

# Landslides in cultural landscapes: legacy effects of land-use in a centennial perspective

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High landslide density under recently forested areas! ... considering historical LiDAR-derived inventory







Landslides in cultural landscapes: legacy effects of land-use in a centennial perspective by Knevels et al.



- > Looking back into the land-use/land-cover since the 18<sup>th</sup> century
- Investigated three time points (1820, 1960, 2015)
- Modelling landslides with land-use legacies and local topography
- > 2 study areas in Austria (Waidhofen & Paldau)
- What does the model tell us? ----> Visit our PICO at screen PICO1.12 ©



Landslides in cultural landscapes: legacy effects of land-use in a centennial perspective by Knevels et al.





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Introduction

**Study Area and Data** 

**Method and Results** 

**Conclusion** 

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Introduction

LiDAR-derived inventories often show a surprisingly high landslide density particularly in forested areas. This apparent contradiction underlines the need to better understand the factors explaining landslide occurrence in cultural landscapes. We hypothesize that land-use legacies may be a previously-neglected explanatory factor.

The **objective** of this study was to assess relationships between landslide occurrence and land-use legacies (until 1820) while also accounting for geomorphological and lithological conditions as possible confounders.



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#### [Overview] | Introduction | Study Area and Data | Method and Results | Conclusion

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- Study areas Paldau and Waidhofen located in the alpine fringe region, Austria
- Input data ...
  - LiDAR DTM (1 x1 m resolution) and its derivatives
  - Lithology and soils
  - Land-use legacy (1820 1960 2015):
    - Biomass removal
    - [Soil compaction]
    - Mean distance to forest border
    - Land-use/land-cover change: current forest, deforestation, afforestation
- Historical landslide inventory based on LiDAR DTM
  - Different polygons for landslide body and scarp













Sampling design (trivial area, spatial auto correlation, scarp points)

Landslide susceptibility modelling using generalized additive model (GAM)

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# Model performance

- Assessment using the area under the ROC curve (AUROC) estimated by 5-fold spatial cross-validation with 100 repetitions
- Paldau: 0.89 median AUROC
- Waidhofen: 0.80 median AUROC



0.9 0.8 AUROC 0.7 0.6 0.5 Waidhofen Paldau GAM Model

# **Method and Results**



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# Sampling design (trivial area, spatial auto correlation, scarp points)

Landslide susceptibility modelling using generalized additive model (GAM)

# **Explanatory power of predictors**

Mean decrease in deviance explained

Odds ratios of land-use legacy variables (and other)

Component smooth functions of numerical variables

#### [Overview] | Introduction | Study Area and Data | Method and Results | Conclusion







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- Sampling design (trivial area, spatial auto correlation, scarp points)
- Landslide susceptibility modelling using generalized additive model (GAM)

# **Key findings**

- Waidhofen:
  - Afforested areas have a 2.4-times higher chance of landslide occurrence than not afforested areas.

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- The chance of landslide occurrence in current forest areas is 0.6-times less than in current non-forest areas.
- Areas with a higher mean distance to the forest border show a lower chance of landslide occurrence (50 m: 0.94 | 100 m 0.87 | 300 m: 0.52).
- Areas with a higher biomass removal show a higher chance of landslide occurrence (from 4000 kg FW/ha: 1000: 1.23 | 4000: 2.3 | 8000: 5.35).

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- Sampling design (trivial area, spatial auto correlation, scarp points)
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# **Key findings**

**Method and Results** 

- Paldau:
  - Deforested areas have a 2.2-times higher chance of landslide occurrence than not deforested areas.

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• The chance of landslide occurrence in current forest areas is 4.7-times higher than in current non-forest areas.









- Integration of land-use legacy as predictors enhances the model fit
  - BUT slope is the most important variable
- Each study must be modelled and explained individually due to different underlying cultural landscape change

 Bias in historical inventory ("landslides in forest areas") can not be completely eliminated -> implementation of land-use in modelling with care!

 Result has the potential to assess implications of future land-use change for landslide occurrences

# **Study Area and Data**



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## **Study Area and Data**

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Terrain attributes	Land-use/land-cover	Social- ecological indicator	Other
Aspect (N-S, W-E)	Land-use/land-cover change classes	Biomass removal	Lithological units
Convergence Index (100m, 500m)	current forest area	[Soil compaction]	Total pore volume
Curvature (plan, profile)	deforestation		Water conductivity
Normalized height	afforestation		
SAGA Wetness Index	Mean distance to forest border		
Slope			
Slope, catchment			
Topographic Position Index			
Upslope contributing area			

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• GIS vector database for 1820, 1960, and 2015

**Study Area and Data** 

Land-use/land-cover: Forest, cropland, grazing land, and other land

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- archival sources and statistical publications
  - 1820: Franciscan Cadastre
  - 1960: aerial photographs
  - 2015: InVeKoS data combined with aerial orthophotos
  - yields and livestock information
- Digitized at scale 1:1000
- Positional error estimates: 1820: 3-5 m; 1960: 5-10 m; 2015: < 3 m</li>







[Cultural landscape change map] [Creation of legacy rasters]

[Change statistics]











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# **Study Area and Data**





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- Landslide presence samples are located in the landslide scarp
- Landslide body is masked for landslide absence samples
- Reduction of spatial auto-correlation effects by using minimum distance constraint of 50 m between sampling points
- Masking of so-called trivial area by using the lithological unit of alluvial deposits to reduce bias in modelled relationships





- Inventory ~ local topography + land-use legacy + lithology + soil
- Landslide susceptibility classification:
  - low susceptibility class contains 5 % of the observed landslides
  - medium susceptibility class contains 25 % of the observed landslides
  - high susceptibility class contains 70 % of the observed landslides
- Proportion of the high susceptibility class area: Waidhofen: 23.52 % | Paldau: 13.07 %
  Waidhofen
  Paldau











	N	Waidhofen		Paldau			
Predictor Odds ratio	Confidence Interval		Odde ratio	Confidence Interval		Incromont	
	Odds Tallo	2.5 %	97.5 %	Ouus railo	2.5 %	97.5 %	norement
Current forest	area (reference lev	/el = currei	nt non-forest	area)			
	0.60*	0.41	0.90	4.71 ***	2.87	7.71	indicator variable
Deforestation (	reference level = r	no deforest	tation)				
	0.81	0.52	1.26	2.25**	1.30	3.87	indicator variable
Afforestation (	reference level = n	o afforesta	ation)				
	2.42***	1.59	3.68	0.76	0.37	1.55	indicator variable
Mean distance	to forest border (r	eference v	alue = 0 m)				
	0.94*	0.92	0.97	1.00	1.00	1.00	50
	0.87*	0.85	0.90	1.00	1.00	1.00	100
	0.52*	0.48	0.57	1.00	1.00	1.00	300
Biomass remo	val (reference valu	ie= 4000 kg	g FW/ha)				
	1.23***	1.12	1.36	1.00	1.00	1.00	1000
	2.31 ***	1.67	3.19	1.00	1.00	1.00	4000
	5.35 ***	3.83	7.48	1.00	1.00	1.00	8000

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1.



[Odds ratios lithology]

Predictor	Odds ratio	Confider	Confidence Interval	
		2.5 %	97.5 %	increment
Lithological unit (reference level =	Oberostalpine Lim	e)		
Talus & glacial deposit***	36.91	13.08	104.11	indicator variable
Inneralpine Neogen***	132.81	32.53	542.23	
Klippen Zone***	66.66	31.53	140.91	
Flysch Zone***	13.30	7.27	24.34	
Oberostalpine Marl***	7.07	4.00	12.51	

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1.

	Paldau			
Predictor	Odds ratio	Confidence Interval		Increment
	Odds fallo	2.5 %	97.5 %	merement
Lithological unit (reference level =	= Tertiary )			
Quaternary Rutschhang, tertiary Clay Marl	0.86	0.55	1.35	indicator
Quaternary High Terraces & Higher Terraces	0	0	Inf	variable

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1.

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