

# The effects of privatization on pasture productivity in southern Kazakhstan

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# Introduction

# Rationale behind land privatization

Resolving the ‘Tragedy of the Commons’ ([Hardin, 1968](#)), policy-makers often choose **private property + property rights transfer** ([Bowles, 2006](#)) because it

- improves land use efficiency and ag. productivity ([Binswanger et al., 1995](#); [Deininger et al., 2001](#); [Holden et al., 2014](#)) through land allocation efficiency, investments, restructuring.

Positive effects of enclosure on agriculture are well documented ([Adamopoulos et al., 2022](#); [Besley et al., 2010](#); [Chari et al., 2021](#); [Chen et al., 2022](#); [Dippel et al., 2020](#)), however, **frictions in other markets** can offset land reform achievements.

Therefore, promising objectives of land reform are often achieved only partially ([Deininger et al., 2023](#))

- especially in former Soviet countries ([Kvartiuk et al., 2021](#); [Petrick, 2021](#));



# Land privatization and quality

([Buehler, 2022](#); [Hou et al., 2022](#); [W. J. Li et al., 2007](#)) document positive effects of privatization on land quality, however, there are also negative consequences ([A. Li et al., 2012](#); [D. Li et al., 2021](#)):

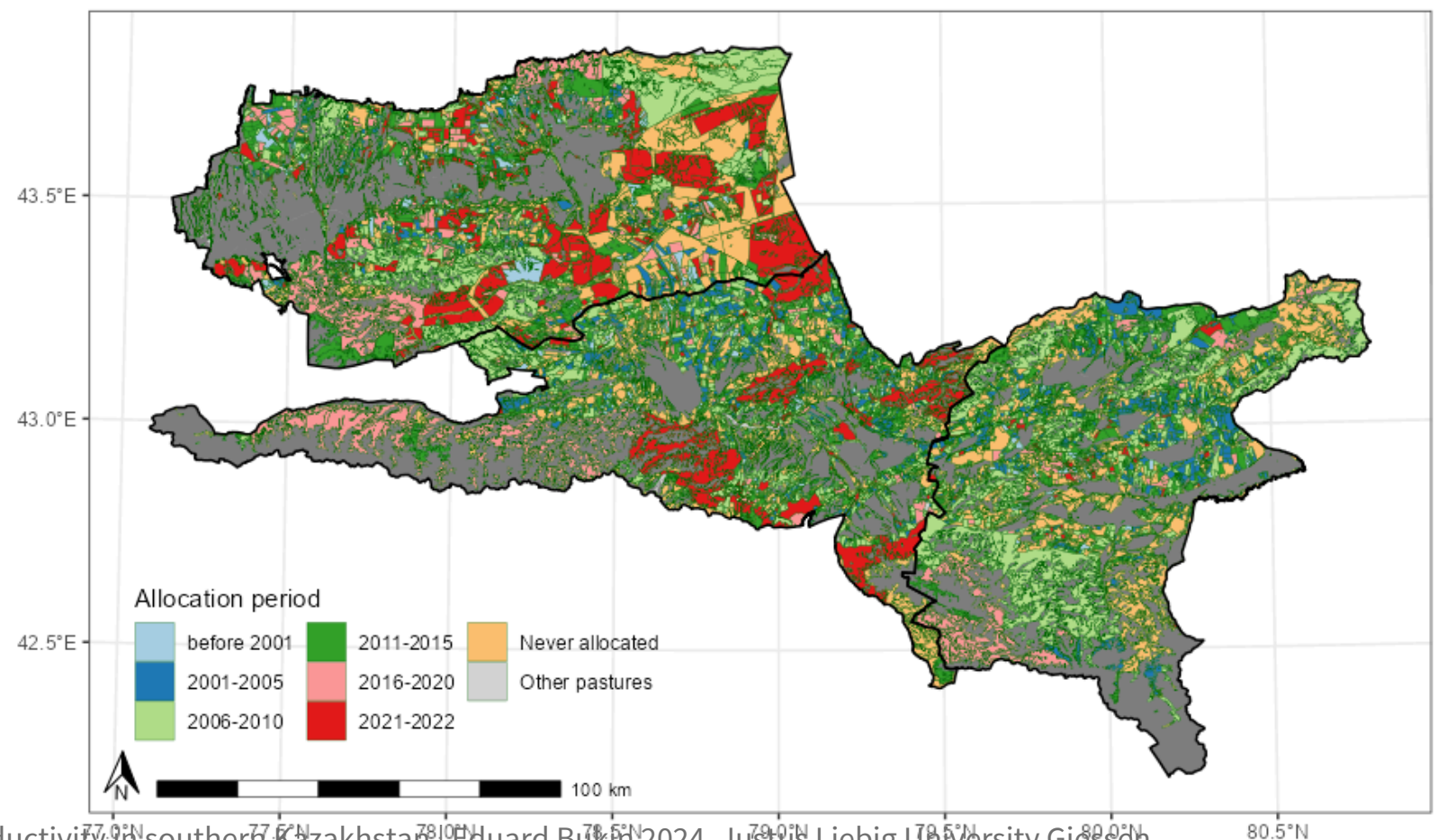
- **unequal land distribution:**
  - leaves others on limited common land ([Rohde et al., 2006](#));
- **spillover effects:**
  - even if management improves on private parcels, it worsens elsewhere ([Masami Kaneko et al., 2009](#));
- **fragmentation of grazing systems:**
  - reduction in livestock mobility ([Galvin et al., 2008](#));
- ‘The tragedy of enclosure’ ([Reid et al., 2008](#));

# Kazakh's natural experiment

Since 1990th, Kazakhstan was implemented a redistributive land reform, cadastre, and inefficient land market institutions, which favor large producers ([Kvartiuk et al., 2021](#)).

- Land reform enabled **Individual Farmers (IF)**
  - who hold ~35% of all livestock
  - privatize pastures under 49 years leases.
- Land reform left **Households (HH)** aside
  - they hold 60% of LS
  - Do not have formal rights to pastures.

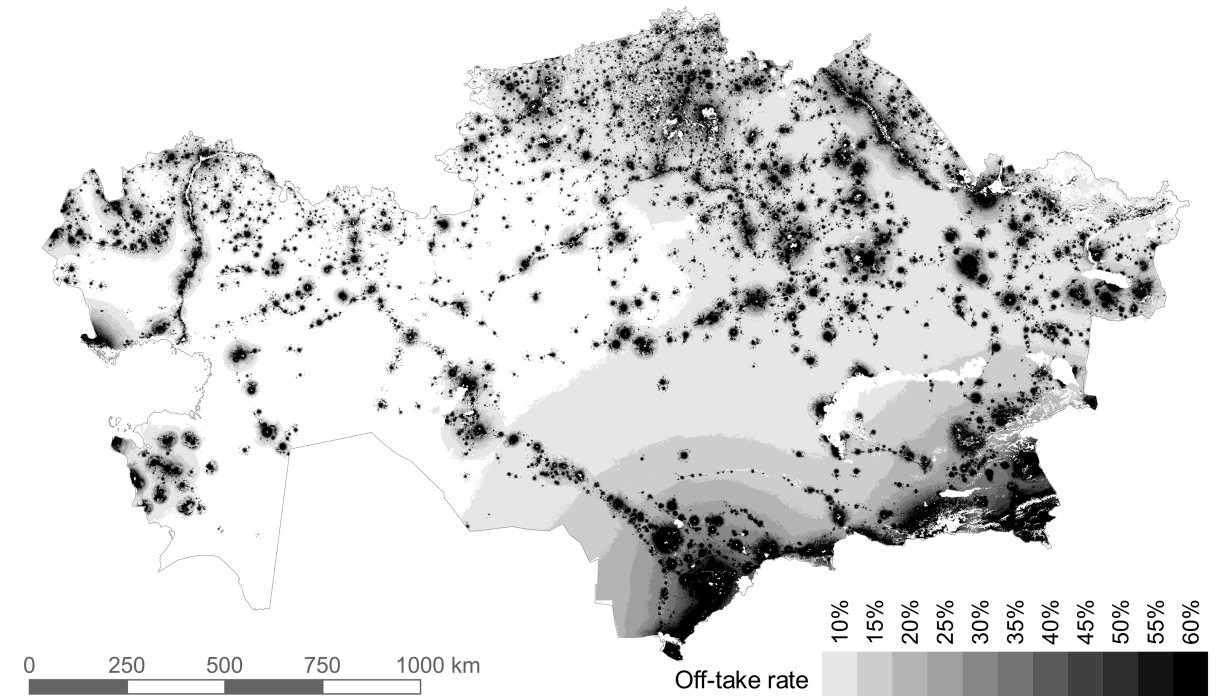
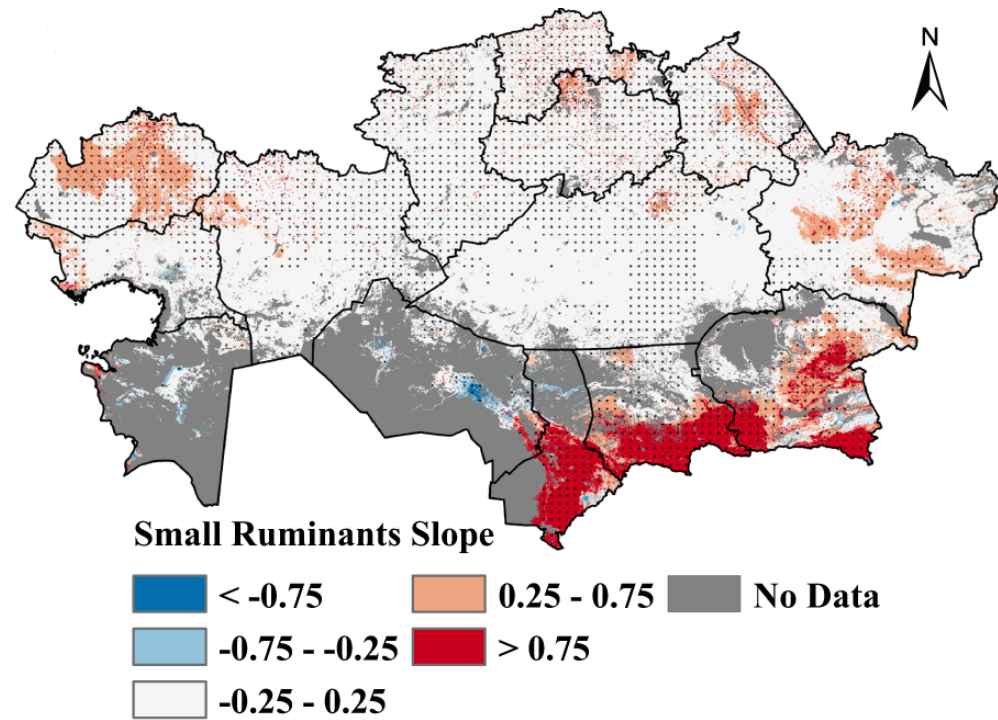
Created by authors based on cadastre data [aisgzk.kz](https://aisgzk.kz)



# Livestock growth 2000-2020

Population growth and urban development fostered demand-driven growth of the livestock sector.

That increased pressure on pastures.



Growth of small ruminants (2000-2020) adapted from Kolluru et al. (2023)

# Land reform had ambiguous consequences

- the land market is inefficient, dysfunctional, and benefiting large enterprises ([Kvartiuk et al., 2021](#));
- ag. enterprises failed to intensify livestock production ([Robinson et al., 2021](#)), maintaining enterprise-household duality ([Petrick, 2021](#));
  - 60% of livestock is kept by **landless households (HH)**
  - HH use **not-yet/never-allocated** or **common** land;
  - never-allocated land areas decreased;
- increased pressure on the land close to settlements; remote pastures little used or abandoned ([Alimaev et al., 2008](#); [Dara et al., 2020](#));

# Research question(s)

- What are the **effects of land privatization on pastures?**
- What are the **spillover effects of privatization?**
- How **pasture use** changes given **proximity to settlement?**
- How do the **grazing practices** adjust to accommodate the fragmented landscape?

# Data and methods



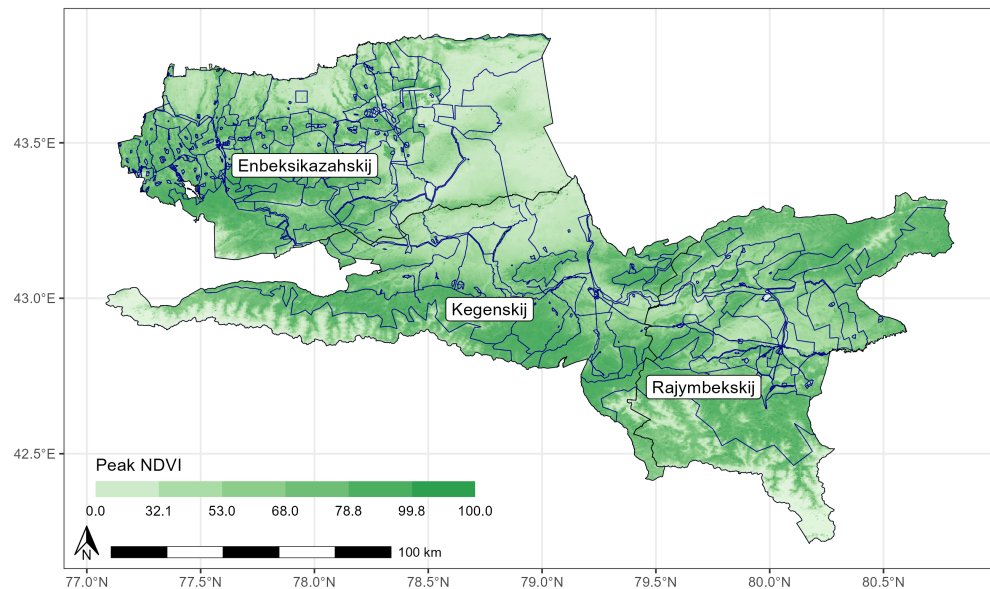
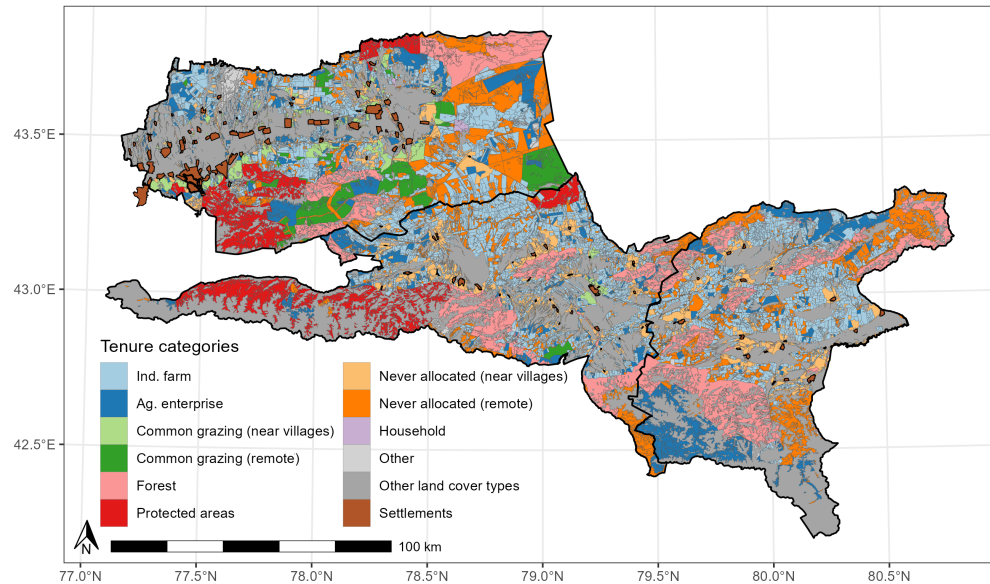
# Data: privatized plots boundaries

We follow 30k plots

- allocated in cadastre between 1990-2023 (top map [aisgzk.kz](http://aisgzk.kz))
- on pasture land only;
- including remaining never-allocated pastures;

Remotely sensed **peak vegetation density (NDVI)** for 2000-2023 using MODIS 250m resolution [MOD13Q1.061](#) (bottom figure).

Other remotely sensed climatic data on monthly cumulative  $\text{Rainfall}_{i,t}^{month}$  and solar  $\text{Radiation}_{i,t}^{month}$ ; monthly average  $\text{Temperature}_{i,t}^{month}$ .



# Identification of the ATT

Staggered absorbing treatment calls for two ways fixed effect model (TWFE) ([Athey et al., 2022](#); [de Chaisemartin et al., 2020, 2022](#); [Goodman-Bacon, 2021](#))

- each plot  $i$  is observed over  $t$  years and a treatment (privatization) is suddenly applied at different time

$$\log \text{NDVI}_{i,t} = \tau D_{i,t} + \beta_s \mathbf{X}_{s,i,t} + \eta_{\cdot,t} + \eta_{i,\cdot} + \epsilon_{i,t}$$

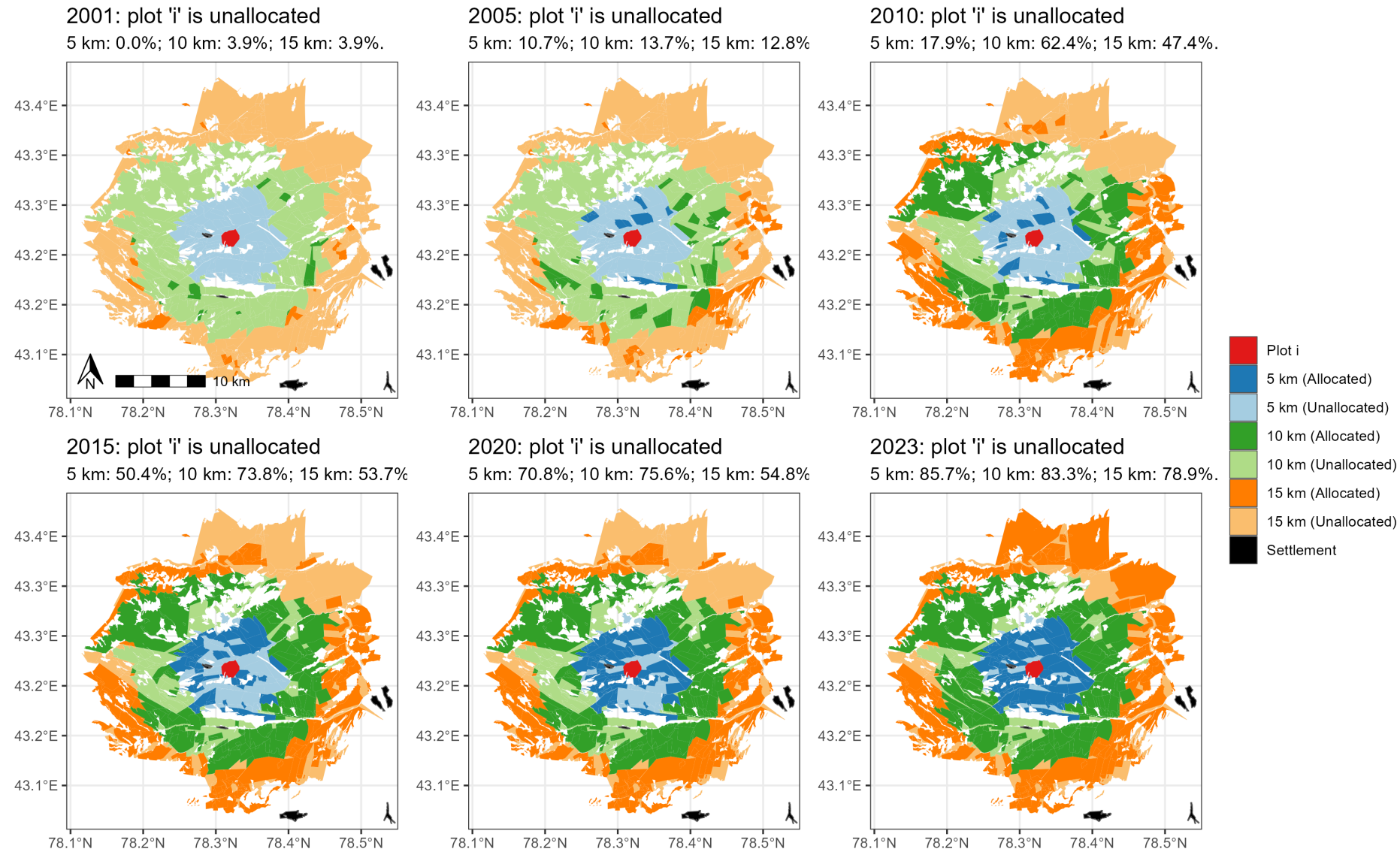
- $\tau$  is the **Average Treatment Effect on the Treated (ATT)** ( $\frac{\Delta \text{NDVI}}{\Delta D} = 100(1 - e^\tau)\% \approx 100 \cdot \tau\%$ );
- Fixed effects  $\eta_{\cdot,t}$  and  $\eta_{i,\cdot}$ .
- 72 control variables  $\mathbf{X}_{s,i,t}$ : monthly rainfall, solar radiation, temperature, monthly interaction terms.

Such TWFE model estimated using heterogeneity robust DiD estimators (overview of the cottage industry is in ([Baker et al., 2022](#); [Roth et al., 2023](#))):

- SA - Sun and Abraham ([Sun et al., 2021](#)); CA - Callaway and Sant'Anna ([Callaway et al., 2021](#)); IMP - imputation estimators ([Borusyak et al., 2023](#); [Gardner, 2022](#); [Wooldridge, 2023](#));



# Spillover examples



# Identification of the spillover effects

(Butts, 2021; Clarke, 2017; Xu, 2023) show that if spillover effects are present:

- their omission leads to the OVB;
- they can be decomposed into:

$$\tau^{\text{spillovers}} \equiv \tau^{\text{direct (ATT)}} + \tau^{\text{spillover on treated}} - \tau^{\text{spillover on control}}$$

We accommodate (Xu, 2023) idea on spatial configuration in  $j$  rings around plot of interest  $i$  in time  $t$ . The resulting model is:

$$Y_{i,t} = \tau^{\text{direct}} D_{i,t} + \sum_{j=1}^p \tau_j^{\text{s. treated}} D_{i,t} S_{i,t,j} + \sum_{j=1}^p \tau_j^{\text{s. control}} (1 - D_{i,t}) S_{i,t,j} \\ + \beta \mathbf{X}_{i,t} + \eta_{\cdot,t} + \eta_{i,\cdot} + \epsilon_{i,t}$$

where,  $S_{i,t,j}$  is the share of land allocated in the ring  $j$  relative to the observation unit  $i$  at time  $t$ .

# Results

# ATT of land allocation

Estimates of ATT using different estimators

	BM	SA	CS (NYT)	IMP static	IMP
<b>Panel: A. Full sample</b>					
ATT	-0.0030**	-0.0035***	-0.0020*	-0.0050***	-0.0034***
N obs.	565,680	565,679	565,679	534,216	534,216
N ind. FE	23,570	23,570	23,570	22,259	22,259
<b>Panel: B. Excluding never-allocated plots</b>					
ATT	-0.0025*	-0.0048***	-0.0013	-0.0132***	-0.0173***
N obs.	380,088	380,087	380,087	334,098	334,098
N ind. FE	15,837	15,837	15,837	13,921	13,921

Note. Estimators are BM - benchmark TWFE, SA - Sun and Abraham, 2021, CA - Callaway and Sant'Anna, 2021, and IMP imputation estimators Gardner et. al. 2022

Significance levels are: '\*\*\*' p-value < 0.001, '\*\*' p-value < 0.01, '\*' p-value < 0.05, '.' p-value < 0.1, and ' ' p-value >= 0.1.

Source: own calculations.

Observations:

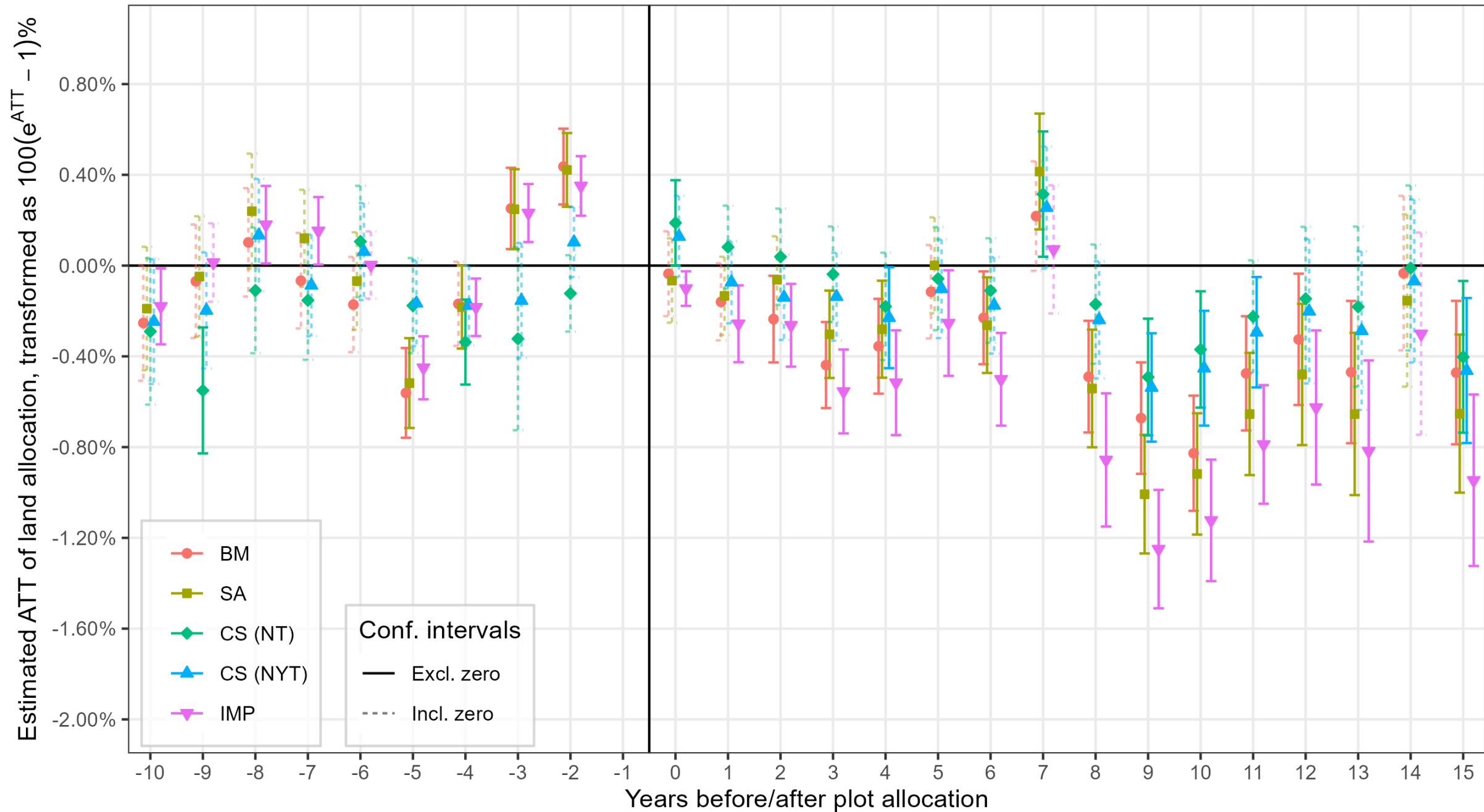
- Negative and significant ATT.
- Land allocation reduces pastures peak vegetation by 0.2-1.7%.

This is the equivalent to a drought that occurs once in 10 years

Results are also robust to:

- Alternative functional forms with fewer controls;
- Sample variation by allocation date quality;

# Event-study of land allocation



# ATT by tenure with sharp land use

Estimator	Ind. farm (own)	Ind. farm (rent)	Ag. ent. (own)	Ag. ent. (rent)
<b>Panel: A. Full sample</b>				
SA	-0.0025	-0.0060***	0.0141**	0.0042.
IMP static	-0.0026	-0.0068***	0.0167***	0.0000
IMP	-0.0003	-0.0024*	0.0003***	0.0002
N obs.	229,248	404,280	192,600	225,504

Note. Estimators are BM - benchmark TWFE, SA - Sun and Abraham, 2021, CA - Callaway and Sant'Anna, 2021, and IMP imputation estimators Gardner et. al. 2022

Significance levels are: '\*\*\*' p-value < 0.001, '\*\*' p-value < 0.01, '\*' p-value < 0.05, '.' p-value < 0.1, and ' ' p-value >= 0.1.

Source: own calculations.

- The effects differ depending on tenure.
- In some tenure types privatization does not change land use

# Spillover effects by tenure (SA estimator)

	Ind. farm (own)	Ind. farm (rent)	Ag. ent. (own)	Ag. ent. (rent)
<b>Panel A. Full sample</b>				
ATT	-0.0399***	-0.0106***	0.0167	0.0204
Spillover on allocated	-0.0062***	-0.0111***	-0.0075***	-0.0078***
Spillover on unallocated	-0.0081***	-0.0124***	-0.0074***	-0.0076***
N obs.	230,950	444,023	188,088	200,087
N ind. FE	9,623	18,501	7,837	8,337

Statistical significance levels are: '\*\*\*' p-value < 0.001, '\*\*' p-value < 0.01, '\*' p-value < 0.05, p-value < '.' 0.1, and ' ' p-value >= 0.1.

Source: own calculations.

- Spillover effects are stronger than the effect of privatization.
  - They magnify the negative impact of privatization.

- Individual farmers reduce the negative effects of spillovers with fencing and enforcing enclosure.
- An irrational seed persists: enclosure causes overgrazing, instead of efficient land use (although land sales and rental is possible).

# Spillover effects by village proximity

	2 km	2-5 km	5 km	5-10 km	10-more km
<b>Panel A. Full sample</b>					
ATT	-0.0171***	-0.0079*	-0.0124***	-0.0057.	0.0083*
Spillover on allocated	-0.0138***	-0.0126***	-0.0113***	-0.0173***	0.0008
Spillover on unallocated	-0.0172***	-0.0140***	-0.0135***	-0.0183***	0.0034.
N obs.	110,399	153,551	263,951	155,399	146,327

Statistical significance levels are: '\*\*\*' p-value < 0.001, '\*\*' p-value < 0.01, '\*' p-value < 0.05, p-value < '.' 0.1, and ' ' p-value >= 0.1.

Source: own calculations.

- Competition for land is the highest within 5km from villages because of the households that use rotations to graze livestock.



# Findings from the field

April 11 to 26, I spent in Kegen district, conducting semi-structured interviews with the Households and Individual farmers.

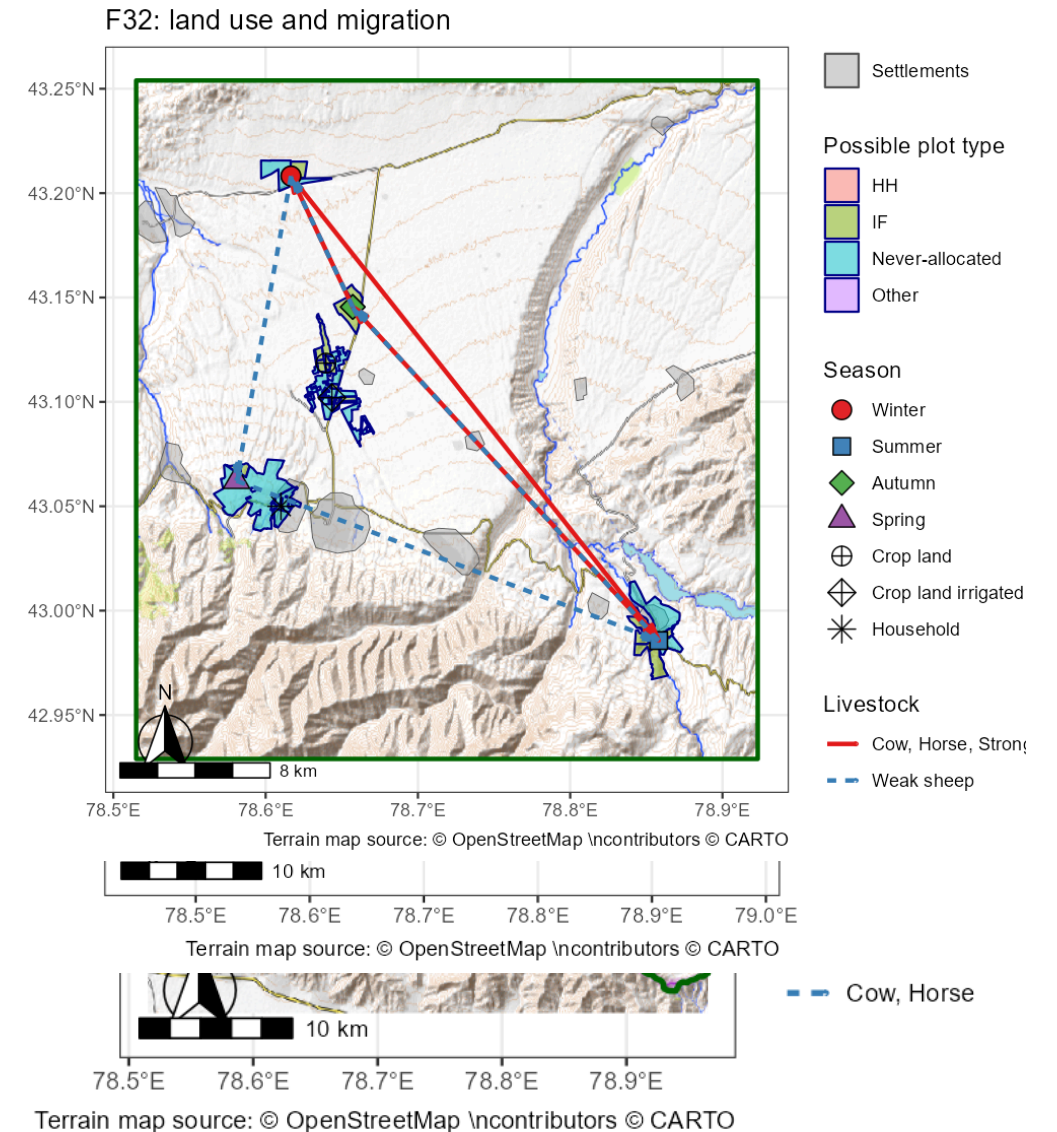
Two distinct cases emerged:

**Transhumance:** most IF and HH implement migratory grazing keeping livestock on different winter, spring, summer, and autumn pastures avoiding feed use.

**No migration:** single pastures year round.

# Successful transhumance

- Land enclosure is **not a central problem** to pasture management because of diverse alternatives in accessing land **informally** (in line with Adamopoulos et al. (2022)).
  - Tenants feel secure about their informal rental rights.
  - Once enclosed, neighbors act opportunistically, requiring land monitoring, especially in proximity to villages.
  - In response, rare fencing occurs, but generally community enforces the enclosure.
- Strong collective action is a key to migration:
  - larger herd sizes are essential to take advantage of scale economy: fixed costs are required to migrate.
- Collective actions depend on **familiar relationship, trust, verbal agreements, neighborhoods, and exchange in-kind: in labor and livestock.**



# No migration

Happens when **collective action fails**:

- “If I migrate, others will graze on my pastures. What my livestock will eat during winter?”
- no roads makes remote transhumance impossible;
- livelihood depends on dairy and related marketing channels (tourism) not accessible from remote pastures.

Failing collective actions are observed with **contrasting inequalities**:

- near urbanized areas, around land “grabbed” by large enterprises, and irrigated crop land.

# Land use around villages

Around villages, when land availability is low:

- Land-less households organize in rotations to monitor livestock;
- They graze in a 5km radius;
- Use unoccupied land, or plots, where enclosure is not enforced by the owner.

This supports privatization spillovers finding where:

- Low availability of land elsewhere leads to more intensive private and communal land use.
- Communal enforcement of enclosure reduces spillover effects on the privatized land.

# Conclusions

Land privatization leads to the **reduced vegetation** on pasture (contrary to findings elsewhere: Hou et al. (2022) Buehler (2022)).

- Fieldwork shows: the same parcel is being more regularly used once privatized (population/LS growth)

IF keep LS on the **same pastures all year round** contrary to the rational expectation of land exchange and migration.

- Field: it happens **when collective action fails**.
- It fails in the presence of external distortions.

**Negative privatization spillovers** exists. They exacerbate the negative effects of privatization also in village proximity

- Field: landless LS owners act opportunistically, but enclosure reduces spillovers also without fencing.

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