



A Mathematical Model of Mongolian Livestock Populations

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Motivation

Model Description

Model Calibration

Results



- Subsistence herding is an important component of Mongolian livestock production.
- Herding is threatened by
 - ▶ Pasture degradation due to overpopulation
 - ▶ Extreme weather (dzuds)
 - ▶ Infectious diseases.
- Develop mathematical models to include these effects on population dynamics.
- Allow for rational planning of livestock management in Mongolia.



- Use difference equations with a time step of one year.
- Extend the Leslie-Gower competition model.
- Model four species that compete with each other
 - ▶ Goats
 - ▶ Sheep
 - ▶ Cattle
 - ▶ Horses.
- Stratify each species by age and gender.
- Model includes
 - ▶ Constant per-capita birth
 - ▶ Density-dependent survival
 - ▶ Density-independent culling
 - ▶ Migration of new animals.



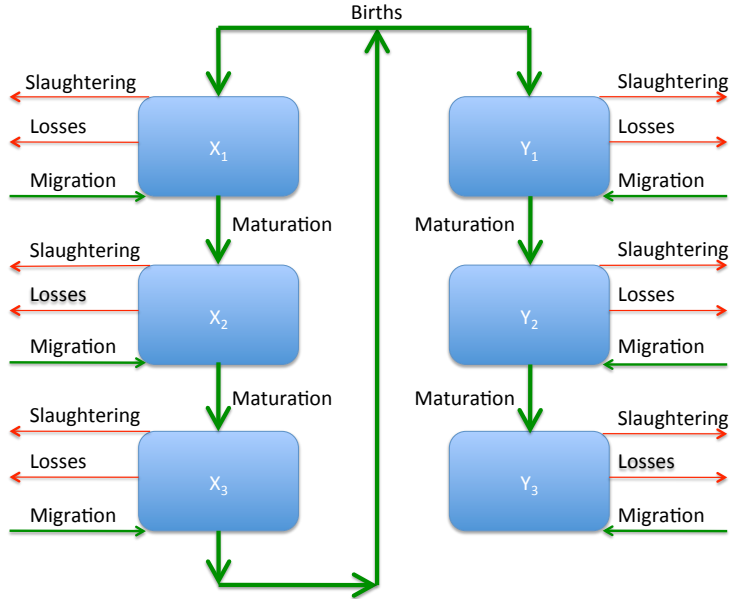
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X_1 : New born females

X_2 : Juvenile females

X_3 : Adult females

Y_1 : New born males

Y_2 : Juvenile males

Y_3 : Adult males



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- Model was calibrated to data for Töv aimag from published annual Mongolian statistics and detailed herd and survey data.
- Model parameters were fit for different time periods where parameters were assumed to be constant within periods but could change between periods.



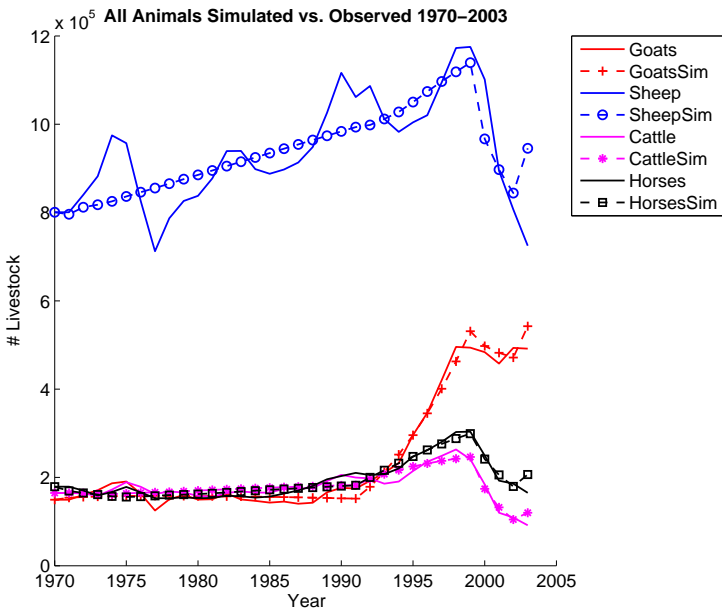
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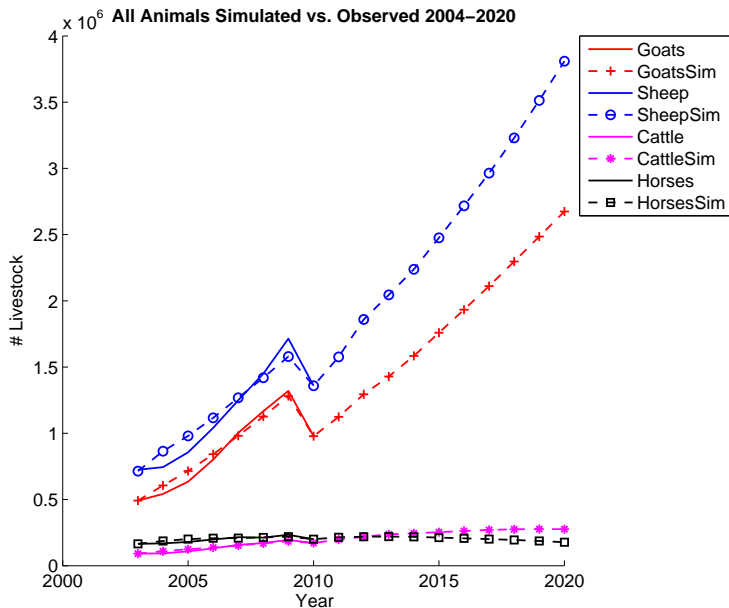


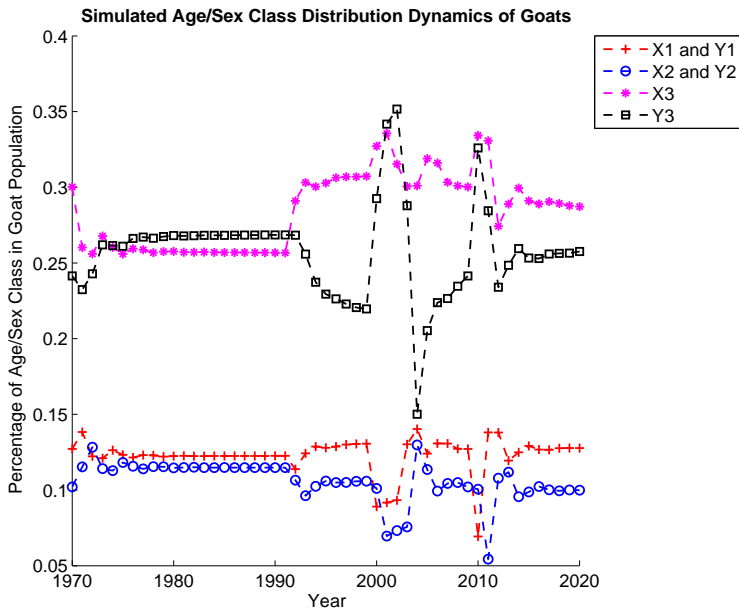
- From 1970–2010 species population and migration data were taken from the National Statistical Office of Mongolia.
- Animal counts from 23 herds in 2011 provided estimates of age and sex distributions.
- Herder surveys in 2011 provided data on culling and animal losses from natural causes.



Label	Period	Description
A	1970–1991	Socialist
B	1992–1999	First post-socialist growth
C	2000–2002	First dzud
D	2003	First post-dzud recovery
E	2004–2009	Second growth
F	2010	Second dzud
G	2011	Second post-dzud recovery
H	2012–2020	Future predictions









- We can reproduce the data on Mongolian livestock populations.
- The model can be used to help plan for sustainable livestock development that is more resistant to dzuds.
- The model can be extended to include the transmission dynamics of infectious diseases such as brucellosis.

