



Water Wars

Devis Decet
Northwestern University

Andrea Marcucci
University of Lausanne

EEA Conference Rotterdam 2024

Motivation

Access to **water** essential for **human life** and economic activity:

- 57% of the global population lives in areas that suffer **water scarcity**.
(Mekonnen and Hoekstra, 2016)
- **Climate change** → exacerbates the issue.
- **Cooperation** in water management and the potential for **conflicts** over water access key concern for policy-makers.
(UN, 2023)



Accelerating water wars

Haitham Nouri , Tuesday 18 Jul 2023

Conflict over water in the Fertile Crescent and East Africa due to dam construction and climate change is harming livelihoods, increasing food insecurity, and fuelling international tensions, writes Haitham Nouri

Accelerating water wars

Haitham Nouri , Tuesday 18 Jul 2023

Conflict over water in the Fertile Crescent and East Africa due to dam construction and climate change is harming livelihoods, increasing food insecurity, and fuelling international tensions, writes Haitham Nouri

Conflict over water as farmers upstream divert rivers

Accelerating water wars

Haitham Nouri , Tuesday 18 Jul 2023

Conflict over water in the Fertile Crescent and East Africa due to dam construction and climate change is harming livelihoods, increasing food insecurity, and fuelling international tensions, writes Haitham Nouri

Conflict over water as farmers upstream divert rivers

RIVER DRIES, DOWNSTREAM FARMERS SUFFER

Thika residents unblock diverted River Ndarugu

Farmers say they had been given permission by a chief to block the river and use the water for irrigation

Accelerating water wars

Haitham Nouri , Tuesday 18 Jul 2023

Conflict over water in the Fertile Crescent and East Africa due to dam construction and climate change is harming livelihoods, increasing food insecurity, and fuelling international tensions, writes Haitham Nouri

Conflict over water as farmers upstream divert rivers

RIVER DRIES, DOWNSTREAM FARMERS SUFFER

Thika residents unblock diverted River Ndarugu

SUB-SAHARAN AFRICA | LAND AND FOOD

Communal Conflicts Across the Kenyan-Ugandan Border

Livestock raiding and competition for water and pastures lead to cycles of reciprocal violence between pastoralist groups in the Kenyan-Ugandan border region. More frequent and severe droughts as well as the proliferation of weapons from war-torn neighbour countries are further aggravating this situation.

Accelerating water wars

Haitham Nouri , Tuesday 18 Jul 2023

Conflict over water in the Fertile Crescent and East Africa due to dam construction and climate change is harming livelihoods, increasing food insecurity, and fuelling international tensions, writes Haitham Nouri

Conflict over water as farmers upstream divert rivers

RIVER DRIES, DOWNSTREAM FARMERS SUFFER

Thika residents unblock diverted River Ndarugu

SUB-SAHARAN AFRICA | LAND AND FOOD

Communal Conflicts Across the Kenyan-Ugandan Border

Livestock raiding and co of reciprocal violence be border region. More frec proliferation of weapons aggravating this situati



REUTERS®

World ▾ Business ▾ Markets ▾ Sustainability ▾ Legal ▾ Breakingviews ▾

World

As water falls short, conflict between herders and farmers sharpens

Conflicts over water

- 1) Resources and land appropriation.
- 2) Prevent water diversion or water blockage.
- 3) Cattle grazing:
 - Pastors VS pastors.
 - Pastors VS Farmers (McGuirk Nunn 2024; Eberle Rohner Thoenig 2023).

This paper

Q: Does water scarcity increase **conflicts** over **water resources**?

This paper

Q: Does water scarcity increase **conflicts** over **water resources**?

- *Novel approach to detect conflicts related to water resources:*

- **Where?** Granular data on rivers network:
 - up-downstream relationship
 - water flow
- **When?** Rainfall shocks (droughts) in neighborhood.

This paper

Q: Does water scarcity increase **conflicts** over **water resources**?

- *Novel approach to detect conflicts related to water resources:*
 - **Where?** Granular data on rivers network:
 - up-downstream relationship
 - water flow
 - **When?** Rainfall shocks (droughts) in neighborhood.
- *Focus on **Africa**:*
 - Largely agrarian.
 - Ethnic grievances (more difficult to share).
 - Lack of infrastructures (e.g. irrigation).
 - Weak states.

Main Findings

- ★ **Rivers network** structure is important to understand climate - water conflicts nexus.
- ★ **Droughts** downstream increase conflicts in water rich areas upstream.
⇒ Increase up to 7.3% of mean level of conflicts in high water presence cells.
- ★ Economic value of water (**agriculture**), difficult cooperation (**ethnic grievances**), **desertification** and **weak institutions** → relevant for the issue.

Contributions to the literature

- **Climate change, weather shocks and conflict** Burke, Hsiang and Miguel, 2015; Sarsons, 2015; Harari and La Ferrara, 2018; ...
 - ↪ **Control of freshwater resources as a specific mechanism** Eberle et al, 2020; McGuirk and Nunn, 2023
 - ↪ **Rivers network as exact structure of spatial spillovers** König et al, 2017; McGuirk and Nunn, 2023; Couttenier et al. (2023)
- **Natural resources and conflict** Dube and Vargas, 2013; Berman et al, 2017; McGuirk and Burke, 2020; Adhvaryu et al, 2021; ...
 - ↪ **Water as a resource curse**
- **Rivers-Freshwater & conflict:** Eberle 2020 WP; Döring 2019 Polit Geogr; Gleditsch et al Polit Geogr 2014; Almer et al. 2017 JEEM
 - ↪ **Use water disaggregated data.**

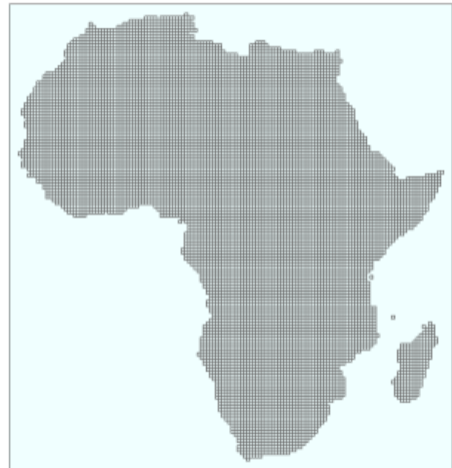
- **Introduction**
- **Data**
- **Empirical strategy & Main Results**
- **Heterogeneity**
- **Conclusions**

A blue-toned topographic map of the African continent is shown. The map uses varying shades of blue to represent elevation and terrain, with darker blues indicating higher altitudes and lighter blues for lower elevations. The word "Data" is written in a dark blue, sans-serif font, centered over the map.

Data

Data

- ★ Panel at $0.5^\circ \times 0.5^\circ$ cell-year level for period 1997-2021.

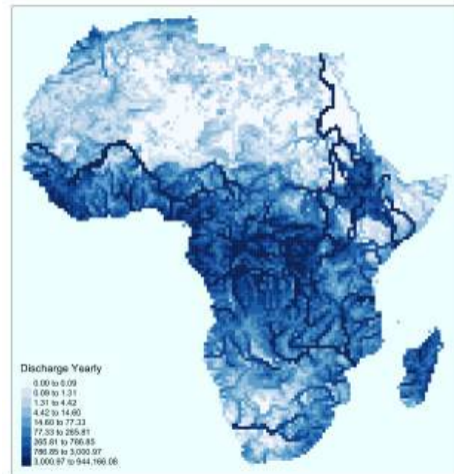


Data

★ Panel at $0.5^\circ \times 0.5^\circ$ cell-year level for period 1997-2021.

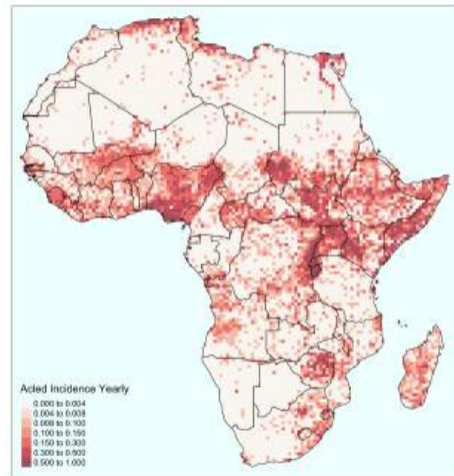
- Hydrology

- **Discharge**: Volume rate of water flow, $0.05^\circ \times 0.05^\circ$ ERA5
- **Rivers network**: Upstream/Downstream relationships HydroSHEDS



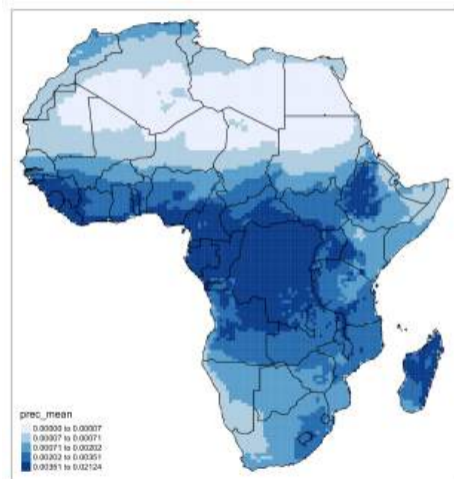
Data

- ★ Panel at $0.5^\circ \times 0.5^\circ$ cell-year level for period 1997-2021.
- Hydrology
- Conflicts
 - **ACLED**: violent events 1997-2021.



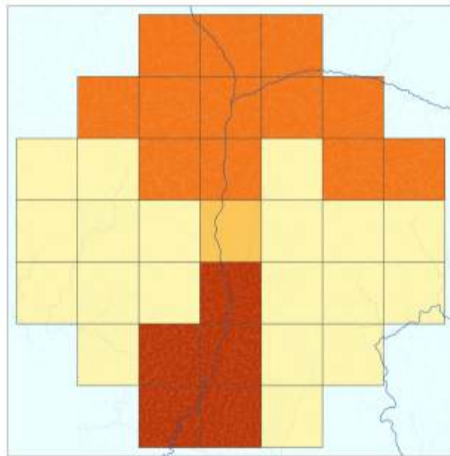
Data

- ★ Panel at $0.5^\circ \times 0.5^\circ$ cell-year level for period 1997-2021.
- Hydrology
- Conflicts
- Rainfall
 - Yearly precipitation ERA5 1951-2021
 - **Shock:** calendar year rainfall \leq 15th percentile of a location's long-run rainfall distribution (as in Burke et al. 2015 EJ and Corno et al. 2020 ECMA)



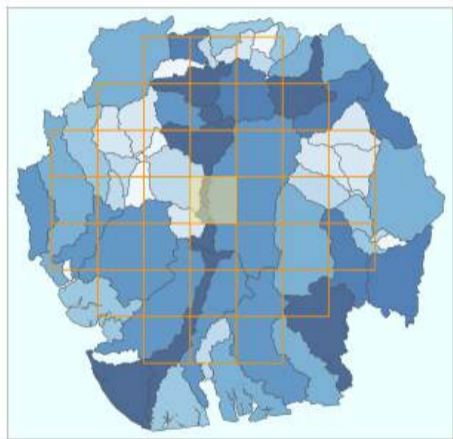
Variables Definition

- **Neighborhood:** all cells within 180 km radius
(Harari and La Ferrara, 2018)



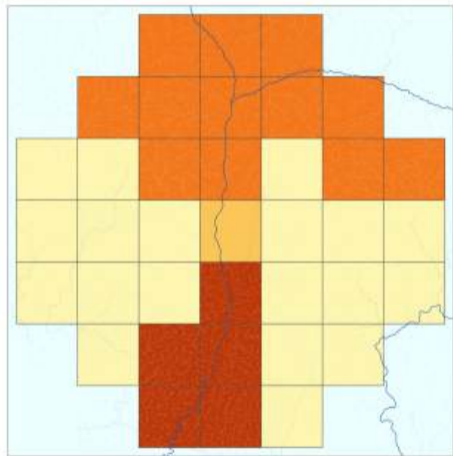
Variables Definition

- **Upstream/downstream** relationships:
 - Overlap grid cells with basins.
 - For each cells select basin with highest **discharge** → unique identifier up-down.



Variables Definition

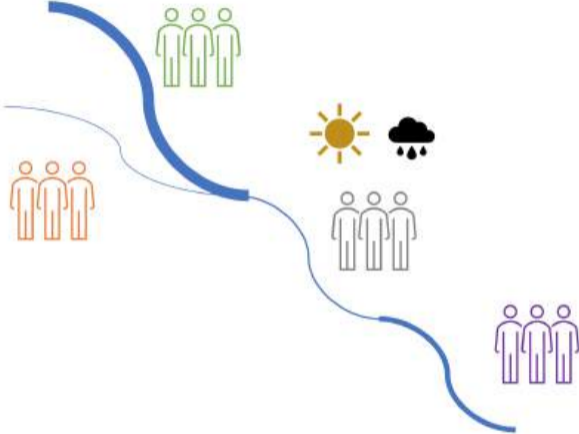
- **Neighborhood**: all cells within 180 km radius
(Harari and La Ferrara, 2018)
- **Upstream/downstream** relationships:
 - Overlap grid cells with basins.
 - For each cells select basin with highest **discharge** → unique identifier up-down.



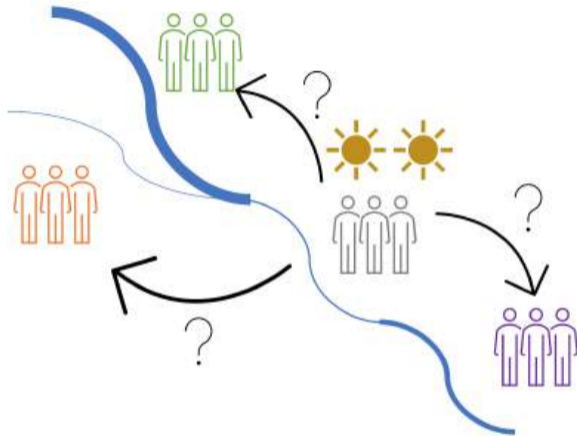


Empirical strategy & Results

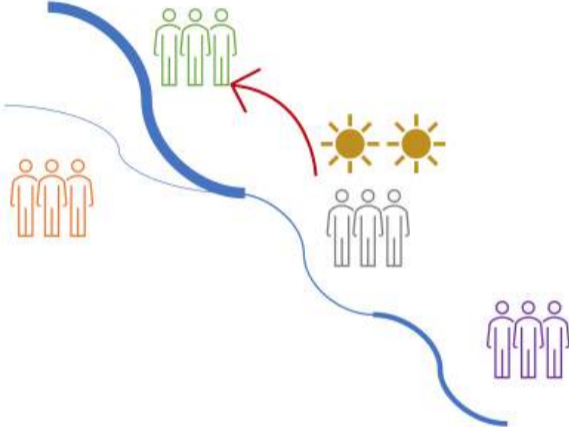
Framework



Framework



Framework



Econometric Specification

$$y_{it} = \gamma_1 Shock_{it}^{Own} + \gamma_2 Water Rich_{it} + \beta_1 Shock_{it}^{Down} + \beta_2 Shock_{it}^{Down} \times Water Rich_{it} + \lambda_1 Shock_{it}^{Up} + \lambda_2 Shock_{it}^{Up} \times Water Rich_{it} + \mu_i + \mu_{ct} + \varepsilon_{it}$$

- $y_{it} \in (0, 1)$: conflict incidence.
- *Shock Own*: rainfall shock in own cell i .
- *Shock Down*: rainfall shock in a neighboring **downstream** cell.
- *Shock Up*: rainfall shock in a neighboring upstream cell.
- *Water Rich*: own water richness.
- μ : cell and country-year fixed effects.

Water Richness

H: *Water rich cells experience more conflict than water poor cells when low rainfall in a neighbouring (downstream) cell ($\beta_2 > 0$)*

1. **Water Amount:** log of average **water** discharge present in the cell in a given year.

Water Discharge

	Incidence (ACLEd)				
	(1)	(2)	(3)	(4)	(5)
Water Discharge	0.0010 (0.0009)	0.0007 (0.0010)	0.0010 (0.0009)	0.0009 (0.0009)	0.0009 (0.0009)
Water Discharge × Shock Down	0.0011*** (0.0004)		0.0011*** (0.0004)		0.0012*** (0.0004)
Water Discharge × Shock Up		0.0003 (0.0005)		0.0003 (0.0005)	-0.0002 (0.0005)
Shock Down	0.0008 (0.0017)		0.0010 (0.0018)		0.0009 (0.0018)
Shock Up		-0.0018 (0.0020)		-0.0024 (0.0021)	-0.0014 (0.0021)
Shock Own			-0.0005 (0.0017)	0.0020 (0.0016)	0.0000 (0.0017)
Cell FE	✓	✓	✓	✓	✓
Country-Year FE	✓	✓	✓	✓	✓
Dep. Var. Mean	0.08201	0.08201	0.08201	0.08201	0.08201
R ²	0.42101	0.42095	0.42101	0.42096	0.42101
Cells	10,228	10,228	10,228	10,228	10,228
Observations	255,700	255,700	255,700	255,700	255,700

Water richness

H: *Water rich cells experience more conflict than water poor cells when low rainfall in a neighboring (downstream) cell ($\beta_2 > 0$)*

1. **Water Amount:** log of average **water** discharge present in the cell in a given year.
2. **Water Monoplist:** own cell has \geq **water** than any other cell in neighbourhood in a year.
3. **Water Monoplist +:** own cell has \geq **water** than any other cell in neighbourhood & \geq **water** than continent-year median.

All Measures

	Incidence (ACLED)		
	Water Discharge (1)	Water Monopolist (2)	Water Monopolist + (3)
Water Measure	0.0009 (0.0009)	0.0120 (0.0098)	0.0151 (0.0106)
Water Measure × Shock Down	0.0012*** (0.0004)	0.0181 (0.0123)	0.0336** (0.0170)
Water Measure × Shock Up	-0.0002 (0.0005)	-0.0020 (0.0118)	-0.0046 (0.0144)
Shock Own	0.0000 (0.0017)	-0.0004 (0.0017)	-0.0004 (0.0017)
Shock Down	0.0009 (0.0018)	0.0049*** (0.0015)	0.0048*** (0.0015)
Shock Up	-0.0014 (0.0021)	-0.0018 (0.0017)	-0.0018 (0.0017)
Cell FE	✓	✓	✓
Country-Year FE	✓	✓	✓
Dep. Var. Mean	0.08201	0.08201	0.08201
R ²	0.42101	0.42101	0.42103
Cells	10,228	10,228	10,228
Observations	255,700	255,700	255,700

Sensitivity Analysis

- **Inference**: allow for spatial correlation ▶
- Alternative **conflict** types ▶
- Alternative **conflict** data: UCDP ged ▶
- Additional **controls**: population, temperature, lagged conflict ▶
- Alternative **radius** ▶
- Alternative **rainfall shocks** ▶



Heterogeneity

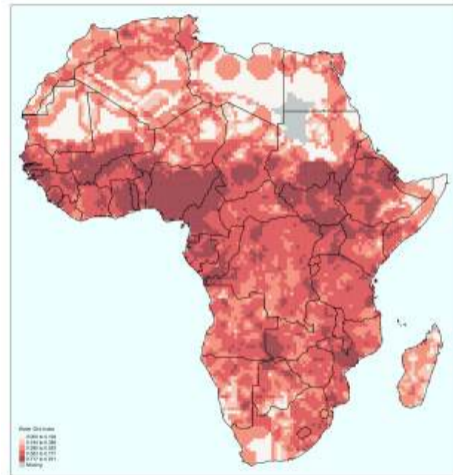
Heterogeneity

- **Agriculture:** water is more valuable.



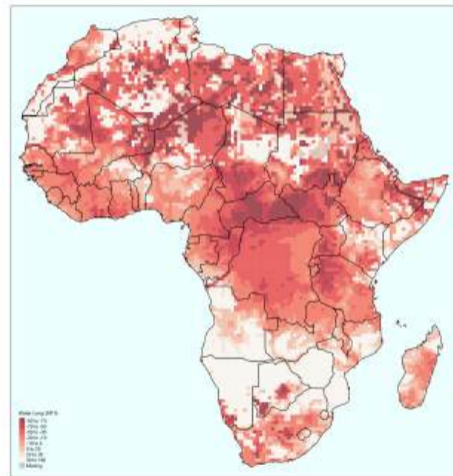
Heterogeneity

- **Agriculture:** water is more valuable.
- **Ethnic grievances:** higher cooperation costs.
Inequality in water ownership between groups:
 - Polarization index.
 - Gini index.
 - Theil index.



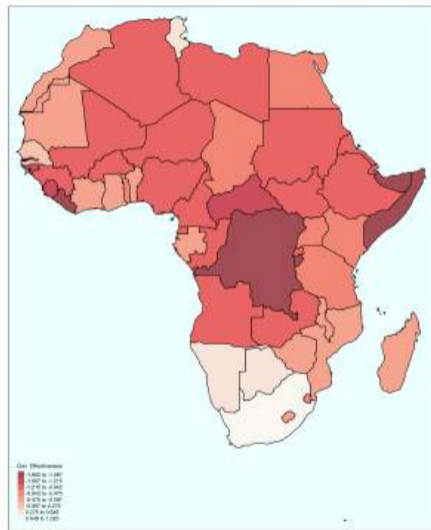
Heterogeneity

- **Agriculture:** water is more valuable.
- **Ethnic grievances:** higher cooperation costs.
- **Water stress:** long-run change in water presence.

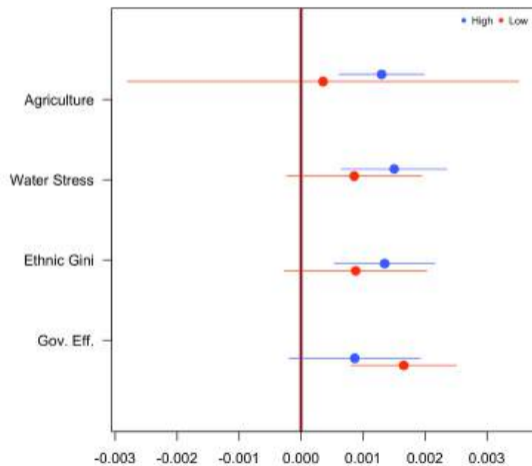


Heterogeneity

- **Agriculture:** water is more valuable.
- **Ethnic grievances:** higher cooperation costs.
- **Water stress:** long-run change in water presence.
- **Institutional quality:**
 - Democracy.
 - Rule of law.
 - Government effectiveness.
 - Corruption.



Heterogeneity



A blue-toned topographic map of the African continent is shown, centered on a white background. The map uses varying shades of blue to represent elevation and terrain. The word "Conclusions" is written in a dark blue, sans-serif font, centered over the map.

Conclusions

Conclusions

What does generate spillover effects in the **climate-conflicts** relationship?

- ★ **New disaggregated data**: up-downstream relationship and water richness.
- ★ **Rivers network** structure is a transmission channel of climate shocks.
- ★ **Control** of water resources is a determinant of conflict.

Next steps:

- Seasonal variation.
- Disentangle pastors-farmers conflicts.
- Quantification for future scenarios.

Thank you!

`andrea.marcucci@unil.ch`

`ddecet@u.northwestern.edu`

Water Discharge Conley

	Incidence (ACLEd)				
	(1)	(2)	(3)	(4)	(5)
Water Discharge	0.0010 (0.0013)	0.0007 (0.0013)	0.0010 (0.0012)	0.0009 (0.0012)	0.0009 (0.0012)
Water Discharge × Shock Down	0.0011** (0.0006)		0.0011** (0.0006)		0.0012** (0.0006)
Water Discharge × Shock Up		0.0003 (0.0006)		0.0003 (0.0006)	-0.0002 (0.0006)
Shock Down	0.0008 (0.0024)		0.0010 (0.0024)		0.0009 (0.0023)
Shock Up		-0.0018 (0.0025)		-0.0024 (0.0025)	-0.0014 (0.0024)
Shock Own			-0.0005 (0.0021)	0.0020 (0.0021)	0.0000 (0.0021)
Cell FE	✓	✓	✓	✓	✓
Country-Year FE	✓	✓	✓	✓	✓
Dep. Var. Mean	0.08201	0.08201	0.08201	0.08201	0.08201
R ²	0.42101	0.42095	0.42101	0.42096	0.42101
Cells	10,228	10,228	10,228	10,228	10,228
Observations	255,700	255,700	255,700	255,700	255,700



ACLEd Conflict Categories

	Incidence (ACLEd)	Incidence Battles	Incidence Violence	Incidence Protests	Incidence Riots
	(1)	(2)	(3)	(4)	(5)
Water Discharge	0.0009 (0.0009)	0.0013* (0.0008)	-0.0008 (0.0008)	0.0006 (0.0007)	-0.0006 (0.0006)
Water Discharge × Shock Down	0.0012*** (0.0004)	0.0013*** (0.0004)	0.0011*** (0.0004)	0.0001 (0.0003)	0.0001 (0.0003)
Water Discharge × Shock Up	-0.0002 (0.0005)	-0.0003 (0.0004)	0.0002 (0.0004)	0.0002 (0.0003)	0.0005 (0.0003)
Shock Own	0.0000 (0.0017)	0.0004 (0.0015)	-0.0011 (0.0015)	-0.0011 (0.0013)	-0.0030** (0.0012)
Shock Down	0.0009 (0.0018)	0.0005 (0.0016)	0.0001 (0.0015)	-0.0004 (0.0014)	-0.0010 (0.0012)
Shock Up	-0.0014 (0.0021)	-0.0032* (0.0018)	-0.0011 (0.0018)	-0.0007 (0.0016)	-0.0016 (0.0014)
Cell FE	✓	✓	✓	✓	✓
Country-Year FE	✓	✓	✓	✓	✓
Dep. Var. Mean	0.08201	0.05431	0.05570	0.04152	0.03507
R ²	0.42101	0.36651	0.38268	0.39875	0.37082
Cells	10,228	10,228	10,228	10,228	10,228
Observations	255,700	255,700	255,700	255,700	255,700



Water Discharge GED

	Incidence (GED Geo3)		
	Water Discharge (1)	Water Monopolist (2)	Water Monopolist + (3)
Water Measure	-0.0003 (0.0006)	0.0147** (0.0072)	0.0129* (0.0070)
Water Measure × Shock Down	0.0005* (0.0003)	0.0143* (0.0086)	0.0305** (0.0124)
Water Measure × Shock Up	-0.0004 (0.0003)	-0.0018 (0.0079)	-0.0058 (0.0095)
Shock Own	0.0012 (0.0011)	0.0012 (0.0011)	0.0012 (0.0011)
Shock Down	0.0001 (0.0011)	0.0017* (0.0010)	0.0016* (0.0010)
Shock Up	-0.0007 (0.0013)	-0.0021* (0.0011)	-0.0021** (0.0011)
Cell FE	✓	✓	✓
Country-Year FE	✓	✓	✓
Dep. Var. Mean	0.03039	0.03039	0.03039
R ²	0.28764	0.28768	0.28771
Cells	10,228	10,228	10,228
Observations	337,524	337,524	337,524

Additional Controls

	Incidence (ACLEd)			
	(1)	(2)	(3)	(4)
Water Discharge	0.0009 (0.0009)	0.0013 (0.0010)	0.0015 (0.0010)	0.0008 (0.0009)
Water Discharge × Shock Down	0.0012*** (0.0004)	0.0012*** (0.0004)	0.0012*** (0.0004)	0.0011** (0.0004)
Water Discharge × Shock Up	-0.0001 (0.0005)	-0.0002 (0.0005)	-0.0002 (0.0005)	-0.0002 (0.0005)
Shock Own	0.0000 (0.0017)	-0.0004 (0.0017)	-0.0006 (0.0017)	-0.0002 (0.0017)
Shock Down	0.0009 (0.0018)	0.0007 (0.0018)	0.0005 (0.0018)	0.0004 (0.0018)
Shock Up	-0.0014 (0.0021)	-0.0015 (0.0021)	-0.0015 (0.0021)	-0.0002 (0.0020)
Log pop.	0.0046 (0.0048)			
Temp.		0.0044** (0.0022)		
Temp. (day)			0.0059*** (0.0020)	
Lagged Incidence				0.1701*** (0.0051)
Cell FE	✓	✓	✓	✓
Country-Year FE	✓	✓	✓	✓
Dep. Var. Mean	0.08201	0.08201	0.08201	0.08366
R ²	0.42102	0.42103	0.42104	0.44153
Cells	10,228	10,228	10,228	10,228
Observations	255,700	255,700	255,700	245,472



Radius 200 Km

	Incidence (ACLED)		
	Water Discharge	Water Monopolist	Water Monopolist +
	(1)	(2)	(3)
Water Measure	0.0009 (0.0009)	0.0104 (0.0106)	0.0093 (0.0112)
Water Measure × Shock Down	0.0010** (0.0004)	0.0217* (0.0123)	0.0341** (0.0168)
Water Measure × Shock Up	-0.0001 (0.0005)	-0.0053 (0.0114)	-0.0061 (0.0133)
Shock Own	0.0003 (0.0017)	-0.0001 (0.0017)	-0.0001 (0.0017)
Shock Down	0.0008 (0.0018)	0.0042*** (0.0015)	0.0041*** (0.0015)
Shock Up	-0.0018 (0.0020)	-0.0018 (0.0017)	-0.0019 (0.0017)
Cell FE	✓	✓	✓
Country-Year FE	✓	✓	✓
Dep. Var. Mean	0.08201	0.08201	0.08201
R ²	0.42100	0.42100	0.42101
Cells	10,228	10,228	10,228
Observations	255,700	255,700	255,700



Radius 160 Km

	Incidence (ACLED)		
	Water Discharge	Water Monopolist	Water Monopolist +
	(1)	(2)	(3)
Water Measure	0.0009 (0.0009)	0.0102 (0.0080)	0.0125 (0.0087)
Water Measure × Shock Down	0.0014*** (0.0005)	0.0133 (0.0109)	0.0224 (0.0144)
Water Measure × Shock Up	-0.0001 (0.0005)	-0.0059 (0.0104)	-0.0066 (0.0125)
Shock Own	-0.0001 (0.0017)	-0.0005 (0.0017)	-0.0005 (0.0017)
Shock Down	0.0002 (0.0020)	0.0049*** (0.0016)	0.0049*** (0.0016)
Shock Up	-0.0015 (0.0022)	-0.0015 (0.0018)	-0.0016 (0.0018)
Cell FE	✓	✓	✓
Country-Year FE	✓	✓	✓
Dep. Var. Mean	0.08201	0.08201	0.08201
R ²	0.42102	0.42100	0.42101
Cells	10,228	10,228	10,228
Observations	255,700	255,700	255,700



Rainfall shocks G10

	Incidence (ACLED)		
	Water Discharge	Water Monopolist	Water Monopolist +
	(1)	(2)	(3)
Water Measure	0.0010 (0.0009)	0.0125 (0.0095)	0.0163 (0.0104)
Water Measure × Shock Down	0.0014*** (0.0005)	0.0275** (0.0137)	0.0458*** (0.0172)
Water Measure × Shock Up	0.0003 (0.0005)	-0.0073 (0.0120)	-0.0104 (0.0138)
Shock Own	0.0006 (0.0020)	0.0002 (0.0020)	0.0002 (0.0020)
Shock Down	-0.0003 (0.0022)	0.0043** (0.0017)	0.0043** (0.0017)
Shock Up	-0.0008 (0.0024)	0.0009 (0.0020)	0.0009 (0.0020)
Cell FE	✓	✓	✓
Country-Year FE	✓	✓	✓
Dep. Var. Mean	0.08201	0.08201	0.08201
R ²	0.42102	0.42101	0.42103
Cells	10,228	10,228	10,228
Observations	255,700	255,700	255,700



Rainfall shocks G20

	Incidence (ACLED)		
	Water Discharge (1)	Water Monopolist (2)	Water Monopolist + (3)
Water Measure	0.0010 (0.0010)	0.0095 (0.0100)	0.0115 (0.0108)
Water Measure × Shock Down	0.0013*** (0.0004)	0.0218** (0.0104)	0.0386*** (0.0143)
Water Measure × Shock Up	-0.0007 (0.0005)	-0.0009 (0.0105)	-0.0027 (0.0128)
Shock Own	0.0031** (0.0015)	0.0028* (0.0015)	0.0028* (0.0015)
Shock Down	-0.0031* (0.0017)	0.0008 (0.0014)	0.0008 (0.0014)
Shock Up	0.0003 (0.0019)	-0.0023 (0.0016)	-0.0023 (0.0016)
Cell FE	✓	✓	✓
Country-Year FE	✓	✓	✓
Dep. Var. Mean	0.08201	0.08201	0.08201
R ²	0.42100	0.42100	0.42103
Cells	10,228	10,228	10,228
Observations	255,700	255,700	255,700



Water Monopolist



Water Monopolist +

