investigated in depth, also in the field. Combining land use, land cover accounts, and land use plans in a geospatial analysis will become a very powerful and useful tool for checking how consistent such plans are with activities on the ground, so to speak, and for checking the direction of change. The accounts can be used for targeting areas for more detailed study, as well, or for monitoring the Land Use Master Plan's implementation, by focusing on areas where land use or land cover are undergoing rapid change.

Moreover, land accounts can inform the valuation of land, after full quality and consistency checks have been carried out. On its part, LAIS provides a systematic overview of land parcel transaction value.

Sustainability **2020**, *12*, 5070

This can be compared with the mortgage value evidenced in the banking system and revenue authority databases. In addition, land parcel transaction value can be compared with—or used as—reference prices for considering, e.g., value for mortgages and compensation if land is taken in the interest of national development. Furthermore, the Government continues to pursue its efforts to separate the value of land from the value of buildings and other structures on it.

Another benefit of land accounts is their potential to inform officials of changes in development and settlement patterns. With more detailed analysis and mapping information, the LAIS database can be used to report on the development of rural settlements and changes in residential land uses, by District or any other level of geographic detail. This can support the "integrated approach to land-use and human settlements" called for in the Second EDPRS. This would require more detailed work, but the data and systems are available to support this process.

In respect of analysing changes in parcel size by land use and geographic area, the LAIS database is once again of immense value. The current system already has quality data for two years, but there is no room for the discussion of long-term trends yet. This analysis shows that national averages of parcel size are not a good indicator of what is happening at the regional Province and District level, where there are both increases and decreases in parcel size across regions and uses. For some areas, these changes reach 3–5% over the two-year period examined, which indicates a rapid change in parcel size but in both directions—there are increases in some areas and decreases in others. The areas showing rapid change may deserve more in-depth analysis and further case studies to determine if such movements reflect plot transaction activity per se or whether they are artefacts of the administrative system or of dubious data quality.

Land accounts in developed countries are often linked to experimental ecosystem accounts so as to permit the assessment of how changes in land use and land cover are likely to affect the future provision of ecosystem services. The ongoing ecosystem accounting work in Rwanda is already making use of the country's land accounts in a similar fashion.

In conclusion, therefore, even though many of the data needed to develop Rwanda's land accounts are already being collected by the Government, compiling land accounts per se—as in this study—clearly led to new insights. Continuing the NCA process will permit the Rwandan Government to track a wider range of developments over time and could contribute directly to policy involving the prudent management of a key resource. While the hurdles for developing land accounts may be greater in many other developing countries, which have worse land data to begin with, many of the benefits from land accounts would be similar there. Thus, unlike the natural resource accounting efforts in African countries in the 1990s and early 2000s, which have since petered out, this new round of NCA initiatives will hopefully engender sufficient support among policymakers to enable the accounts to be maintained in posterity.

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