# Vulnerability and Adaptation to Drought: Economic Impact Scenarios\*

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## Objectives – Outline of the Presentation

- Drought and Economy Perspective: AP Case Study
- Methodological Framework
- Analyzing Vulnerability to Drought
- Economic Impact of Drought
- Conclusions

## **Case Study : Erstwhile Andhra Pradesh**

- Telangana (9 districts)
  - Three districts (Rangareddi; M'nagar and Nalgonda)
- Andhra Pradesh (13 districts)
  - Four districts in Rayalaseema region (Anantpur; Chittoor, Cuddapah and Kurnool)
- Study Scope (8/23 districts)
- Rain shadow districts
  - Groundwater based economy
  - Home to 35% (30M) of total population
  - Majority (70%) is dependent on agriculture





## **Drought and Economic Perspective**

## Rainfall and economic performance in Andhra Pradesh



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## **2002 Drought Effect on Agriculture**

• 2002 drought on agriculture and its contribution to GSDP



Total contribution of 21.02% in Gross State Domestic Product

Total contribution of 15.34% in Gross State Domestic Product



- Develop a framework for simulating long-term impacts of drought in drought-prone areas and at state levels;
- Conduct risk assessments of the impacts under different scenarios; and
- Assist the GoAP in development of a strategy for adapting to drought and water deficits



- Outputs (EP curve, average annual, return period)
  - Direct losses
    - Agriculture production, value
  - Economic losses
    - GVA, GDP
  - Fiscal losses
    - Revenue, expenditure
  - Drought maps
    - Hazard based on index
    - Risk based on yield/production loss
- Deliverables
  - Report/Publication



## **Probabilistic Drought Risk Assessment Model**

## Hazard and Vulnerability Module

- Mandal/Block level rainfall data used
- Generated stochastic rainfall events
- To identify drought events
- Vulnerability : EPIC\* simulated yield
  - Generated at block level; averaged for district
  - Management inputs taken from ANGRAU
- Observed/reported yield
  - Comparison between simulated & reported
  - For example:
    - » 1997, 2002 drought years
    - » 1996, 1998 normal years
    - » Anantapur and Mahboobnagar

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#### \*EPIC: Crop Growth Simulation Model



## Hazard: Simulation of Drought Events



Seasonal Normal Rainfall

Anantapur District EP (Historical Vs. Modeled)

Validation of SPI for Anantapur

| _            |       |          | -      | -       |     |
|--------------|-------|----------|--------|---------|-----|
| District     | Minor | Moderate | Severe | Extreme | Any |
| Anantapur    | 6.1   | 7.8      | 41.7   |         | 3.2 |
| Prakasam     | 6.8   | 8.9      | 29.4   |         | 3.4 |
| Rangareddy   | 7.5   | 7.7      | 35.7   | 500.0   | 3.4 |
| Nalgonda     | 7.4   | 6.8      | 41.7   |         | 3.3 |
| Chittoor     | 6.5   | 9.6      | 38.5   | 500.0   | 3.5 |
| Cuddapah     | 6.3   | 9.1      | 35.7   | 250.0   | 3.3 |
| Kumool       | 6.8   | 7.9      | 38.5   | 500.0   | 3.3 |
| Mahabubnagar | 6.8   | 7.5      | 41.7   | 500.0   | 3.3 |
| 8 districts  | 6.8   | 8.2      | 38.5   |         | 3.3 |

 Standardized Precipitation Index (SPI) is one of the means used fc defining and monitoring drought.

- Its an index based on the probability of precipitation for any time scale.
- It determines the rarity and severity of a drought at a given time scale
- Advantages: developed for any regions/temporal/spatial

Simulated Return Periods (in Years); however, it defers at block level

**WORLD BANK GROUP** Note: Model simulations based on historical data.

#### **Review of near real time Drought scenario**



The average yield and planting area (resolution: block/mandal level)

 $\checkmark$  each of the simulated events

- The average yield of five crops (JO, MA, GN, SU, and RI)
  ✓ For category of drought is determined with the help of EPIC model.
- EPIC runs are made at block/mandal level for

✓ selected events (10 numbers) representing different categories of drought.

The events are selected from the 500-year event set
 ✓ for every block to represent each of the drought categories
 ✓ based on a representative SPI value.



## **Exposure: Computation of yields and production at district level**

#### **Planting Area Model:**

- GCA, GIA, GrfA versus current year monsoon strike date
- Change in GCA, GIA, and GrfA over previous year with change in rainfall over previous year.





## **Exposure and Vulnerability Module (2)**

#### Impact of Severe Drought on Yield (% Decrease with Respect to Normal Yield) RMSI 😂 RMSI 🧐 a world of solution livering a world of solution Impact of Severe Drought on Yiel NORMAL YEAR AVG YIELD MAIZE (Reduction w.r.t normal) **MAIZE (Tonnes per hectare)** Less than 0.5 Less than 5% 0.5 to 1.0 5% to 10% 1.0 to 2.0 10% to 30% 2.0 to 3.0 30% to 50% 3.0 to 4.0 50% to 70% 4.0 to 5.0 5.0 to 6.0 **70% to 90%** Greater than 6.0 90% to 100% Crop Not Grow n all others



Production associated with the categories of drought at the block, district and combined levels.

- Production is computed for each of the 500 events at the block-level as
  - Production=Planted area x Average yield.
  - Block-level production is then summed up
  - Events categorized as normal year in the 500-year event set at the corresponding (district or state) level.
- % loss in production for each event and crop is then calculated as:
  - % Loss in Production=100 x (Average Normal Year Production – Production for the event) / Average Normal Year Production



|             | Ananthapur       | Mahbubragar      | Kumool | Cuddapah | Chittoor | Prakasam | Rangareddy | Nalgonda |
|-------------|------------------|------------------|--------|----------|----------|----------|------------|----------|
| Normal      | -                | _                |        | -        |          |          |            | -        |
| (MT/Ha)     | 2.87             | 2.15             | 2.59   | 2.73     | 2.86     | 3.10     | 237        | 2.69     |
| Yield losse | s in drought ye: | ars (% normal yi | elds)  |          |          |          |            |          |
| Minor       | 14%              | 10%              | 13%    | 11%      | 10%      | 10%      | 19%        | 8%       |
| Moderate    | 27%              | 19%              | 32%    | 21%      | 18%      | 19%      | 24%        | 16%      |
| Severe      | 45%              | 26%              | 62%    | 31%      | 35%      | 33%      | 31%        | 29%      |

Rice Yields in Normal Years and Yield Losses in Drought Years

- Loss of VOP of the eight drought-prone districts is defined as
  - the difference between the VOP of the five crops during a normal year and the VOP during a drought year.
  - the eight districts faced a loss in VOP due to drought every 2 to 3 years (2.5 years on average).
- The VOP loss is as high as over 15% once every 10 years on average and exceeds 25% once every 25 years





- The AAL of output due to exposure to drought
  - 5% (signifcant loss) assuming no changes in the current cropping pattern.
  - The AAL 6 % in the worst affected Anantapur, followed by Mahabubnagar, and others
- There were further variations within districts, and across blocks.
- For small and marginal farmers, even a 10% or 5% decrease in output could mean falling below the poverty line.





Average Annual Loss of Value of Production Output, by District

Reducing Cultivable Rice Area in Anantapur: VoP Loss Exceedance Probability Curve

- Case 0 a typical "real-life" situation during the years of normal rainfall or minor drought.
- Case 1 single irrigation of rain-fed crops at the flowering stage or its equivalent
- Case 2 first irrigation as above plus second irrigation at the time of yield (grain formation).





#### Reducing Cultivable Rice Area in Anantapur: VoP Loss Exceedance Probability Curve

- The AAL gain was estimated at 32% under the single irrigation (Case 1)
- AAL gain was 47% under the double irrigation (Case 2)
- Partially reallocating water from rice cultivation to life-saving irrigation to less water-intensive crops would *reduce by half the AAL* during the drought years
- Thus *increase the all-year average annual crop production value* by one-third for single irrigation and by almost half for double irrigation.





## **Economic Assessment: Structure of AP Economy**

- Structure defined
  - in terms of gross value added (GVA)
  - in various sectors and
  - Interrelations among them
- Primary sector
  - Agriculture, livestock, forestry, fishing, mining
- Secondary sector
  - Manufacturing, electricity, water supply, construction
- Tertiary sector
  - Trade, real estate, railways, communication, banking, public admin, transport, other services

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Sector-wise Gross Value Added (GVA) Time Series, 1980–2003, 1993–94 Constant Prices

## **Economic Assessment: Background Data**

Method: Seemingly unrelated regression (SUR)

#### Macro Model: Specification

- Model preliminary specification
  - $\ln PGVA_t = 11.45 + 0.40 \ln PCFC_t + 0.72 \ln YIELD_t$ (R<sup>2</sup> = 0.97)
  - $\ln \text{SGVA}_{t} = 0.71 \ln \text{SCFC}_{t} + 0.37 \ln \text{AGVA}_{t-1}$ (R<sup>2</sup> = 0.84)
  - $\ln \text{TGVA}_{t} = 1.33 \ln \text{TCFC}_{t} 0.12 \ln \text{AGVA}_{t-1}$ (R<sup>2</sup> = 0.98)
    - » 'en' means natural logarithm
    - PGVA<sub>t</sub>, SGVA<sub>t</sub> and TGVA<sub>t</sub> mean primary, secondary and tertiary sectors' gross value added(GVA), in
    - year t, respectively
    - » AGVA<sub>t-1</sub> means last year's agricultural GVA
    - PCFC<sub>t</sub>, SCFC<sub>t</sub> and TCFC<sub>t</sub> mean the consumption of fixed capital(CFC), in year t, in the primary,
    - secondary and tertiary sectors, respectively.
    - YIELD<sub>t</sub> is the agricultural yield in year t





#### Sectoral GVA contributions

## **Economic Assessment: Input-Output Model**

- All India I-O table available for 1998-99
- AP I-O table prepared from the all India table
- AP I-O table aggregated from 115 sectors to 19 sectors
- The Final Demand considered ( PFCE,Exp/Imp)
- Output multipliers estimated
- Employment coefficients estimated

## Employment Multiplier

- Employment coefficients
  - Provides the number of workers required to produce Rs.1 lakh value of output
  - For example, to produce Rs. 1 lakh value of agricultural output 7.3 workers are required
- Employment coefficients will be used to calculate employment multipliers
  - It measures the total change in employment in the economy for a unit change in employment in a particular sector.

| Commodity                  | Employment<br>Coefficients |
|----------------------------|----------------------------|
| Agriculture                | 7.31                       |
| L&F&L                      | 0.28                       |
| M & Q                      | 0.47                       |
| Food Products              | 1.00                       |
| MAN (1)                    | 2.59                       |
| MAN (2)                    | 0.14                       |
| Construction               | 0.86                       |
| EGW                        | 0.08                       |
| Railway transport services | 0.32                       |
| Ser(1)                     | 0.99                       |
| B&I                        | 0.15                       |
| SER (2)                    | 0.85                       |



#### **Economic Impact of Drought at the State Level**

#### • Assessment of Direct and Indirect Loss Potentials: Benchmark Case





Sector-wise Gross Value Added (GVA) Time Series, 1980–2003, 1993–94 Constant Prices

## Average Annual Loss as % of Gross Value Added due to Droughts

- The AAL in GVA for the overall state economy is estimated at a very modest 0.2%, jumping to over 1% for the agriculture sector.
- The largest average damage appears to be caused by moderate droughts, which contribute almost 50% to the AAL in the agricultural sector

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Sector-wise Gross Value Added (GVA) Time Series, 1980–2003, 1993–94 Constant Prices

- In a minor drought, average loss is estimated
  - > 3% of agriculture GVA
  - < 1% of livestock GVA.
- In moderate drought:
  - ~ 4% of agriculture GVA
  - ~ 1% of total GVA.
- During severe drought,
  - 8% in the agricultural sector
  - 2% for the whole economy;

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• Tertiary sector, however, showed a gain of 2%





## Economic Losses, in Sectoral GVA, Caused by Droughts - EP Curve

- A moderate drought event (occurring 1-in-10 years) cause:
  - 4% GVA loss in the agricultural sector,
  - 1.5% GVA loss in the secondary sector, and
  - 1% GVA loss in the livestock sector.
- During severe drought,
  - increase to 7% for the agriculture sector,
  - 3% for the secondary sector, and
  - 2% for the livestock sector.
- Per GVA analysis shown
  - secondary sector is more exposed to drought due to its inter-dependence on the agriculture sector than the livestock sector





## Simulating the Impact of Structural Changes in the AP Economy (1)

- Resilience to drought is examined through scenarios in the macro-econometric model
  - The baseline Case 0 scenario represents the current economic structure (in terms of GVA).
  - Alternative scenarios, Cases 1 and 2, assume that the share of the agricultural sector decreases,
- The share of the tertiary sector increases significantly

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| *<br>Scenario | Agriculture | Livestock | Others | Primary | Secondary | Tertiary      |
|---------------|-------------|-----------|--------|---------|-----------|---------------|
| Case 0        | <b>1</b> 4% | 6%        | 6%     | 26%     | 25%       | sector<br>49% |
| Case 1        | 7%          | 6%        | 6%     | 19%     | 21%       | 60%           |
| Case 2        | 4%          | 6%        | 6%     | 16%     | 17%       | 6/%           |

Sector-wise Gross Value Added (GVA) Time Series, 1980–2003, 1993–94 Constant Prices

- The maximum possible impact due to a major drought is
  - below 1% of total GVA in Case 1 and
  - well below 0.5 % in Case 2
- The macro-economic impact of drought events
  - is limited at the state level
  - in terms of loss in the total GVA

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Sector-wise Gross Value Added (GVA) Time Series, 1980–2003, 1993–94 Constant Prices

- Human and social costs
  - ✓ Remain devastating for millions of people
  - ✓ Effect at the farm level is significant
  - ✓ For small and marginal a loss in output value of 5-10%, fall below the poverty line
- Location differences
  - ✓ Vary greatly across locations and crops on drought severity
  - ✓ Different crops can be particularly vulnerable in different districts
  - ✓New approaches are needed to adapt to frequent droughts



## **Key Findings**

- Impact on agriculture sector
  - Livelihood, income and employment are directly affected
  - Employment loss for 2002–03 in the agricultural VOP is estimated > 44 lakhs (4.4 Million people).
  - Moderating loss of employment remains a key challenge
- Impact on Households
  - HH losses to drought are varied; tailored assistance would be needed.
- Macroeconomic impact

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- Less impact in AP due economy shifts from Ag to other sectors
- Increased GVA from Manufacturing (secondary) and Service (tertiary) sectors
- Shift to manufacturing and service could be a powerful drought mitigation strategies

## Methodology development

 ✓ developed a robust analytical framework for simulating the longterm impacts of drought at the micro [drought-prone areas] and macro [state] levels);

## • Findings and observations for analysis

✓ conducted a quantitative probabilistic risk assessment of the impacts under different scenarios; and

How does EA framework help to proactive drought action

✓ Assisted the GoAP in the development of a futuristic and anticipatory strategy for adapting to frequent drought events and conditions of water deficit



# Thanks!

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## **Crop Yield Changes under Climate Change Scenarios: Results**

## • Climate Change Scenario 1:

- Maximum temperature increases by 2°C
- Minimum temperature increases by 4°C
- Annual rainy days decrease by 5 percentage points
- Atmospheric carbon-dioxide at 550 ppm

## • Climate Change Scenario 2:

- Maximum temperature increases by 2°C
- Minimum temperature increases by 4°C
- Annual rainy days decrease by 5 percentage points
- Cumulative June–September (monsoon) rainfall decrease by 10 percentage points
- Atmospheric carbon-dioxide at 550 ppm



|                 |                      | Average crop yield change with<br>respect to baseline |      |  |
|-----------------|----------------------|---|------|--|
| Crops           | Baseline<br>scenario | CCS1  | CCS2 |  |
| Rice            | 2.59 t/ha            | -9%   | -8%  |  |
| Groundnut       | 0.97 t/ha            | 2%  | 0%   |  |
| Jowar (Sorghum) | 0.87 t/ha            | 3%  | 0%   |  |
| Sunflower       | 0.51 t/ha            | 10%   | 9%   |  |
| Maize           | 2.10 t/ha            | 3%  | 0%   |  |