



# Cattle network analysis in Paraguay: first step for potential disease spread prevention and control

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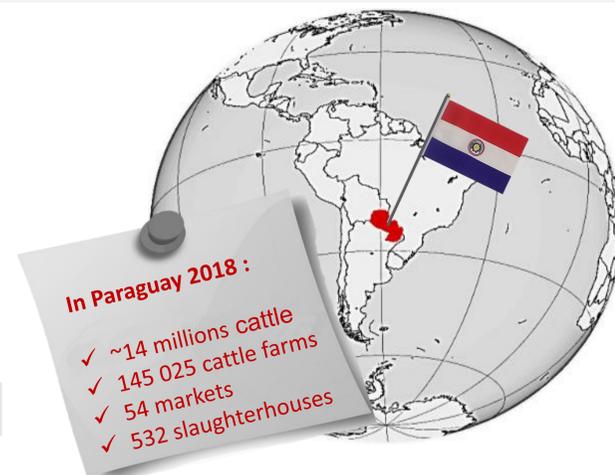


**Background** Beef exports make up a significant part of Paraguay's agriculture sector: it is the 7th largest meat exporting country in the world! The movement of cattle in Paraguay constitutes a high-risk activity for the possible spread of diseases which may have a significant impact on the country's economy.

## Materials and Methods

- 1 Data retrieved from the database on cattle inventory of the Veterinary Services for 2014 to 2018 was used to create density maps.
- 2 Database from SENACSA recording cattle movements in Paraguay was used to construct the movement network including all data from 2014 to 2018.
- 3 The holding level (farm / market) was considered as a node and each movement of cattle between two holdings was considered as a link.
- 4 Network analysis was performed using the R Igraph package to generate the "static" network and calculate network parameters

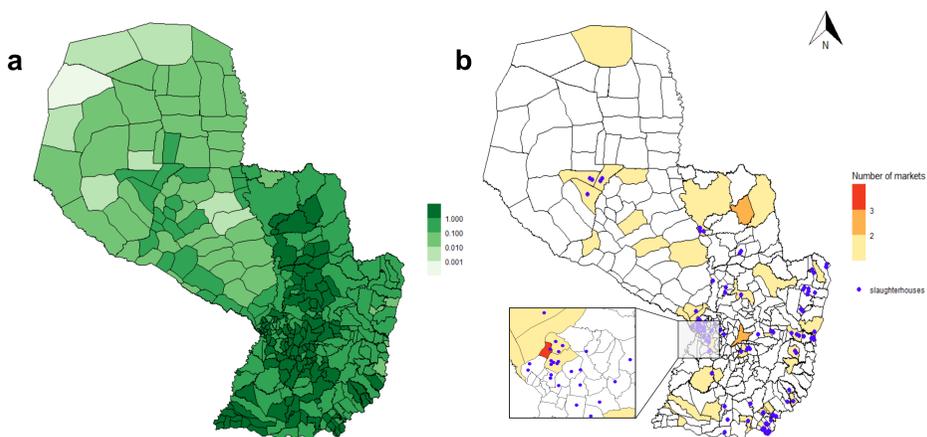
Compared to randomly simulated network parameters with the same number of nodes and links



## Results

A total of 1,402,410 cattle movements with 29,385,414 moved animals were recorded from 2014 to 2018.

**Fig.1** Mean density of cattle farms per km<sup>2</sup> (a) and location of markets and slaughterhouses (b) at the district level



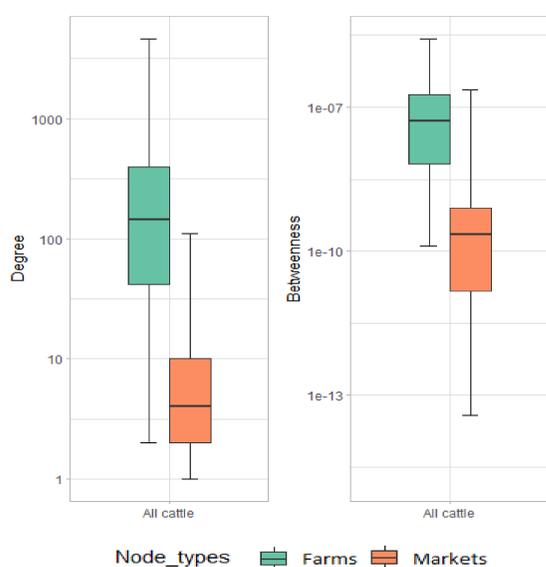
Farm density and number of markets and slaughterhouses are higher in the eastern region.

**Table.1** Parameters of the cattle network

Number of nodes	72,096
Number of links	366,626
Assortativity	-0.04
Average path length	5.5
Clustering coefficient	0.02

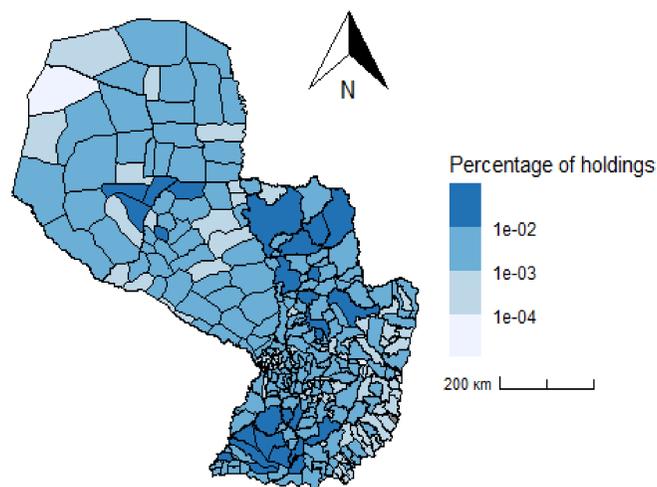
- **Assortativity** was negative: highly connected nodes are linked to weakly connected nodes.
- **Average path length** was three times higher than that of the random network.
- **Clustering coefficient** was 2 times higher than that of the random network.

**Fig.2** Distribution of degrees and betweenness (farms vs markets)



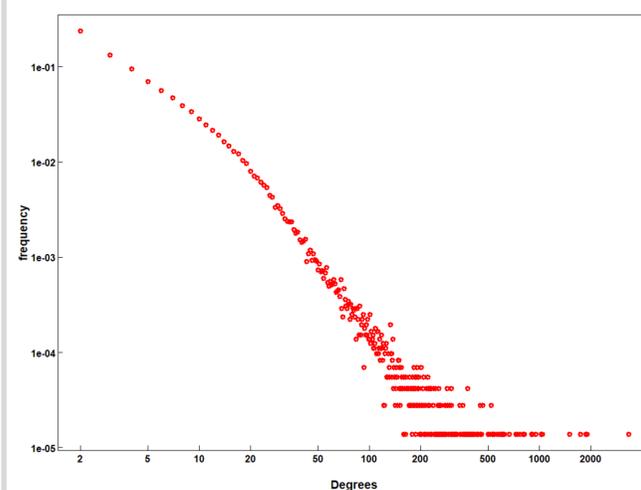
**Degrees** (number of links attached to a node) and **betweenness** (proportion of shortest paths passing through a node) were higher for **markets**.

**Fig.3** Spatial distribution of holdings included in the largest strong component per district



Size of the **largest strong component**: **32,149 nodes** (44% of total nodes)

**Fig.4** Distribution of degrees



**Linear trend** in the distribution of degrees plotted in a logarithmic scale.

## Discussion and perspectives

**Linear distribution** of nodes and values obtained for **assortativity**, **average path length** and **clustering coefficient** suggest that the cattle movement network in Paraguay is **scale-free**: disease spread can occur faster due to the presence of high degree nodes (**hubs**). Higher centrality parameters for markets show that markets may play an important role in a disease propagation. Holdings included in the largest strong component were located all over the country: every holding can be reached from every other holding via one or several directed paths. All these findings indicate that to prevent the spread of a bovine emerging disease, **effective surveillance and control systems should be implemented in Paraguay**.