

# Land and Conflict in MENA

## Land Use Change induced by Conflict and Displacement along the Syria-Turkey border

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You may access an interactive version of our maps at

<https://javierparada.github.io>

We appreciate any comments. Please feel free to contact us at

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## Objective:

- Assess the impact of conflict (Syrian Civil War) on land use
- Research questions
  - Extent of the phenomenon (cropland gains and losses)
  - What are the mechanisms (linked to violence and migration)?
  - Are these transitory or permanent changes?
  - What is the overall economic impact?
- Data
  - Satellite imagery: [MODIS land cover type data](#)
    - Compare 2009 and 2017
  - Focus on Syria, Turkey and Iraq

# Data: MCD12Q1.006 MODIS Land Cover Type Yearly Global 500m

- Availability: Yearly 2001-2019

Dataset Provider

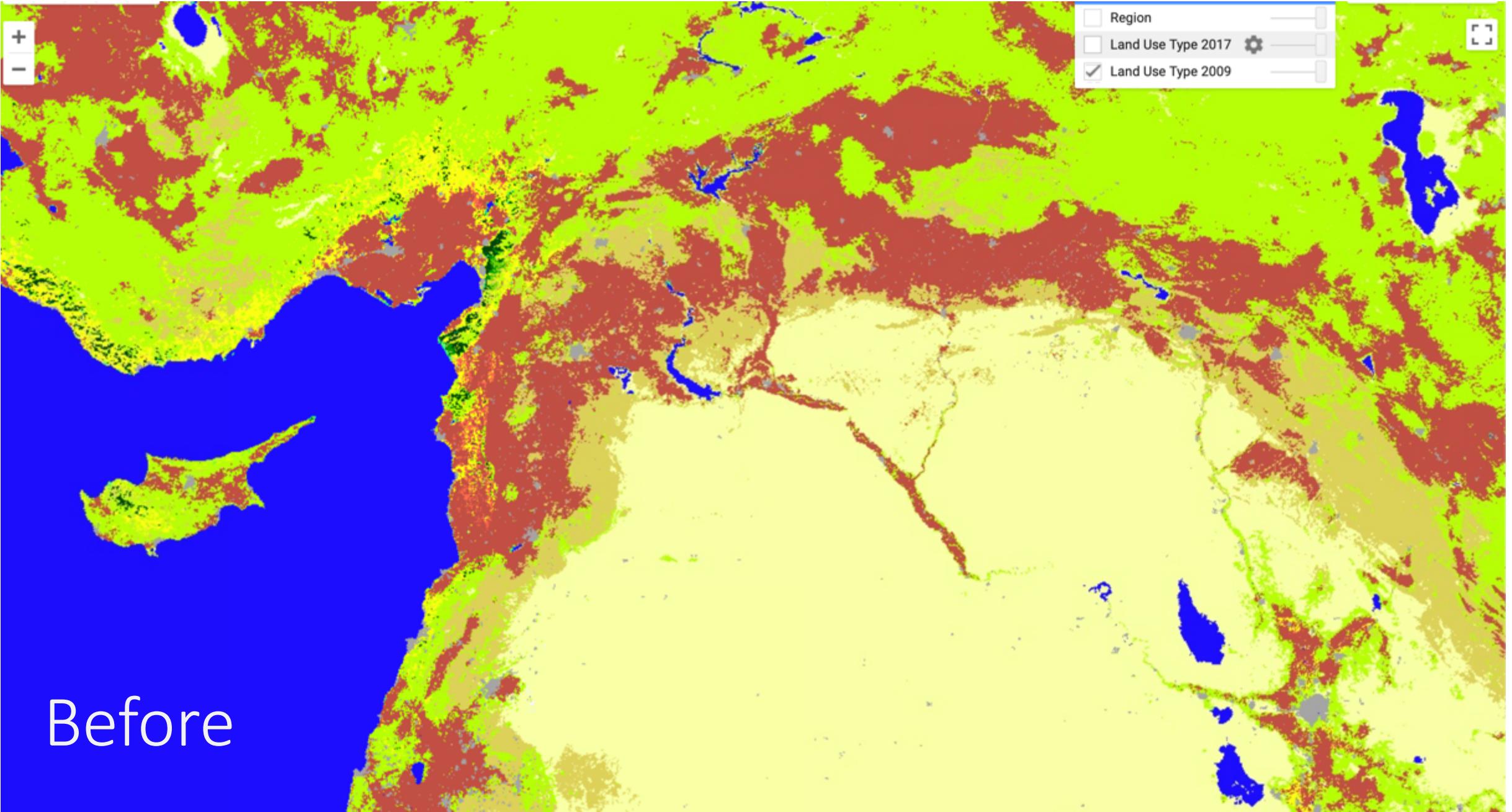
[NASA LP DAAC at the USGS EROS Center](#)

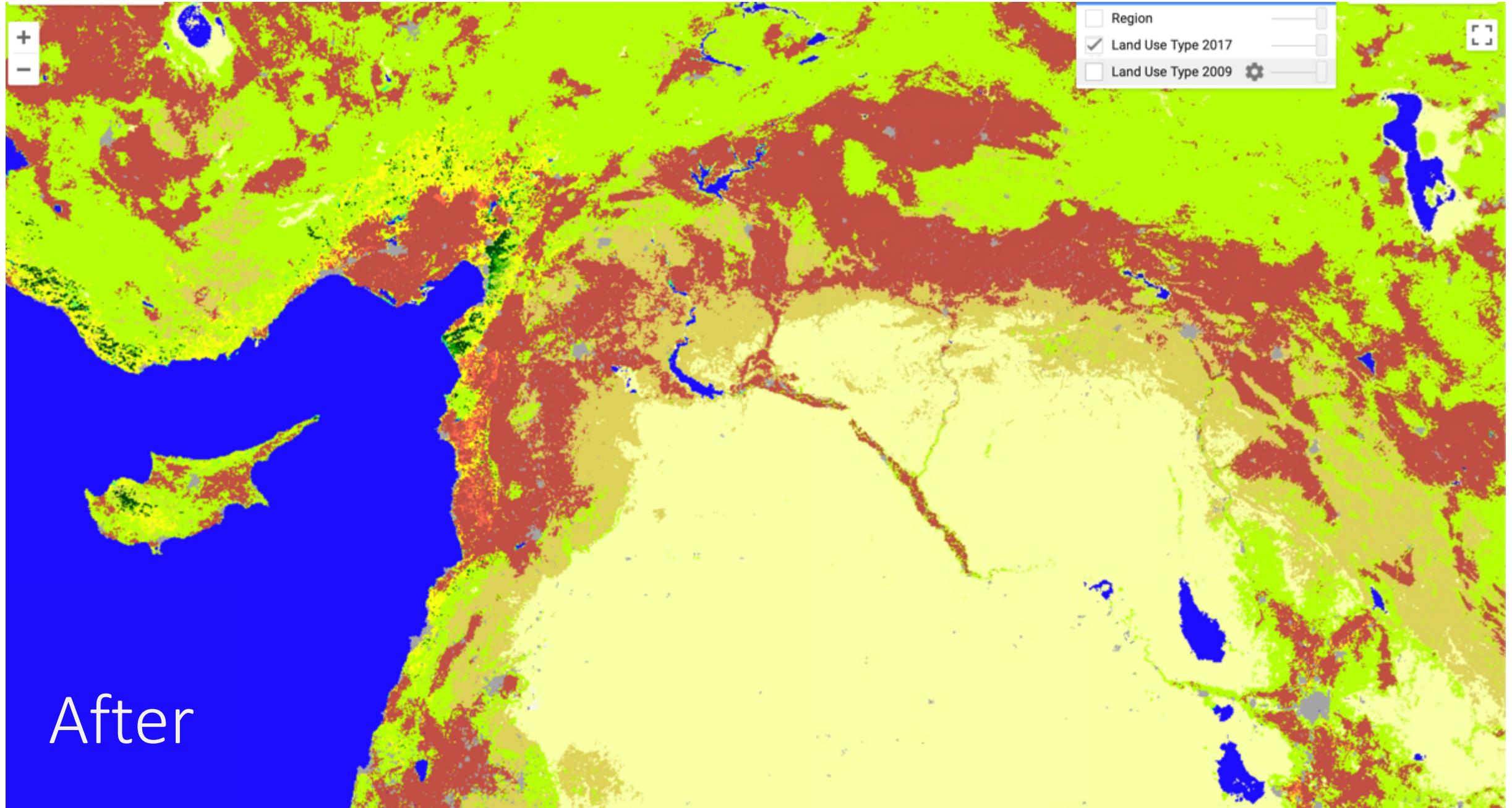
- Collection Snippet

```
ee.ImageCollection("MODIS/006/MCD12Q1")
```

Land Cover Type 2: Annual University of Maryland (UMD) classification

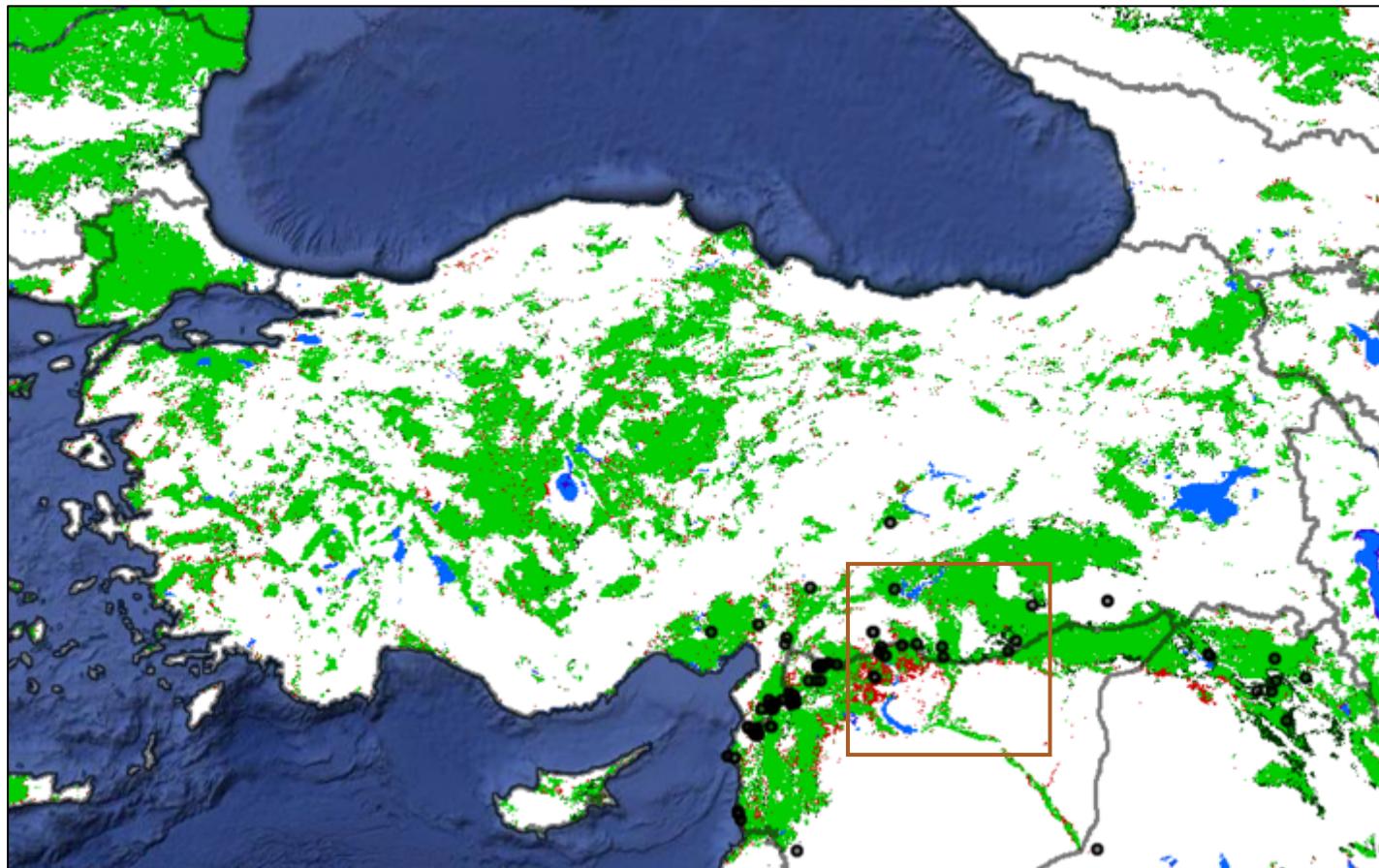
Value	Color	Color Value	Description
0	#1c0dff	#1c0dff	Water Bodies: at least 60% of area is covered by permanent water bodies.
1	#05450a	#05450a	Evergreen Needleleaf Forests: dominated by evergreen conifer trees (canopy >2m). Tree cover >60%.
2	#086a10	#086a10	Evergreen Broadleaf Forests: dominated by evergreen broadleaf and palmate trees (canopy >2m). Tree cover >60%.
3	#54a708	#54a708	Deciduous Needleleaf Forests: dominated by deciduous needleleaf (larch) trees (canopy >2m). Tree cover >60%.
4	#78d203	#78d203	Deciduous Broadleaf Forests: dominated by deciduous broadleaf trees (canopy >2m). Tree cover >60%.
5	#009900	#009900	Mixed Forests: dominated by neither deciduous nor evergreen (40-60% of each) tree type (canopy >2m). Tree cover >60%.
6	#c6b044	#c6b044	Closed Shrublands: dominated by woody perennials (1-2m height) >60% cover.
7	#dcd159	#dcd159	Open Shrublands: dominated by woody perennials (1-2m height) 10-60% cover.
8	#dade48	#dade48	Woody Savannas: tree cover 30-60% (canopy >2m).
9	#fbff13	#fbff13	Savannas: tree cover 10-30% (canopy >2m).
10	#b6ff05	#b6ff05	Grasslands: dominated by herbaceous annuals (<2m).
11	#27ff87	#27ff87	Permanent Wetlands: permanently inundated lands with 30-60% water cover and >10% vegetated cover.
12	#c24f44	#c24f44	Croplands: at least 60% of area is cultivated cropland.
13	#a5a5a5	#a5a5a5	Urban and Built-up Lands: at least 30% impervious surface area including building materials, asphalt and vehicles.
14	#ff6d4c	#ff6d4c	Cropland/Natural Vegetation Mosaics: mosaics of small-scale cultivation 40-60% with natural tree, shrub, or herbaceous vegetation.
15	#f9ffa4	#f9ffa4	Non-Vegetated Lands: at least 60% of area is non-vegetated barren (sand, rock, soil) or permanent snow and ice with less than 10% vegetation.





# Cropland expansion in Turkey

Map 1: Land cover type change (Turkey and Syria, 2009-2017)



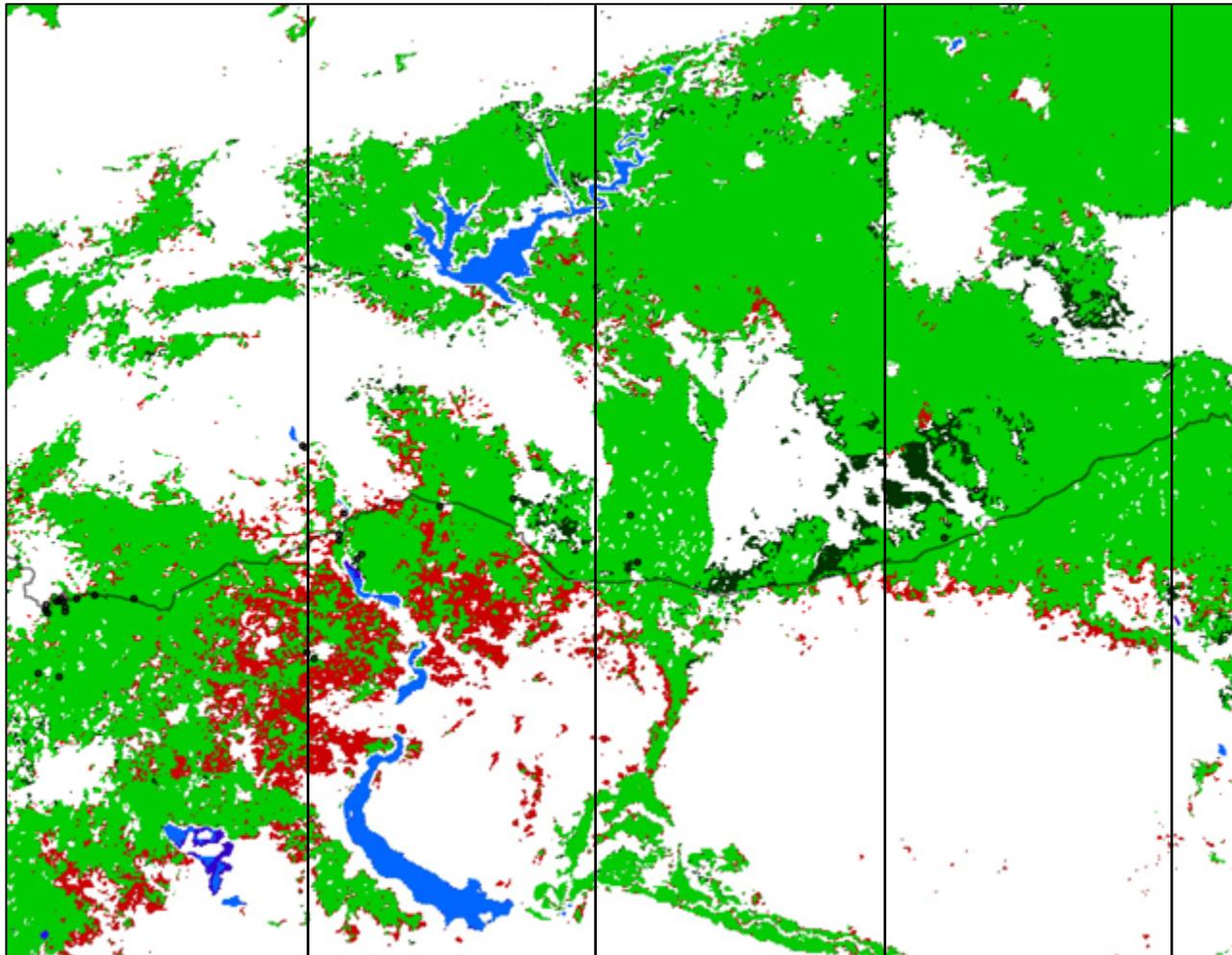
Source: MCD12Q1.006 MODIS Land Cover Type Yearly Global 500m

- Migrants (working in agriculture) initially located near the border
- Cropland expanded at the margin of existing cropland (likely irrigated, commercial agriculture)
  - Refugee camps

Cropland 2009 --> 2017 Classification	
Water	--> Water
Other	--> Other
Other	--> Cropland
Cropland	--> Other
Cropland	--> Cropland

## Zooming in to the Syria-Turkey border

Map 2: Land cover type change (Syria-Turkey border, 2009-2017)



- Most of the abandoned cropland is located around the Euphrates river on the Syrian side of the Syria-Turkey border in Aleppo and Ar-Raqqa governorates.
- Most of the newly developed cropland in Turkey is in Sanliurfa and Mardin provinces.
  - Refugee camps

Cropland 2009 --> 2017 Classification	
Water	--> Water
Other	--> Other
Other	--> Cropland
Cropland	--> Other
Cropland	--> Cropland

Source: MCD12Q1.006 MODIS Land Cover Type Yearly Global 500m

## Further zooming in to the Syria-Turkey border

Map 3: The Ar Raqqah - Sanliurfa border

- There are no natural barriers (rivers, mountains) separating the two countries

**2009**



**2016**

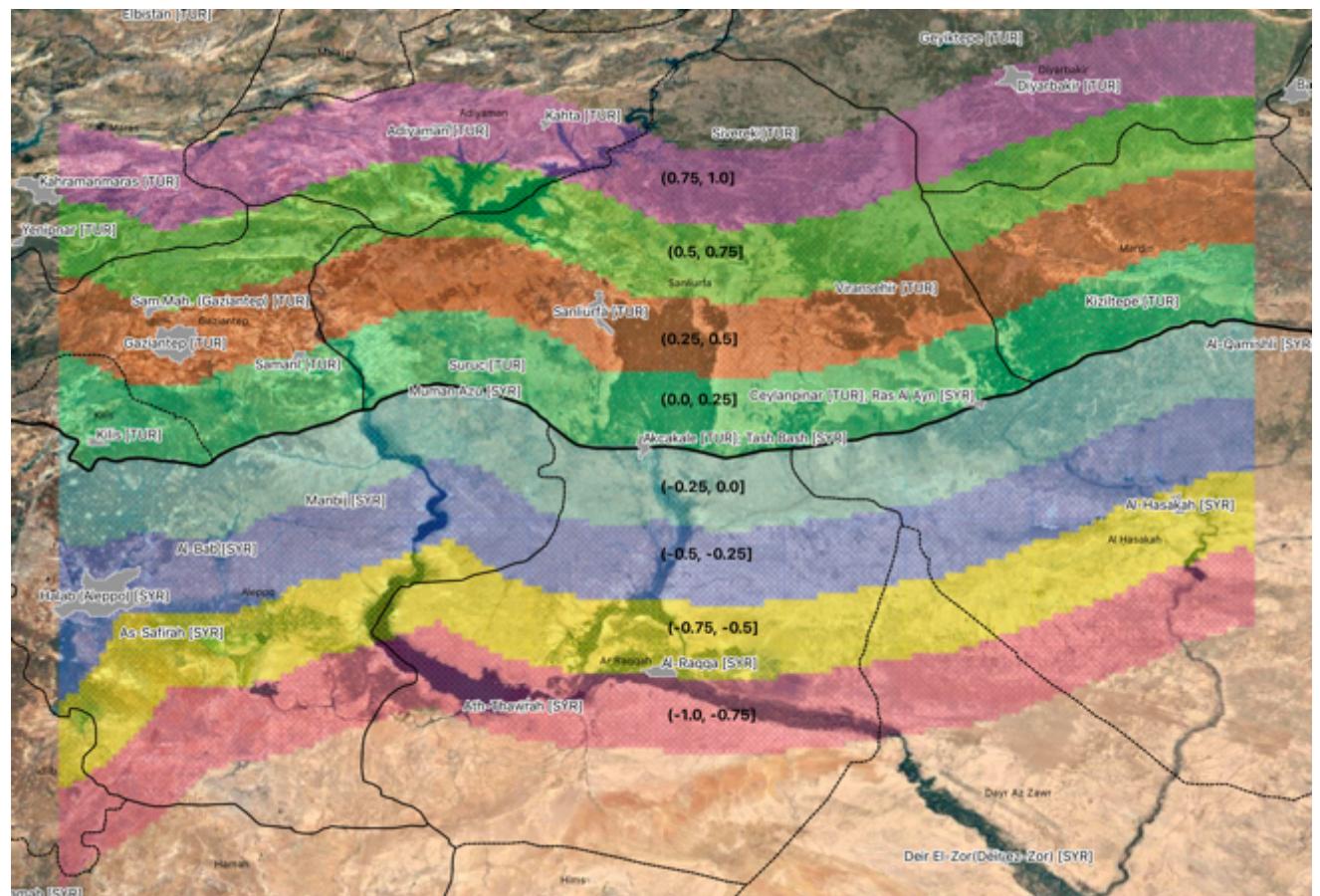


Source: Google Earth

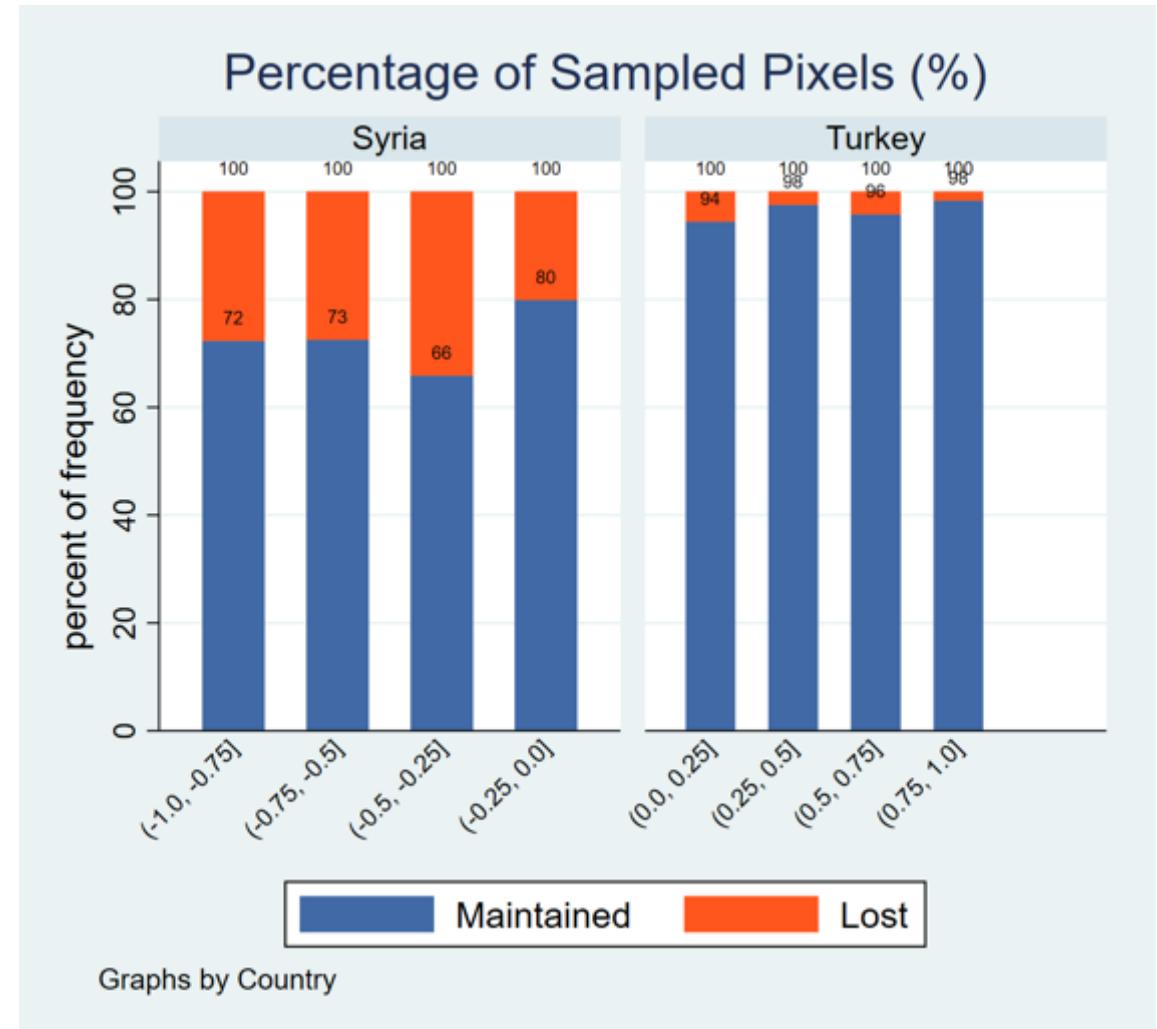
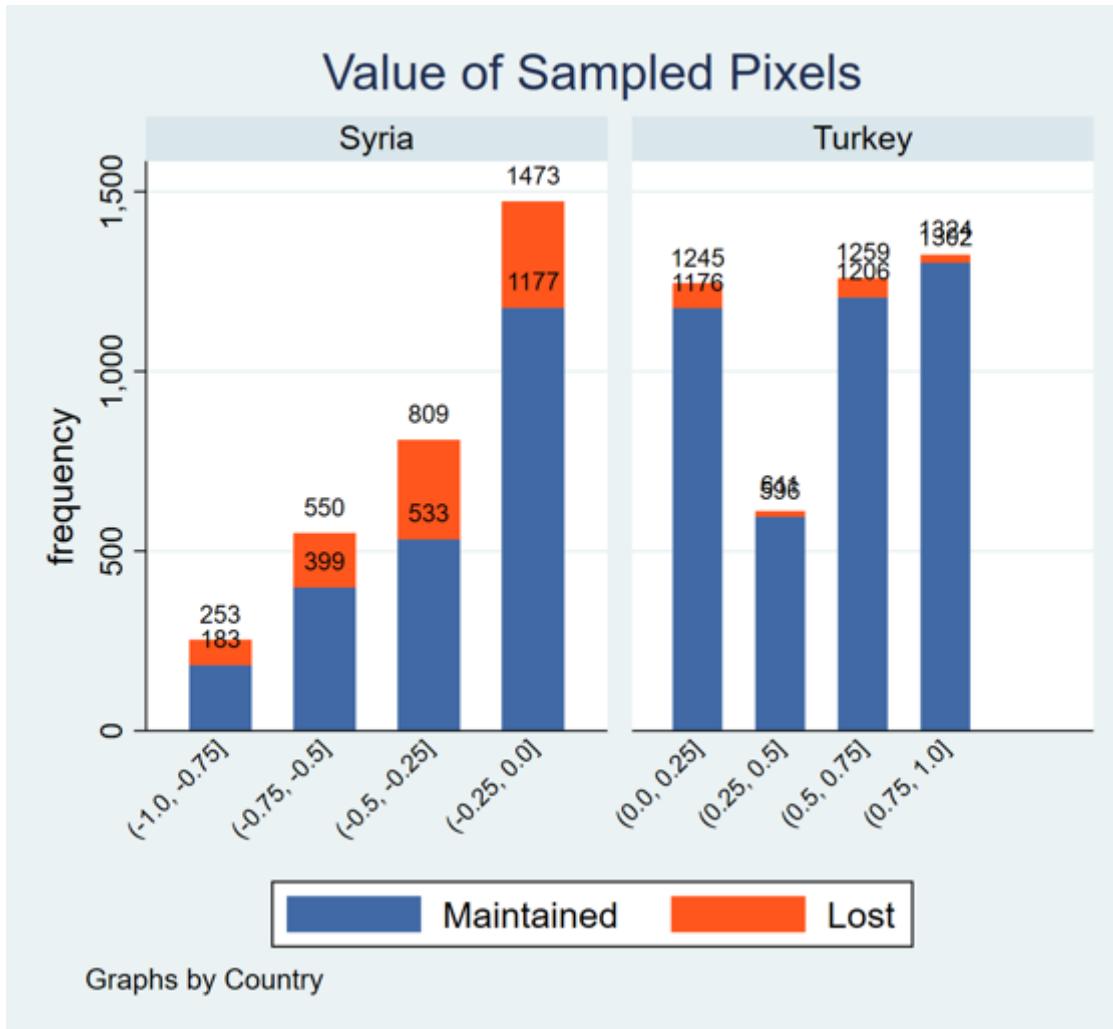
# Buffer zone analysis

- We study **transitions into and out of cropland** on each side of the border (1-degree band / 110 km in each direction)
  - **Losses:** Whether 2009 croplands were maintained or lost in 2017
  - **Gains:** Whether 2017 croplands already existed in 2009 or were newly developed
- We divide each band into 4 **buffers**. The areas of the two middle buffers are similar in:
  - total area
  - cropland area
  - weather

Map 4: Buffer zones along the Syria-Turkey border

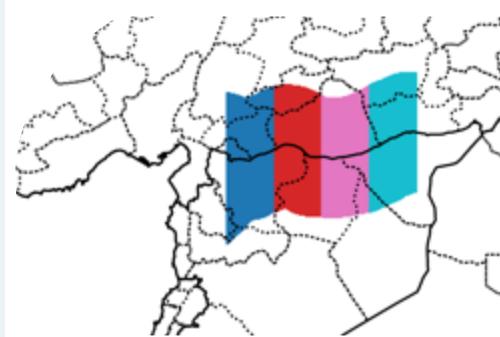
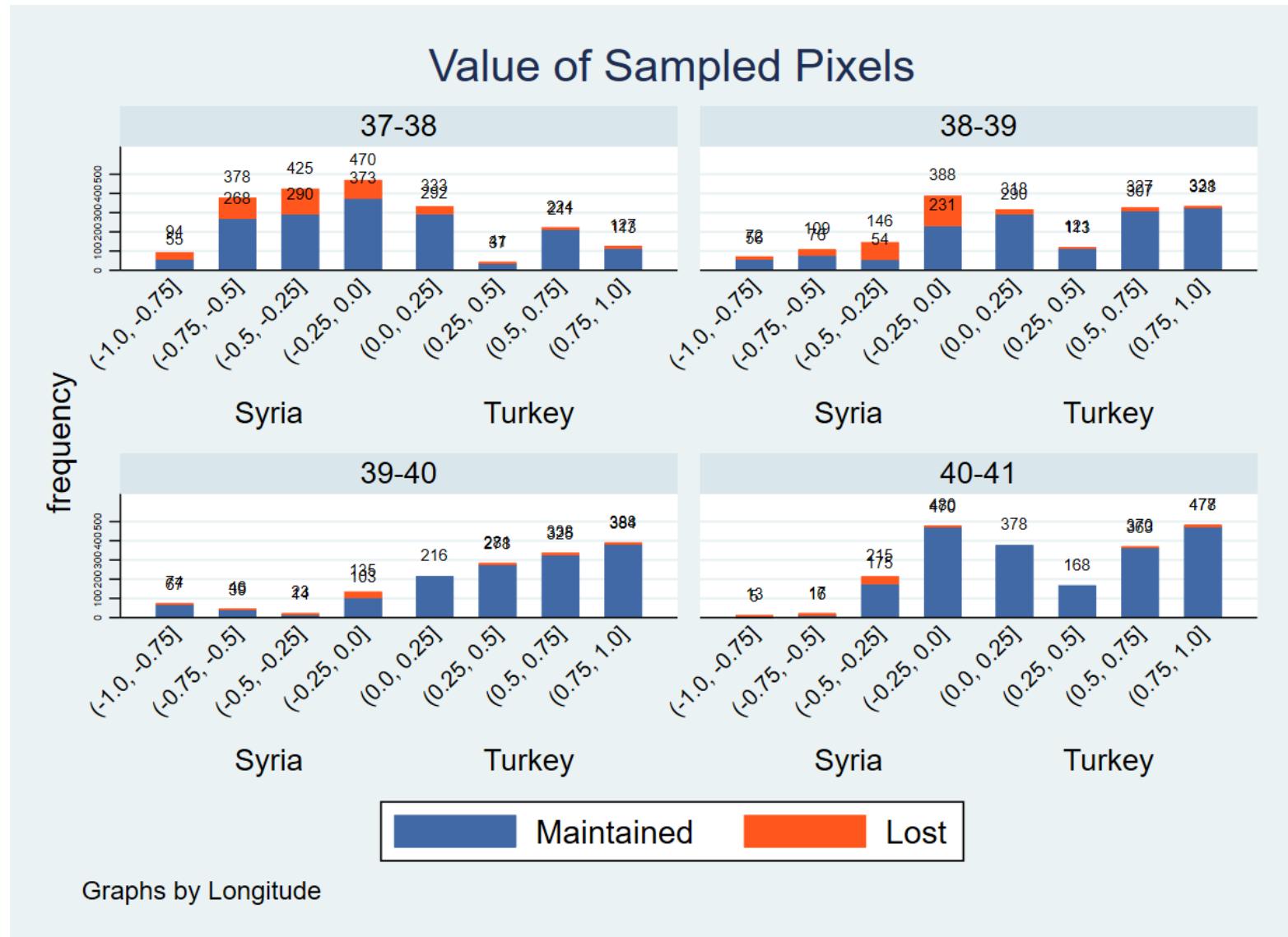


# Transition out of cropland between 2009-2017



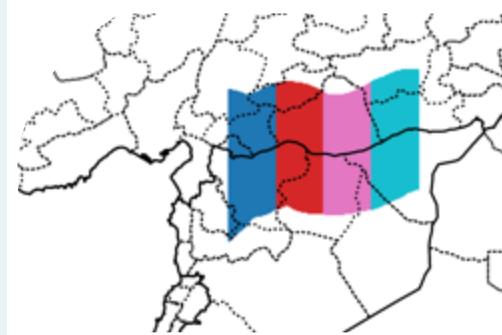
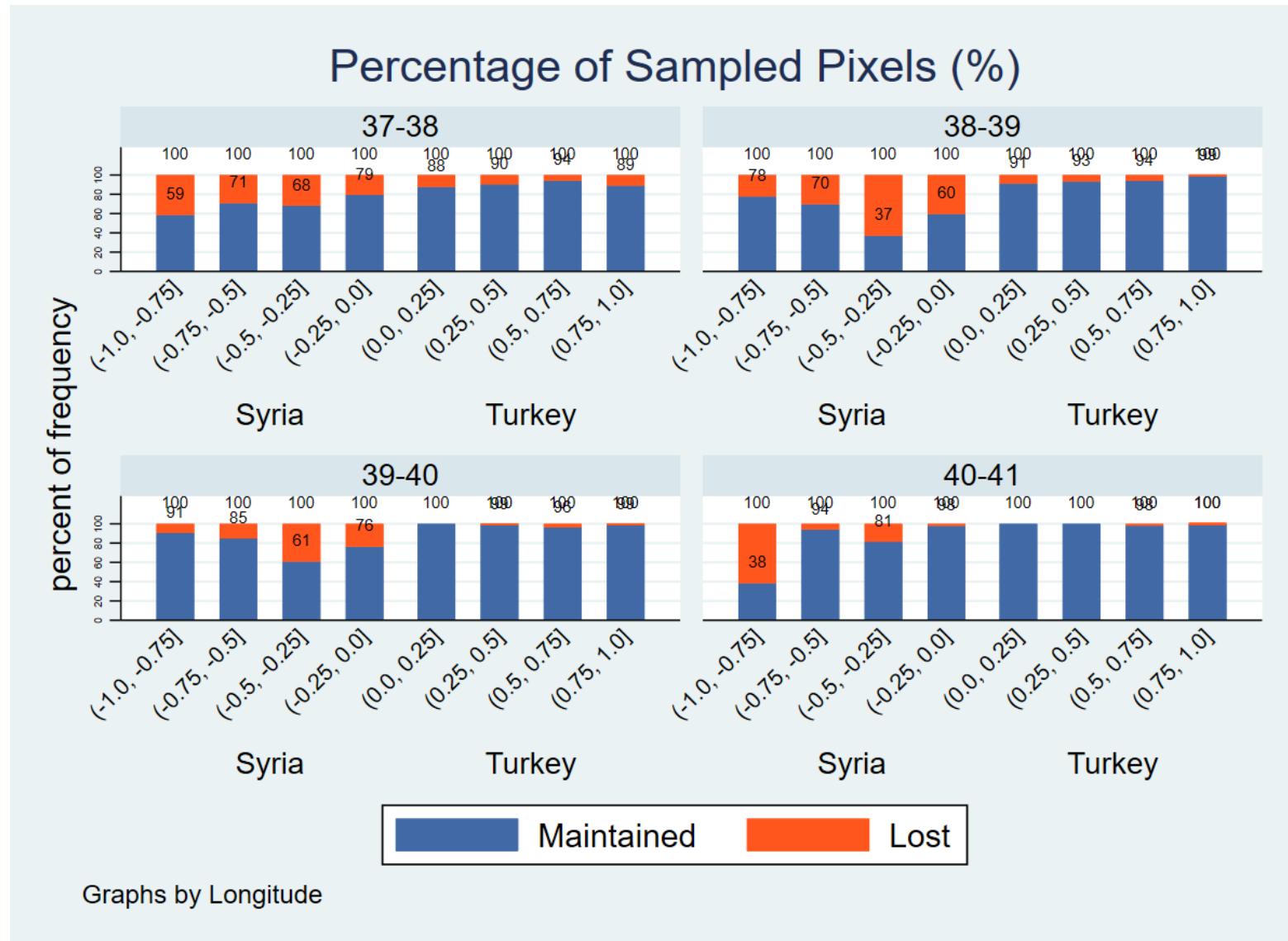
# Transition out of cropland between 2009-2017

## Value for each longitude bin

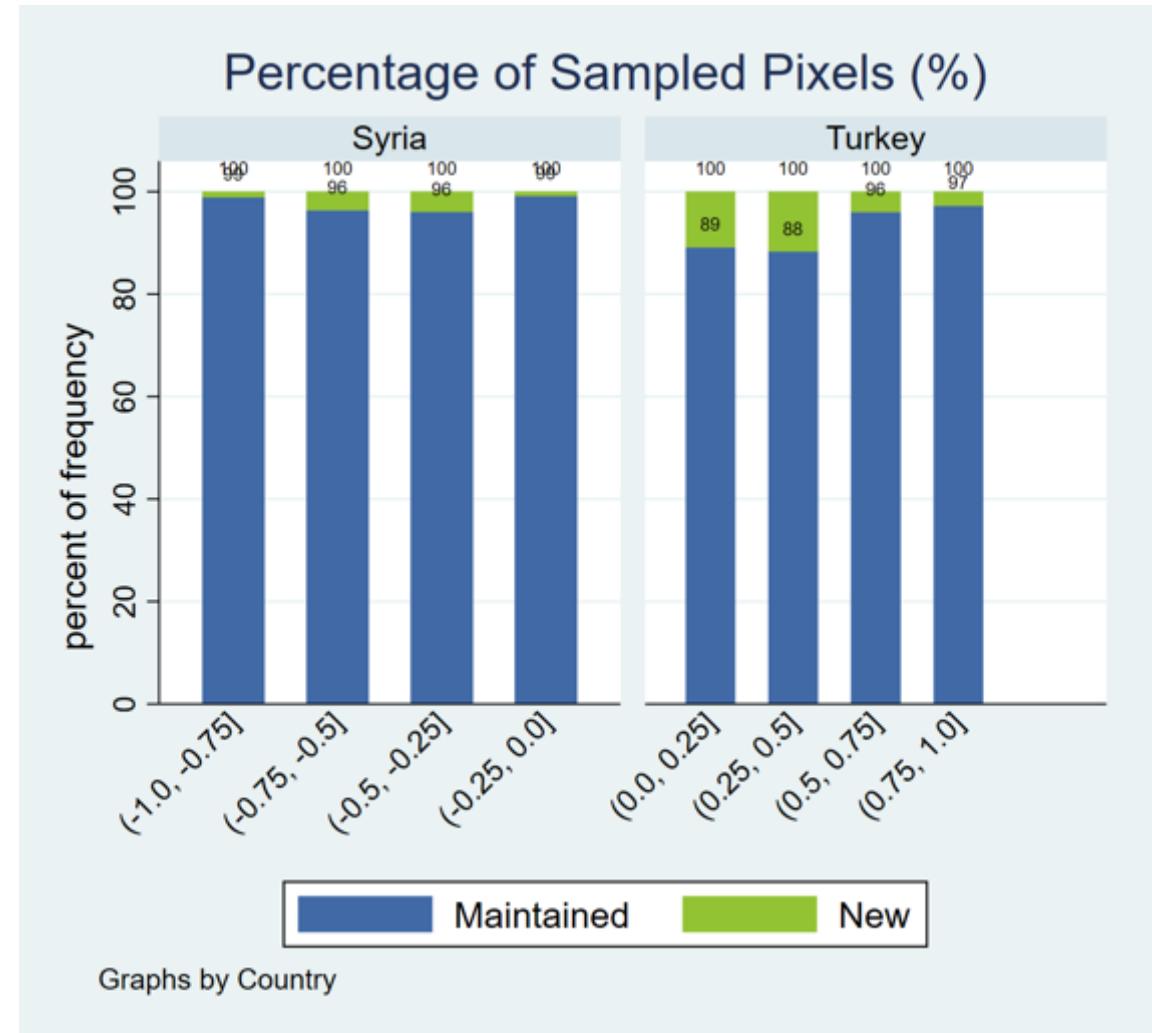
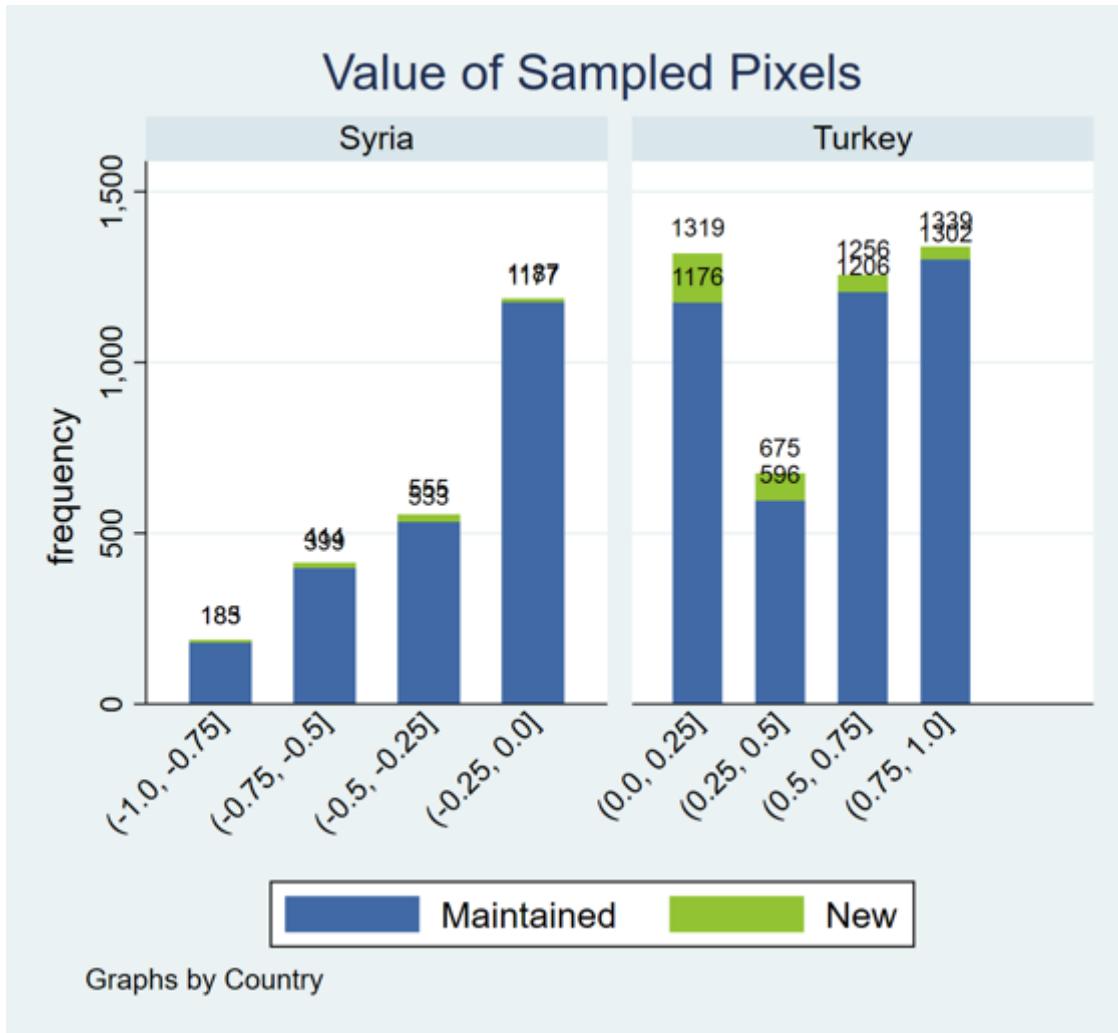


# Transition out of cropland between 2009-2017

## Percentage for each longitude bin

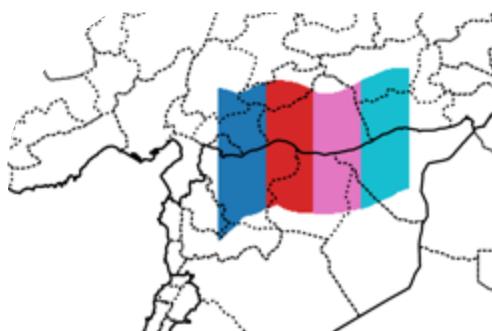
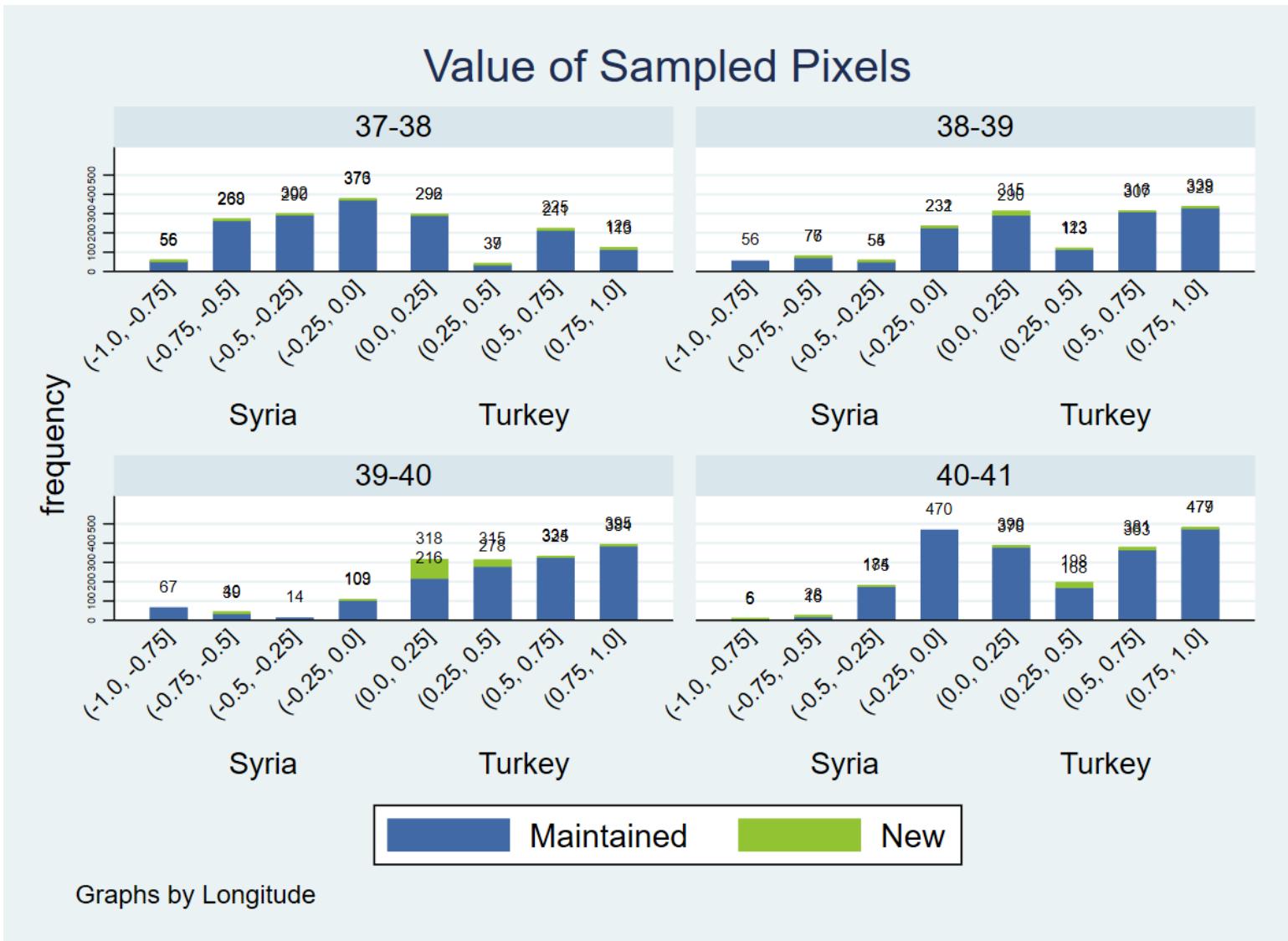


# Transition into cropland between 2009-2017



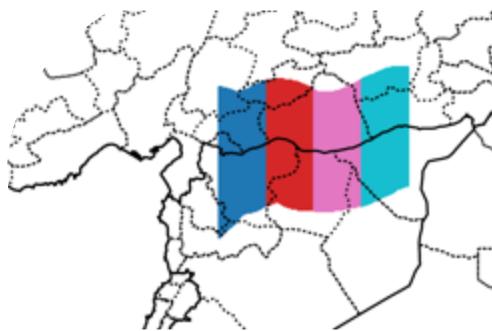
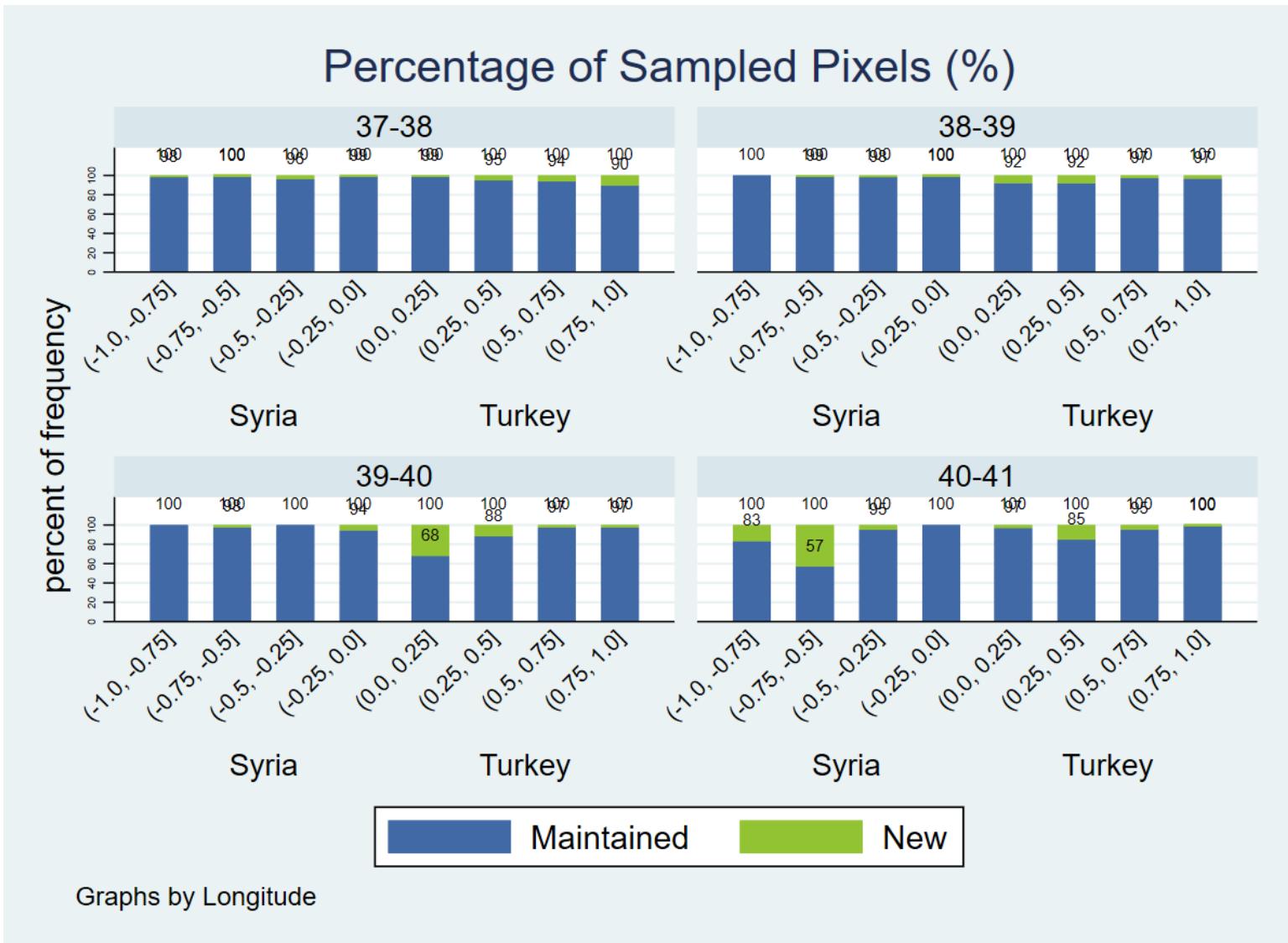
# Transition into cropland between 2009-2017

## Value for each longitude bin

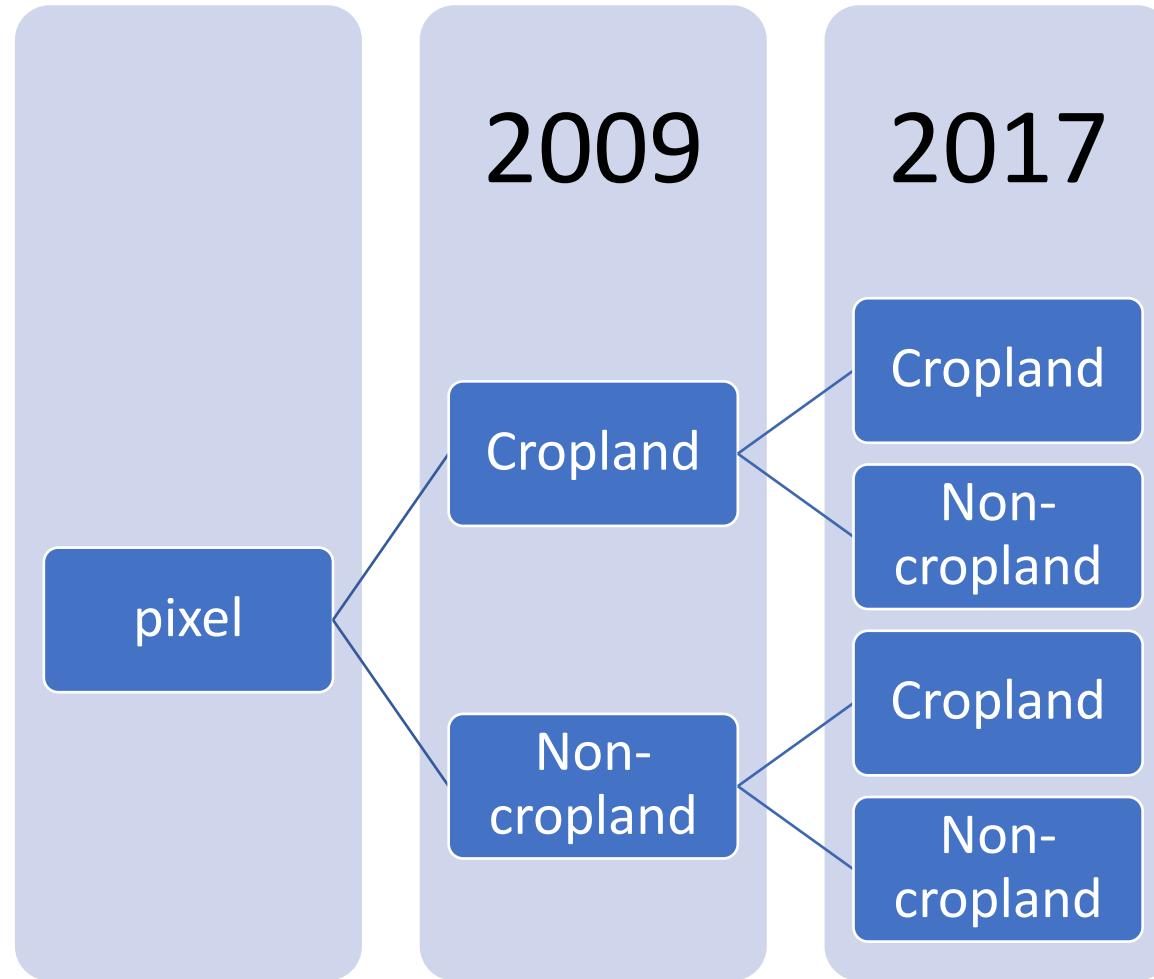


# Transition into cropland between 2009-2017

## Percentage for each longitude bin



# Land Cover Change Model



# Estimation

- Linear regression

```
reg cropland ib7.bins    if Longitude=="I"
```

- Logit regression

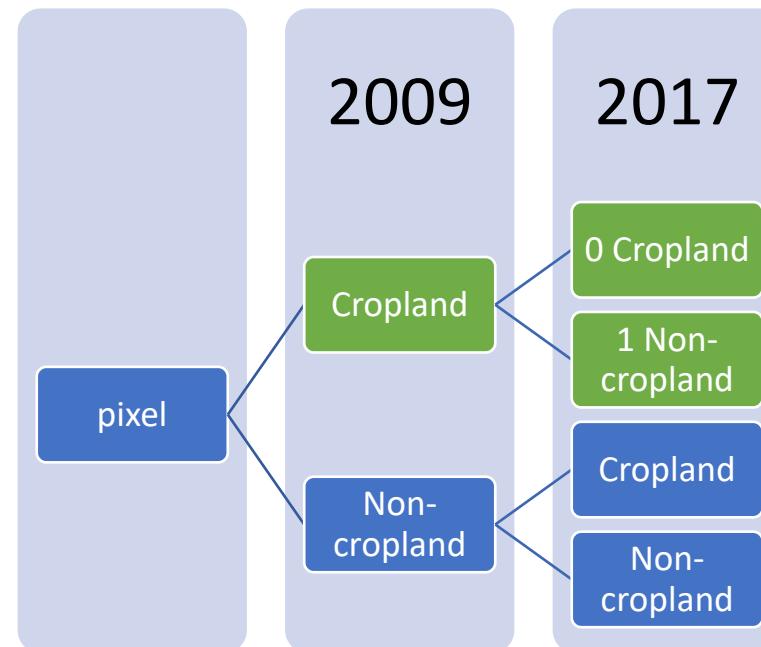
```
logit cropland ib7.bins   if Longitude=="I"
```

Omit from regression: Northern buffer in Turkey

ib7 = leaves out the last buffer in Turkey – sets its coefficient to zero.

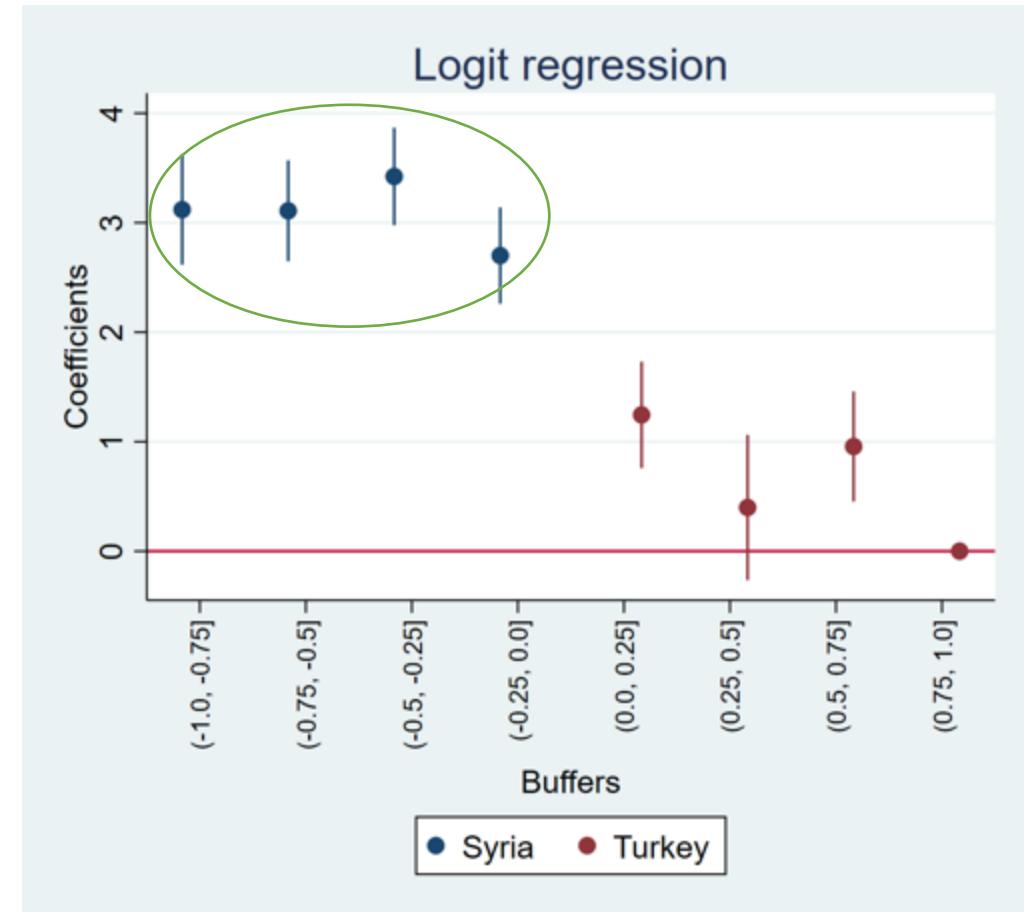
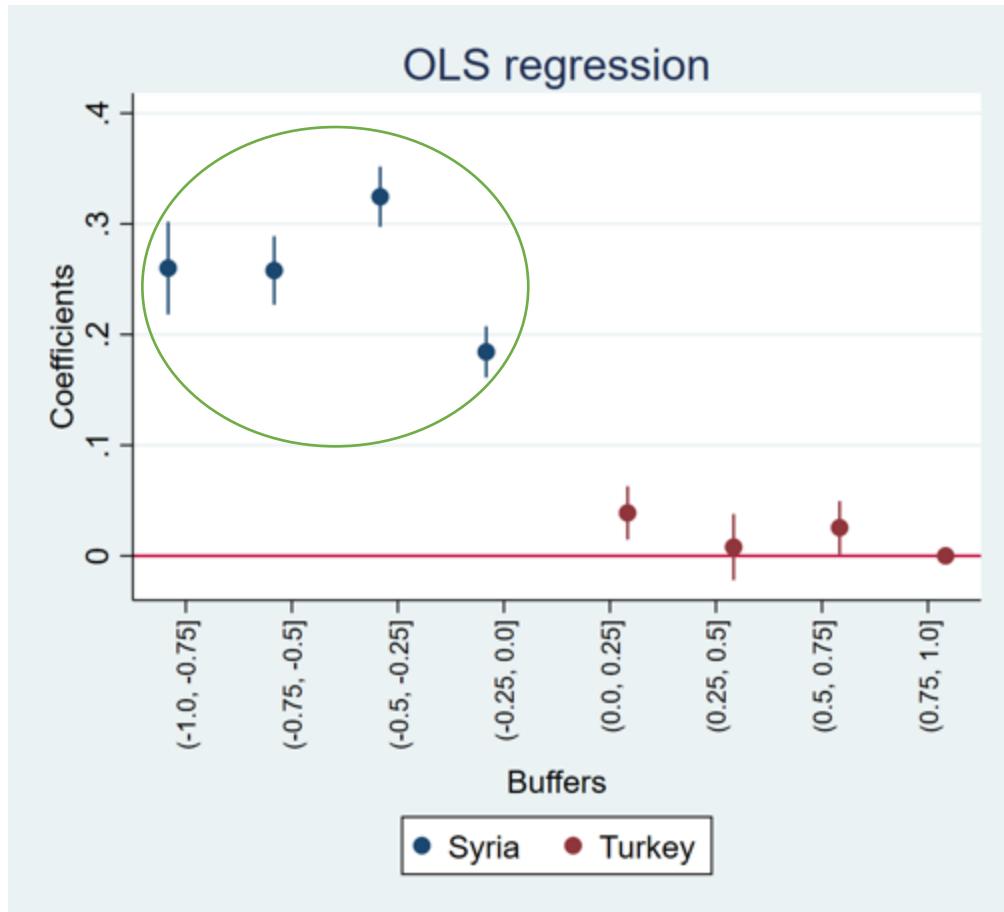
# Model 1: Losses

- Interpretation
  - Crossing the border into Syria leads to greater losses



# Coefficients for distance to the border

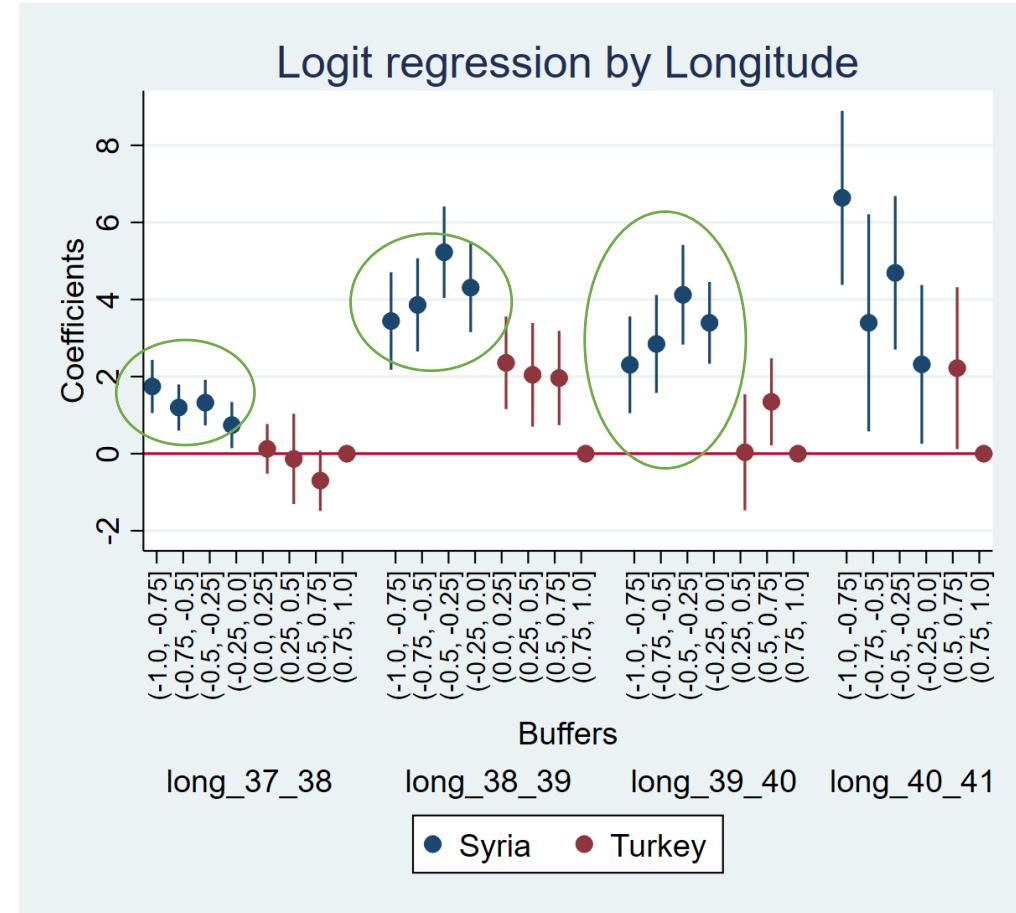
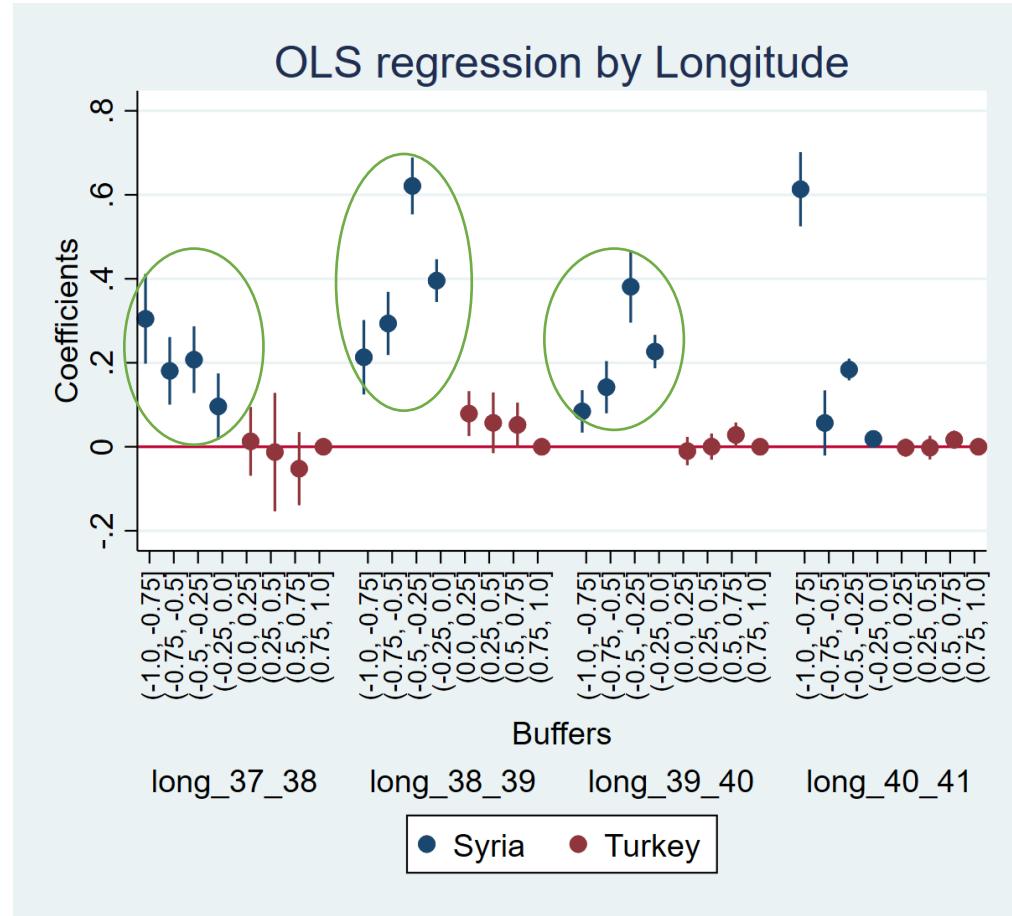
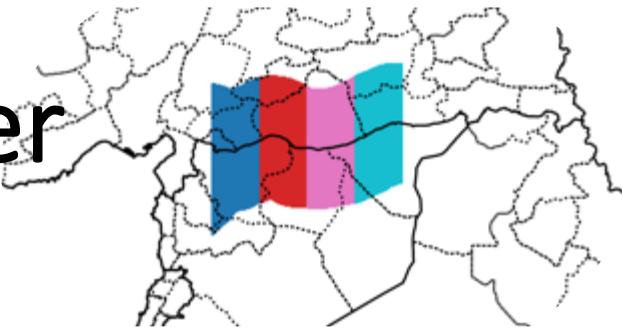
Loss of cropland = 1, Maintained cropland = 0



No clear effect of distance from the border, but a clear effect for what side of the border are you in.

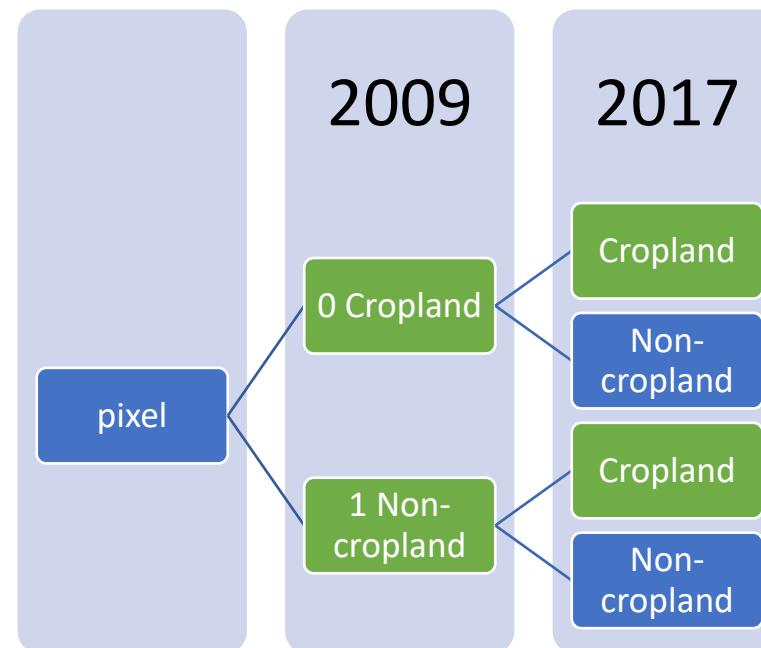
# Coefficients for distance to the border

Loss of cropland = 1, Maintained cropland = 0



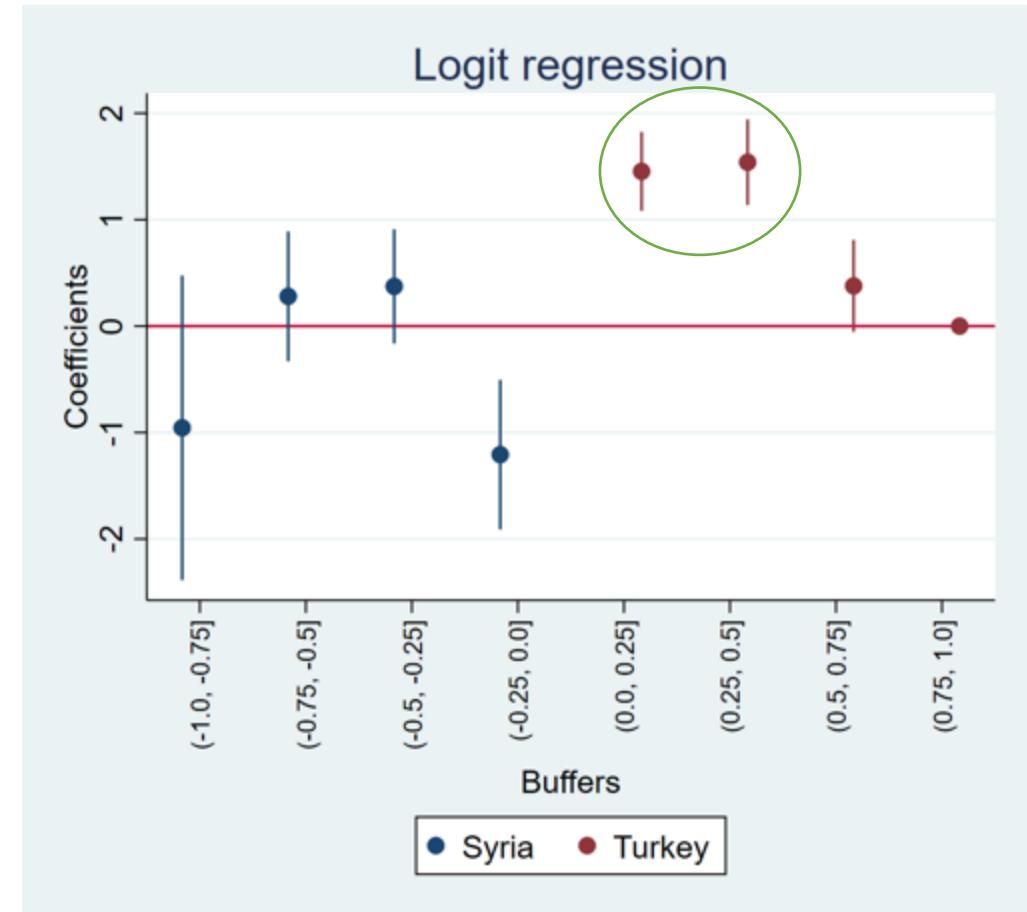
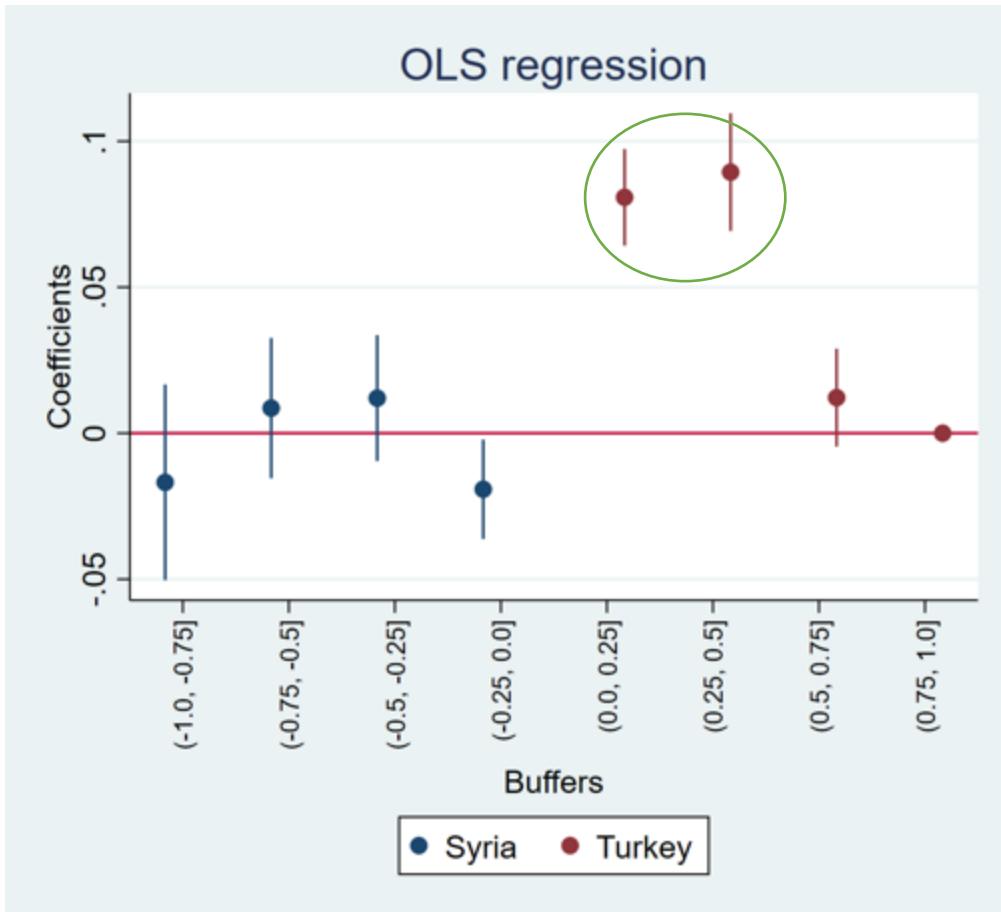
# Model 2: Gains

- Interpretation
  - Being in Turkish side close to the border leads to higher gains



# Coefficients for distance to the border

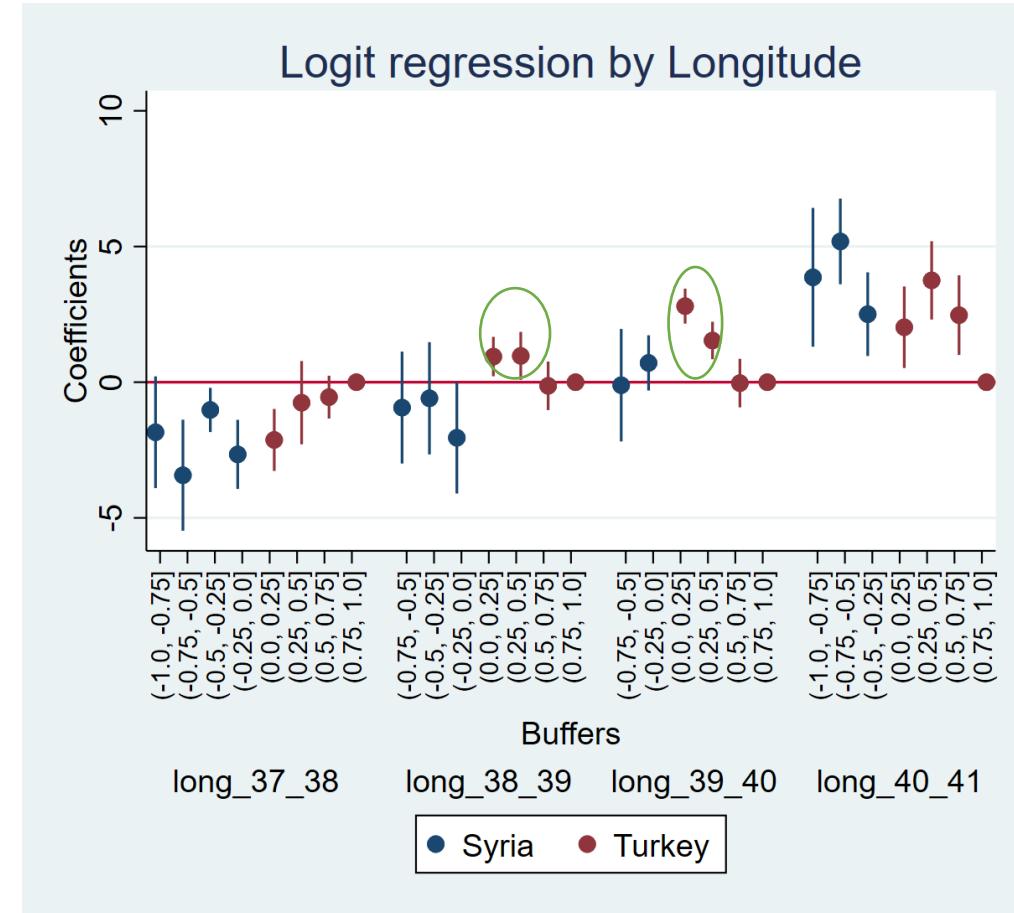
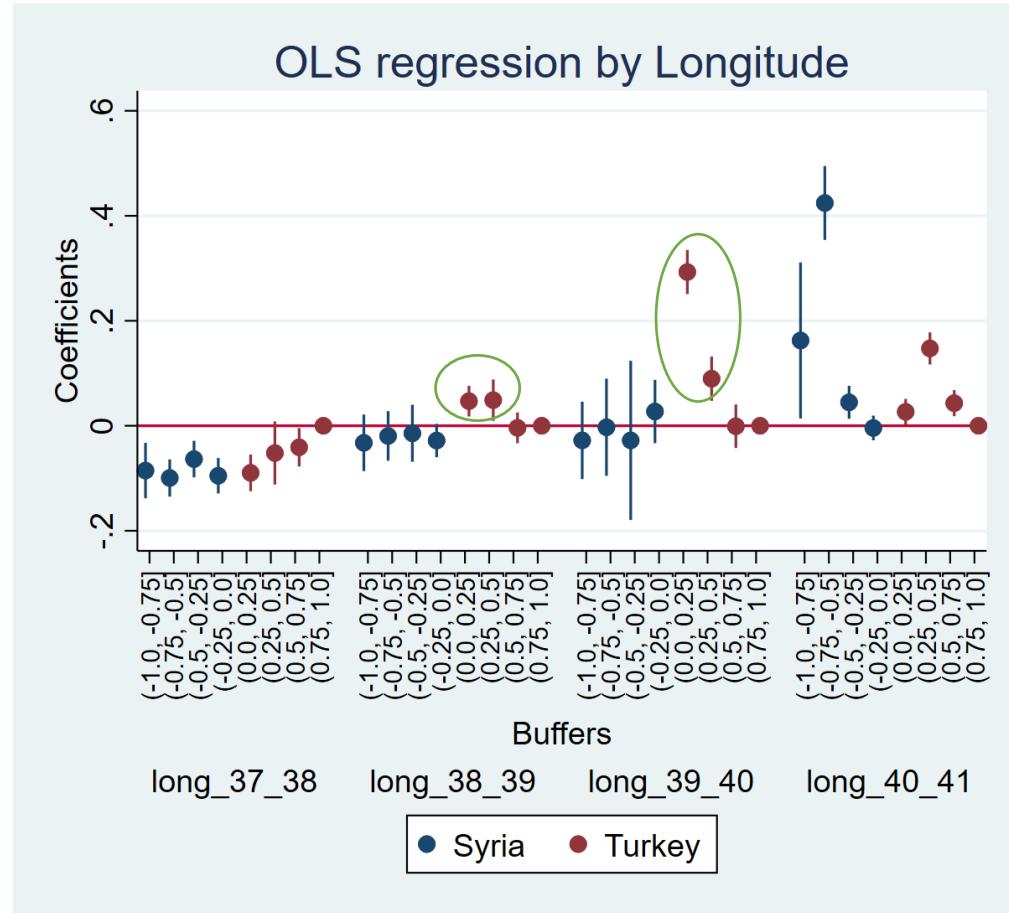
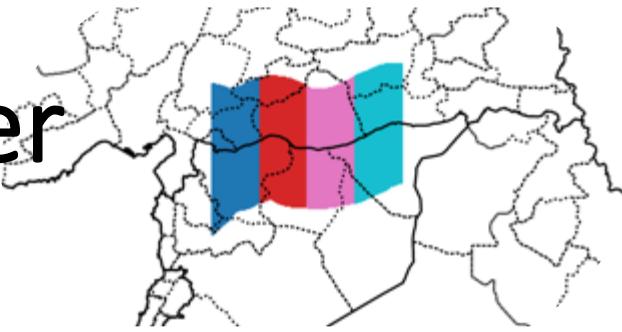
Gained cropland = 1, Maintained cropland = 0



Two Turkish buffers closest to the border are most likely to have new croplands

# Coefficients for distance to the border

Gained cropland = 1, Maintained cropland = 0



# Next steps

- Adding control variables (precipitation, elevation)
- Endogenous borders – ISIS in Iraq
- Mechanisms
  - Proximity to violence from UCDP data
  - Population movement – cropland gain in Turkey
- Extensive versus intensive margin
- Temporary versus permanent effects
- Other outcomes (nighttime lights)

Two papers:

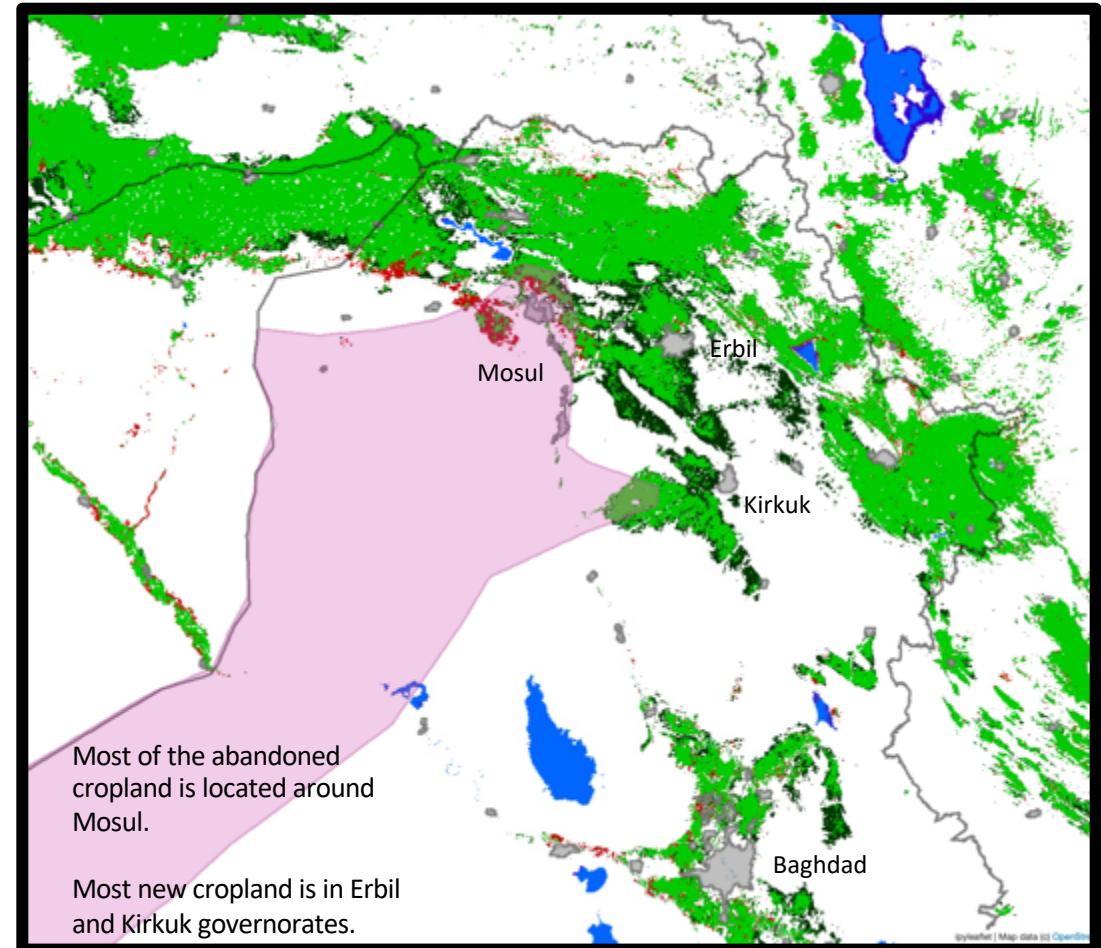
1. A Spatial Econometric Model of Land Use Change due to Conflict and Displacement along the Syria-Turkey border
2. A Spatial Econometric Model of Land Use Change due to Conflict and Displacement in Iraq

# Iraq land cover was also affected by ISIS occupation

Map 5: ISIS controlled area (2015)



Map 6: Land cover type change (North Iraq, 2009-2017)



Source: Political Geography [www.polgeonow.com](http://www.polgeonow.com)

Source: MCD12Q1.006 MODIS Land Cover Type Yearly Global 500m

# Thanks!

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