

# Price Dynamics in Storage Models

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# Storage in a Markov Economy

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# What is stored?

## Commodities and others

- Agricultural products
  - Soy, coffee, cocoa, palm oil, sugar, wheat, corn, etc.
- Mineral products
  - Oil, natural gas
  - Metals
- Water
- Rights

# Basic competitive storage logic

- $p_t > Ep_{t+1}$  implies no storage  $S_t = 0$

- Storage  $S_t > 0$  implies  $p_t = E p_{t+1}$

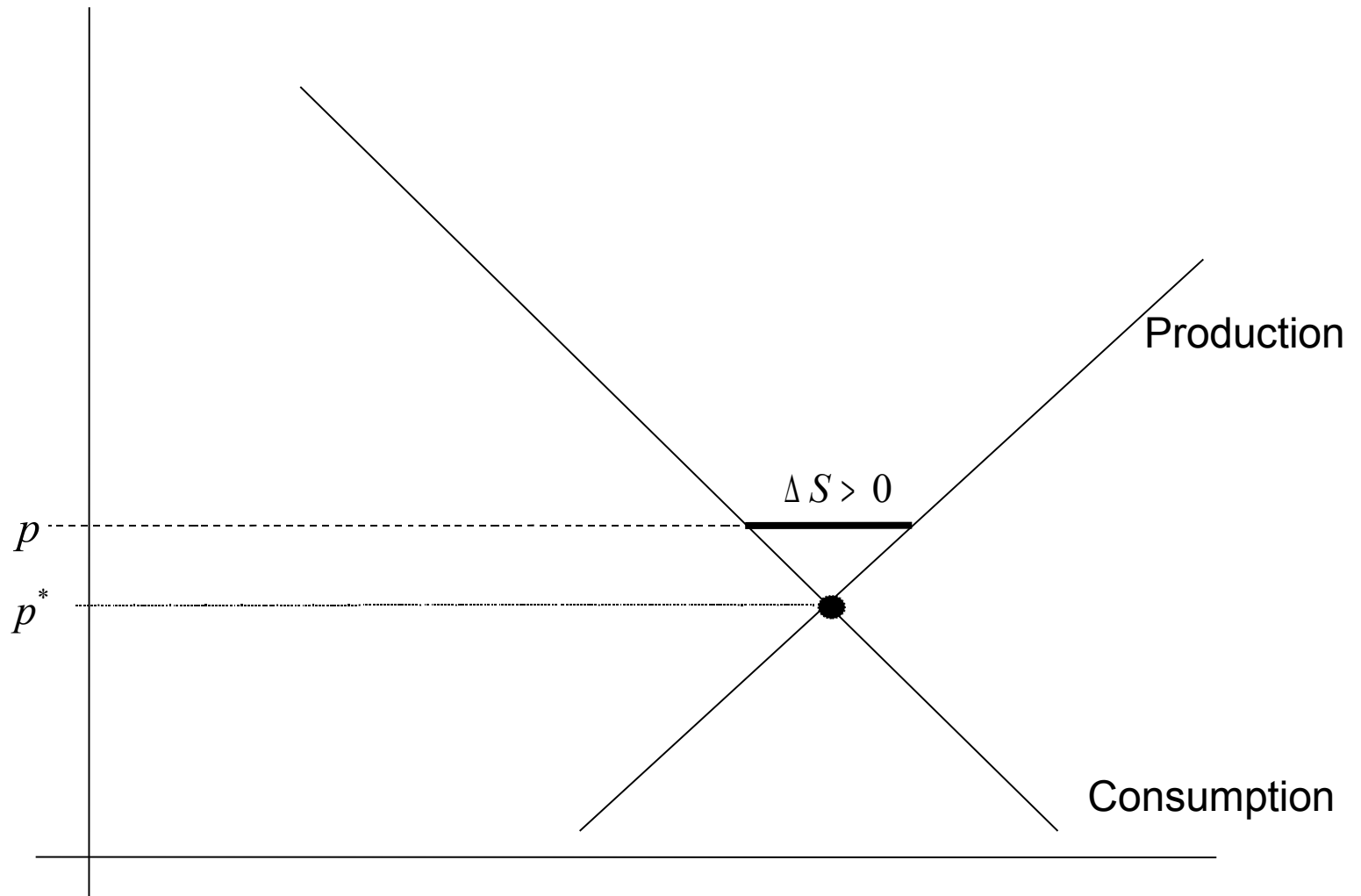
- *Variations*

$$p_t + c = Ep_{t+1}$$

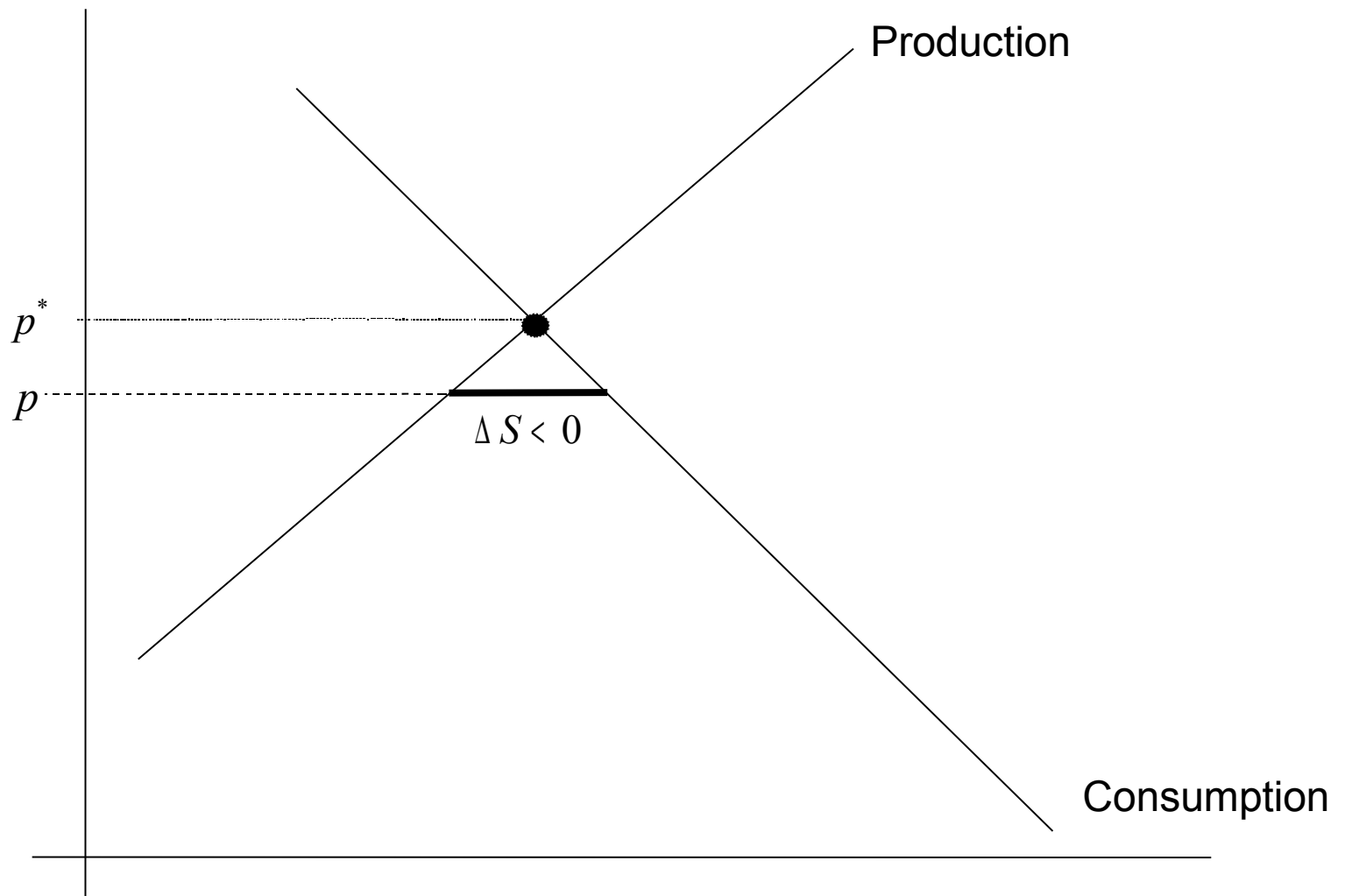
$$p_t = \frac{1}{1+r} Ep_{t+1}$$

$$p_t = \frac{1-d}{1+r} Ep_{t+1}$$

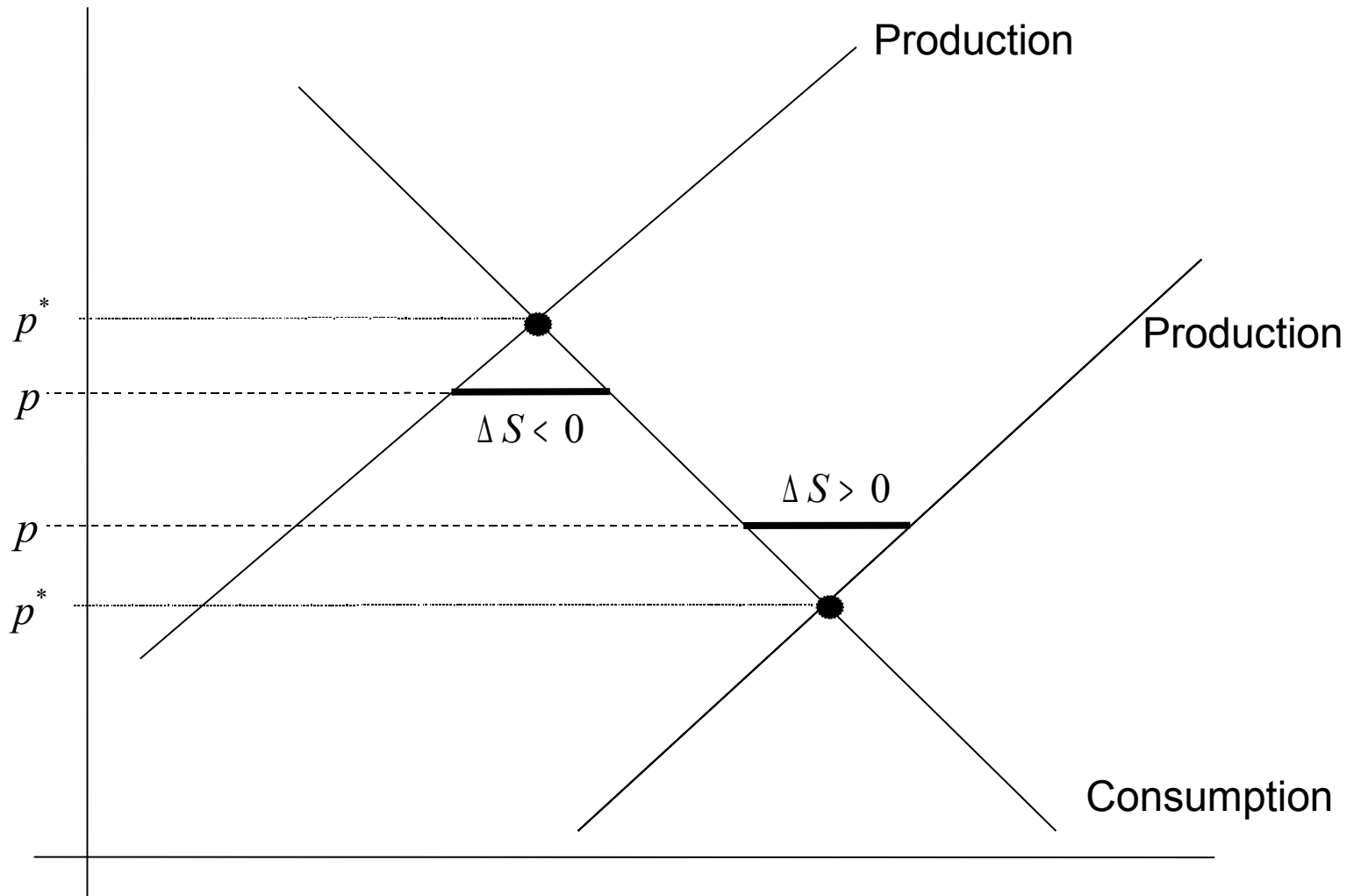
# Excess supply function $\Delta_\sigma[p] = \Delta S$



# Excess supply function $\Delta_\sigma[p] = \Delta S$



# Random factor $\sigma$



# The equilibrium

- Fundamental data  $\Delta_\sigma[p]$  where  $\sigma$  follows some exogenous process
- Equilibrium  $S_0$  and  $p_t(S, \sigma, X)$ 
  - Conservation of matter  $\Delta_{\sigma_t}[p_t(S_t, \sigma_t, X_t)] = S_{t+1} - S_t$
  - Rational expectations
  - No arbitrage = CRS storers
  - No negative storage constraint
- Generally Markov (time is eliminated from  $p(\cdot)$ )
- No bubbles

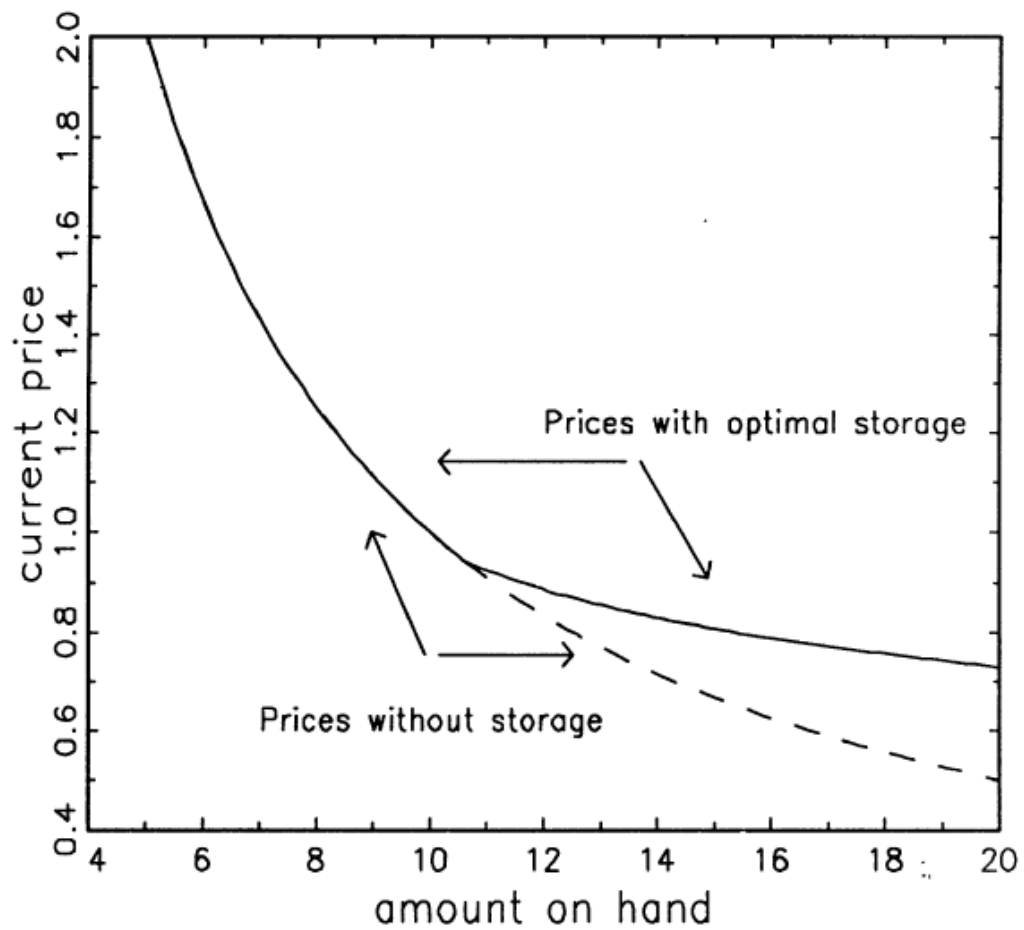


FIGURE 2  
Prices with and without storage

From Deaton-Laroque RES92



# Randomness source $\sigma$

- Some combination of fundamental consumption and production functions
- Typical cases
  - iid shocks, stock only state var.
  - correlated shocks
  - Tb explored: with some capital dynamics (goes further with endogeneization)

# Statistics

- Stationary nonlinear process
- Pure theory
  - price a function of former shocks
  - iid case: future price a (random) fonction of current price
- If only prices are observed
  - iid case: future price predicted with current only
    - Prices are serially, NL correlated
  - AR shocks: 2 lagged prices
  - etc.

## Deaton-Laroque (RES96, JPE96, JAppE97)

- Correlation puzzle: yearly prices are highly correlated
- Does the basic storage model explain well this fact?
  - iid version: not quite
  - AR version: yes but
    - with high *exogenous* correlation
    - does not perform so much better than (linear) AR
- Ways out
  - Information on stocks
  - Capital dynamics
  - Spot and future prices

## Routledge-Seppi-Spatt (JF00)

- Discrete time
- Finite set of possible shocks+Markov
- Focus on relationship between spot and future prices
  - Contango
  - Backwardation
- Convenience yield
  - Fully endogenized here (embedded option)
  - Alternative: not so convincing
- Samuelson effect

# Natural Gas

- Results from Creti (U Bocconi) and Villeneuve
- Limited diversification in Europe (Russia, Norway, Algeria)
- Precautionary Storage: supply disruptions
  - Exogenous
  - Discrete
  - Reversible

# Our approach

- Dynamic model under perfect competition
  - Equilibrium = Optimum
  - Notion of target stock
  - Optimal stockpiling and drainage rules
  - Evaluation of “simple” suboptimal policies
  - “Statistical” properties of the equilibrium

# Model

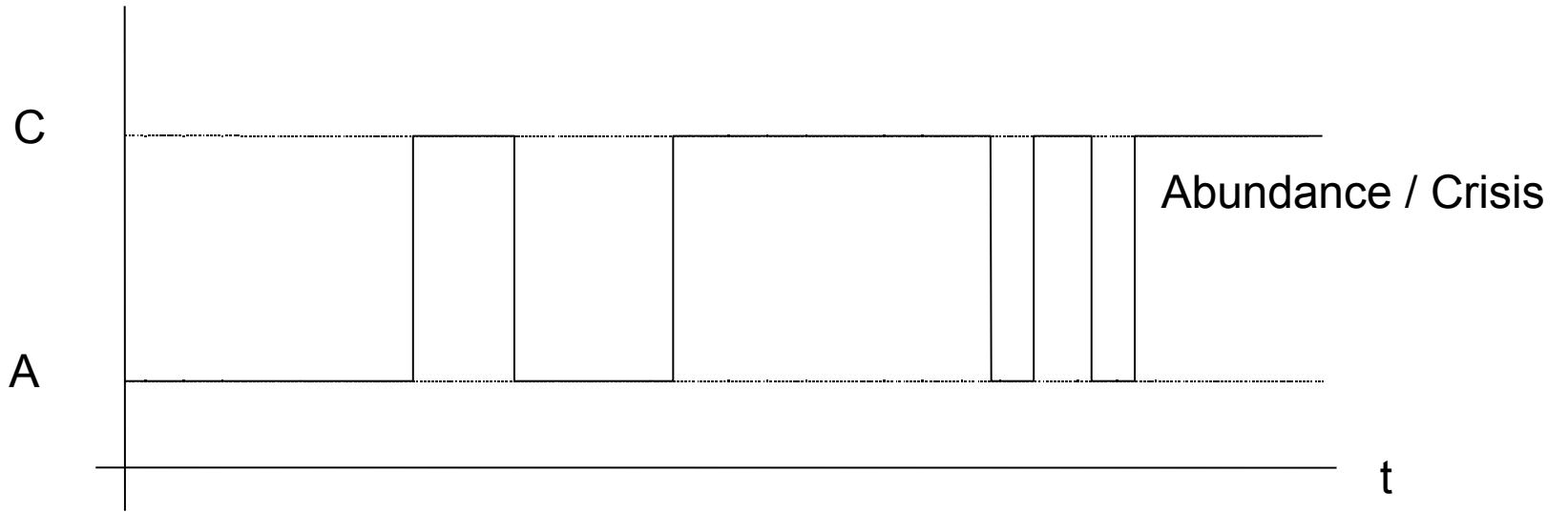
- Continuous time
- Exogenous random discrete state variable
  - Abundance  $A$
  - Crisis  $C$
- Endogenous continuous state variable
  - $S =$  Stocks, which depends on
    - Stockpiling rule
    - History

# Random process

- $A \longrightarrow C$  : Bernoulli process  
Jump probability between  $t$  and  $t+dt = \lambda_C dt$
- $C \longrightarrow A$  : idem  
Jump probability between  $t$  and  $t+dt = \lambda_A dt$
- Unconditional Prob. of state C :  $\lambda_C / (\lambda_A + \lambda_C)$
- Unconditional Prob. of state A :  $\lambda_A / (\lambda_A + \lambda_C)$



# A possible history



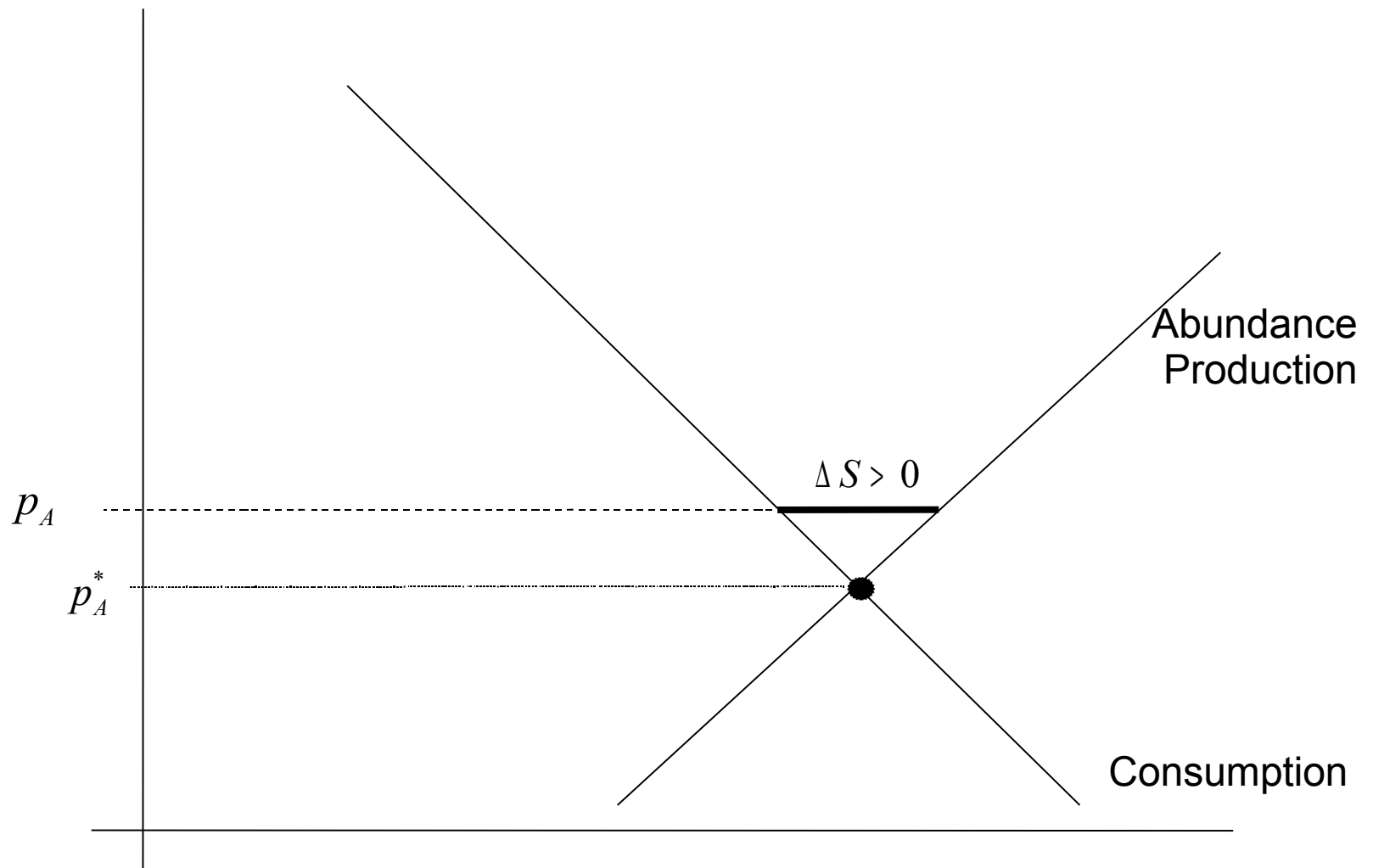
# Supply and demand

- $p$  current price
  - Current final consumption and production only depend on  $p$   
[strong assumption]
- Short term
  - Supply = Demand  
meaning
  - Demand = Final consumption + Stockpiled commodities**
  - Supply = Production + Released commodities**
- Can be summarized with **Excess** supply functions

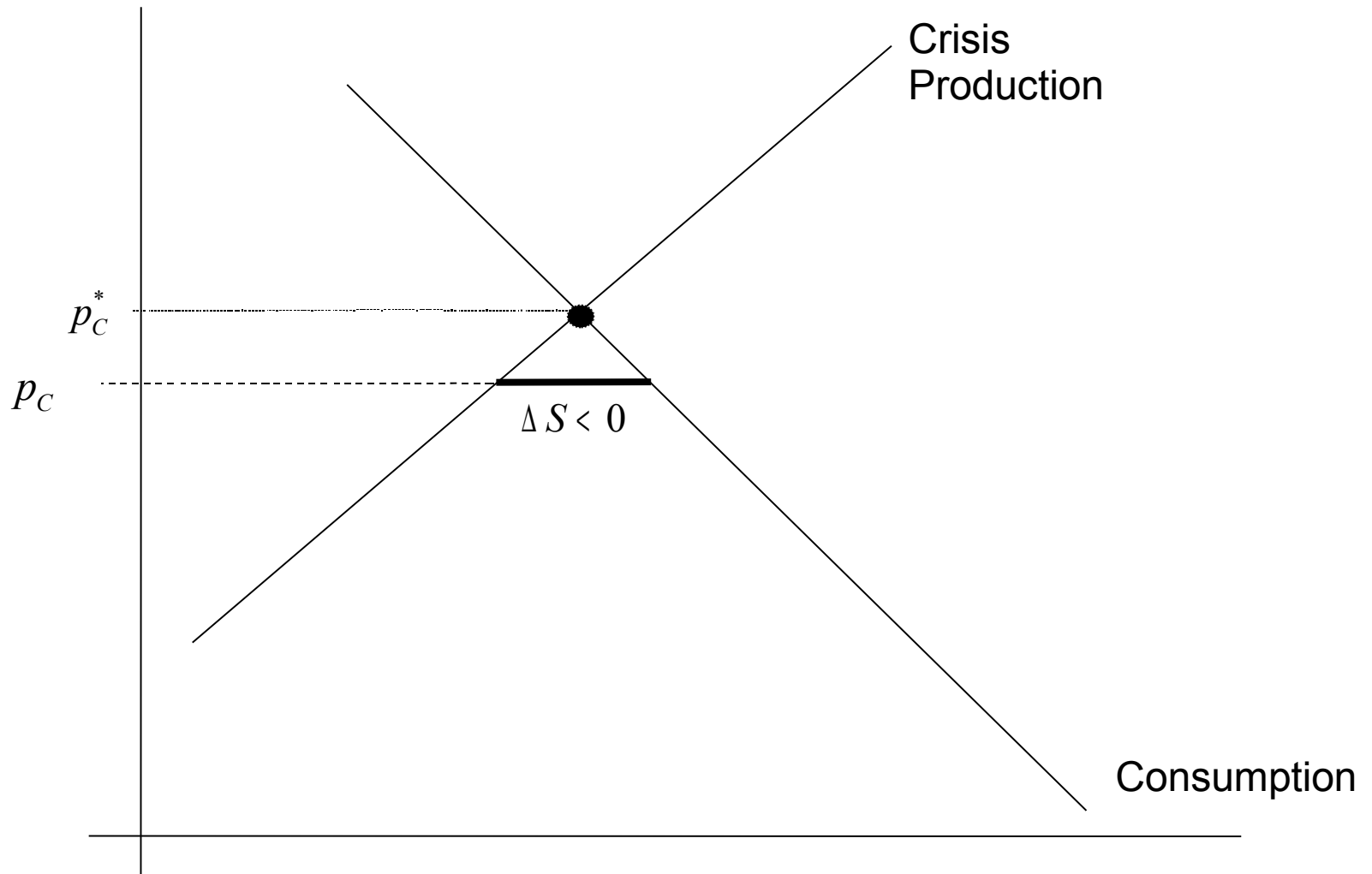
**$\Delta_C[p]$  = Stock variation if C and price  $p$**

**$\Delta_A[p]$  = Stock variation if A and price  $p$**

# Excess supply: Abundance



# Excess supply: Crisis



# Equilibrium

- Conservation of matter
- No negative stocks
- Price taking behavior
- Competitive stockholding
- Rational expectations

## Markovian equilibrium

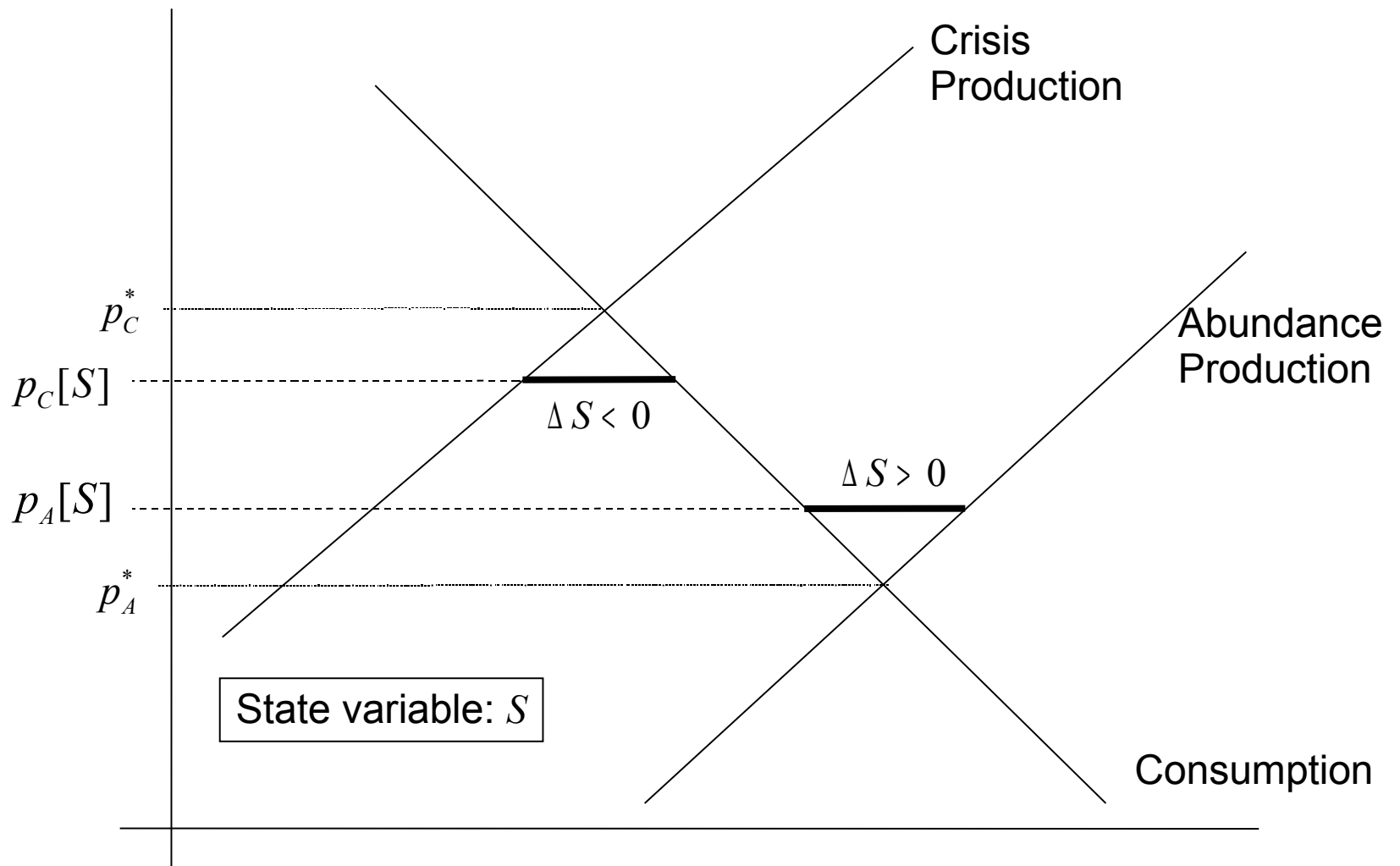
- What matters is  $S$  and  $A/C$  (not time per se)
- Equilibrium is a pair of functions

$$p_C[S] \text{ and } p_A[S]$$

- Causes stock dynamics

$$\Delta_A[p_A[S]] \text{ and } \Delta_C[p_C[S]]$$

# Supply shock



# Differential equations

- Risk neutral storers bet on expected gains and losses

$$p_A[S] + c dt = (1 - r dt) [(1 - \lambda_C dt) p_A[S + dS] + (\lambda_C dt) p_C[S + dS]]$$

with

$$dS = \Delta_A [p_A] dt$$

+ similar equation for crisis price.

We eliminate time and we get:

$$\begin{cases} \Delta_A [p_A] \cdot \frac{dp_A}{dS} = (r + \lambda_C) p_A - \lambda_C p_C + c \\ \Delta_C [p_C] \cdot \frac{dp_C}{dS} = (r + \lambda_A) p_C - \lambda_A p_A + c \end{cases}$$

A nonlinear system +  
 $p_C[0] = p^* C$   
 $p_A[S^*] = p^* A$   
 $S^*$  is the target stock

- No explicit solution
  - non linear system
  - Bounded Value Problem
  - boundary conditions at singular points
  - target stock is implicit
- Propositions
  - existence
  - uniqueness
  - algorithm for resolution
  - comparative statics



# Parameters

Table 1: Parameter values				
Financial and physical costs	$r = .1$	$c = .1$		
Linear excess supply	$\beta_C = 1$	$p_C^* = 5$	$\beta_A = 5$	$p_A^* = 1$
Rates of jumps	$\lambda_C = 1$	$\lambda_A = 1$		

- Stocks variations

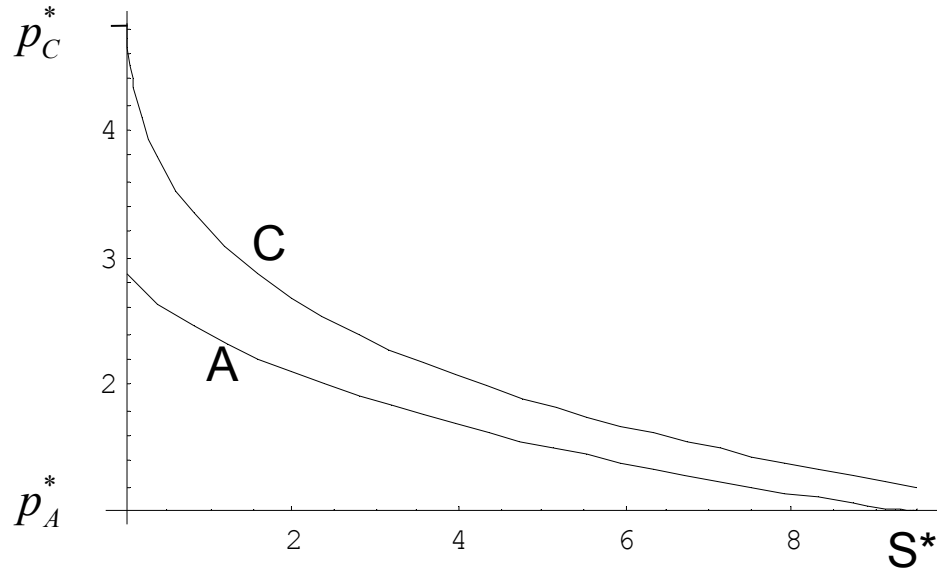
$$\Delta_C[p] = p - 5 < 0$$

$$\Delta_A[p] = 5(p - 1) > 0$$

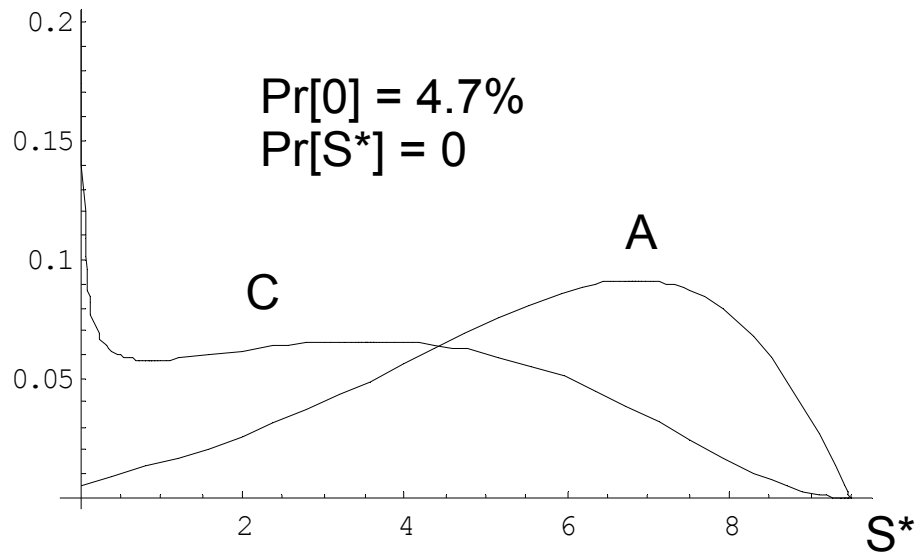
=> Price between 1 and 5

=>  $S^* = 9.5$

# Equilibrium



Prices as  
a function of the stock



State densities as  
a function of the stock

# Solving the equations

- Change of variables: integrate LHS in ODE

$$p_A(S) \rightarrow x_A = \int \Delta_A [p_A(S)] \cdot \frac{dp_A(S)}{dS}, \quad x_A(S^*) = 0$$

$$p_C(S) \rightarrow x_C = \int \Delta_C [p_C(S)] \cdot \frac{dp_C(S)}{dS}, \quad x_C(0) = 0$$

- System with additively separable variables

$$\begin{cases} \frac{dx_A}{dS} = a_{11} \cdot g_A(x_A) + a_{12} \cdot g_C(x_C) + a_{13} \\ \frac{dx_C}{dS} = a_{21} \cdot g_A(x_A) + a_{22} \cdot g_C(x_C) + a_{23} \end{cases}$$

Phase diagram  
(S the underlying variable)

# Linear excess supply functions

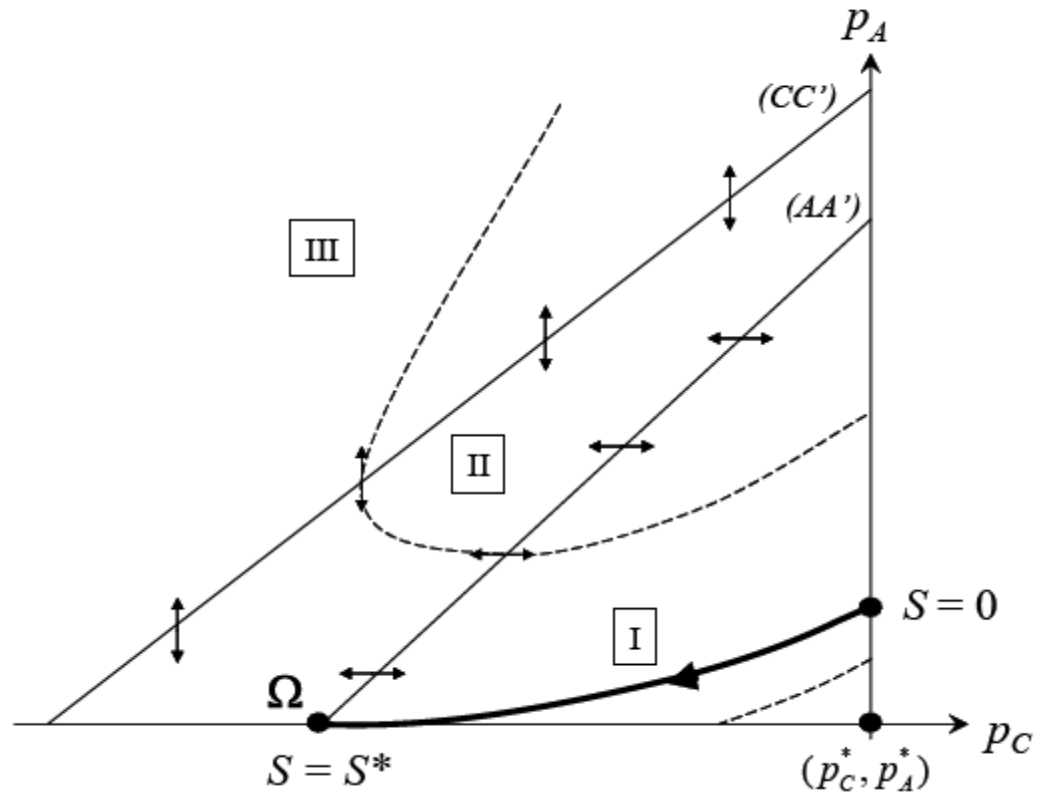
$$\Delta_A[p] = \beta_A (p - p_A^*)$$

$$\Delta_C[p] = \beta_C (p - p_C^*)$$

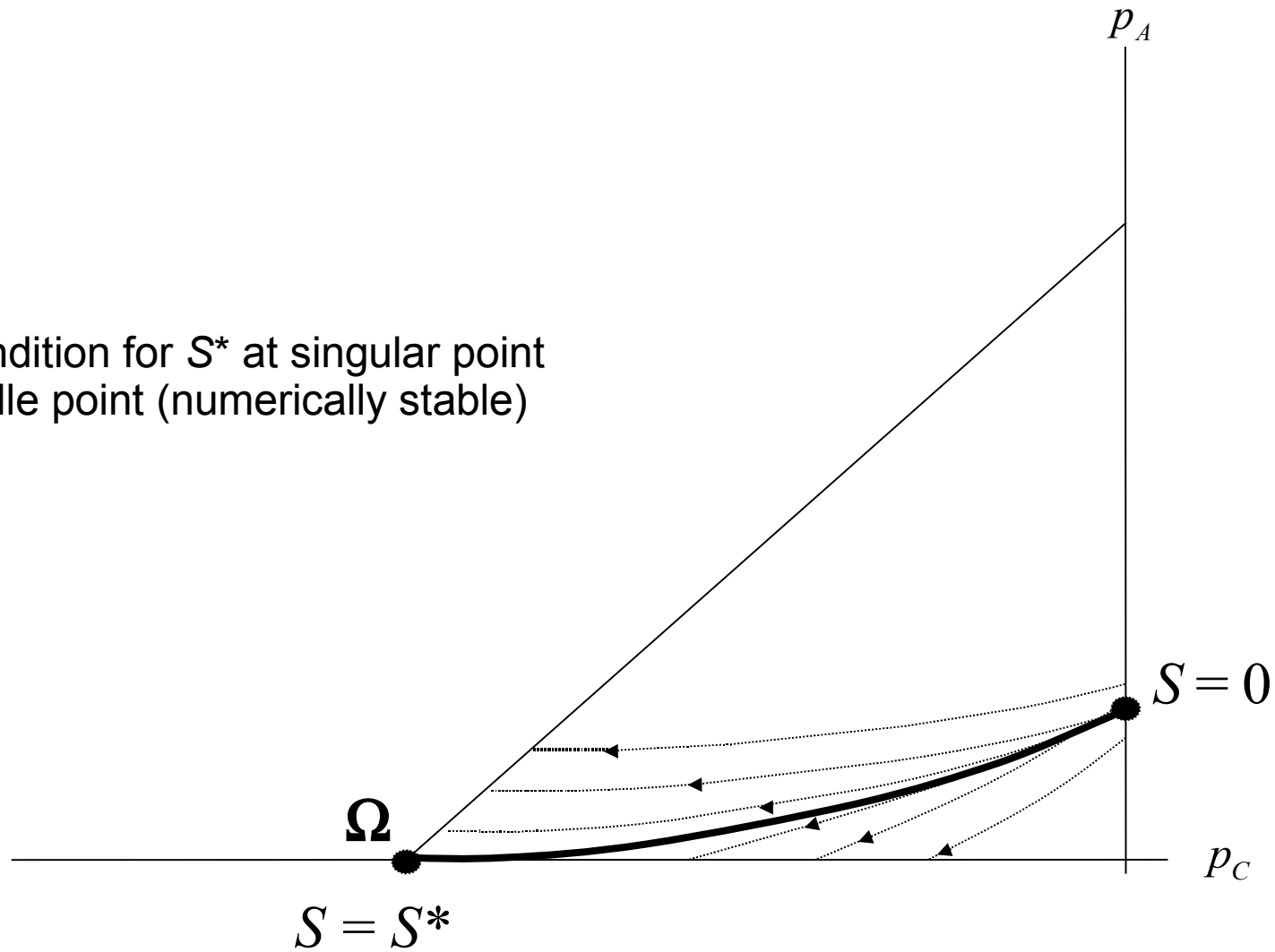
$$p_C^* > p_A^*$$

Most qualitative results are valid  
for more general excess supply functions

# Phase diagram



Limit condition for  $S^*$  at singular point  
But saddle point (numerically stable)



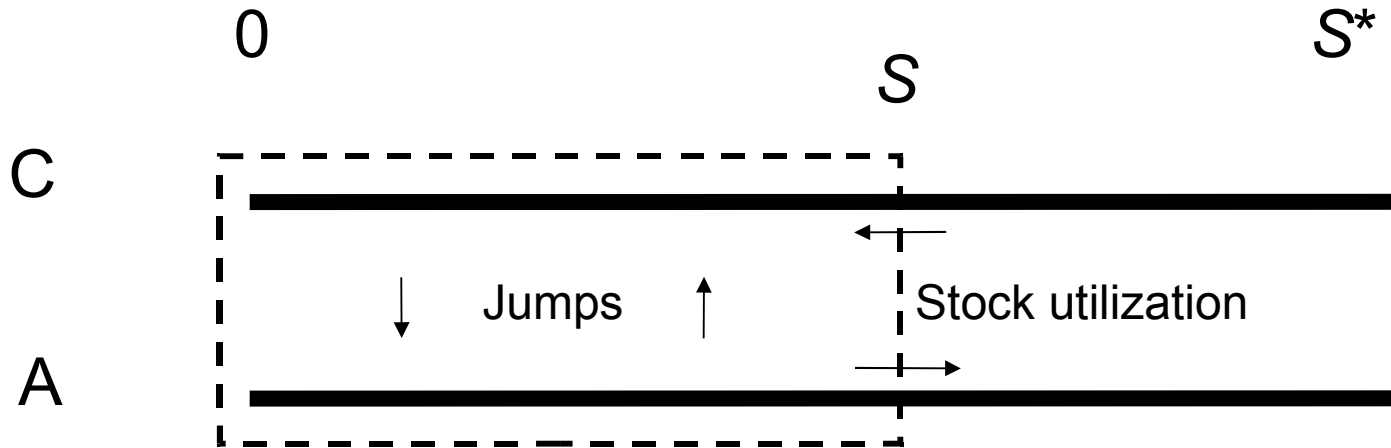
- $S^*$  increases
  - If crisis probability increases
  - If abundance probability decreases
  - If costs decrease ( $c$  or  $r$ )
  - Effects of  $\Delta_A[.]$  and  $\Delta_C[.]$  ambiguous
    - Level effects (e.g. depth of crisis)
    - Slope effects (e.g. flexibility during crisis)

# States distribution

- Densities for states A or C
- Probabilities of  $S = 0$  and  $S = S^*$
- Density and probability dynamics  
Evolution between  $t$  and  $t+dt$
- Stationary distribution

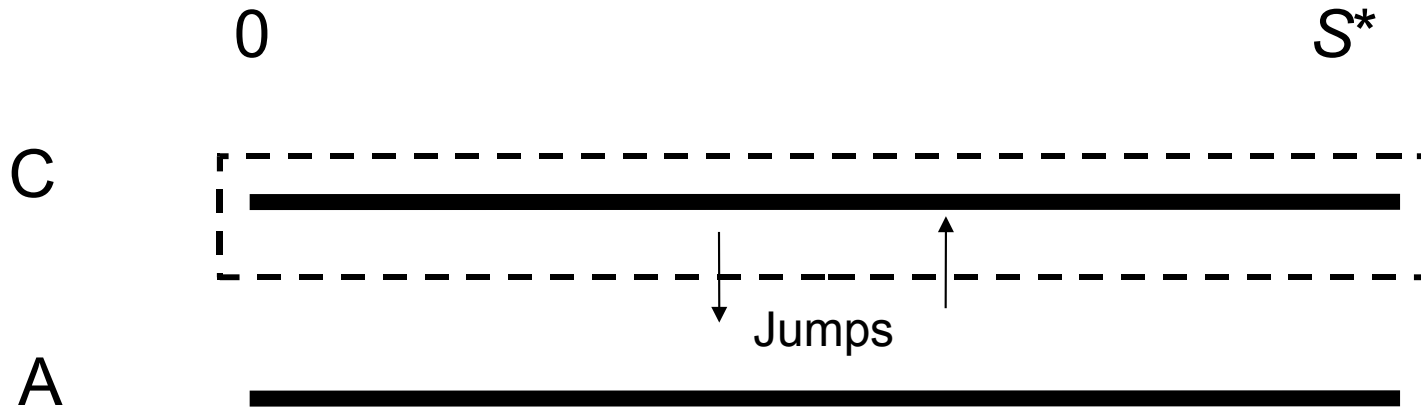


# States distribution



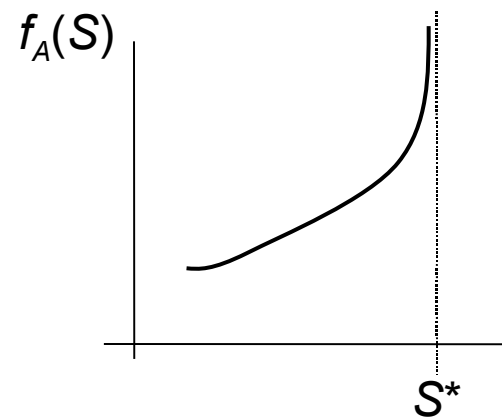
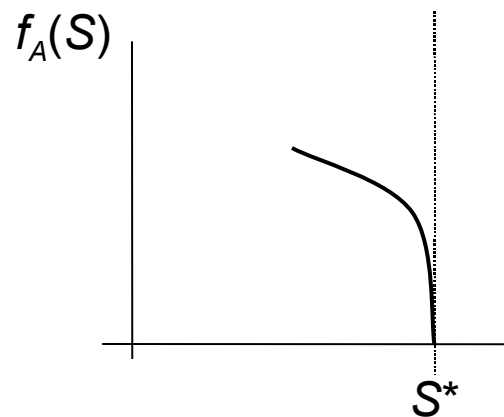
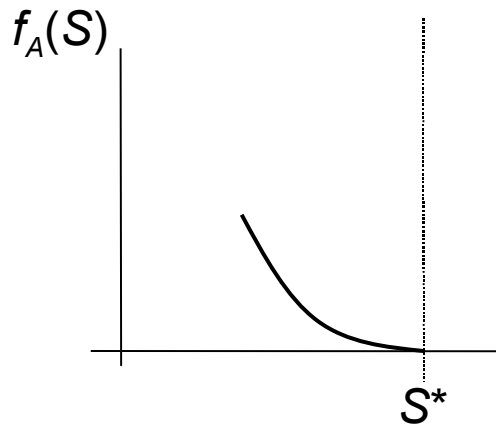
$$\frac{d \Pr[S \in [0, S]]}{dt} = f_C(S, t) \cdot \Delta_C[p_C(S)] - f_A(S, t) \cdot \Delta_A[p_A(S)]$$

# States distribution



$$\frac{d \Pr[C]}{dt} = -\lambda_A \Pr[C] + \lambda_C \Pr[A]$$

- Gives ODE satisfied by densities  
=> stationary distribution
- Explicit conditions on the shape of distribution around  $S = 0$  and  $S = S^*$



# Extensions

- Injection and release costs
  - Nodal prices theory: different prices inside and outside the storage
  - Prices follow similar laws of motion
- Limited storage capacity
  - Changes boundary condition (upper limit on  $S$ )
  - Capacity constraint binds in finite time
  - Rents associated with scarcity of storage capacity (effect on value of storage capacity)
- Nonlinear excess demand

# Extensions

- Price stabilization, e.g. constant price

$$p^* : \lambda_A \Delta_A [p^*] + \lambda_C \Delta_C [p^*]$$

- If  $> 0$  : stocks converge to infinity and price stabilized with Prob 1
  - If  $< 0$  : stabilization fails ( $S = 0$  with positive probability)
  - If  $= 0$  : stocks follow a symmetric random walk
- Expropriation risk
  - Market power on storage services