Agricultural intensification vs climate change: What drives long-term changes of sediment load?

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Abstract: Climate change and agricultural intensification are expected to increase soil erosion and sediment production from arable land in many regions. However, so far, most studies were based on short-term monitoring and/or modeling, making it difficult to assess their reliability in terms of estimating long-term changes. We present the results from a unique data set consisting of measurements of sediment loads from a 60 ha catchment (the Hydrological Open Air Laboratory, HOAL, in Petzenkirchen, Austria) which was observed periodically over a time period spanning 72 years. Specifically, we compare Period I (1946-1954) and Period II (2002-2017) by fitting sediment rating curves for the growth and dormant seasons for each of the periods. The results suggest a significant increase in sediment loads from Period I to
Period II with an average of $5.8 \pm 3.8 \, \text{t yr}^{-1}$ to $60.0 \pm 140.0 \, \text{t yr}^{-1}$. The sediment flux changed mainly due to a shift of the sediment rating curves (SRC), given that the mean daily discharge significantly decreased from $5.0 \pm 14.5 \, \text{l s}^{-1}$ for Period I to $3.8 \pm 6.6 \, \text{l s}^{-1}$ for Period II. The slopes of the SRC’s for the growing season and the dormant season of Period I were 0.3 and 0.8, respectively, whilst they were 1.6 and 1.7 for Period II, respectively. Climate change, considered in terms of rainfall erosivity, was not responsible for this shift, because erosivity decreased by 30.4% from the dormant season of Period I to that of Period II, and no significant difference was found between the growing seasons of Periods I and II. However, the change in sediment flux can be explained by the changes in land use and land cover (LUCC) and the change in land structure (i.e. organization of land parcels). At low and median streamflow conditions, land structure in Period II (i.e. the parcel effect) had no apparent influence on sediment yield. With increasing streamflow, it became more important in controlling sediment yield, as a result of an enhanced sediment connectivity in the landscape, leading to a dominant role at high flow conditions. The increase in crops that make the landscape prone to erosion and the change of land uses between Periods I and II led to an increase in sediment flux, although its relevance was surpassed by the effect of parcel structure change at high flow conditions. We conclude that land cover and land use change and land structure change should be accounted for when assessing sediment flux changes. Especially during high flow conditions, land structure change substantially altered sediment fluxes, which is most relevant for long-term sediment loads and land degradation. Increased attention to
improving land structure is therefore needed in climate adaptation and agricultural catchment management.

**Keywords:** Sediment regime; Land use/cover change; Parcel structure; Climate change; Agricultural catchment

**Introduction**

Soil erosion is a phenomenon of worldwide importance because of its environmental and economic consequences (Garcia-Ruiz, 2010; Prosdocimi et al., 2016). Climate change, land use/cover changes (LUCC) and other anthropogenic activities are commonly considered potential agents that drive variation of soil erosion rates (Nearing et al., 2004; Zhang et al., 2021). The impacts of climate change (e.g. Nearing et al., 2004; Zhang and Nearing, 2005; Mullan, 2013; Palazon and Navas, 2016) and of land use and cover change (e.g. Bochet et al., 2006; Korkanç et al., 2018; Nampak et al., 2018; Li et al., 2019; Perović et al., 2018) on erosion have been studied in recent years. As the two agents usually exert their influence on soil erosion simultaneously, their relative contributions have also been increasingly investigated in recent years (e.g. Bellin et al., 2013; Sun et al., 2020; Zhang et al., 2021). Combining field investigations with model simulations, Zhang et al. (2021) quantitatively evaluated the contributions of the decrease in annual rainfall erosivity, the decrease in arable land and bare land, and the construction of silt trap dams to the reduction of sediment load of a typical Loess watershed between 1987-2016, with the contribution
values being +29%, +40%, and +31%, respectively. Scholz et al. (2008) modelled how management practices on the local scale would affect soil erosion compared to climate change. They concluded that the conservational management practices would have a greater impact on reducing soil erosion rates than forecasted effects of climate change (i.e. the decrease in rainfall amounts in erosion sensitive months). Also, soil erosion accelerated by livestock grazing was found to be more important than climate change in the Qinghai-Tibet Plateau (Li et al., 2019).

Previous studies provide valuable information on understanding how LUCC and climate change affect soil erosion and sediment load. However, it seems that most of the previous studies considered LUCC (a change in land use and/or types of crops) and landscape structure change (a change in parcel size and structure) together. The relevance of landscape structure changes alone has so far received less attention. However, land use policies, such as land consolidation, have changed agricultural practices to a large extent since 1945, the beginning of agricultural industrialization (e.g. Moravcová et al., 2017; Devaty et al., 2019), and in particular in countries where this process is relatively recent (Bouma et al., 1998; Moravcova et al., 2017; Zhang et al., 2021).

Landscape structures usually influence erosion due to the boundary effects between land uses and land units (parcels) that differ in water and sediment trapping capacity (Baudry and Merriam, 1988; Merriam, 1990; Takken et al., 1999; Phillips et al., 2011). Van Oost et al. (2000) and Devaty et al. (2019) evaluated the role of landscape structure by accounting for its spatial connectivity using modelling approaches and
found that landscape structure is an essential factor when assessing the risk of soil erosion affected by land use changes. Both studies emphasized the potential impacts of land parcel structure changes on sediment production through altering hydrological and sediment connectivity. However, both studies relied on models, making connectivity assumptions in their studies. Instead of focusing on the spatial connectivity, others (e.g. Bakker et al., 2008; Sharma et al., 2011; Chevigny et al., 2014; Wang et al., 2021; Tang et al., 2021; Madarász et al., 2021) evaluated the effect of terrain, soil properties, lithology, management practices and other processes associated with landscape and/or land structure changes and highlighted their impact on sediment production. It has also been shown that the impact of landscape structure on erosion is more heterogeneous when different crops are grown, and the underlying lithology, soil properties and topography show substantial spatial variability across the catchment (David et al., 2014; Cantreul et al., 2020).

In our analysis, we evaluate the relative roles of climate change, LUCC and the change of land structure on sediment production. We define LUCC as a change in either type of land use (i.e. arable land, grassland, forest) or type of land cover (agricultural management, mainly by crops with different risk of soil erosion). We focus on understanding the respective role of LUCC and landscape structure change, based on long term observations that were usually not available in previous studies. We present the results from a unique data set consisting of measurements of sediment loads from a small agricultural catchment over a time window of 72 years. The study catchment is the 66 ha Hydrological Open Air Laboratory (HOAL) located in
Petzenkirchen (Blöschl et al., 2016), which, in addition to being exposed to climate change, has experienced a significant change in land use and land cover as well as parcel structure due to changes in land management policies during the past decades. Both discharge and suspended sediment concentration have been monitored periodically in the HOAL catchment from 1945 to 1954 and from 2000 to now. This provides an opportunity to disentangle the impacts of land structure change, land use/land cover change, and climate change based on long-term measurements. Specifically, we aim at i) exploring how the sediment regime shifted between the periods of 1945-1954 and 2002-2017; ii) analyzing whether climate change or LUCC (or both) were responsible for any change in the sediment regime; and iii) identifying the relevance of land structure change (i.e. land consolidation) on erosion control compared to LUCC.

2. Methods

2.1 Catchment characteristics

The HOAL catchment is situated in Lower Austria's alpine forelands (48°9' N, 15°9' E) with elevations ranging from 268 m to 323 m a.s.l. and a size of 66 ha (Figure 1). The climate of the catchment belongs to the temperate, continental climate zone (Dfb) according to Köppen-Geiger (Kottek et al., 2006). The mean annual precipitation is 746 mm (1946 - 2006), 62% of the rain falling between May and October. The mean daily air temperature is 8.8°C (1946-2006). The dominant land use is arable land, accounting for on average 82% of the catchment land use over the past few years. Typical crops include winter wheat, corn and barley. Deciduous trees grow along the
stream (6%), 10% of the area is grassland, and 2% is paved. The subsurface of the catchment consists of tertiary marine sediments. Soils are classified into five types: calcic cambisols, vertic cambisols, gleyic cambisols, planosols and gleysols (IUSS Working Group WRB, 2015).

2.2 Data availability

Both discharge \((Q, \text{l/s})\) and suspended sediment concentration \((C, \text{mg/l})\) have been measured at the catchment outlet periodically since the 1940s. A data set of discharge and sediment concentration was available for the period 1945-1954. After that, measurements were stopped and started again in 1990. Therefore, data records for the period 1946-1954 (Period I) and 2002-2017 (Period II) were used for this analysis. In Period II, the stream gauge was relocated. However, the difference in catchment size is very small (around 200 m²). This is indicated by the different locations of the discharge gauge in Figure 1. Due to technological advances, the measurement method of both \(Q\) and \(C\) changed between the two periods. In Period I, discharge was registered by a Thompson weir and a paper chart recorder, while in Period II, it was registered by an H-Flume and a pressure transducer. Thus, high temporal resolution, one-minute data for discharge were available for both periods. Sediment concentrations were measured manually every 3-4 days in Period I, whilst an automatic method (i.e. equal-discharge-increment sampling) and additional manual sampling were applied in Period II. Daily precipitation and 5-min rainfall intensities were available for both periods, but for Period I, 5-min rainfall intensities were only available during the growing season.
We used parcel-based land use data from 1946 to 1949 and 2007 to 2012, representing Period I and Period II land use, respectively. Land use categories were agricultural land, including crop type, grassland, forest, roads and settlements (i.e. paved area). We defined a parcel as a continuous area of land with a single crop type. Parcel boundaries were specified according to the cadastral map and aerial photographs. In Period II, these boundaries were also visually inspected. Figure 1 depicts the geographic catchment location, and parcel structure and land use for a specific year in each period.

Figure 1 Geographical location of the HOAL catchment in Petzenkirchen in Austria and Europe (a) and Parcel structure and land use in the HOAL catchment for 2007 (b) and 1946 (c). Coordinates as EPSG: 31256 – MGI / Austria GK East (meters).
2.3 Data analysis

2.3.1 Changes in rainfall erosivity and flow regime

The erosive potential of rainfall events was quantified by the R-factor of the Revised Universal Soil Loss Equation (RUSLE), which is defined as the product of kinetic energy of a rainfall event and its maximum 30-min intensity, using the rainfall erosivity tool RIST (USDA-Staff, 2019) according to

$$EI_{30} = \sum_{i=1}^{m} E_i \cdot I_{30,i}$$  \hspace{1cm} (1)

where \(EI_{30}\) is the Annual R-factor (MJ·mm ha\(^{-1}\)·hr) calculated as the sum of single event R-factors, \(E_i\) is the total kinetic energy for a single event (MJ·m\(^{-2}\)), \(I_{30}\) is the maximum rainfall intensity in 30 minutes within a single event \(i\) (mm·h\(^{-1}\)), and \(m\) is the number of events per year.

We assumed erosivity density \(ED\) (i.e. \(EI_{30}\) divided by event precipitation) to be a particularly relevant climatic indicator of soil erosion process and catchment sediment yield, because it is calculated as a combination of rainfall kinetic energy and maximum rainfall intensity of rain events. These are commonly considered as the relevant parameters of rain to trigger soil erosion. We thus tested, whether the means of the monthly erosivity density \((ED)\) are significantly different between Period I and Period II by using a t-test. Due to the absence of rainfall intensity measurements, we could not directly calculate \(ED\) for the months of the dormant season (November to March) of Period I. Instead, we calculated \(ED\) from a relationship between \(EI_{30}\) and monthly rainfall of Period II, assuming that the relationship was sufficiently temporally invariant over the investigated periods. Erosivity density is very low...
during the dormant season. The mean $ED$ was $0.66 \pm 0.21$ and $2.54 \pm 2.43$ MJ·ha$^{-1}$·hr$^{-1}$ respectively for the dormant season and the growing season of Period I, whilst it was $0.42 \pm 0.11$ and $1.87 \pm 1.35$ MJ·ha$^{-1}$·hr$^{-1}$ respectively in Period II (Figure 3a). Thus, the error arising from the use of this relationship is expected to be small.

We also compared daily flow duration curves to understand whether hydrological regime change has influenced flow transporting capacity and sediment regime change. Following the definitions of Smakhtin (2001), we compared low flow ($Q_{70\%}$), high flow ($Q_{10\%}$) and median flow rate ($Q_{50\%}$) quantiles for the two periods.

### 2.3.2 Sediment regime analysis

To analyze sediment regime, we first estimated sediment loads for the different periods. After calculating SRCs for Period I and Period II, using the data pairs of $Q$ and $C$ measurements, daily sediment load was estimated (see equation 2) by combining the measured high resolution data (1 min) for $Q$ with the derived SRC for each period. For further analysis, the daily sediment load was aggregated either by month or year.

$$Y = \sum Q_i \cdot \hat{C}_i \cdot T_i / 1000000 \quad (2)$$

where $Y$ is the sediment load within a day (kg·day$^{-1}$), $Q_i$ is the observed discharge at time step $i$ (l·s$^{-1}$); $\hat{C}_i$ is the estimated sediment concentration at time step $i$ (mg l$^{-1}$). $T_i$ (s) is the elapsed time between time step $i$ and the next time step $i+1$. The statistical differences of sediment loads either between seasons or between periods were examined by a t-test.
Following a commonly used approach (Asselman, 2000; Warrick and Rubin, 2007; Sheridan et al., 2011; Vaughan et al., 2017; Khaledian et al., 2017), the SRCs were here assumed to follow a power-law function, which was fitted by least squares regression:

\[ C = a \cdot Q^b \]  

(3)

where \( C \) is sediment concentration (mg l\(^{-1}\)), \( Q \) is discharge (l s\(^{-1}\)), and \( a \) and \( b \) are regression coefficients. The coefficient \( a \) is usually associated with easily transported intensively weathered materials and may vary over seven orders of magnitude (Syvitski et al., 2000). The parameter \( b \) represents the capacity of the stream to erode and transport sediment, reflecting how sediment concentration is non-linearly related to streamflow (Sheridan et al., 2011; Fan et al., 2012). It typically varies from 0.5 to 1.5 and rarely exceeds 2. Sometimes \( b \) is also regarded as a measure of the quantity of newly available sediment sources (Vanmaercke et al., 2010; Guzman et al., 2013).

Considering that data records were registered with different intensity for Periods I and II (see section 2.2), for the sake of consistency, we used monthly averages, as in other studies (Syvitski and Alcott, 1995; Sheridan et al., 2011; Hu et al., 2011), to construct SRCs. We assumed that monthly averages could reflect a varied hydrological and/or sediment response to seasonally prevailing weather characteristics such as dry periods or convective storms (Sheridan et al., 2011).

We chose arithmetic means of the observations to represent the monthly \( Q \) and \( C \) values. These monthly averages were pooled together and then grouped into growing season of Period I (Period I_G), dormant season of Period I (Period I_D), growing
season of Period II (Period II_G), and dormant season of Period II (Period II_D), respectively. For each of these four periods, we fitted SRC.

We analyzed the fitted SRC by two strategies to evaluate whether and how the sediment regime changed between these periods. Besides directly comparing the slopes of the four seasonal SRCs by ANCOVA analysis with the log-transformed discharge as independent variable, we also fitted the SRC for each specific year’s season and plotted the regression coefficients $a$ against their corresponding $b$ to evaluate a possible sediment regime shift during Periods I and II.

The latter framework was adapted from Thomas (1988), and also employed by Asselman et al. (2000) and Fan et al. (2012) to examine differences in sediment regimes between spatially different sites. Also, Sheridan et al. (2011) used the framework to reveal post-fire temporal shifts of a sediment regime. Thomas (1988) suggested that time-based sampling methods (either random sampling or systematic sampling) preferentially use observations of relatively small discharges to fit a SRC. This tends to reduce the slope and increase the intercept of a SRC (see point C in Figure 2b). In contrast, flow-based automatic sampling methods such as equal-discharge-increment sampling preferentially use observations of relatively large discharges. Thus, they tend to cause a reversed pattern of $a$ and $b$ (i.e. increase the slope and decrease the intercept of SRC, see the point A in Figure 2b). However, irrespective of sampling practices, the pairs of data points $a$ against $b$ will likely be allocated along a straight line, if sediment transport regimes are similar. The reason for the $a$-$b$ pairs lying nearly on a straight line is mainly due to a mathematical
property. That is, the slopes could be expressed by a linear function of the intercepts with the coordinates of the common point (Thomas, 1988). Therefore, for years with similar means of log-$Q$ and log-$C$, the SRCs will pass through one common point O (Thomas, 1988; Syvitski et al., 2000; Desilets et al., 2007; Sheridan et al., 2011). This common point O (Figure 2a) is usually interpreted to reflect time invariant catchment characteristics, such as relief, drainage area, and drainage density, while the variation of the slope of SRCs (Figure 2a) is interpreted to reflect temporally dynamic characteristics, such as average or maximum discharge and sediment availability (Asselman, 2000). The coefficients $a$ are usually inversely linearly related to $b$ (Thomas, 1988, Syvitski et al., 2000 and Desilets et al., 2007), and each point is representative of a period (or a catchment). If sediment transport regimes are similar between periods (catchments), the points will be plotted on the same line (such as A, B, C in Figure 2b), with points A of Figure 2b (upper-left-side) often exhibiting steeper sediment rating curves than points C (lower-right side). As for different lines in Figure 2b, the lower ones characterized by points A’, B’, and C’ represent situations with most of the annual sediment load being transported at relatively low flow discharges. Whilst the higher ones characterized by A, B, and C represent situations with suspended sediment being mainly transported at high streamflow. Compared to a direct evaluation of rating curves, relating coefficient $a$ to exponent $b$ is more conductive to revealing temporal evolution of sediment regime (Syvitski et al., 2000; Desilets et al., 2007). The change in the relationship of coefficients $a$ against $b$ between the periods was also examined by ANCOVA.
Figure 2 Schematic showing a) how sediment rating curves (SRC) may rotate around a common point and b) how exponents $b$ of the SRC relate to coefficients $a$. Lines A, B and C on the left are SRC of different periods (e.g. years) sharing a similar common point $O$. Once sediment regimes shift due to the changes in catchment characteristics (change in drainage density, drainage area, and topography) the common point $O$ would change to point $O'$, and the linear relationship between $a$ and $b$ of the SRC would exhibit a shift as well. The schematic is based on $\log C = \log a + b \log Q$ (Equation 3).

To account for uncertainties of the fitted SRC during each period, we additionally established theoretical sediment rating curves (tSRC)

i) For each period (i.e. Period I_G, Period I_D, Period II_G, and Period II_D), we carried out random sampling of $\log a$ ($n=500$, package "sample" in R), assuming that the samples of the coefficient of $\log a$ follow normal distributions, which was examined with a Kolmogorov-Smirnov test of normality (mean = 1.02, SD = 2.01, $n=44$, $p<0.05$);
ii) Given the set of the sampled 500 values of log \( a \), we generated a set of values \( b \) according to the previously established linear relationship between log \( a \) and \( b \);

iii) Given a set of specified \( Q \) values, we derived 500 tSRC for each period, corresponding to the paired log \( a \) and \( b \) samples;

iv) Using these tSRC we calculated the 50 percentile, the 5 percentile, and the 95 percentile for each period to estimate the uncertainties of the sediment rating curves. The tSRC of the periods were also used to quantify the effect of land consolidation, i.e. the change of parcels structure and sizes (Parcel_effect) and the effect of land use and land cover changes (LUCC_effect). Vegetation usually plays a minor role in the dormant season due to the absence of a dense vegetation cover on arable land and little erosive rainfall (Madsen et al., 2014; Kundzewicz, 2012; Salesa and Cerda, 2020; Hou et al., 2020). Therefore, landscape structure in the dormant season was considered a dominant factor for water and sediment transfer across the land surface, and thus runoff production and sediment production (Sharma et al., 2011; Devátý et al., 2019). Therefore, we hypothesized that the total change in sediment yield (Total_effect) resulted from land cover change (LUCC_effect), land structure change (Parcel_effect) and climate change (Climate_effect). Since the area of our catchment is only 0.66 km\(^2\), no obvious change was found in the shape of the small stream for the two periods. Stream sediment resuspension is rather small (Eder et al., 2014), therefore, the contribution of bank erosion was not taken into account. The effects of land cover and land structure change was quantitatively separated according to the seasonal differences in tSRC after determining the climate change effect. Specifically,
we assumed that the shift of sediment regime from Period I_D to Period II_G was representative of the Total_effect (Equation 4), and the shift in sediment regime between Period I_D and Period II_D was mainly due to land consolidation (Parcel_effect) (Equation 5). The LUCC effect, thus, could be estimated according to Equation (6) if the Climate_effect was insignificant (section 3.1). The contributions of Parcel_effect and LUCC_effect to the Total_effect were estimated according to Equations (7) and (8), respectively.

\[
\text{Total\_effect} = tSRC_{50\%}(\text{Period II\_G}) - tSRC_{50\%}(\text{Period I\_D}) \quad (4)
\]

\[
\text{Parcel\_effect} = tSRC_{50\%}(\text{Period II\_D}) - tSRC_{50\%}(\text{Period I\_D}) \quad (5)
\]

\[
\text{LUCC\_effect} = \text{Total\_effect} - \text{Parcel\_effect} - \text{Climate\_effect} \quad (6)
\]

\[
\text{Parcel\_effect\%} = \frac{\text{Parcel\_effect}}{\text{Total\_effect}} \times 100 \quad (7)
\]

\[
\text{LUCC\_effect\%} = \frac{\text{LUCC\_effect}}{\text{Total\_effect}} \times 100 \quad (8)
\]

3. Results

3.1 Changes in climate and flow regime

Because climate change is often found responsible for hydrological change (e.g., Kelly et al., 2016; Wang et al., 2020), we compared erosivity density (ED) and monthly precipitation (P) of the two periods to examine whether climate affected the variation of the sediment regime in the catchment (Figure 3). The mean monthly ED in the growing season were 2.37 ± 1.38 and 1.84 ± 0.86 MJ·ha⁻¹·hr⁻¹ for Periods I and
II, respectively (Figure 3a). No significant difference \((p>0.05)\) was found between the two growing seasons. Mean monthly ED in the dormant seasons showed a significant \((p<0.05)\)

![Figure 3 Monthly erosivity density a) and monthly precipitation b) for Periods I and II. The bars with a dashed outline represent the growing seasons (April to October), the bars with a solid outline the dormant seasons (November to March). The whiskers indicate the range between the minimum and the maximum, the asterisks indicate the outliers.](image)
decrease from the first to the second period (0.66±0.21 and 0.42±0.11 (MJ·ha⁻¹·hr⁻¹), respectively). A $t$-test suggests that there was no significant ($p>0.05$) difference in mean monthly $P$ between the first and second periods in both the dormant and the growing seasons (Figure 3b). The mean monthly $P$ was 50±33 and 76±54 mm for the dormant and growing season of Period I, and it was 53±29 mm and 79±47 mm for the two seasons of Period II. The decrease in $ED$ during the dormant season of Period II and the insignificant change in monthly $P$ suggest that climate change between Period I and II was not responsible for an increased sediment load (see section 3.3). It should be noted, that processes related to snow play a minor role in the catchment because it is considered a lowland catchment, located in a region with very small amounts of snowfall (about 10% of annual rainfall). Thus, a possible change in the proportion of snowfall in precipitation during the winter season of Periods I and II was not accounted for when addressing the impact of climate change on sediment load.

Streamflow in Period I was higher than that of Period II, and the mean annual streamflow was 188 and 146 mm yr⁻¹ for Periods I and II, respectively. Daily flow duration curves for both periods are displayed in Figure 4. A $t$-test suggests that they are significantly different ($p<0.05$). The $Q_{70\%}$ low flow of the two periods was 2.7 and 2.4 l.s⁻¹, the $Q_{50\%}$ median flow was 4.0 and 3.1 l.s⁻¹, and the $Q_{10\%}$ high flow was 10.7 and 7.5 l.s⁻¹, for the two periods, respectively. The decreased flow regime of Period II, which is probably in part due to an increased evapotranspiration over the past decades (Duethmann and Blöschl, 2018), indicates that streamflow cannot account for the
observed increased sediment load of Period II. Otherwise an increased streamflow would be expected in Period II.

Figure 4 Mean daily flow duration curve for Periods I (solid line) and II (dashed line).

3.2 Change in land use and land organization

Table 1 shows how land use changed between the two periods. During Period I, cropland and grassland accounted for 73% to 82% (varying between years) and 14% to 22%, respectively. However, due to agricultural intensification, cropland increased to around 82% in Period II, at the expense of a decreasing share of grassland. Forest, including sparse forest, accounted for 1.8% area during Period I but increased considerably until Period II to around 11%. The increase in cropland and forest suggests higher rates of evaporation and transpiration, and consequently less streamflow, which is in line with the previously examined trends of streamflow.
dynamics. When further analyzing the land use classes of arable land, a substantial change was found for the crop types too, with the crops of low risk for soil erosion being replaced with crops that exhibit a high soil loss potential. This was particularly true for maize. In addition, the diversity of crops decreased considerably (Table 2). This shift towards agricultural uniformity likely acts as a land structure effect. A loss of heterogeneity of crop types increases the probability that different fields are managed with the same crop. Then even smaller fields may behave similarly to larger fields in terms of sediment production.

Besides the change in land use, the parcel structure of the catchment has also changed (Table 1). This change was related to a land consolidation plan issued in 1955 in Austria (Devátý et al., 2019) and a massive trend to agricultural industrialization that evolved after 1945 (mainly referring to the massive application of advanced machinery and fertilization technologies that started in the 1950s). During Period I, arable land was fragmented across many small parcels, with a mean parcel size between 0.5 - 0.6 ha and a resulting parcel density (number of parcels per ha area) between 1.7 - 2.0 ha⁻¹ in different years. In Period II, these values increased considerably to mean parcel sizes between 1.7 - 2.7 ha and parcel densities between 0.3 - 0.6 ha⁻¹. Similarly, the mean parcel size and parcel density of grassland during Period I were 0.13 - 0.17 ha and 5.2 - 7.2 ha⁻¹. It changed to 1.06 ha and 0.9 ha⁻¹ in Period II. As parcel structures are identified to influence sediment loads mainly due to the boundary effects (e.g. Baudry and Merriam, 1988; Takken et al., 1999; Phillips et
al., 2011), the substantial decrease in parcel density of the catchment in Period II, was expected to affect sediment load as well.

Table 1 Parcel and land use statistics for Periods I and II. Land use for the years 1946 to 1949 represents Period I, land use for the years 2007 to 2012 represents Period II; N is the number of parcels for a given land use, density is the number of parcels per ha, mean size represents the mean area of parcels with a particular land use.

Table 2 Crop statistics of arable land for Periods I and II; Crop statistics for the years 1946 to 1949 represent Period I, crop statistics for the years 2007 to 2012 represent Period II; Erosion risk for a particular crop is classified as high or low according to the classification of management in the RUSLE. The statistical values represent the ranges of the area for each crop during Periods I or II.
3.3 Change in sediment transport regime

3.3.1 Direct comparison of the fitted SRCs

Figure 5 shows the fitted sediment rating curves ($p<0.05$) for both periods. A t-test suggests that the slopes of the regression lines are significantly ($p<0.05$) different between the dormant seasons or growing seasons. Although rainfall erosivity of Period II_G was similar to that of Period I_G (Figure 3a) and streamflow of Period II was generally lower than that of Period I (Figure 4), the fitted SRC of Period II_G was steeper than that of Period I_G (Figure 5a), with the coefficients $b$ being 0.3 and 1.6 for Period I_G and Period II_G, respectively (Table 3). The fitted SRC of Period II_D demonstrated a faster response of sediment concentration to increasing flow compared to that of Period I_D (Figure 5b), the coefficients $b$ being 0.8 and 1.7 for Period I_D and Period II_D, respectively. However, the rainfall $ED$ in Period II_D was generally lower than that of Period I_D (Figure 3a). This suggests a lower probability of a substantial increase in sediment availability. These results indicate that neither changes in rainfall erosivity nor the hydrological regime could explain the increase in sediment dynamics.
Figure 5 Sediment rating curves for a) the growing seasons and b) the dormant seasons in the two time periods. Each point represents a monthly mean observation.

Table 3 Parameter values for the coefficients of the SRC for different periods and seasons according to Equation (3).

<table>
<thead>
<tr>
<th>Period</th>
<th>Coefficient</th>
<th>( r^2 )</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>( a )</td>
<td>( b )</td>
</tr>
<tr>
<td>Period I G</td>
<td>16.7</td>
<td>0.3</td>
</tr>
<tr>
<td>Period I D</td>
<td>4.9</td>
<td>0.8</td>
</tr>
<tr>
<td>Period II G</td>
<td>5.4</td>
<td>1.6</td>
</tr>
<tr>
<td>Period II D</td>
<td>1.2</td>
<td>1.7</td>
</tr>
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</table>

3.3.2 Relationship between coefficient \( a \) and \( b \)

The changing steepness of a fitted SRC does not necessarily imply a change in the sediment regime as the slopes of fitted SRC are sometimes affected by catchment size or the distribution of samples (Asselman, 2000). To minimize possible interference of other factors in identifying variations or shifts of the SRC, we investigated the relationship between coefficients \( a \) and \( b \) of the SRC. Figure 6 shows the coefficients \( \log(a) \) plotted against \( b \) for the four investigated time frames. Interestingly, the data points of both Periods I and II, for the growing season are more concentrated in the lower right part of the graphs (Figure 6a). A different pattern of \( \log(a) \) against \( b \) was
found for the dormant season (Figure 6b), i.e. the data points of Period I concentrated in the lower right area (blue points). But the points were more concentrated in the upper left area for Period II.

Figure 6 Relationship between coefficients $a$ and $b$ for a) growing season and b) dormant season of Period I (blue) and Period II (red), respectively. $\log(a)$ in x-axis represents the decadal logarithm. The arrows represent the shift of the sediment regime between Period I and Period II (see text below). All regressions are significant at $p<0.05$.

According to Asselman (2000), a shift of sediment regime means an alteration of either soil erodibility and/or erosive power of the river. In Figure 6, we found that the regression lines of Periods I to II are different. The intercepts of the regression lines are significantly different ($p<0.05$) for the growing seasons (Figure 6a). The slopes of the regression lines for Periods I and II were -1.60 and -0.94 in the growing season (Figure 6a), and -1.58 and -0.80 in the dormant season, respectively (Figure 6b). The upward shift of the line at $\log(a)$ larger than around 0.6 suggests that in Period II,
most of the sediment was transported at relatively high flow rates. Since climate
change was not responsible for the increased hydrological regime (see section 3.1),
we mainly attribute this shift to the increase in hydrological connectivity, such as flow
path density and flow length, and a change in land use and land cover statistics.

Figure 7 Theoretical sediment rating curves (tSRC) for the growing seasons (a) and the dormant seasons (b) of Period I and II. Solid lines denote the 50 percentile of the tSRC for each period (i.e. tSRC_{50\%}). The grey area denotes the range of the predicted tSRC composed of 5 and 95 percentiles (i.e. tSRC_{5\%} and tSRC_{95\%}). Q_{30\%} and Q_{70\%} represent the flow conditions of 3.9 l s^{-1} and 2.0 l s^{-1}, respectively.

Figure 7 displays the theoretical sediment rating curves (tSRC) with their uncertainties for the different periods and seasons. At a given Q higher than approximately Q_{70\%}, sediment concentrations in Period II_G were higher than those in Period I_G (Figure 7a), whereas for flow rates below this value sediment concentrations were not different. The increased sediment concentrations in Period II_G are in line with the observations of the sediment load of Period II_G (6.3 ± 32.5 t per month) which is largely enhanced compared to that of Period I_G (0.4 ± 0.9 ton
per month), see Table 4. Sediment concentrations were less different between the
dormant seasons of Period I and Period II at flow rates lower than $Q_{30\%}$ (Figure 7b),
which is also reflected by the insignificant ($p>0.05$) difference in sediment loads
between Period I_D and Period II_D (being $0.6\pm1.1$ and $3.2\pm14.0$ t per month,
respectively). However, an ANCOVA suggests that the derived $t_{SRC_{50\%}}$ were
significantly different ($p<0.05$) between the two periods, both in the growing seasons
and dormant seasons. This enables us to estimate LUCC_effect and Parcel_effect
according to the derived $t_{SRC}$s.

<table>
<thead>
<tr>
<th>Period</th>
<th>Growing season (t month$^{-1}$)</th>
<th>Dormant season (t month$^{-1}$)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Period_I</td>
<td>0.4±0.9</td>
<td>0.6±1.1</td>
</tr>
<tr>
<td>Period_II</td>
<td>6.3±32.5</td>
<td>3.2±14.0</td>
</tr>
</tbody>
</table>

Note: Estimates based on equation (2)

### 3.4 Parcel_effect versus LUCC_effect

Figure 8 demonstrates the dynamic contributions of land structure (Parcel_effect) and
LUCC changes (LUCC_effect) on sediment concentrations with increasing flow. Land
structure change and the increase in cropland as well as a shift to crops with high risk
of erosion explain the increase in sediment yield. However, the extent of their
contributions to this increase differ. Generally, with higher flow rates, the contribution
of the LUCC_effect gradually decreased, whilst the contribution of the Parcel_effect
increased. The Parcel_effect accounted for more than 50% of the Total_effect after the
flow rate exceeded 20 l s$^{-1}$ approximately (i.e. $Q_{70\%}$) (Figure 8), exhibiting a dominant
role in sediment production. This opposite trend of the relative contributions of the
LUCC_effect and the Parcel_effect suggests that, even though land structure change
and LUCC both have unbenevolent effects on erosion control, their hydrological consequences may be different. Land structure change probably explains much of the variation of sediment load at high flow conditions.

Unlike the situation during high flow rates, the Total_effect showed an almost zero value at flow rates less than approximately 2 l.s\(^{-1}\) (i.e. \(Q_{70\%}\)), suggesting no difference in sediment load between Periods I and II at low flow conditions. The increase in sediment concentration at flow rates of 2 l.s\(^{-1}\) up to around 20 l.s\(^{-1}\) seemed to be mainly caused by the changes in LUCC of Period II, as the contribution from the LUCC_effect was consistently higher than that of the Parcel_effect.

One may note that forest land cover increased considerably from Period I to Period II. We hypothesize that even though a beneficial effect of forest increase (up to a total of 11% of the catchment) may have appeared in Period II, it was easily offset by the negative effect of crop land changes, particularly the increase in row crops that are in general at a high risk of erosion. This contributed substantially to sediment yield compared with other land uses and other crop types (Kijowska - Strugala et al., 2018).
Figure 8 Contribution of Parcel_effect and LUCC_effect to the Total_effect across various flow rates. Total_effect (Equation 4) is displayed in terms of suspended sediment concentration. Parcel_effect and LUCC_effect was estimated by Equations (5) and (6), respectively; their contribution to the Total_effect was estimated by Equations (7) and (8), respectively.

4. Discussion

The industrial intensification of agriculture implemented during the last 70 years has raised considerable concerns regarding erosion and sediment loading of rivers (e.g. Bakker et al., 2008; Chevigny et al., 2014). However, with global climate warming, the different contributions of LUCC, land policy adjustments (i.e. land structure changes), and climate change affecting sediment load remain not well understood.

This paper aims at evaluating the relative roles of climate change, LUCC, and land structure changes for sediment production, particularly at different flow rates.

4.1 Change in sediment load between two time periods
We found that the sediment load increased almost six fold from Period I to Period II. This finding is supported by estimates of the management factor (C-Factor) and the slope and slope length factor (SL-Factor) of the RUSLE for Period I and Period II (Fiener et al., 2020). The C-Factor integrates changes in land use and crop statistics, thus it directly corresponds to changes of LUCC. The SL-Factor integrates parcel slopes and parcel sizes. Considering that the slopes in the HOAL did not change between the two periods, the SL-Factor may be used as direct indicator for changes in land structure. While the mean C-Factor of the HOAL catchment increased from 0.16 in Period I to 0.33 in Period II, the SL-Factor increased from 0.76 to 0.96. Added together, the changed values for these two factors increased the theoretical soil loss within the catchment by over 150%. This value is smaller than the changes observed, however it should be noted, that the RUSLE has not been designed to account for sediment loads of catchments but to estimate field scale soil loss within catchments. This may explain the observed differences to a certain extent.

4.2 Potential interference of different sampling methods

Due to technical advancement over the long investigation period, different sampling methods, i.e. grab sampling and automatic equal-discharge-increment sampling, were used in this study for Periods I and II. This may affect both rating curve estimation and sediment load estimation (Harmel et al., 2010; Thomas, 1988).

To test a potential influence that may result from the different sampling frequencies in the two periods, we resampled the data set of Period II. We randomly selected
repeated subsamples (n=10) of the $Q$-$C$ observations of Period II with equal sample size to that of Period I. With each of the resampled datasets, we calculated SRCs. Combined with the flow data, the derived 10 SRCs were then used to calculate a mean annual sediment load. Comparing the mean annual sediment load from the resampling $(62.4 \pm 10.2 \text{ t} \cdot \text{yr}^{-1})$ to that of the original data set $(60.0 \pm 140.0 \text{ t} \cdot \text{yr}^{-1})$ resulted in an insignificant difference, suggesting that the different sampling strategies of Periods I and II did not affect the results.

Further support to the validity of our results is provided by Groten and Johnson (2019), who suggested that for sediment with very fine textural composition, the bias of different sampling strategies might be small. In our study catchment, the topsoil of the catchment is very fine textured consisting of 75% silty loam, 20% silty clay loam, and 5% silt according to the USDA soil classification (Picciafuoco et al., 2019).

4.3 Dynamic relevance of land consolidation in controlling sediment load

Climate change in terms of both monthly erosivity density ($ED$) and precipitation ($P$) was not responsible for the increase in sediment load, instead it could be explained by LUCC and land structure changes. This finding is particularly important in regions, where a strong intensification of agricultural management took place during the last decades. The relative contributions of LUCC and land structure changes varied with streamflow. For flow conditions below around 5 l.s$^{-1}$ (i.e. $Q_{20\%}$), land structure change had no apparent adverse effect on erosion, but with increasing flow, the contribution
to sediment load increased continuously, leading to a dominant role at high flow rates. This finding is partially in line with David et al. (2014) and Cantreul et al. (2020). They reported that landscape structure was less important for soil erosion than LUCC during normal flow conditions. However, they did not investigate whether the effect of landscape structure showed a dynamic behavior with increasing flow. In contrast, the LUCC_effect, i.e. the increase of crops with high erosion risk and the change in land use, continuously affected sediment load with gradually decreasing importance at high flow conditions. Similar results were reported by Vaughan et al. (2017), who showed that sediment concentration at low and median flow conditions was considerably associated with a change in catchment characteristics, primarily land use and land cover. Although the role of LUCC was dominating for flow conditions less than $Q_{20\%}$, it’s contribution to the total annual sediment load was small. More than 75% of the total sediment load was transported during a small number of events (25 events in Period I, 8 events in Period II) and all events had flow rates above 15 l.s$^{-1}$ (approximately at $Q_{13\%}$ in Period I or $Q_{4\%}$ in Period II, respectively), which underlines the importance of land structure for sediment loading.

The dynamic relevance of LUCC and land structure changes in sediment production is associated with the processes and mechanisms controlling overland flow as a transporting agent for sediment (e.g. Sun et al., 2013; El Kateb et al., 2013; Nearing et al., 2017; Silasari et al., 2017; Kijowska - Strugała et al., 2018). A change in types of land use and used crops (LUCC) implies alterations of surface characteristics, such as above ground structure morphology, litter cover, organic matter components, root
network (Gyssels et al., 2005; Wei et al., 2007; Moghadam et al., 2015; Patin et al., 2018) and soil properties (Costa et al., 2003; Moghadam et al., 2015). These properties influence the protective role of vegetation in soil detachment, the flow capacity to transport sediment particles, and runoff flow paths to the stream channels (Van Rompaey et al., 2002; Lana-Renault et al., 2011; Sun et al., 2018). The protective effects tend not to linearly increase with increasing surface runoff. Accelerated discharge and stronger scouring effects of upslope discharge might impair the protective role of vegetation (e.g. Zhang et al., 2011; Santos et al., 2017; Bagagiolo et al., 2018; Yao et al., 2018; Wang et al., 2019). Vegetation usually exhibits a smaller interception capability at high rainfall intensity, resulting in an enhanced splash erosion and availability of mobile soil particles (Cayuela et al., 2018; Magliano et al., 2019; Nytch et al., 2019). However, the decreasing contribution of the LUCC_effect does not directly imply an absolute decrease of the magnitude of the LUCC_effect. The absolute change in sediment concentration resulting from LUCC reveals an increasing trend as flow rates increase. Thus, the contribution of the LUCC_effect stands for the relevance of LUCC in erosion control compared to the change due to land structure. The magnitude of the LUCC_effect probably depends mainly on where within the catchment the LUCC is changed and how the proportional area of various land uses changes. We will address this topic in future analyses.

Unlike land cover and land use change, landscape structure is usually combined with other catchment properties, such as slope characteristics and soil properties (Gascuel-Odoux et al., 2011) and additional erosion and transport factors (Verstraeten
et al., 2000). These factors exert a more complicated influence on erosion. For example, the effect of landscape structure on soil erosion may be identified on moderate slopes, while on steep slopes it may be concealed by on-site severe soil erosion (Chevigny et al., 2014). However, the key process for erosion control is the fact that landscape elements and their structural position (i.e. parcel structure, field boundaries, hedges and similar) alter hydrological connectivity between land and water. This is particularly true when the land cover on both sides of boundaries is different (Van Oost et al., 2000). Reducing parcel size and heterogeneity increases hydrological connectivity significantly and results in a substantial off-site damage effect, irrespective of on-site erosion of the investigated land use (Boardman et al., 2018; Devátý et al., 2019). During low and median flow conditions, surface runoff and sediment may arrive to a lesser extent at field boundaries due to efficient interception effects of the vegetation cover. This may explain the identified dynamic relevance of land structure change in sediment load found here.

5 Conclusions

Climate change, land use and land cover change, and other human-associated activities are widely regarded as potential agents driving hydrological change. Understanding the relevance of each of these agents in the hydrological cycle is critical for implementing adaptive catchment management measures and addressing climate change. Although very significant climate change influences in the last decades have been identified for certain components of the hydrological cycle we
found that climate change expressed in changes in rainfall erosivity and precipitation cannot explain the increased sediment production between 1946-1954 and 2002-2017 in the investigated catchment. Instead, both LUCC and land structure change played important, dynamic roles in erosion and sediment production.

The relevance of land use and land cover change versus land structure change varied dynamically with changing flow conditions. The reduction in parcel density undoubtedly increased sediment load, particularly at higher flows due to the decreased capacity of trapping sediment particles between parcels and increasing flow lengths inside parcels. Unfavorable land use or land cover change increased sediment load at most flow conditions, although the relevance of this process decreased at high or very high flow rates. Therefore, when addressing soil conservation measures at the catchment scale, the distribution of fields, land structure, and vegetation cover should be simultaneously considered. Such a strategy would be conducive to deal with the risk of soil erosions at different flow rates. Land use policy adjustments resulting from technological development have been vital to deal with food security issues in the past. However, now we experience the negative influence of these adjustments on the hydrological cycle. Therefore, rather than focusing on climate change solely, we need to pay increased attention to anthropic management activities to counteract their negative impact on hydrological change effectively.

**Author contributions**
Shengping Wang has led the data analysis, drafted the manuscript, and revised the manuscript; Peter Strauss was responsible for the project design, oversaw the whole analysis, and conducted manuscript revision as the project leader; Carmen Krammer was responsible for data collection and data preparation; Elmar Schmaltz has contributed to figure drawing and manuscript revision; Borbala Szeles has helped with data analysis and manuscript revision; Kepeng Song and Yifan Li helped with data processing; and Günter Blöschl oversaw and critically reflected on the manuscript writing as the senior scientist.

Competing interests
The authors declare that they have no conflict of interest.

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