

# Natural Hazards, Growth and Risk-Transfer

## An Empirical Comparison between Risk-Transfer-Mechanisms in Europe and the USA

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## 2002 flooding in Germany and Austria

- A low penetration of flood insurance coverage (among private homeowners) ( $\approx 10\%$ )
- Governments (ad-hoc, catastrophe fund) incapable of providing sufficient relief
  - Austria:  $\approx 50\%$  of damages covered by federal relief
  - Austria: average time span between damage and transfer of funds: 85 days
- Provision of federal relief is influenced by discretionary decisions by politicians - *Rubber-boots-policies*
  - Germany: "Schroeder-Rule" financed by postponing a tax reform.
  - Austria: Reduction of public spending in other areas.

# Motivation

## Public discussion about implementing alternative (ex-ante) insurance systems

- Imperfections on market for flood insurance
- Various forms of existing mandatory insurance schemes
- Proposition: Ex-ante risk transfer mechanisms (e.g. mandatory insurance) are more efficient than ex-post policies (e.g. ad hoc governmental relief) (Kunreuther & Pauly 2006)
- "Case study evidence" - Limitation on demand side (e.g. claim processing)
- Empirical evidence missing

# Outline

- Panel-econometric analysis of the effects of floods on income
- Compare the effects of existing societal risk-transfer mechanisms against flood

## Europe

212 NUTS II - regions

Mandatory Insurance

Ad-hoc governmental intervention

## USA

3,085 counties

U.S. NFIP

Ad-hoc governmental intervention

- Presentation of results structured by sample

# Summary of Results

- Floods have a negative impact on income in flood year
- Floods have a positive impact on income in the year after the flood
- Mitigating effects of ex-ante risk-transfer mechanisms in the flood year (Europe & USA)
- Negative effects of ad-hoc governmental intervention in flood year (Europe & USA)
- NFIP counties follow a less volatile growth path in years following a flood (USA)

# Natural Hazards and Economic Development

## Impact on Economic Growth

- + (Skidmore & Toya 2002)
  - Destruction of old (less productive) technology
  - Increase in total factor productivity
- - (Rasmussen 2004 - Caribbean)

# Drawbacks of existing empirical studies

- Space:

- Analysis so far: Country-level
- Comparing a flood with the same spatial extent in the USA and Austria
- Assuming same absorptive capacity (e.g. infrastructure)

⇒ "The smaller, the better" - regional units

- Time:

- Analysis so far: Long-run
- Effect of  $x$  of disasters over  $n$  years
- Omitted variables that account for dynamics over time (e.g. economic freedom, degree of federalism)
- Higher frequency of disasters in the future? (IPCC 2007)

⇒ Analysis of short-run effects

# Disasters in an endogenous growth model

- Solow growth model and
- Economics of disaster management (Tol & Leek 1999)
- Derivation of panel-econometric growth function (Islam 1995)
- Negative effect of disaster
- Mitigating effect of risk-transfer (depending on level of coverage)
- Costs of risk-transfer (depending on coverage)



# Economic data

- 199 European regions (NUTSII) (EU15 + CZ, H, N, PL & CH)
- Yearly data 1980-2004
- European Regional Database, Cambridge Econometrics
- Eurostat
  
- 3,050 U.S. counties
- Yearly data 1970-2003
- Regional Economic Information System, BEA, U.S. Department of Commerce

# Hazard data

## 1. Historical flood events:

- 1 Europe:
  - Major flood events
  - EM-DAT, CRED Brussels
- 2 U.S.A:
  - Flood events on county level (Damage:  $> \$ 50.000$ )
  - Sheldus database, University of South Carolina

# Hazard data

Flood dummy:

- 1 "Economic damages" inaccurate, inconsistent collection methods
- 2 Disaster damages are endogenous
- 3 Exogenous variables on magnitude !?
- 4 Effects of an *average* flood

# Hazard data

## 2. Flood hazard distribution: (Robustness test)

- Magnitude of flood might differ between regions
- Controlling for regional exposure
- GIS-data on flood areas
- Calculation of regional (NUTSII or county) mean
- Cross section data! - Interaction term
- Worldbank and Columbia University (Dilley et. al. 2005)

# Risk-Transfer mechanisms

## 1. Ex-ante Risk-transfer mechanism

| Variable  | Benefits | Costs | Variation        |
|---|----------|-------|------------------|
| <b>Europe:</b><br>Mandatory insurance                       | +        | n.a.  | Countries        |
| <b>U.S.A:</b><br>National Flood Insurance<br>Program (NFIP) | +        | -     | Counties & Years |

# Risk-Transfer mechanisms

## 2. Ex-post discretionary political decisions

- No (comprehensive) data on governmental relief on regional level available
- **Rubber-boots-policies:**
  - Discretionary, "unbureaucratic" financial assistance
  - Generosity is higher in election years
  - $\approx 50\%$  of FEMA's disaster payments are politically motivated (Garrett & Sobel 2003)



Election years as empirical proxy for discretionary federal disaster relief

# Risk-Transfer mechanisms

## 2. Ex-post discretionary political decisions

| Variable                                 | Benefits | Costs                               | Variation      |
|--|----------|-------------------------------------|----------------|
| <b>Europe:</b><br>Federal Election years | +        | not directly<br>in subsequent years | Country & Year |
| <b>U.S.A:</b><br>Federal Election years  | +        | not directly<br>in subsequent years | Year           |
| Presidential Election years              | +        | not directly<br>in subsequent years | Year           |

# Empirical strategy: Europe

- Presence of lagged (endogenous) dependent variable ( $\ln y_{i,t-1}$ )
- Large number of  $N$  (counties, regions) vs. small number of  $T$
- $\Rightarrow$  Dynamic panel models
- Lags of  $Flood_{it}$ ,  $Flood * Insurance_{it}$  as additional instruments for  $(\ln y_{i,t-1})$
- Judson & Owen 1999:  $T = 24 \Rightarrow$  One-step GMM-Diff estimator (Arellano & Bond 1991)



## Effects of flood events regional GDP in Europe, GMM-DIFF-estimator, 1980-2004

| Dependent Variable $\ln y_{it}$ | 1.1                  | 1.2                  | 1.3                  | 1.4                  |
|---------------------------------|----------------------|----------------------|----------------------|----------------------|
| $\ln y_{i,t-1}$                 | 0.438***<br>(9.14)   | 0.438***<br>(9.20)   | 0.442***<br>(9.44)   | 0.437***<br>(9.11)   |
| $\ln s_{it}$                    | 0.182***<br>(6.42)   | 0.180***<br>(6.37)   | 0.181***<br>(6.33)   | 0.188***<br>(6.57)   |
| $Agriculture_{it}$              | -0.097***<br>(-5.71) | -0.096***<br>(-5.71) | -0.096***<br>(-5.44) | -0.098***<br>(-5.55) |
| $Service_{it}$                  | 0.136**<br>(2.14)    | 0.137**<br>(2.12)    | 0.160**<br>(2.27)    | 0.154**<br>(2.34)    |
| $Flood_{it}$                    | -0.004*<br>(-1.78)   |                      |                      | -0.006**<br>(-2.36)  |
| $Flood_{i,t-1}$                 |                      | -0.000<br>(-0.08)    |                      |                      |
| $(Flood * Exposure)_{it}$       |                      |                      | -0.001***<br>(-3.09) |                      |
| $(Flood * Insurance)_{it}$      |                      |                      |                      | 0.007*<br>(1.75)     |
| Year FE                         | Yes                  | Yes                  | Yes                  | Yes                  |
| Number of obs.                  | 4,277                | 4,277                | 4,277                | 4,277                |
| Number of Instruments           | 194                  | 194                  | 184                  | 205                  |
| Prob > Chi <sup>2</sup>         | 0.000                | 0.000                | 0.000                | 0.000                |
| Sargan                          | 0.208                | 0.147                | 0.191                | 0.264                |
| AR(1)                           | 0.000                | 0.000                | 0.000                | 0.000                |
| AR(2)                           | 0.244                | 0.246                | 0.246                | 0.242                |

## Marginal effects of flooding and risk-transfer mechanisms European regions

| <b>Marginal effect of<br/>flood disasters</b> | <i>Flood<sub>it</sub></i><br>M.E.<br>(Std.Err.) | <i>Flood<sub>i,t-1</sub></i><br>M.E.<br>(Std.Err.) | <i>Flood * Exp<sub>it</sub></i><br>M.E.<br>(Std.Err.) | <i>Flood<sub>it</sub></i><br>M.E.<br>(Std.Err.) |
|---|---|--|---|---|
| In regions without<br>risk-transfer           | -0.004*<br>(0.002)                              | -0.000<br>(0.002)                                  | -0.001***<br>(0.000)                                  | -0.006**<br>(0.003)                             |
| In regions with<br>risk-transfer              |   |  |   | 0.000<br>(0.003)                                |

## Marginal effects of flooding and election years in European regions

| Marginal effect of<br>flood disasters | $Flood_{it}$       | $Flood_{it}$        | $Flood_{i,t-1}$      |
|---------------------------------------|--------------------|---------------------|----------------------|
|                                       | M.E.<br>(Std.Err.) | M.E.<br>(Std.Err.)  | M.E.<br>(Std.Err.)   |
| In years without federal<br>elections | -0.004*<br>(0.002) | -0.003*<br>(0.003)  | 0.004**<br>(0.002)   |
| In years with federal<br>elections    |                    | -0.007**<br>(0.003) | -0.009***<br>(0.003) |

# Empirical strategy: USA

- Presence of lagged (endogenous) dependent variable ( $\ln y_{i,t-1}$ )
- Large number of  $N$  (counties, regions) vs. small number of  $T$
- $\Rightarrow$  Dynamic panel models
- Lags of  $Flood_{it}$ ,  $Flood * Insurance_{it}$  as additional instruments for  $(\ln y_{i,t-1})$
- Judson & Owen 1999:  $T = 30 \Rightarrow$  First-Difference estimator  
Anderson & Hsiao (1981)

# Empirical strategy: USA

- Income and Participation decision NFIP - subject to reversed causality
- Endogenous treatment (Heckman 1978)
  - 1 Probit regression on participation decision for every year
  - 2 Calculation of inverse Mill's ratio
  - 3 Mill's ratio as additional instrument for NFIP and Interaction term

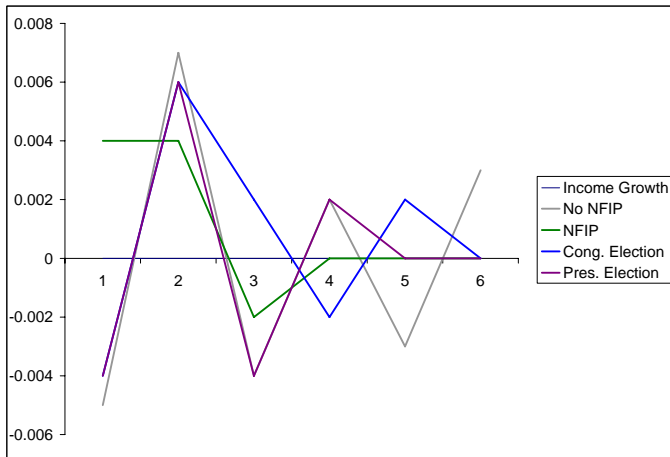
## The effects of floods on personal income in U.S. counties

| <i>Dependent Variable</i>  | FE                   | IV-FE                | AH-FD                |
|--|----------------------|----------------------|----------------------|
| <i>lny<sub>it</sub></i>  | 3.1                  | 3.2                  | 3.3                  |
| <i>lny<sub>i,t-1</sub></i>                                       | 0.658***<br>(0.006)  | 0.801***<br>(0.007)  | 0.127***<br>(0.047)  |
| <i>ln(Agric. Inc.)<sub>it</sub></i>                              | 0.025***<br>(0.001)  | 0.023***<br>(0.001)  | 0.035***<br>(0.001)  |
| <i>ln(Pop. density)<sub>it</sub></i>                             | 0.013***<br>(0.002)  | -0.002<br>(0.002)    | 0.047<br>(0.030)     |
| <i>BEA Corr.</i>   | 0.012***<br>(0.001)  | 0.015***<br>(0.001)  | 0.009***<br>(0.002)  |
| <i>Flood<sub>it</sub></i>  | -0.005***<br>(0.001) | -0.005***<br>(0.001) | -0.004***<br>(0.001) |
| <i>(Flood * Insurance)<sub>it</sub></i>                          | 0.003***<br>(0.001)  | 0.002***<br>(0.001)  | 0.010***<br>(0.003)  |
| <i>(NFIP)<sub>it</sub></i>                                       | 0.002**<br>(0.001)   | 0.002**<br>(0.001)   | -0.096***<br>(0.007) |
| <i>County FE</i>   | Yes                  | Yes                  | No                   |
| <i>Year FE</i>   | Yes                  | Yes                  | Yes                  |
| Number of obs.   | 92,407               | 86,444               | 67,350               |
| Prob >Chi <sup>2</sup>   | 0.000                | 0.000                | 0.000                |
| R <sup>2</sup>   | 0.984                |                      |                      |
| Number of Instruments  |                      | 38                   | 34                   |
| Hansen J-Stat  |                      | 0.662                | 0.213                |
| Kleinbergen-Paap-Stat  |                      | 0.000                | 0.000                |
| 1 <sup>st</sup> Stage F-Stat. <i>lny<sub>i,t-1</sub></i>         |                      | 121.83***            | 116.03***            |
| 1 <sup>st</sup> Stage F-Stat. <i>(NFIP)<sub>it</sub></i>         |                      |                      | 178.00***            |
| 1 <sup>st</sup> Stage F-Stat. <i>(Flood * Ins.)<sub>it</sub></i> |                      |                      | 1,845.43***          |

## Marginal effects of floodings and the NFIP in U.S. counties

| <b>Marginal effect of flood disasters</b> | <i>Flood<sub>it</sub></i><br>M.E.<br>(Std.Err.) | <i>Flood<sub>i,t-1</sub></i><br>M.E.<br>(Std.Err.) | <i>Flood * Exp<sub>it</sub></i><br>M.E.<br>(Std.Err.) | <i>Flood<sub>it</sub></i><br>M.E.<br>(Std.Err.) |
|---|---|--|---|---|
| In regions without risk-transfer          | -0.004***<br>(0.001)                            | 0.007***<br>(0.001)                                | -0.001***<br>(0.000)                                  | -0.005**<br>(0.001)                             |
| In regions with risk-transfer             |   |  |   | 0.002***<br>(0.001)                             |

## Deviation from growth-path by risk-transfer system over time (U.S. sample)





# Future Research

- Dynamic-Spatial-Panel estimates - Effects of a flood in neighboring regions
- Decompose benefits into:
  - ① Pre-disaster: Incentives for prevention
  - ② Post-disaster: More efficient relief
- Costs of ex-ante risk-transfer mechanisms - Cross section (Diff-in-Diff)

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