



UNIVERSITY OF CENTRAL ASIA  
GRADUATE SCHOOL OF DEVELOPMENT  
Institute of Public Policy and Administration

# Determinants of milk market participation among small dairy farmers in Kyrgyzstan

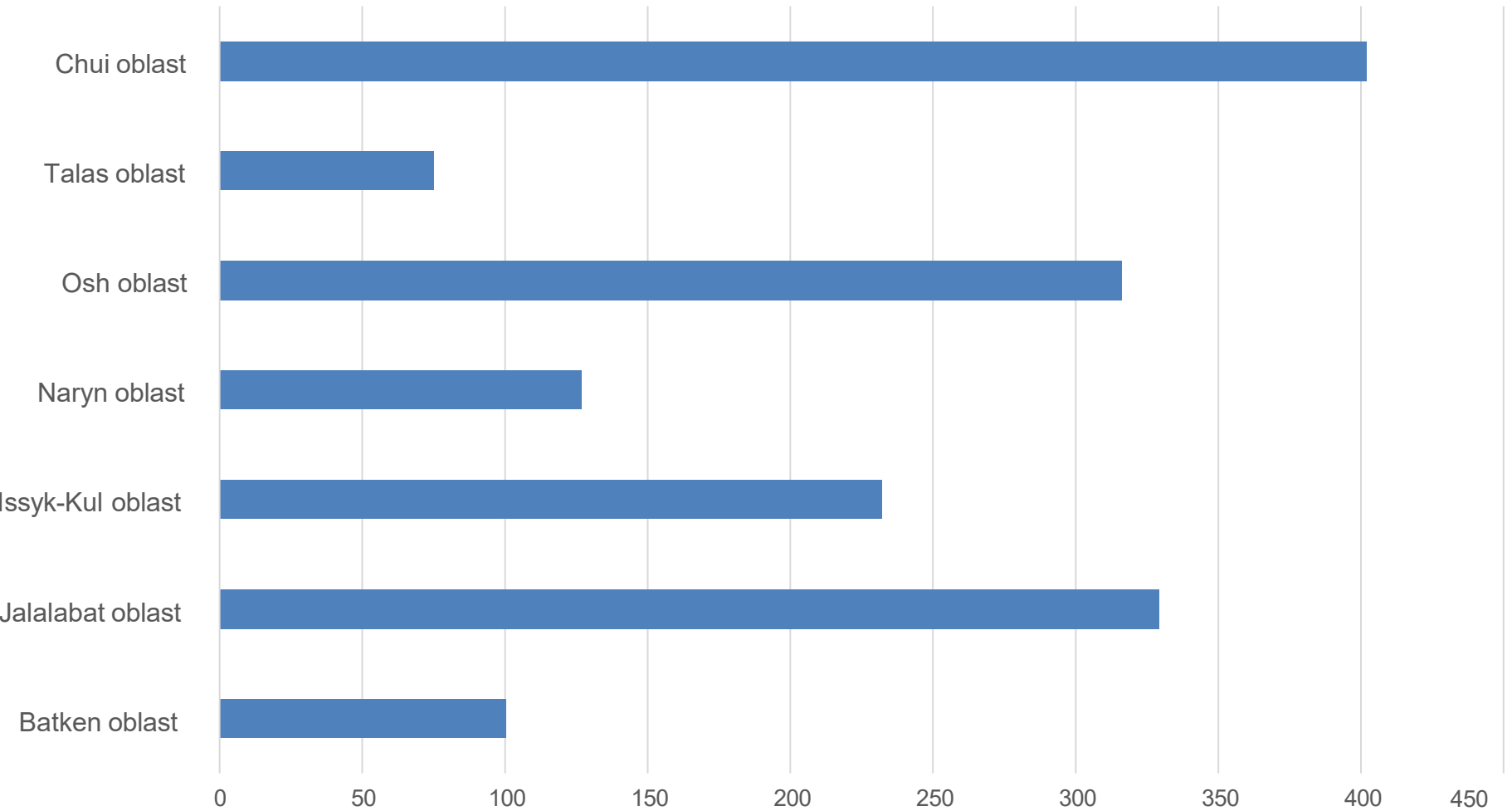
# Overview

- Motivation of the study
- Literature review
- Data and methodology
- Hypotheses
- Regression results
- Summary
- Policy implications
- Discussion

# Actuality of the study

1. Social factor, antipoverty effect
2. Market integration (from subsistence to commercialization)
3. Capitalization of the natural resources
4. Export potential

# Production of milk by region in 2018 (thnd. tons)



**Source: NSC KR**

# Research questions

1. What are the determinants that explain a farmer's choice to participate in the dairy market in the Chui region of Kyrgyzstan?
2. If a farmer decides to participate in the dairy market, what factors influence the volume of milk sold?

# Literature Review

- Globalization, privatization, and vertical coordination in food value chains in developing and transition countries (Swinnen, J. & Maertens, M., 2007)
- Farmers, Vertical Coordination, and the Restructuring of Dairy Supply Chains in Central and Eastern Europe (Dries, L., Gemenji, E. & Noev, N., 2009. Farmers)
- Formal versus informal: Efficiency, inclusiveness and financing of dairy value chains in Indian Punjab (Birthal, P. S., Chand, R. & Josh, P. K., 2017)
- "Key factors for increasing farmer participation in markets: evidence from the Malian dairy sector" (Vroegindewey, R., Richardson, R. & Thériault, V., 2021)

# Methodology

Cragg Double-Hurdle Model- econometric model used to analyze consumer behavior and estimate the demand for a particular product or service

The Cragg Model consists of two parts: the first hurdle and the second hurdle

**First Hurdle:** This part of the model estimates the probability that farmer decides to sell the product (milk) at all.

**Second Hurdle:** It models the quantity decision.

# Cragg Double-Hurdle Model

*Stage 1: market participation*

$$P(M_i = 1) = P(Q_i > 0) = X_i\alpha + \varepsilon_i$$

*Stage 2: sales volume conditional on participation*

$$Q_i = Z_i\beta + \mu_i,$$

where  $P$  is the probability of participation in the market ( $M$ );  
 $Z_i, X_i$  - two vectors of explanatory variables from the main model;

$\alpha$  and  $\beta$  - the marginal effects of these vectors of explanatory variables for the first and second stages, respectively.



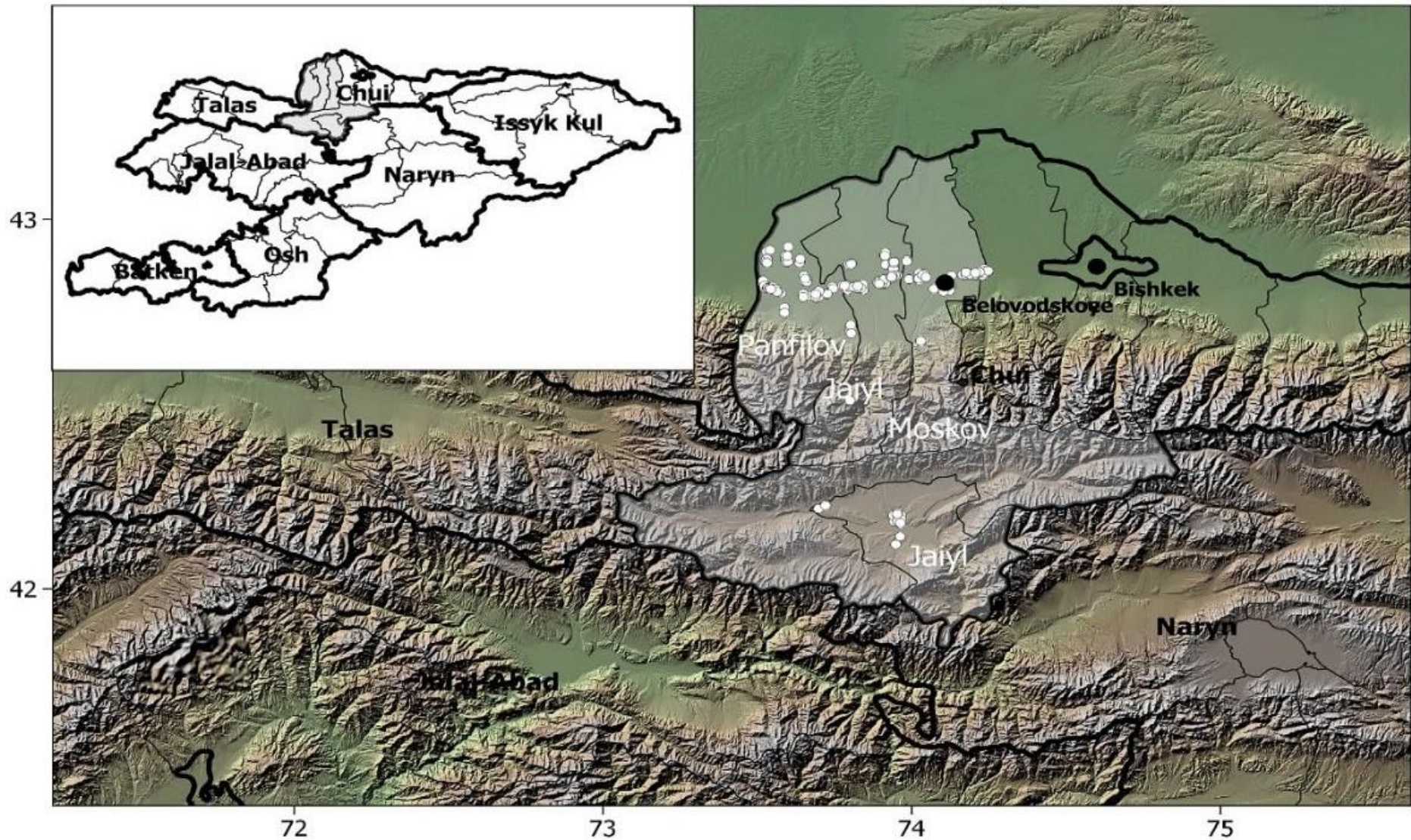
# Data

Source: AniCAnet project in 2018 (summer)

Sample: 250 households keeping 5 or more cattle

Variables: 1470 from ANICANET + 19 from WorldClim  
V1 climatic dataset

# Map of sampling



Source: Sarah Robinson

# Survey questionnaire

- **Household/farm structure, labor and production specifics;**
- **Land ownership and land transactions;**
- **Farming: production and marketing;**
- **Grazing and fodder;**
- **Costs of farm inputs, investment and loans, labor and access to information;**
- **Animal breeding and health.**

# Hypotheses

- Access to **village pasture** can push the farmer to keep cows as they will save on fodder preparation and purchase (+) (Stage 1)
- Using of **hayfields** increases the fodder base for feeding cattle, consequently the milk volume (+) (Stage 1)
- More **hay** provided to the animals will increase milk output (+) (Stage 1)
- The more the village **population** the more milk can be collected by intermediaries (+) (Stage 1)
- The high **prices** can incentivize to sell the milk (+) (Stage 1/Stage 2)
- **More cows** produce more milk (+)(Stage 1/Stage 2)
- The high **milk yield** can be the incentive for the participation decision and the sold quantity (+) (Stage 1/Stage 2)
- High **rainfall** increases the hay and crop growth intensity which affects on milk productivity (+) (Stage 1/Stage 2)
- The **loan** can be used for fodder purchase increasing the milk volume (+) (Stage 1/Stage 2)
- **Milking machinery** is a precondition for larger milk quantities produced per farm (+) (Stage 2)
- Large milk quantities can be stored only with professional **cooler** (+) (Stage 2)
- Cultivating the **cropland** increases the fodder base for feeding cattle consequently the milk volume (+) (Stage 2)
- More **grain** provided to the animals will increase milk output (+) (Stage 2)

# Regression output

Probit (1st stage)				Truncated regression (2nd stage)		
	Coef.		P-val	Coef.		P-val
Number of cows	0.712	***	<0.001	1.973	***	<0.001
Roughage fodder	0.002		0.58	0.053	***	<0.001
Concentrate fodder	0.006		0.684	-0.059		0.508
Local pasture	1.004	***	<0.001			
Cropland area	0.002		0.805	0.239	**	0.014
Hayfield area	-0.074		0.112	-0.234		0.263
Credit constrained	0.314		0.426	-2.095		0.253
Median price	0.394	***	0.005	2.203	*	0.051
Population	-0.082		0.117			
_cons	-6.557	***	0.001	-44.337	**	0.011
Milking machinery				5.519	**	0.06
Cooler				0.361		0.917
Legal status				4.619	**	0.059
Coop member				4.356		0.111
sigma						
_cons	7.816		<0.001			



# Summary

## **Significant determinants of the 1 stage:**

- Access to the local pasture
- Median milk price
- Number of cows

## **Significant determinants of the 2nd stage:**

- Number of cows
- Roughage fodder
- Cropland area cultivated
- Milking machinery
- Farm registration
- Median milk price

# Policy implications

- Promoting Financial Inclusion for Dairy Farmers (financial intermediation, Financial Literacy and Training Programs)
- Improving access to credit facilities for farmers interested in investing in modern milking machinery (subsidies, leasing)
- Incentives for Farm Registration (reduced taxes, access to subsidized resources, or eligibility for government support programs)
- Price stabilization mechanisms can also be explored to mitigate market fluctuations (revealing of collusion on purchasing price among big actors)
- Promoting Sustainable Pasture Management for Dairy Farms (regulations to prevent overgrazing, educating farmers on rotational grazing, payments for environmental services)

# Discussion

- Actuality of the used data for paper
- Number of determinants in regression models
- Inclusion of seasonal price to regression
- How to take into account reverse causality. What if farmers stock up their herd or invest into milking equipment only as a consequence of better market access? This problem needs to be discussed in the framework of what econometricians call the “identification strategy” for your model.



# Thank you for your attention!



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