




# OPTIMIZATION OF FERTIGATION PRACTICE

AN APPROACH BASED ON VIABILITY THEORY AND OPTIMAL CONTROL

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1<sup>er</sup> octobre 2024



**AG 2024 du réseau REUSE-Avignon**

# OUTLINE

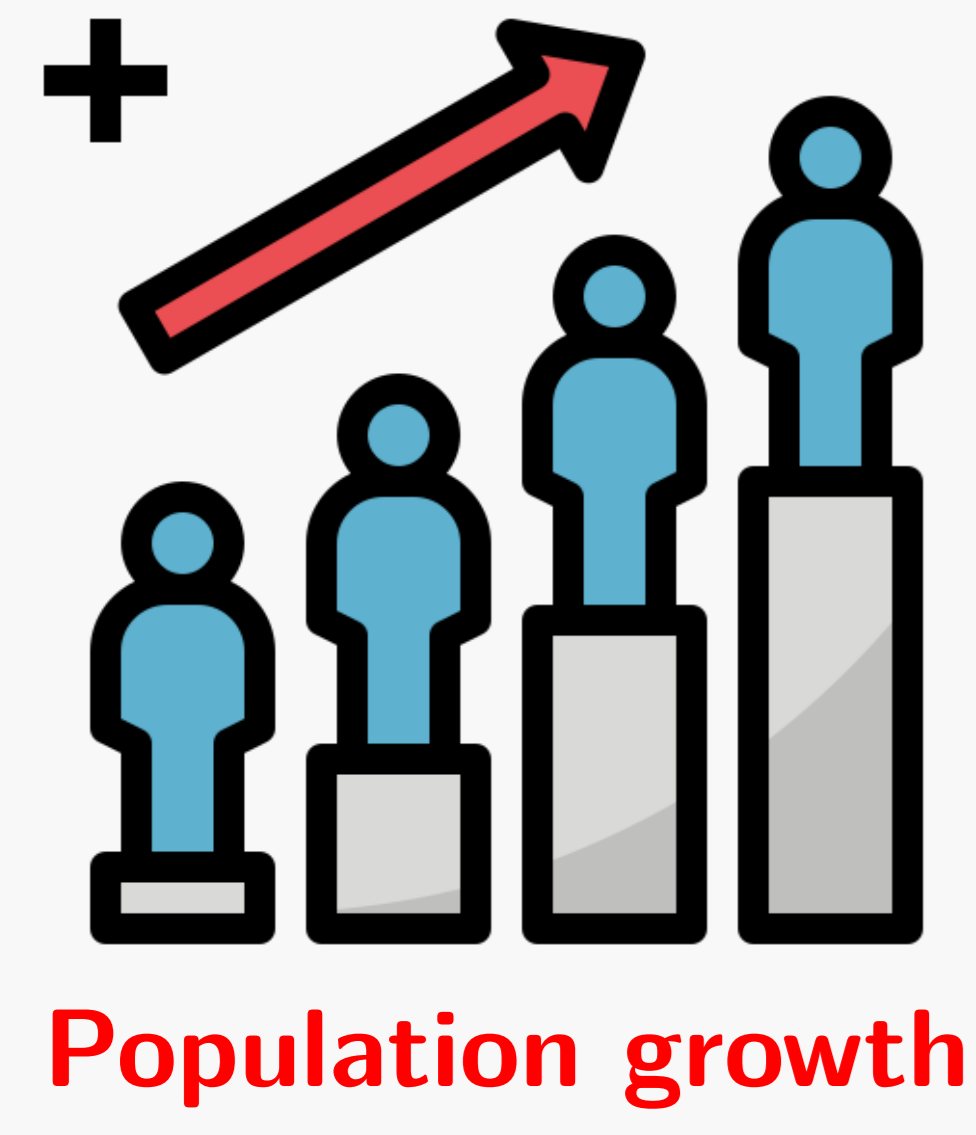
A large, empty rectangular area with a light gray background and a thin yellow border, intended for writing the outline content.

# OUTLINE

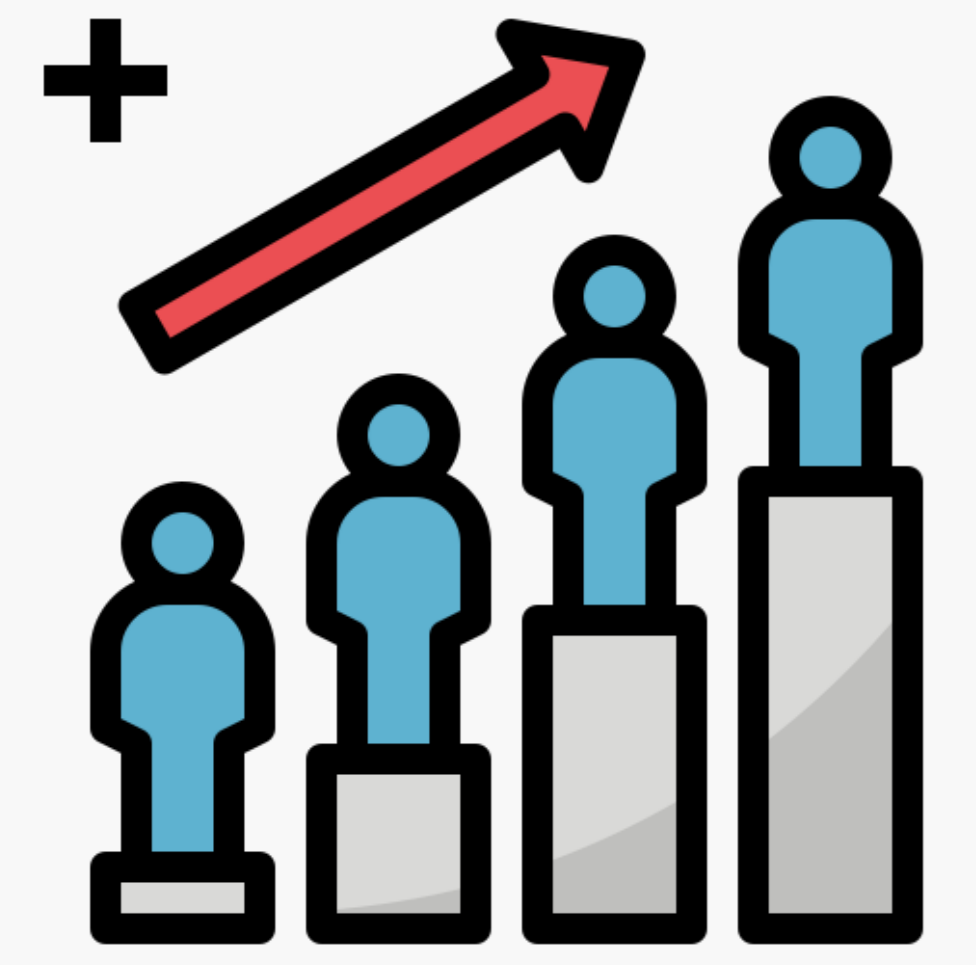
- **Motivation**
- **Crop fertigation model**
- **Problem formulation**
- **Optimal strategies**
- **Conclusion**

# MOTIVATION

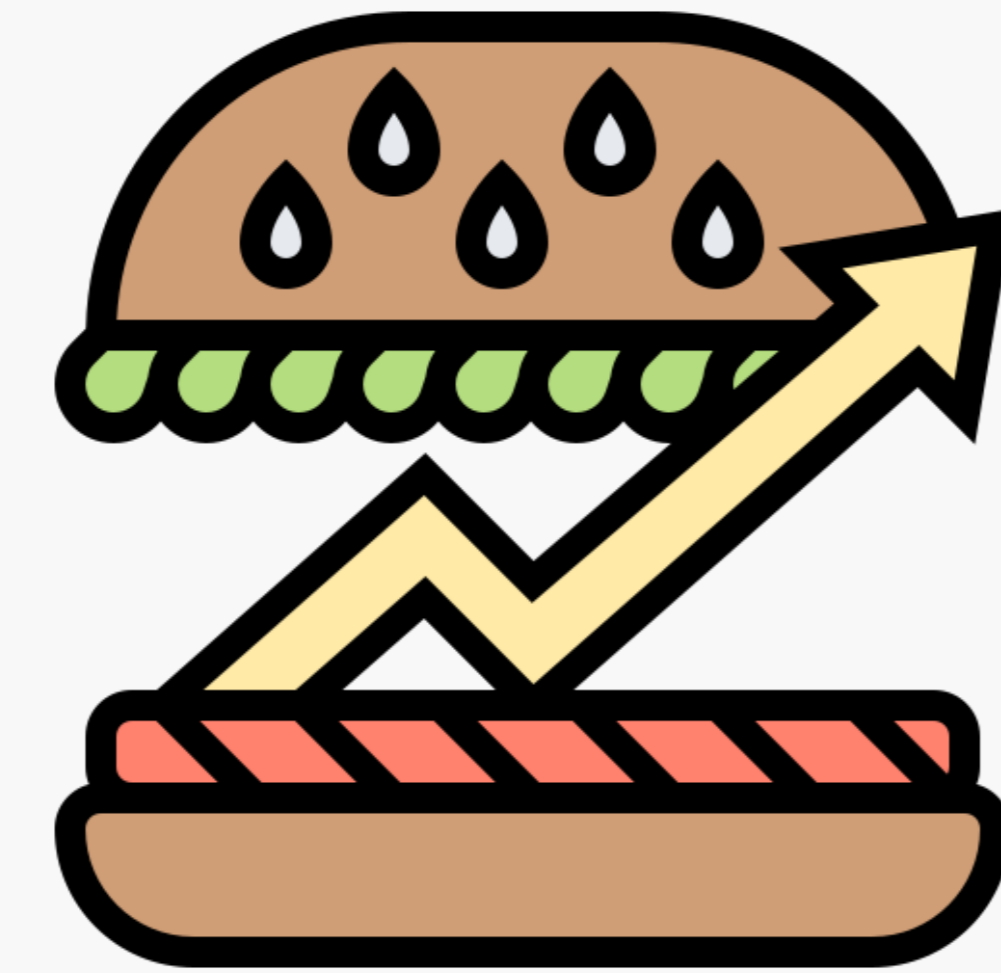
# MOTIVATION



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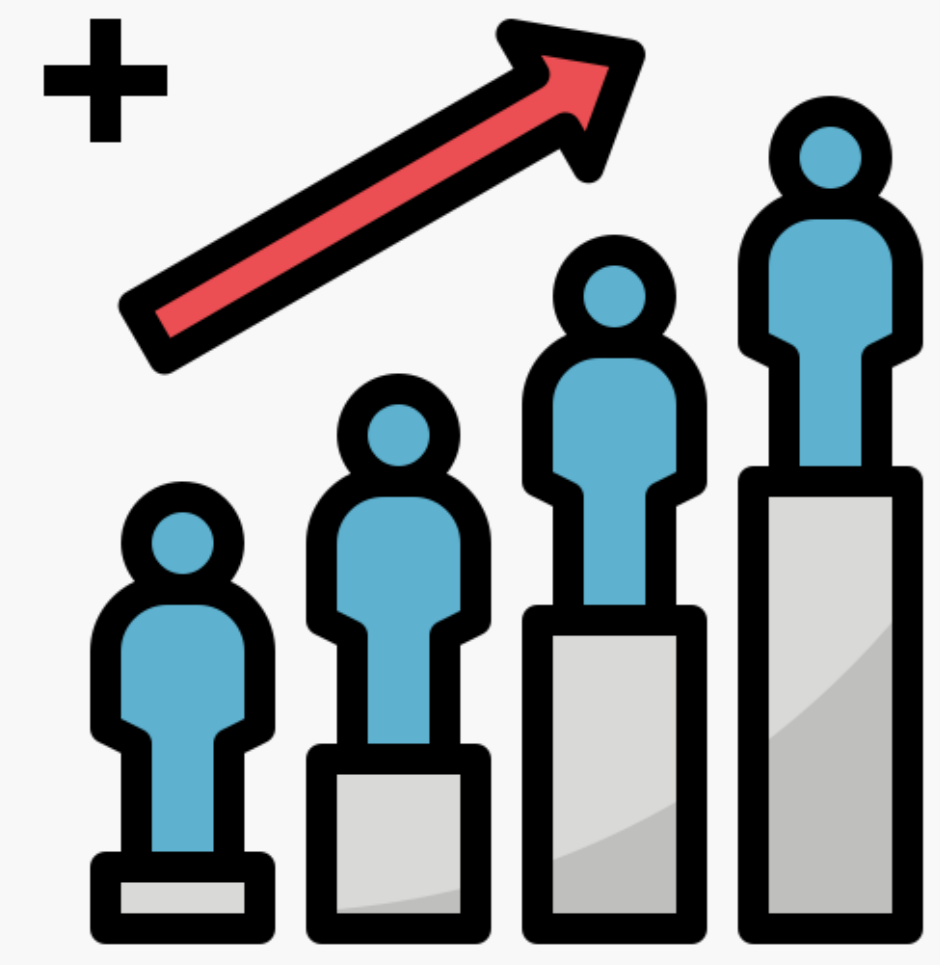


Population growth

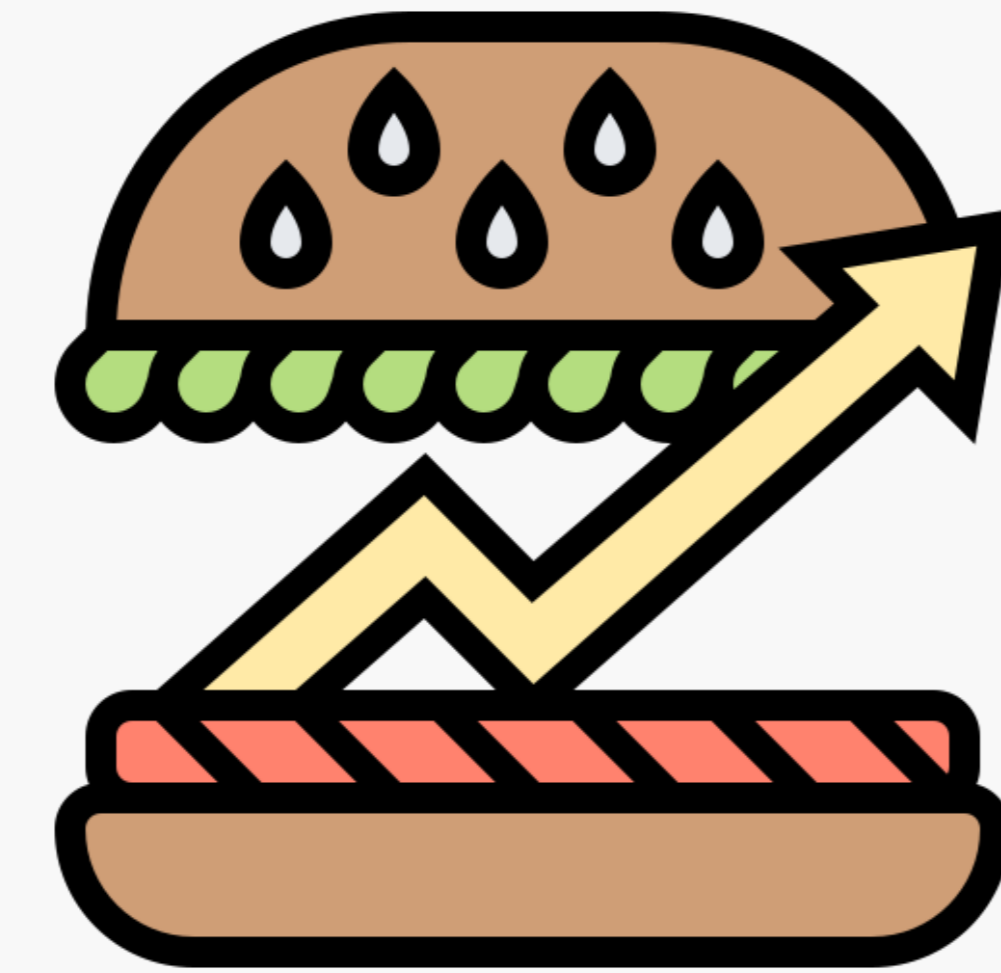


Food demand

# MOTIVATION



Population growth

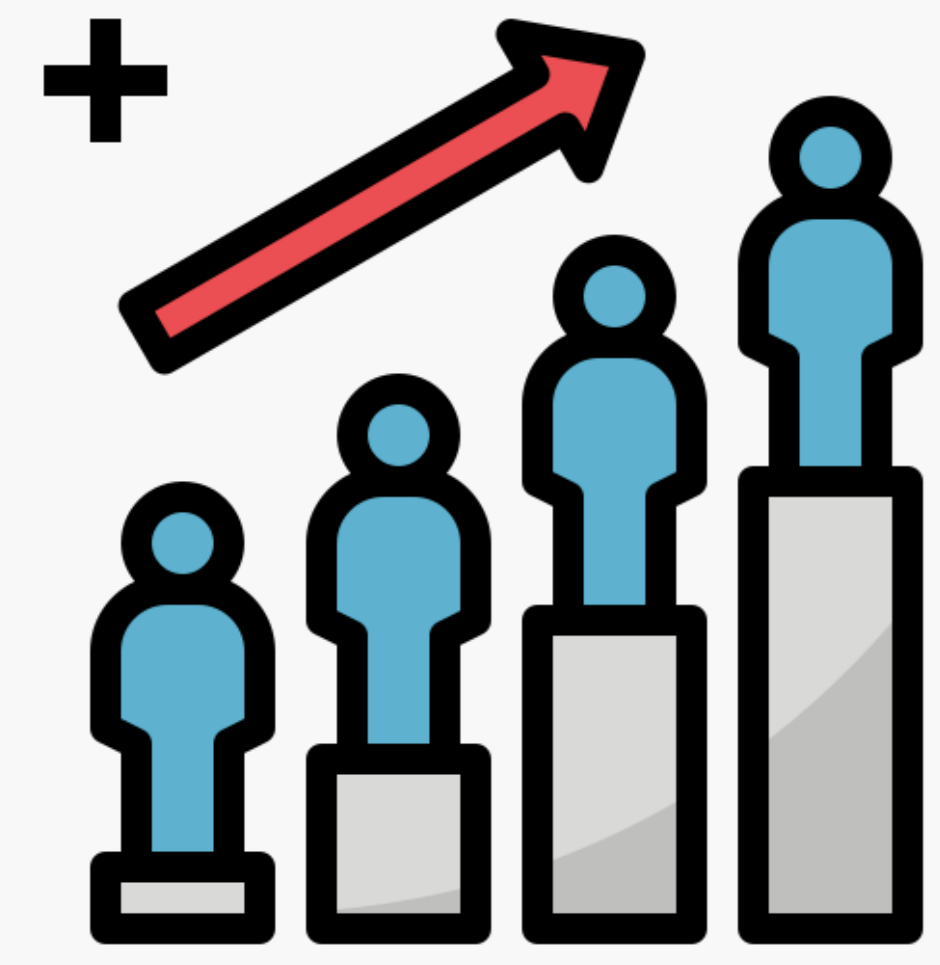


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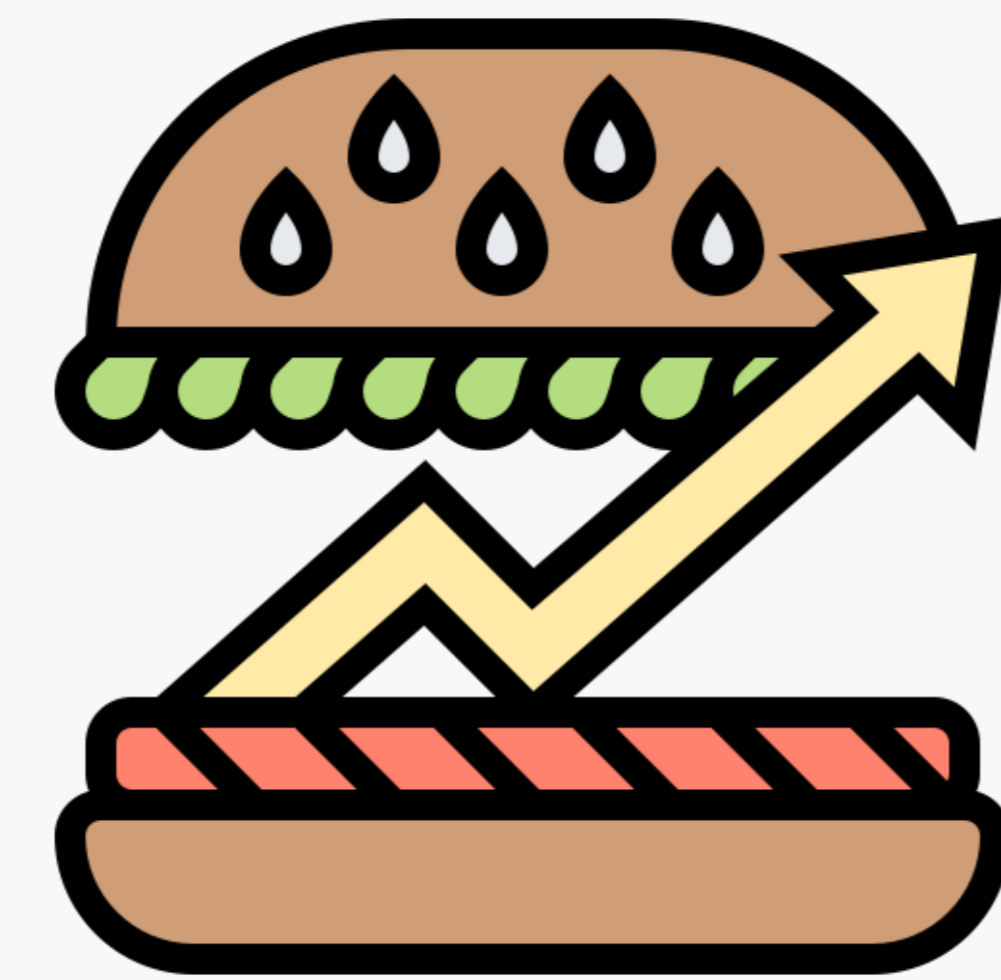


Climate change

# MOTIVATION



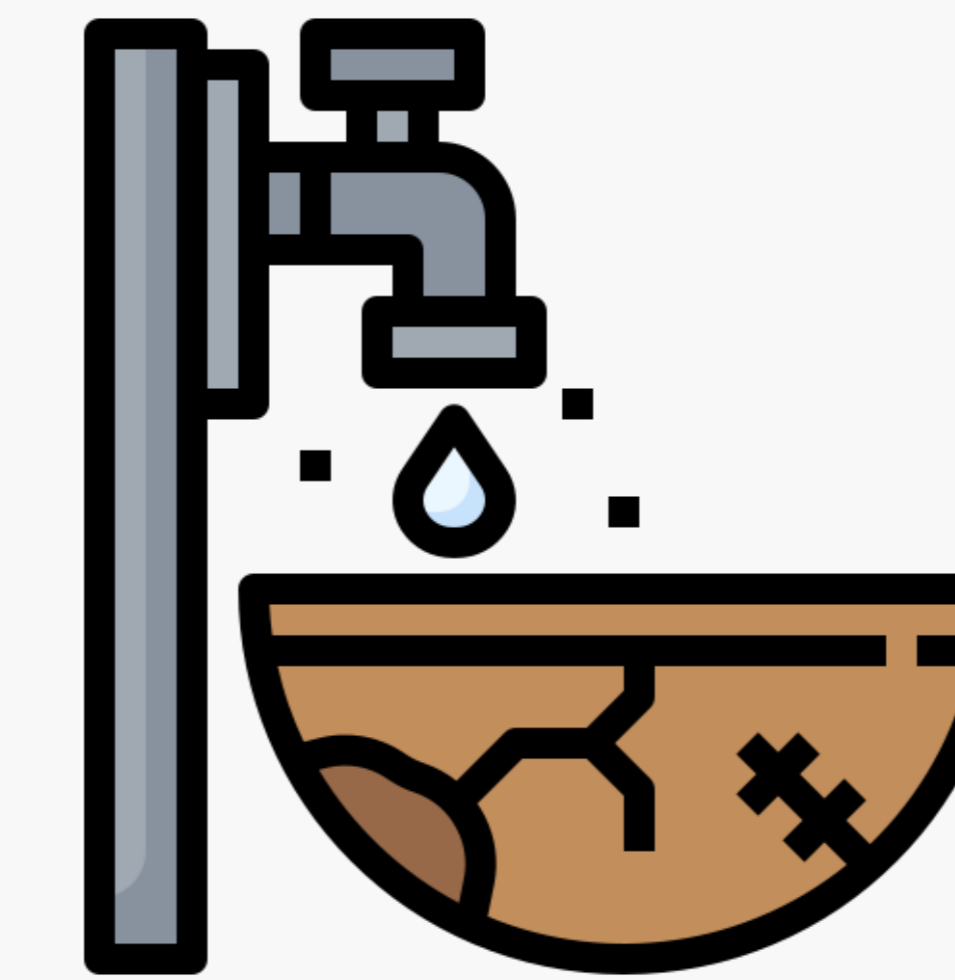
Population growth



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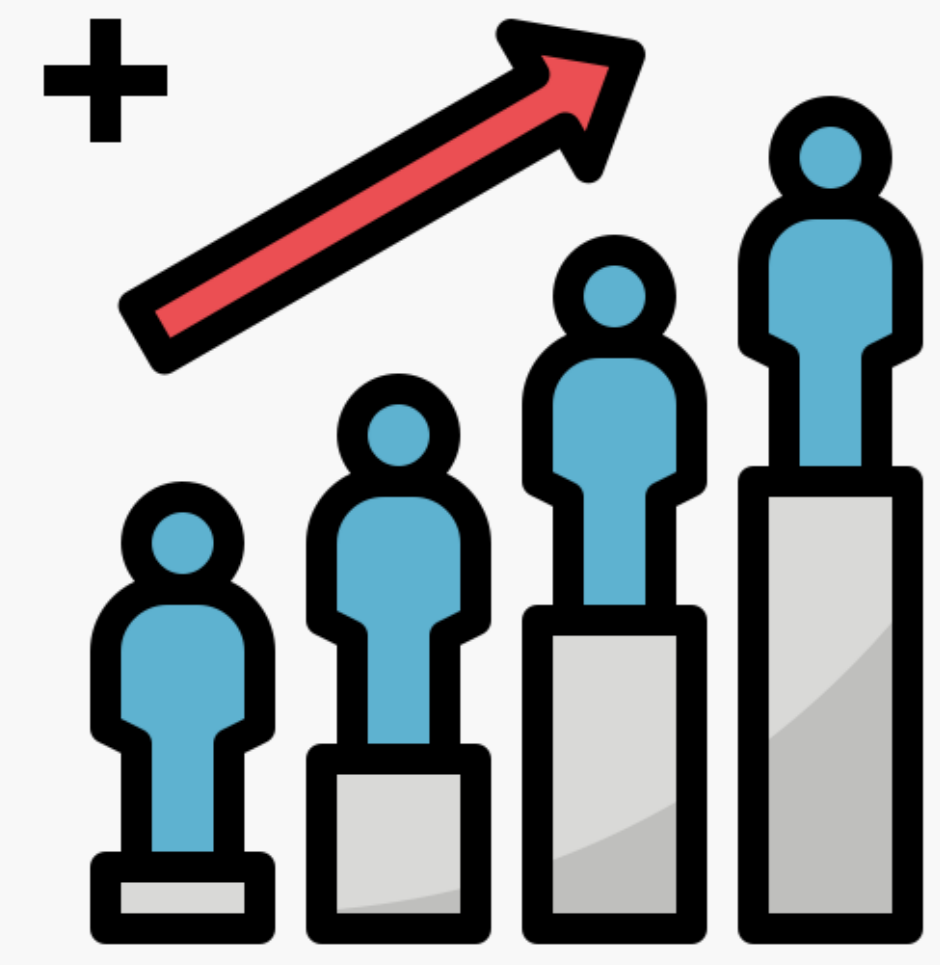
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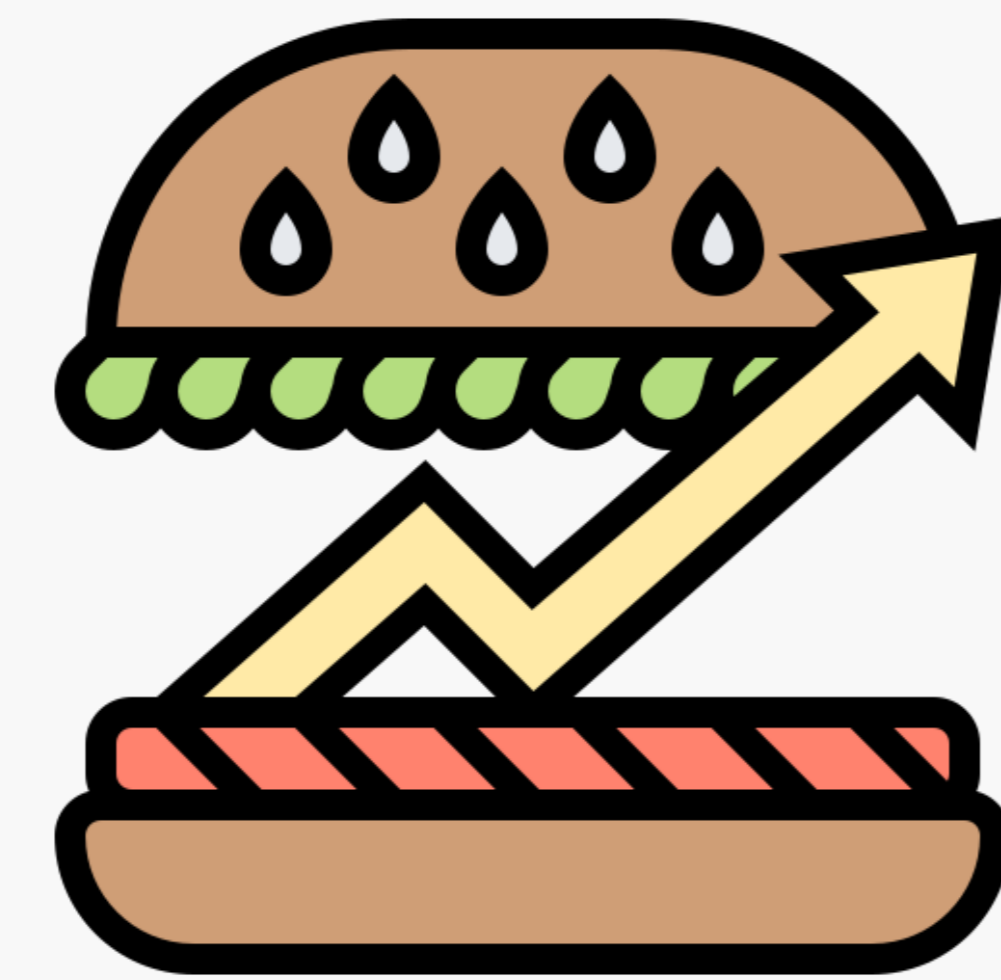
Water scarcity



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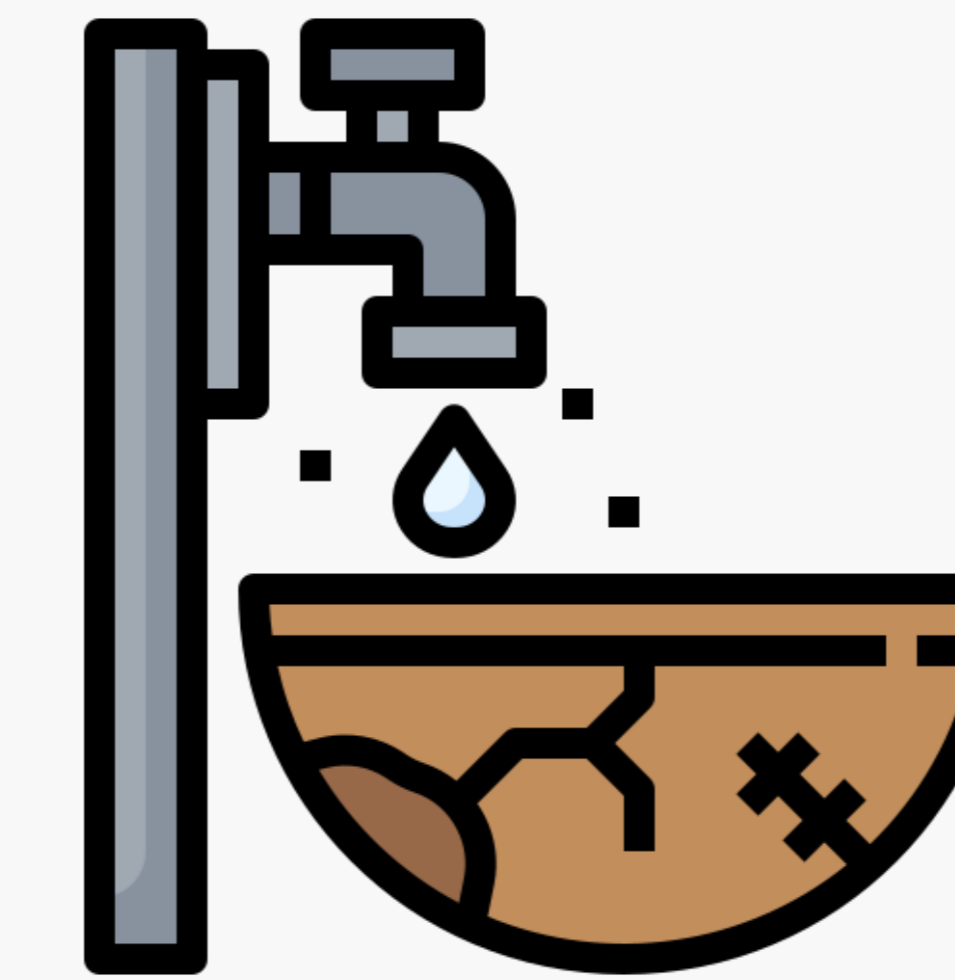
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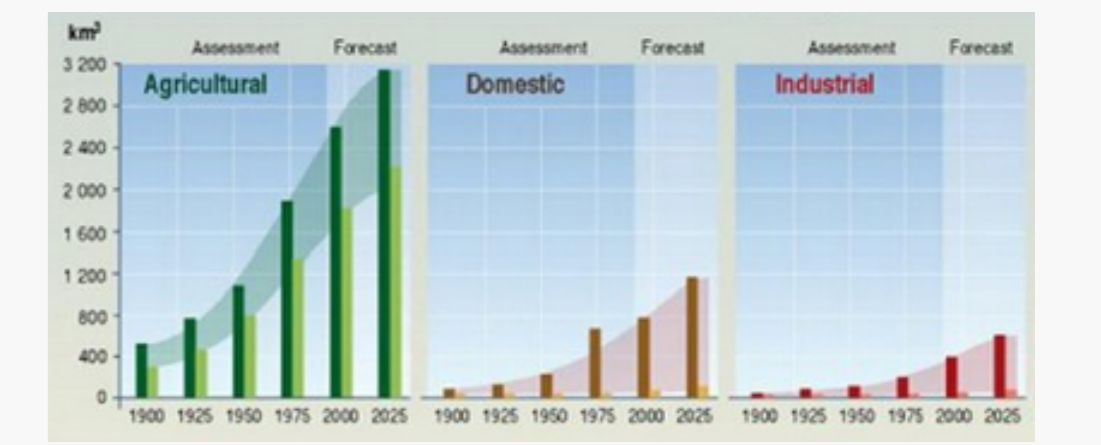
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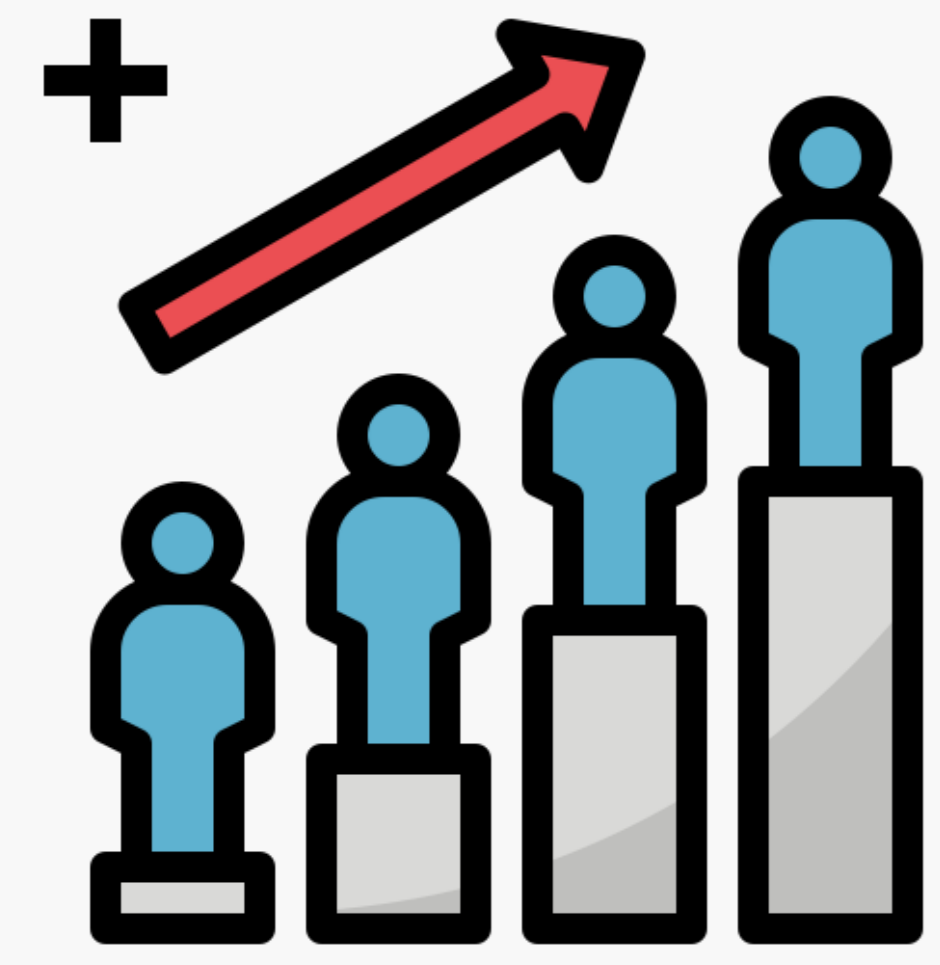


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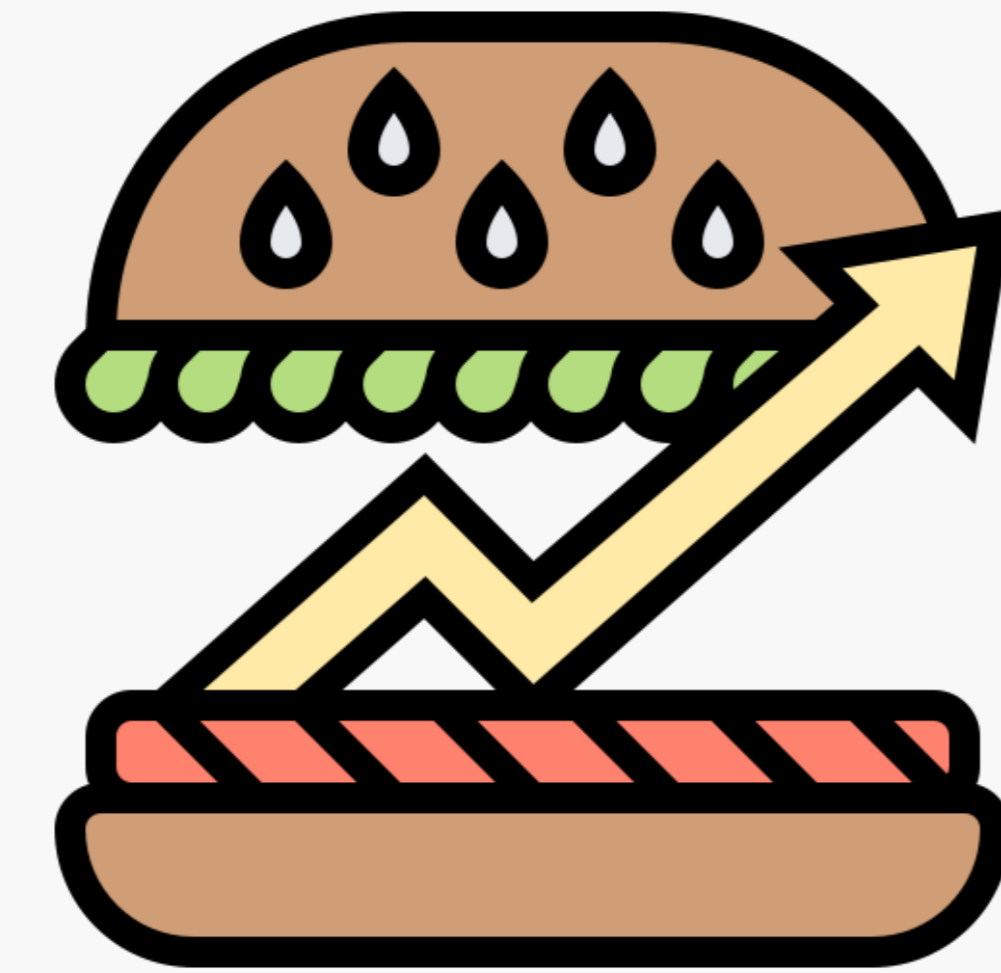


60% of mobilized water for agriculture

## MOTIVATION



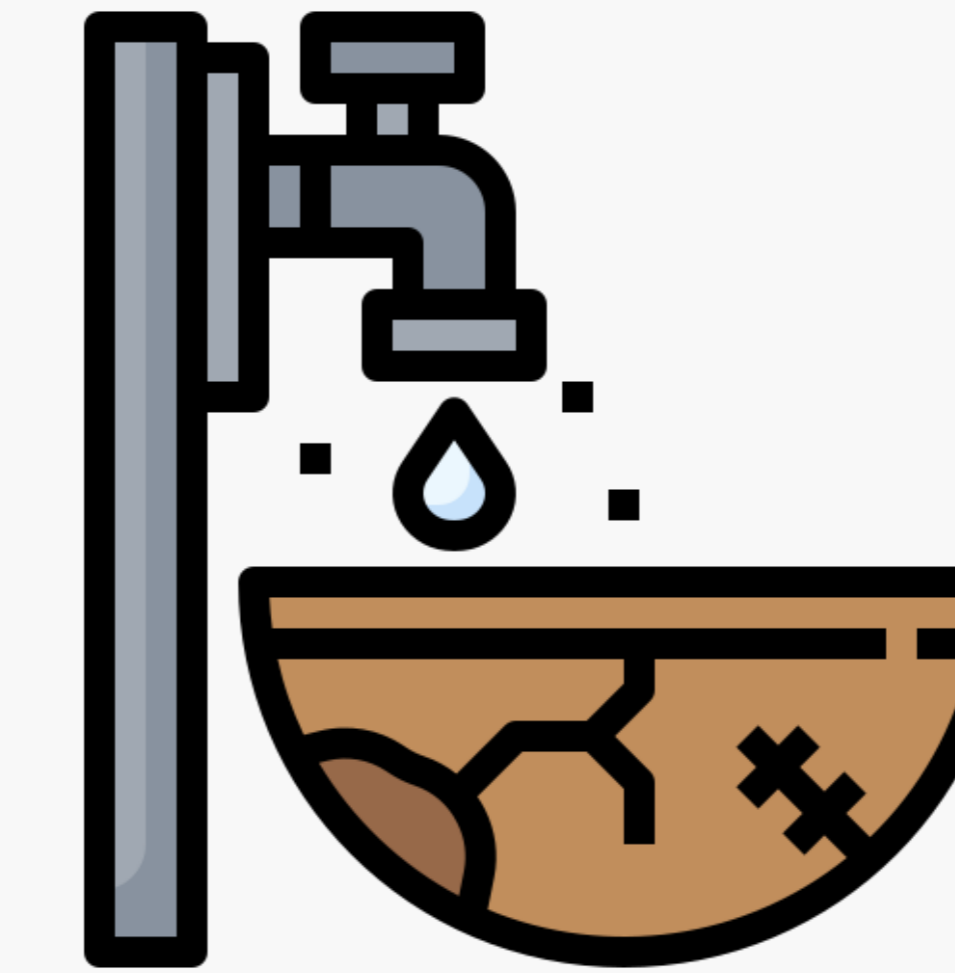
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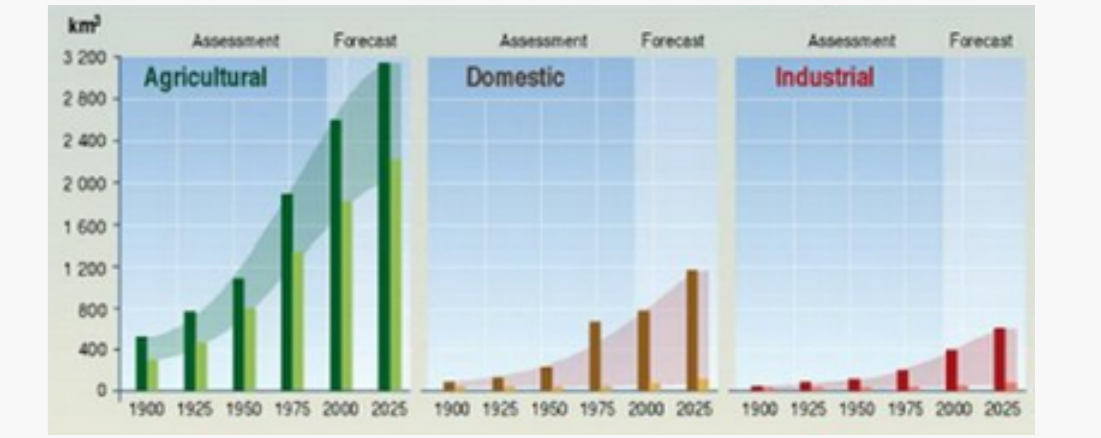
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Climate change



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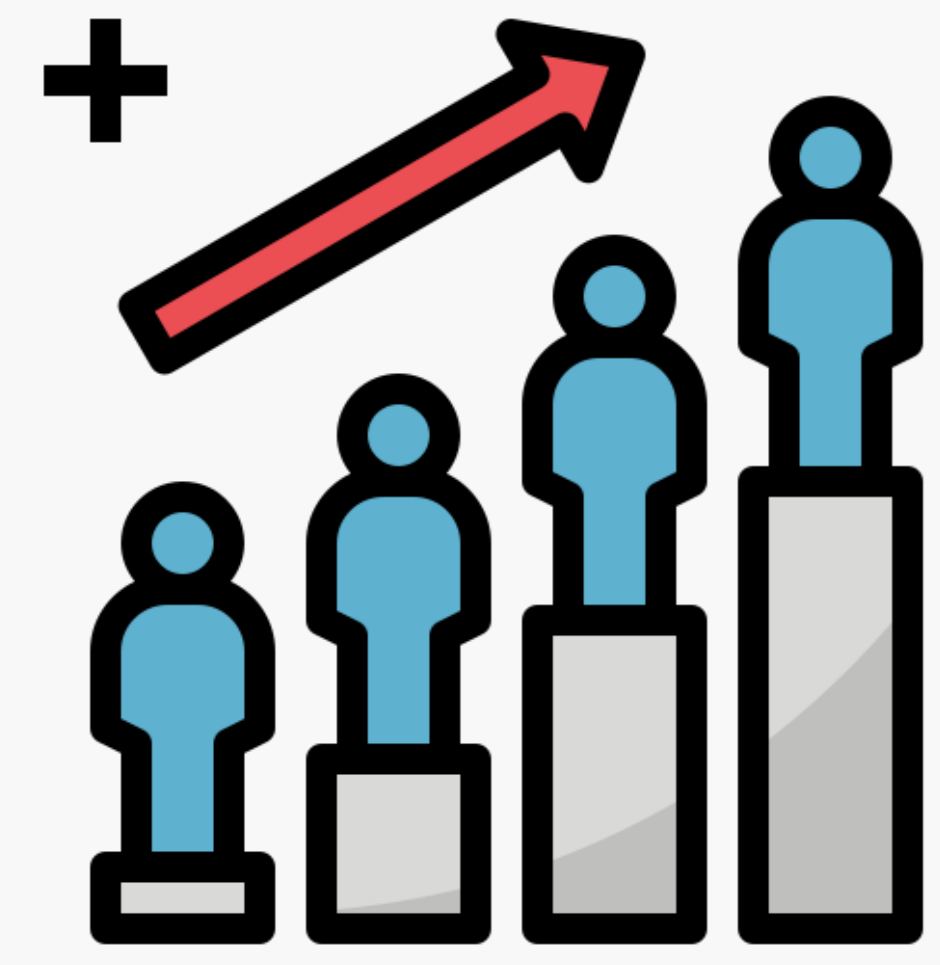
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## CHALLENGES

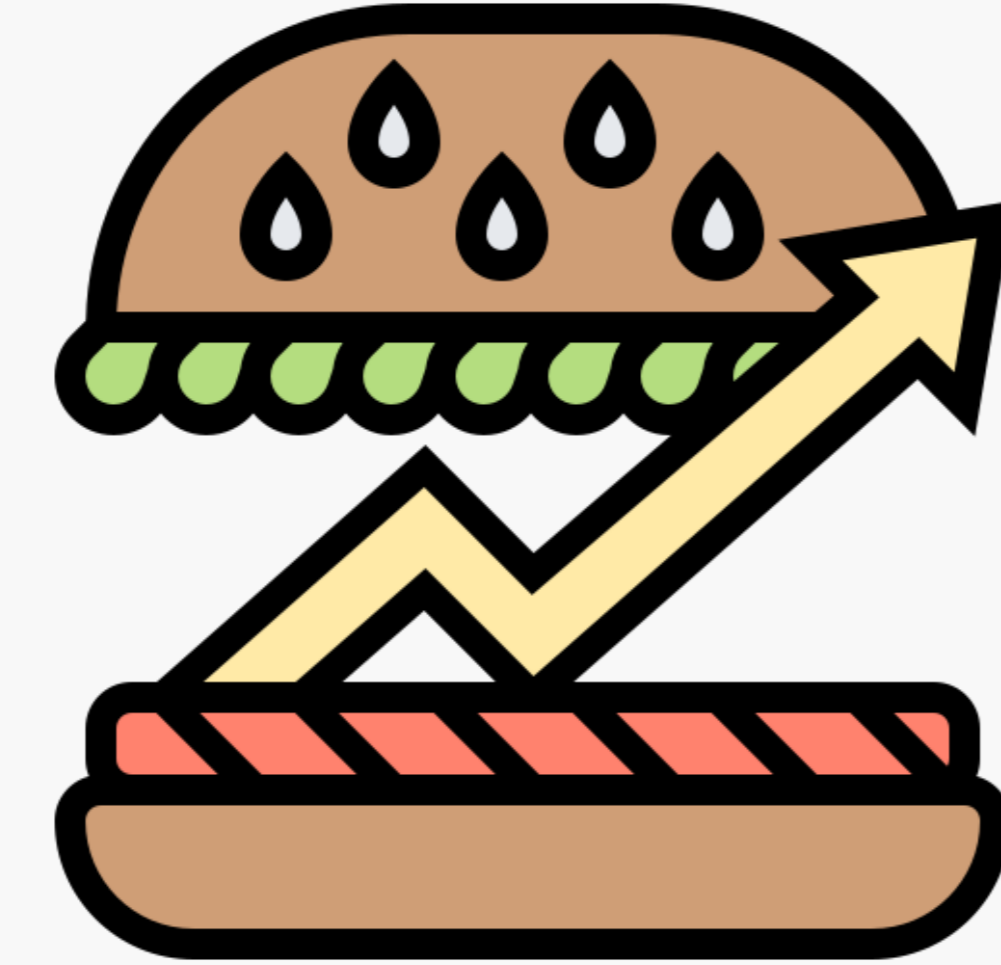
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## MOTIVATION



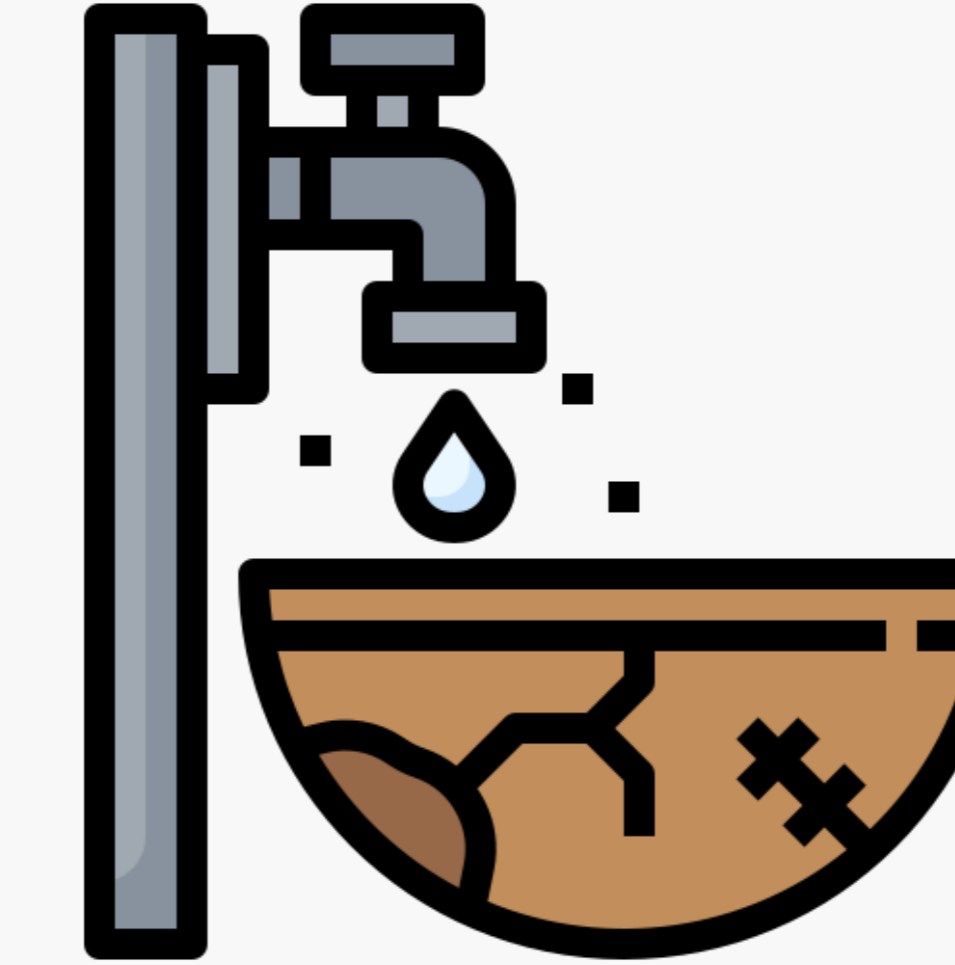
Population growth



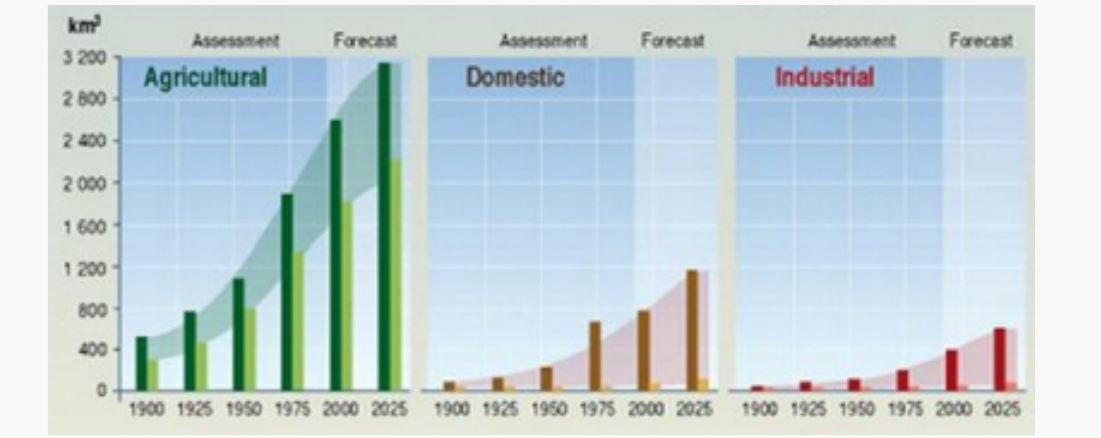
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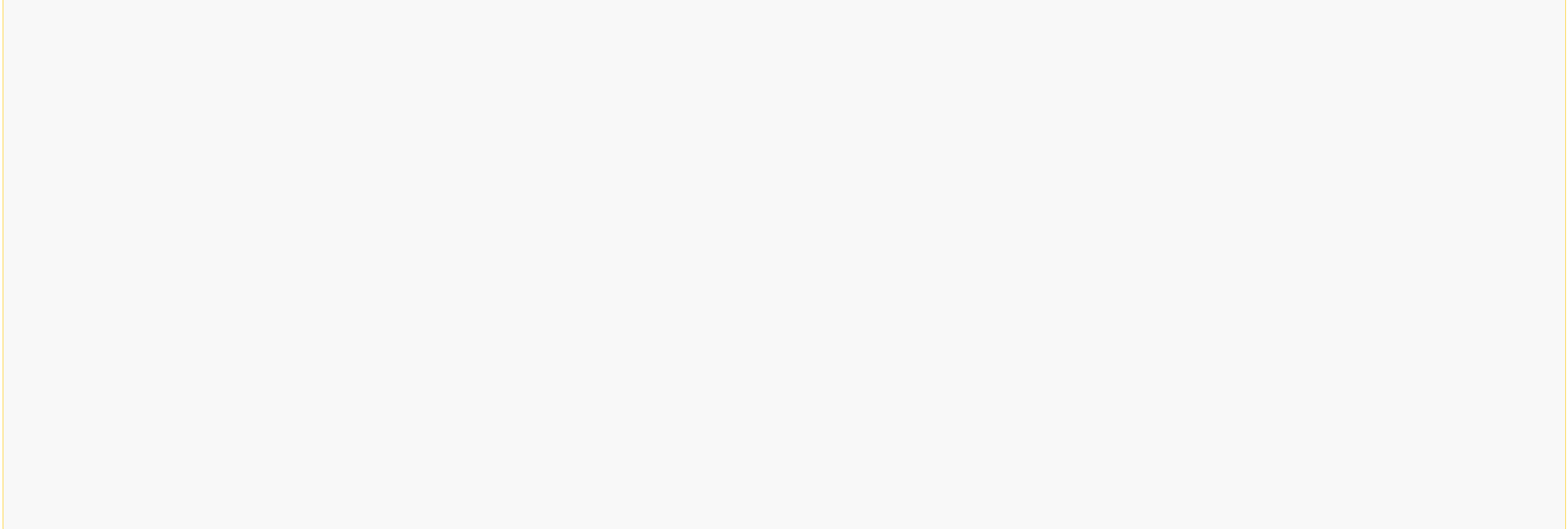


60% of mobilized water for agriculture

## CHALLENGES

- Increase agricultural production to meet food needs
- Optimize agriculture irrigation with treated wastewater

# CROP FERTIGATION MODEL



## CROP FERTIGATION MODEL

- Water balance equation :

$$\dot{S} = k_1 \left( -\varphi(t)K_S(S) - (1 - \varphi(t))K_R(S) + k_2 u \right)$$

$u$  := irrigation flow rate

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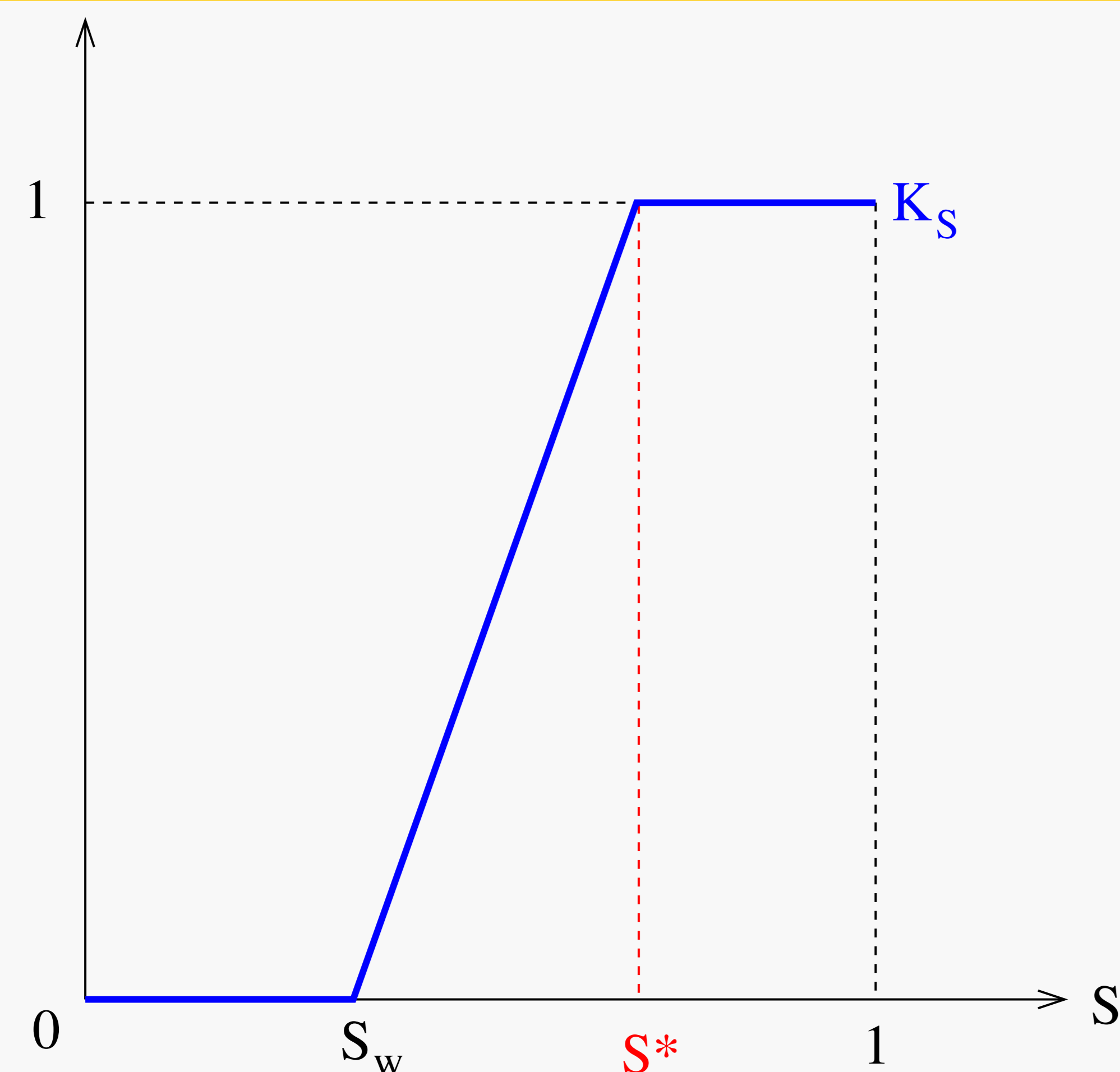
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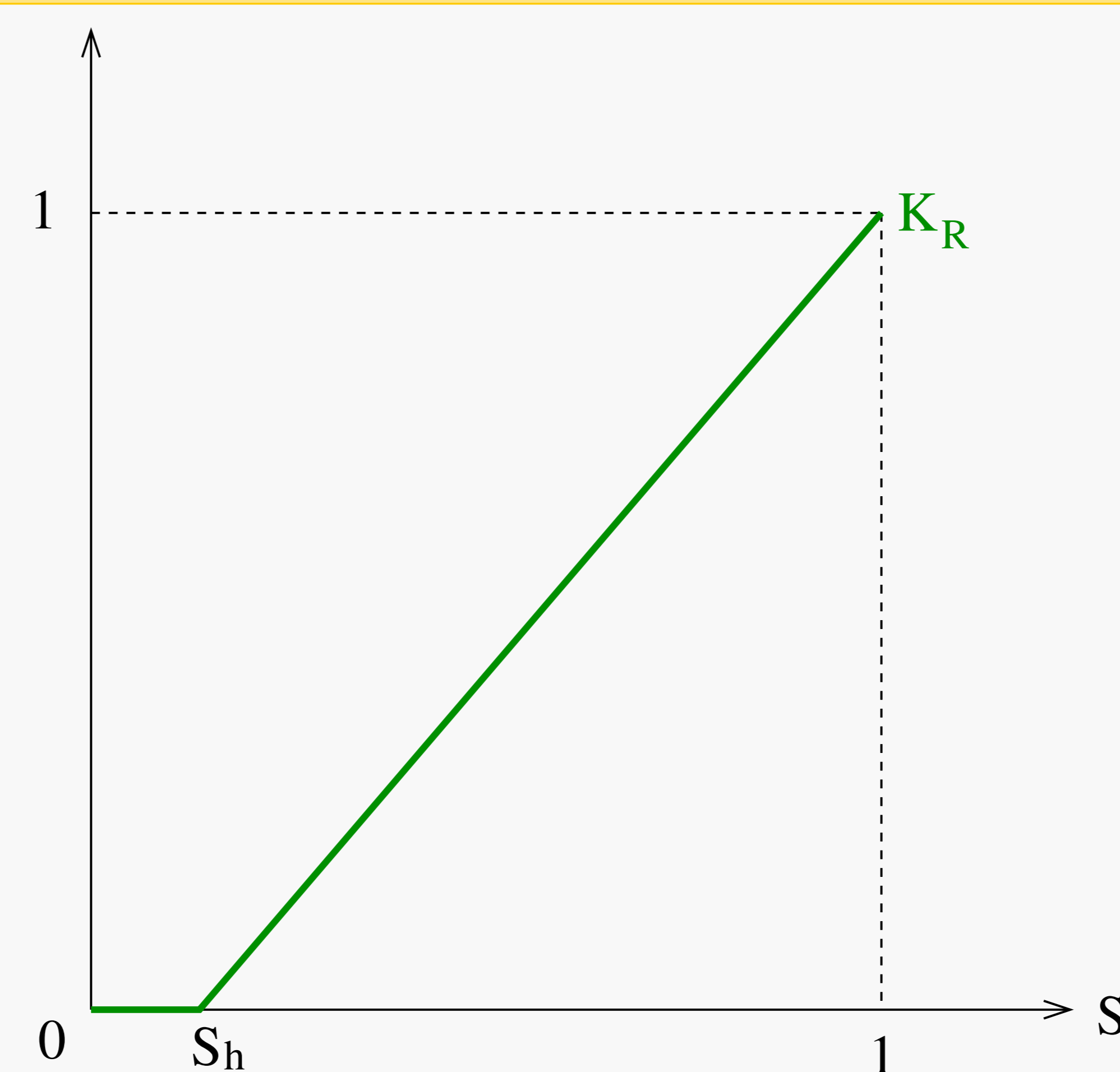
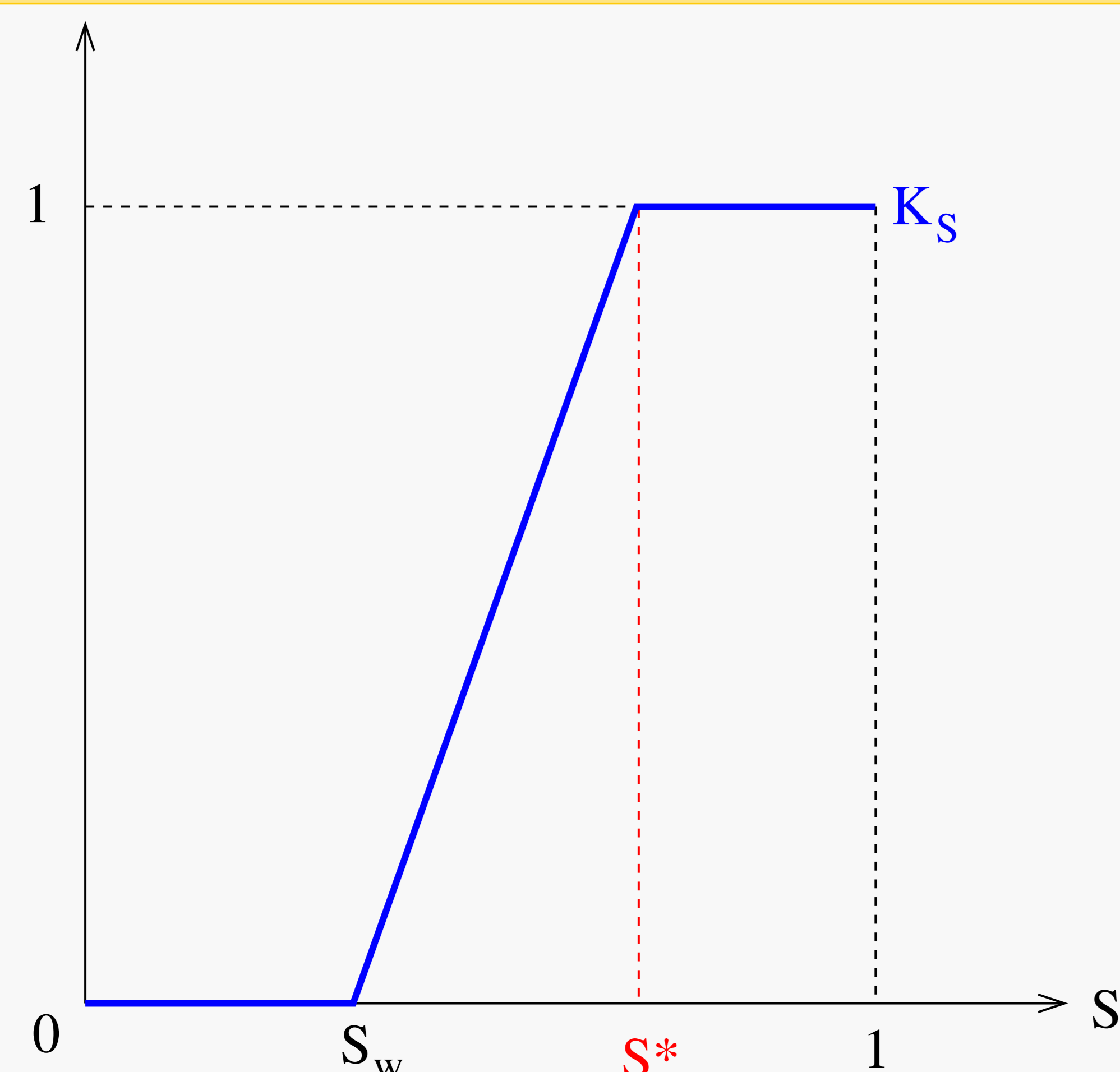
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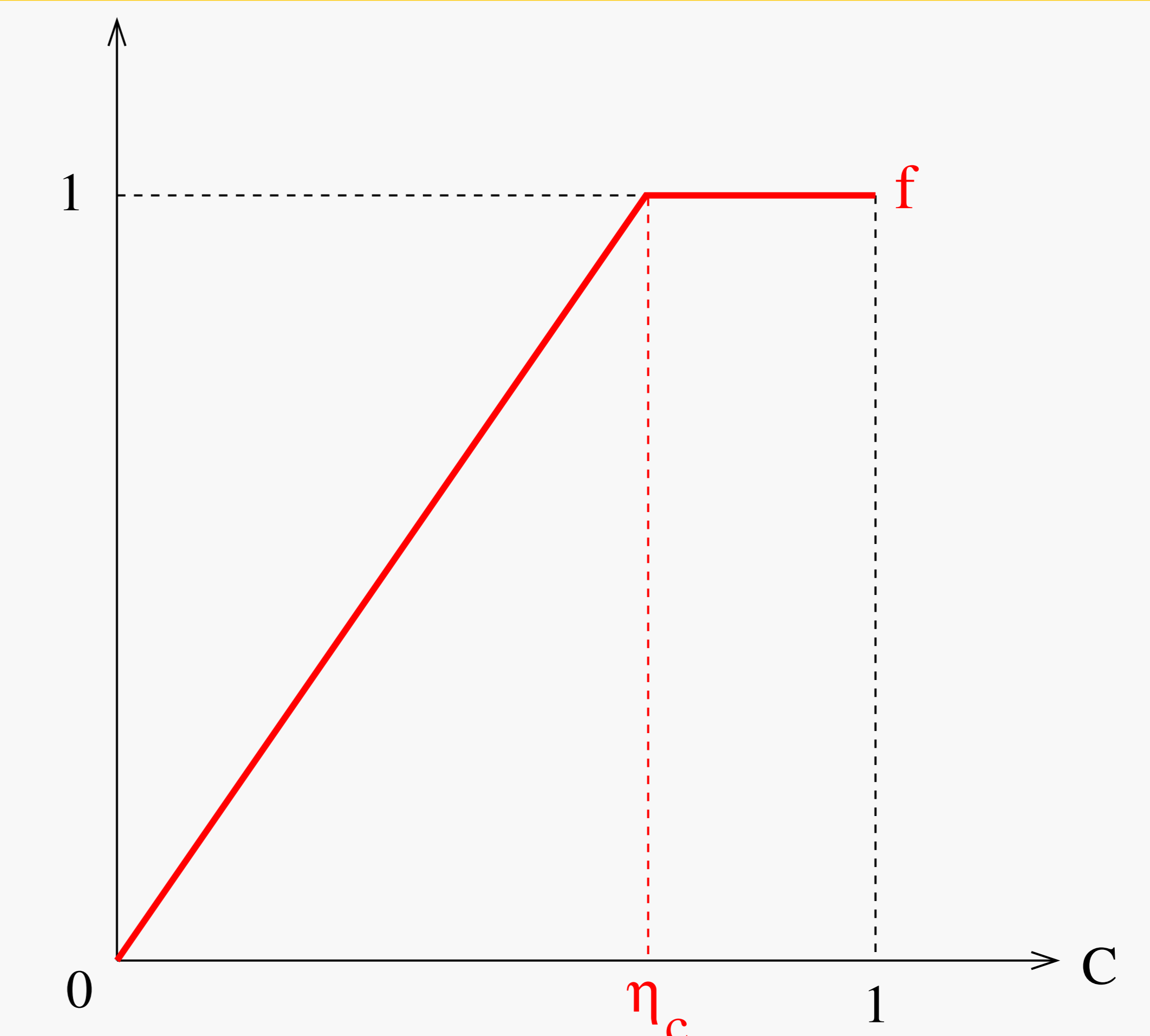
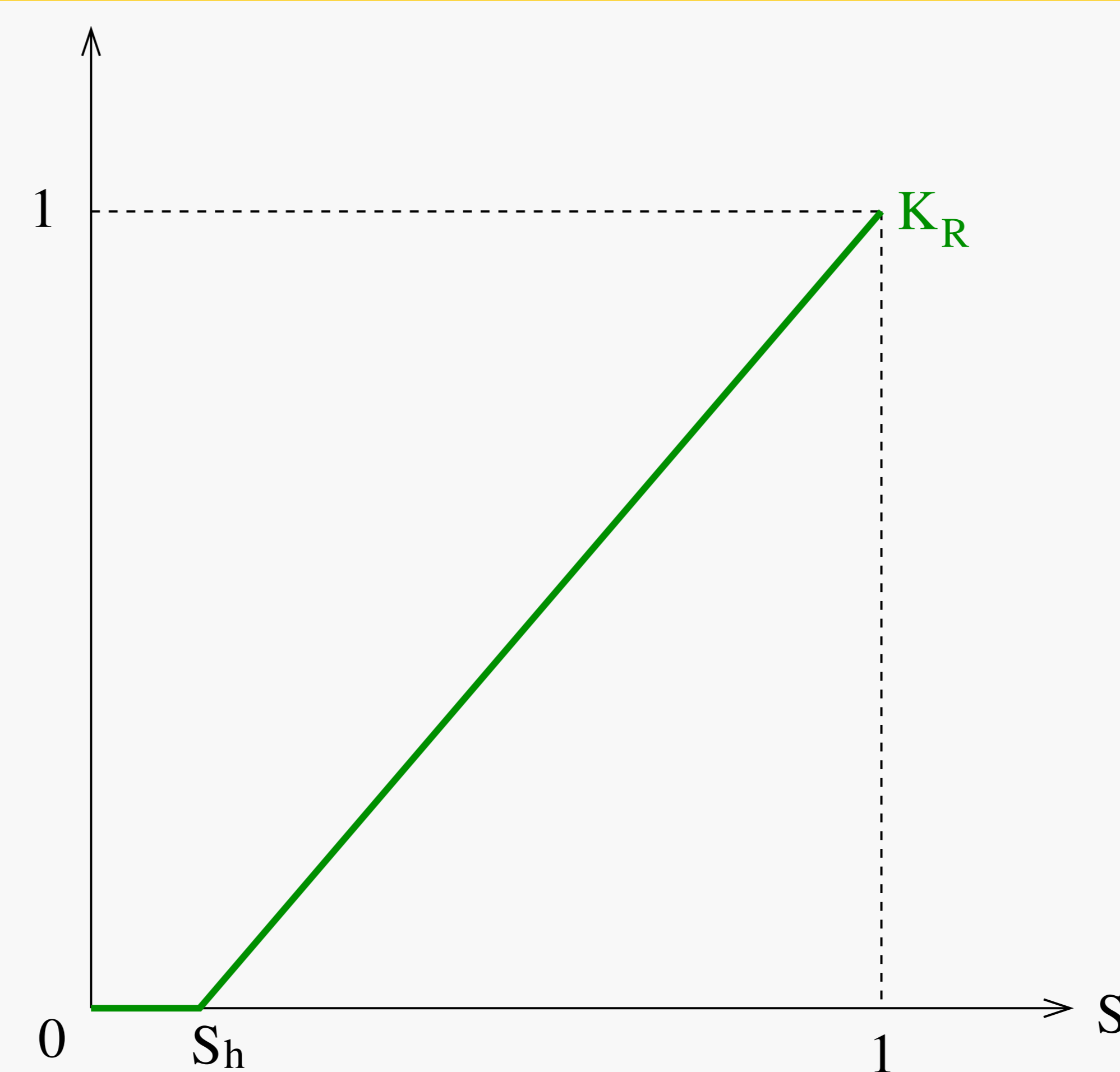
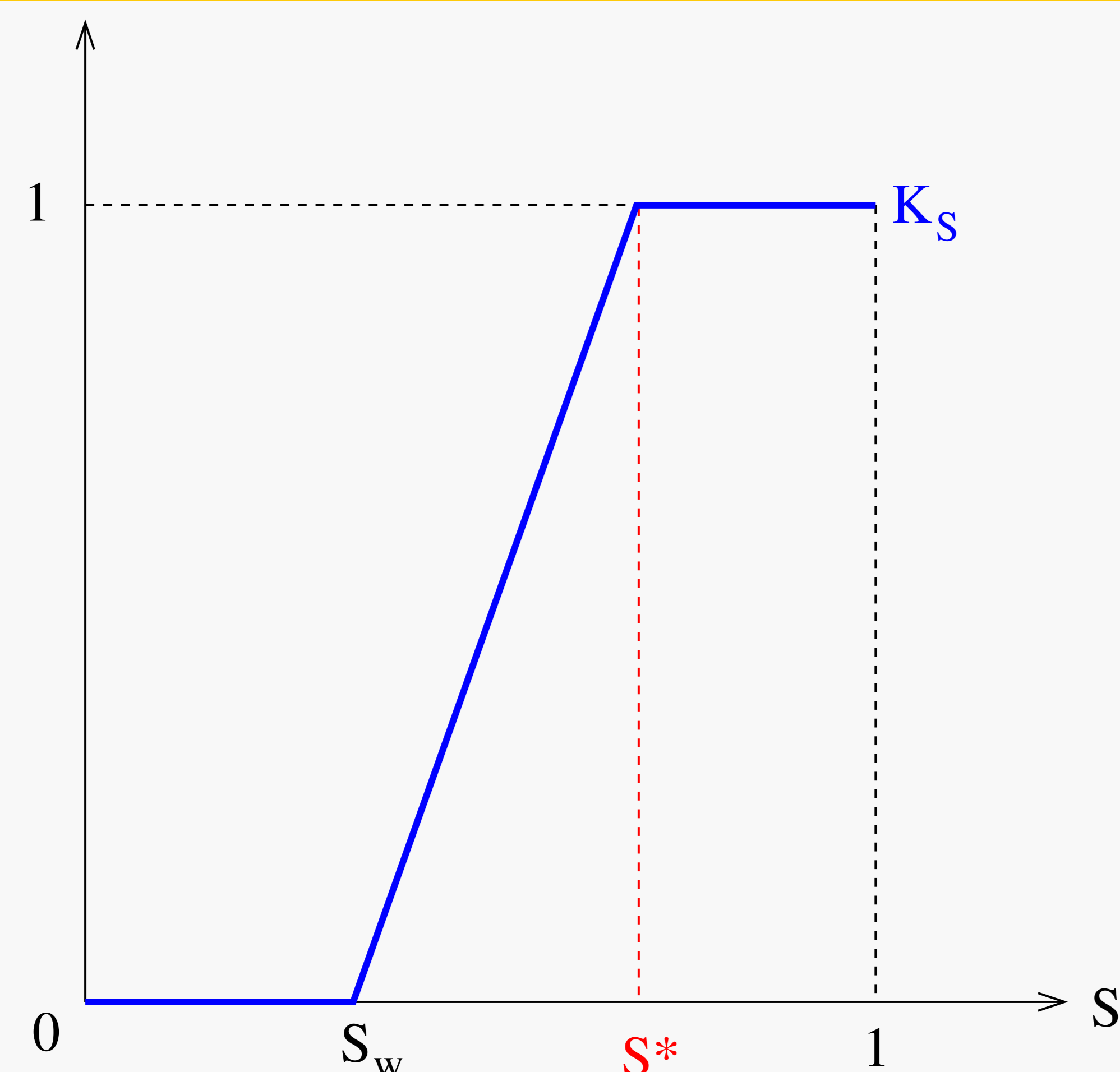
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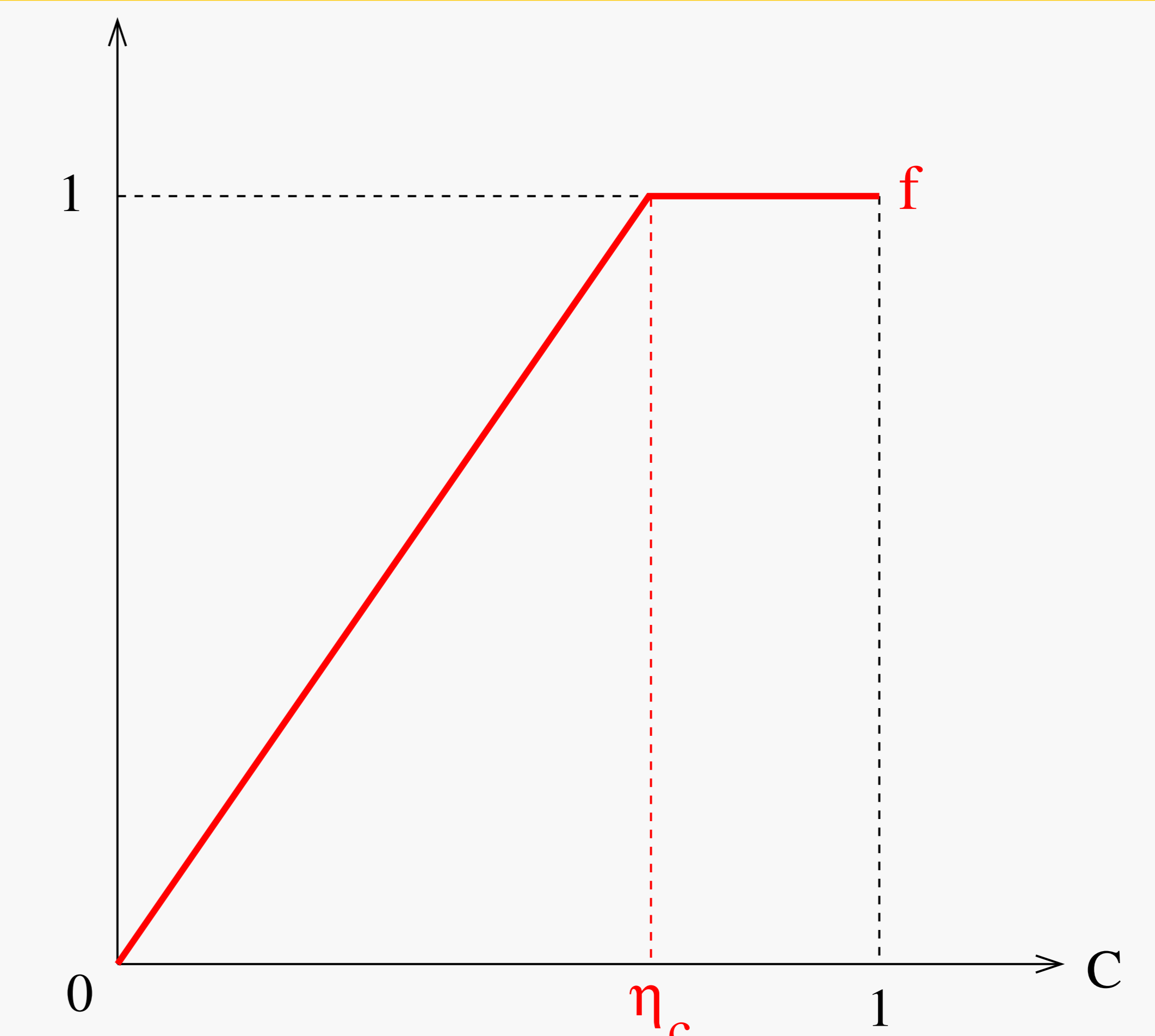
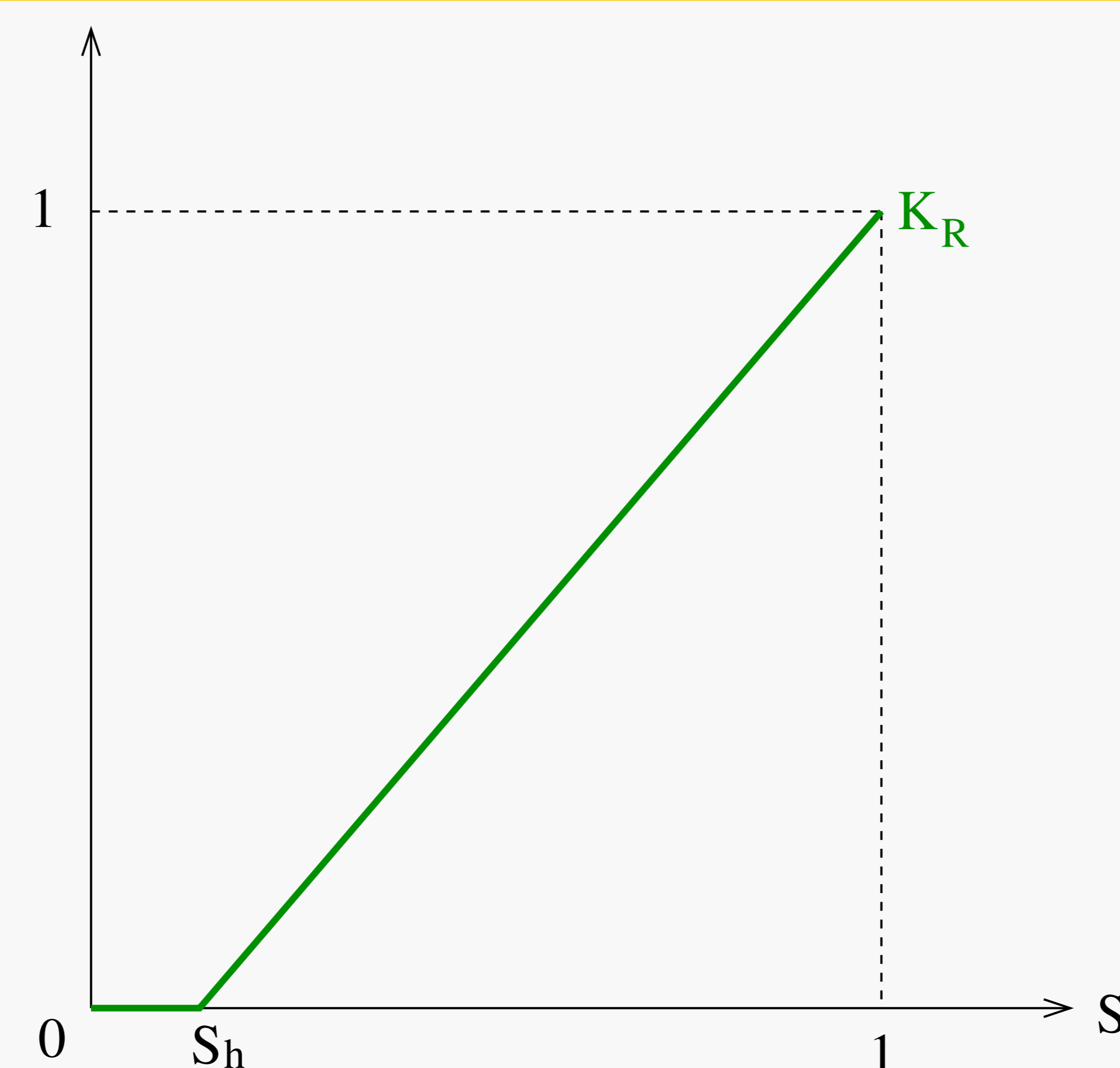
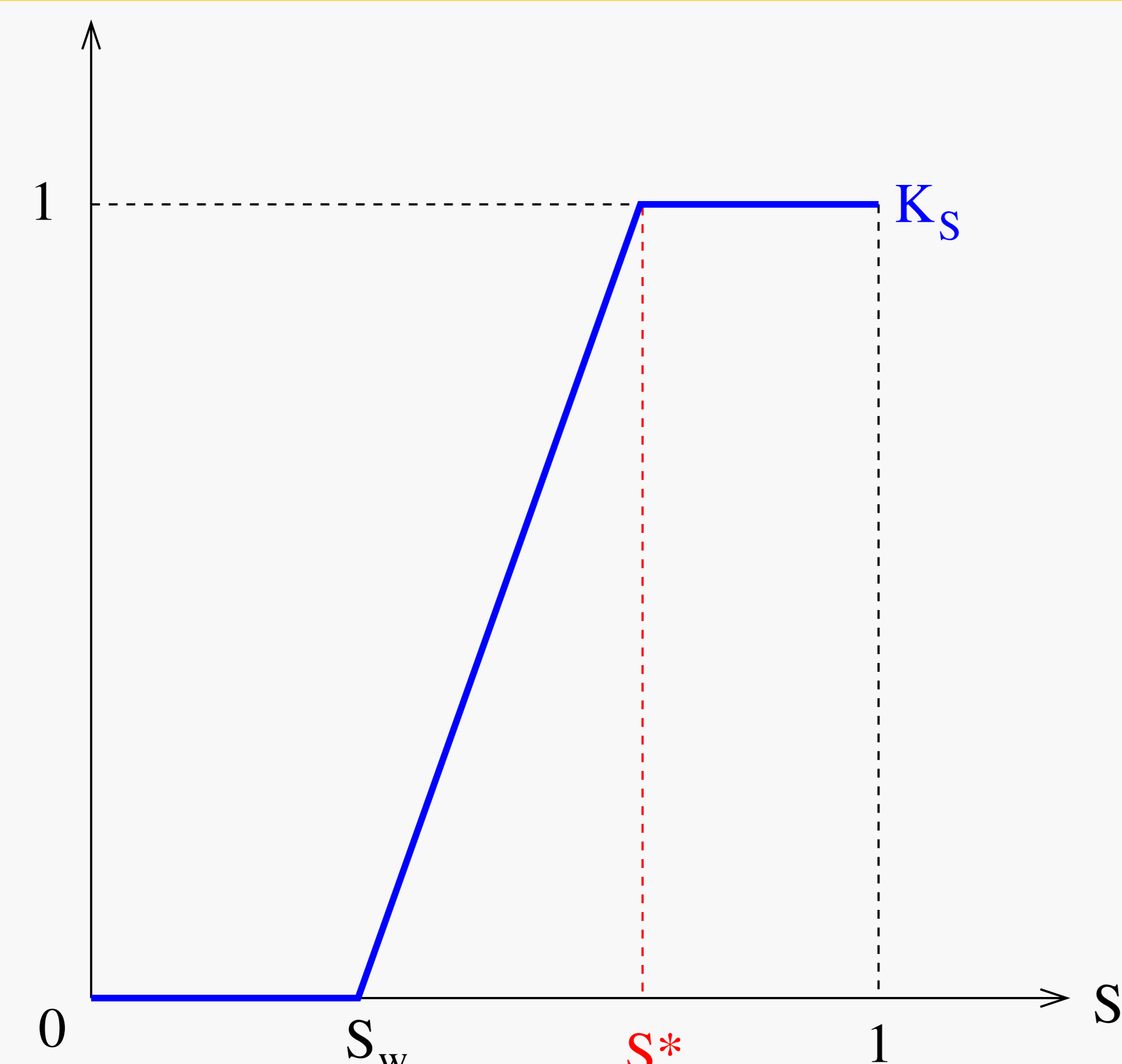
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## RESPONSE FUNCTIONS



Crops suffer from **water stress** (resp. **nitrogen stress**) when  $K_S$  is not maximum (resp.  $f$  is not maximum).

## PROBLEM FORMULATION

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- $$\begin{aligned} \max B(T) \quad & \text{under minimal water consumption} \iff \min_{u(\cdot)} \int_0^T u(\tau) d\tau \\ \text{s.t.} \quad & B(T) \text{ is maximum} \end{aligned}$$

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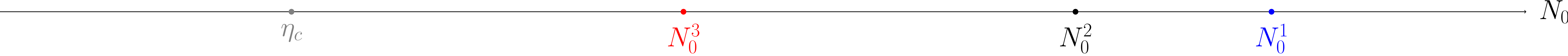
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## CONSTRAINED OPTIMAL CONTROL PROBLEM

$$\begin{aligned} \min_{u(\cdot)} \int_0^T u(\tau) d\tau, \quad (S_{0,S_0}^u(t), N_{0,S_0,N_0}^u(t)) \in E := \{(S,N) \in [0,1] \times \mathbb{R}_+ ; S \geq S^*, N \geq \eta_c S\}, \\ t \in [0,T] \end{aligned}$$

**PROPOSITION**

Depending on the initial  $N_0$ , one of the four strategies below is optimal.

 $\eta_c$  $N_0^3$  $N_0^2$  $N_0^1$  $N_0$

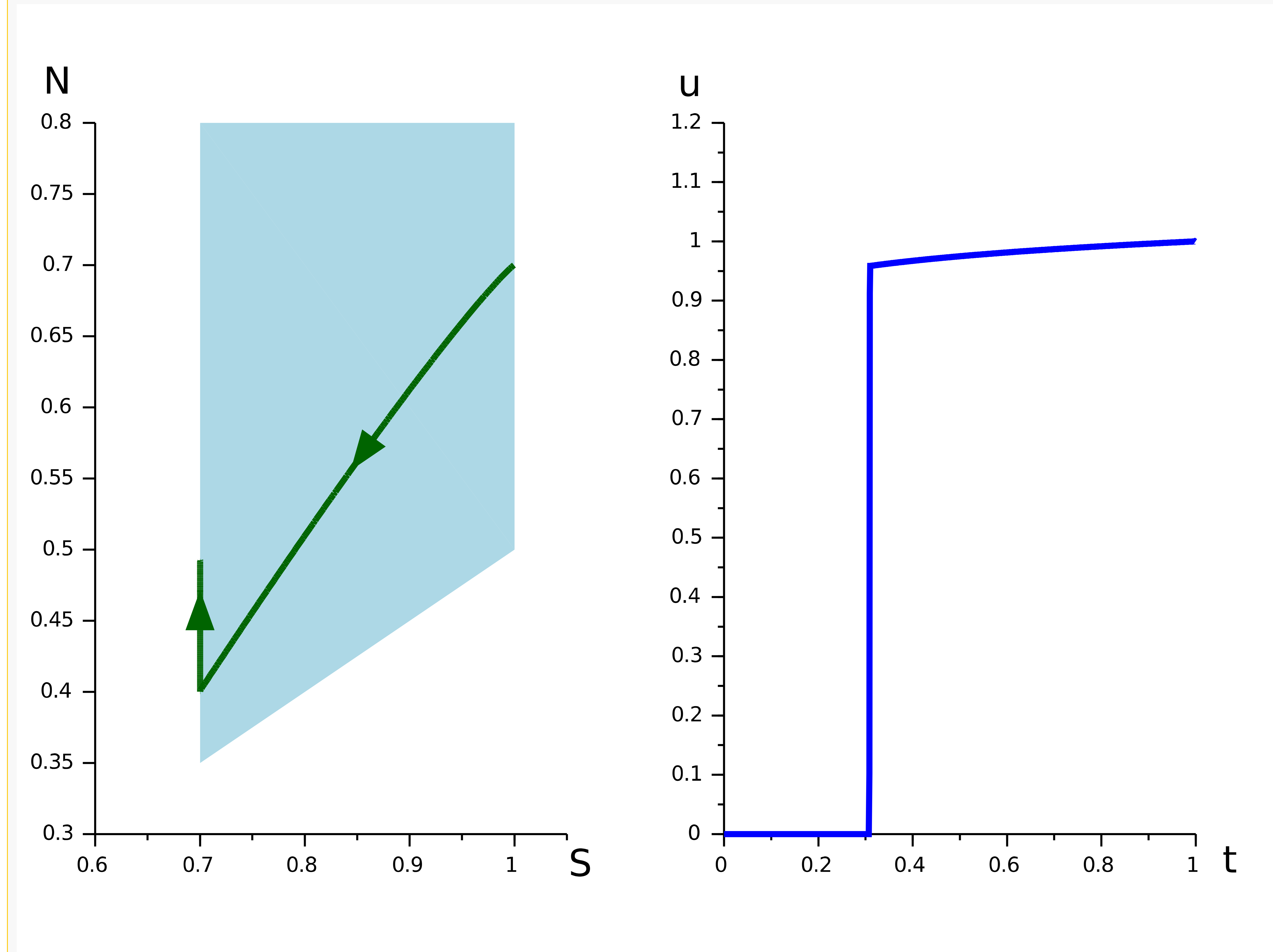


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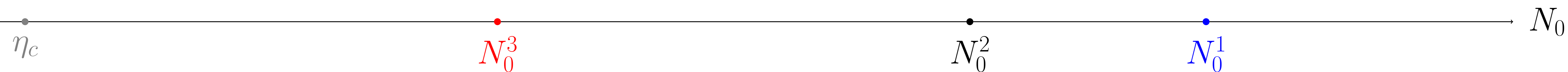


## STRATEGY 1 $\rightarrow N_0 \geq N_0^1$

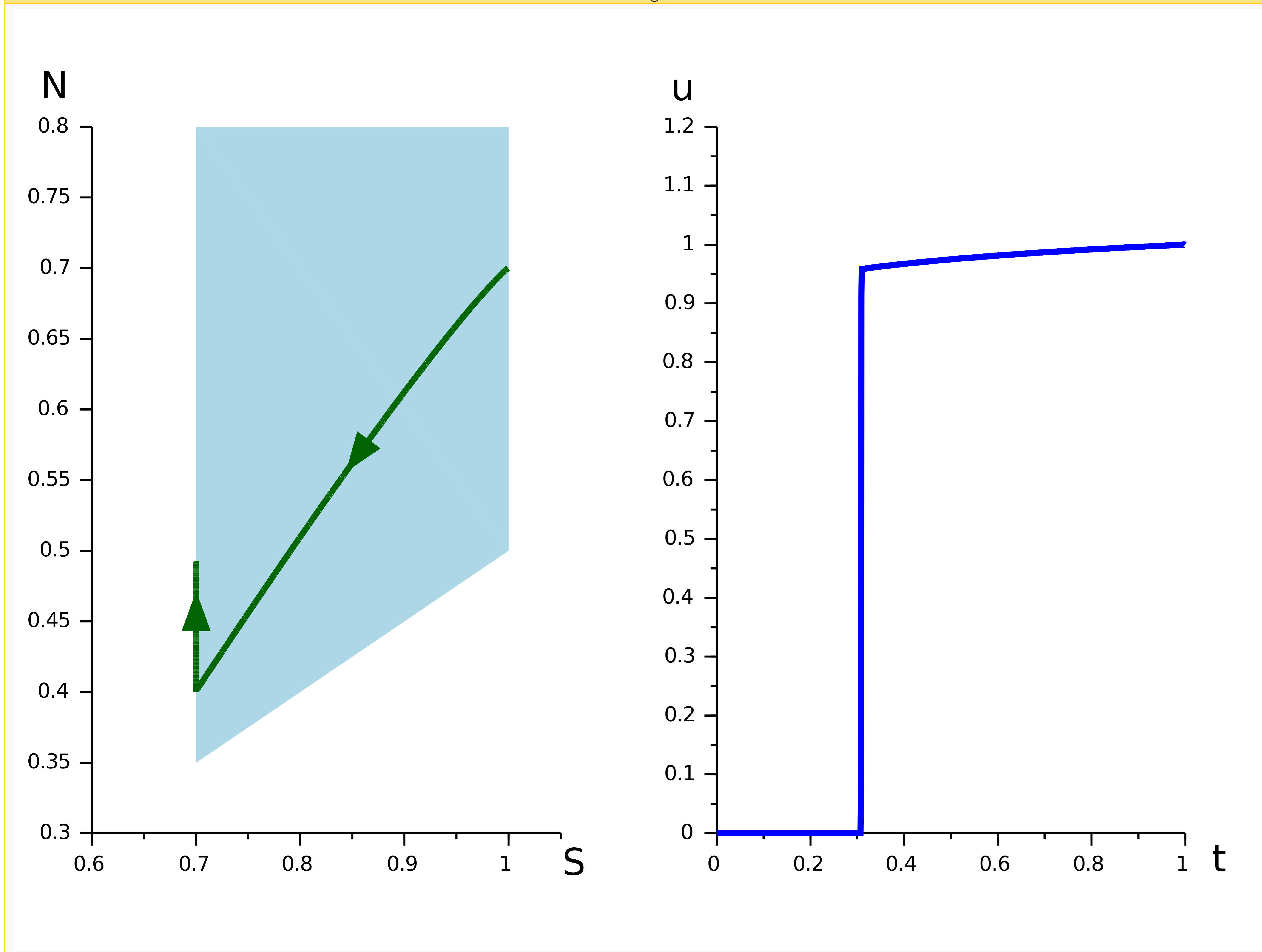


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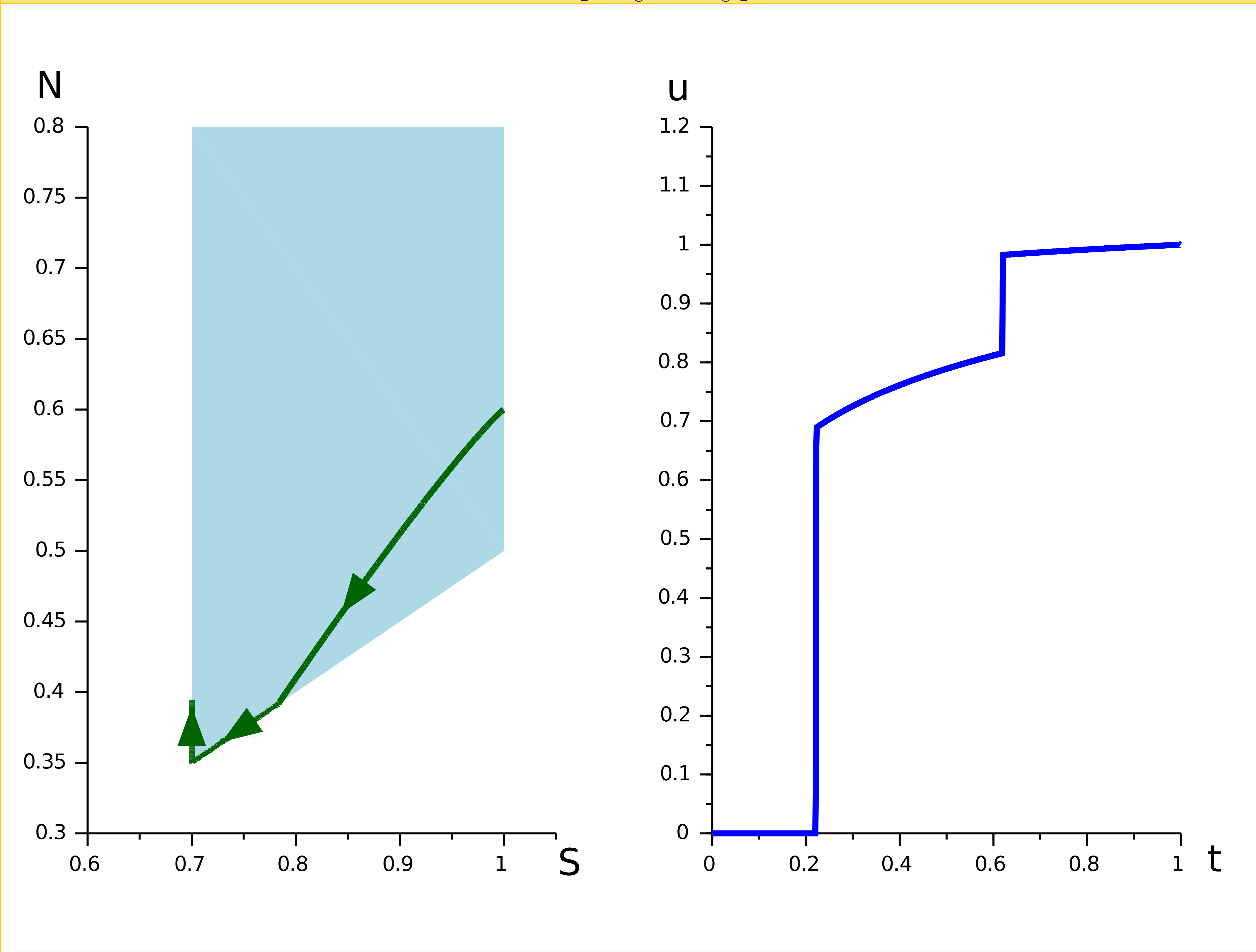
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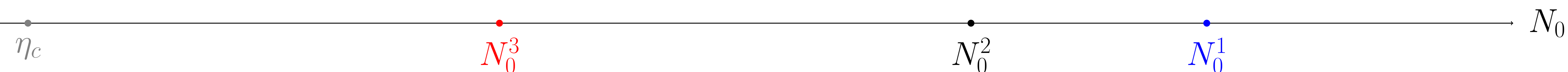


## STRATEGY 2 $\rightarrow N_0 \in [N_0^2, N_0^1]$

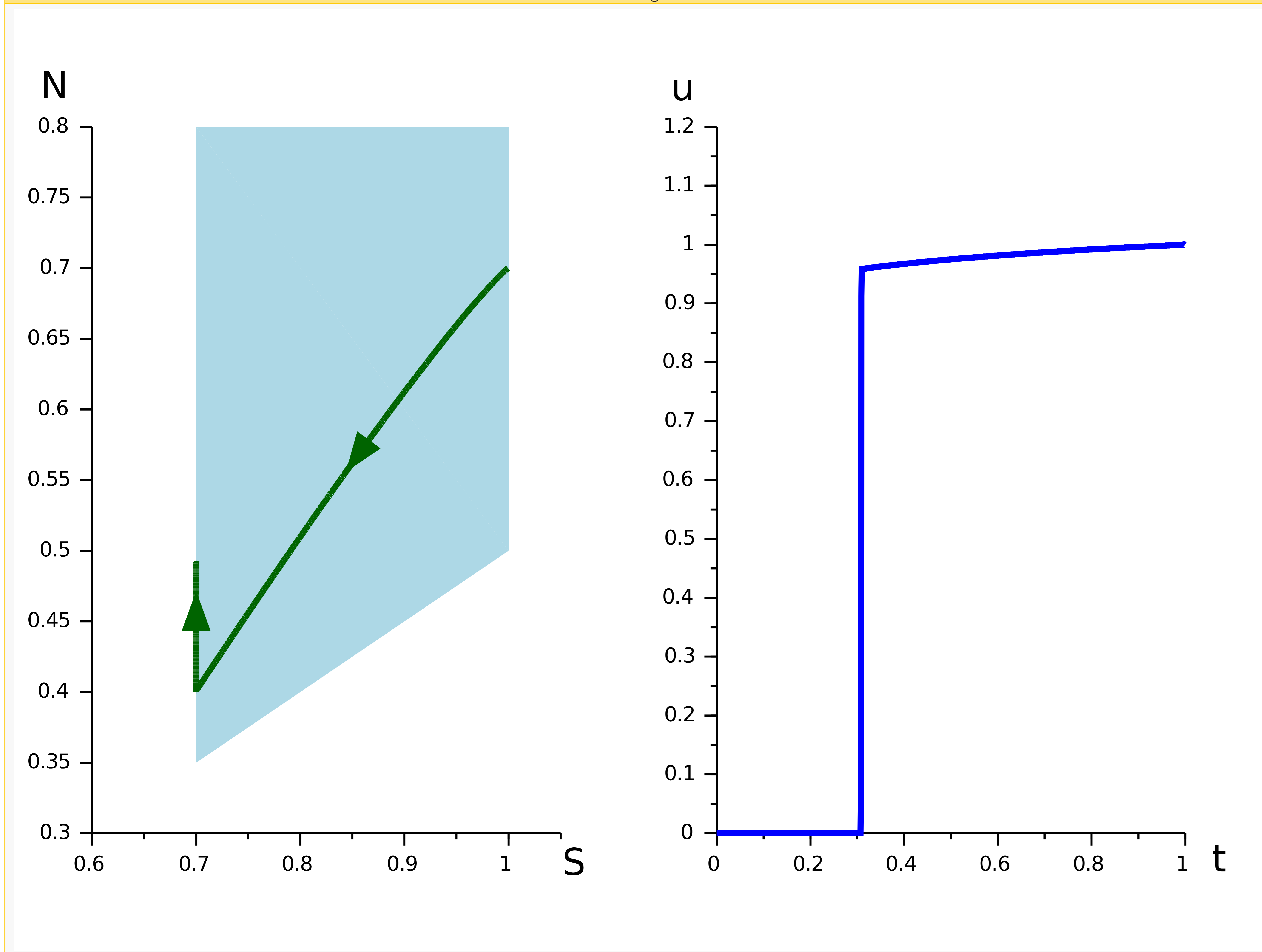


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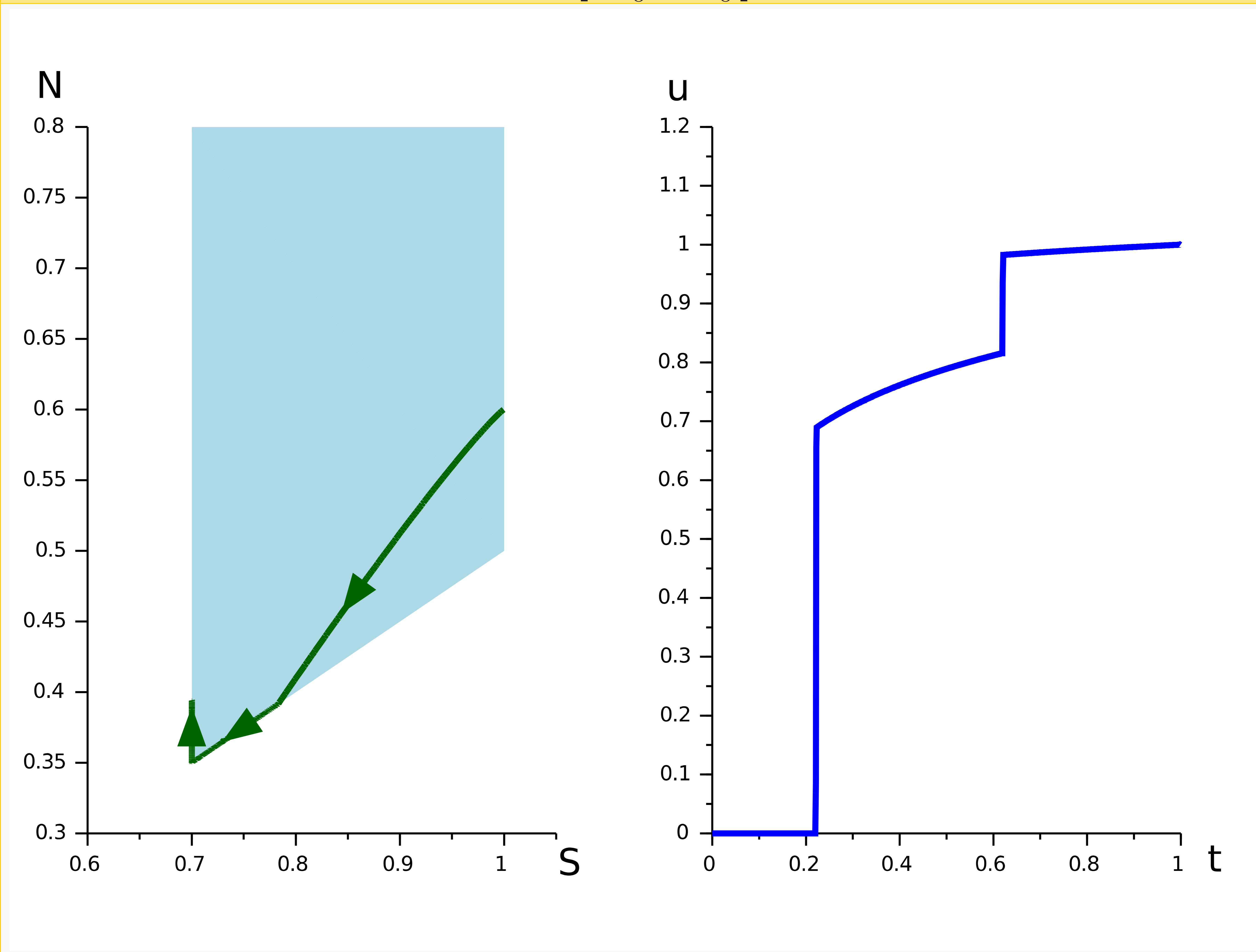
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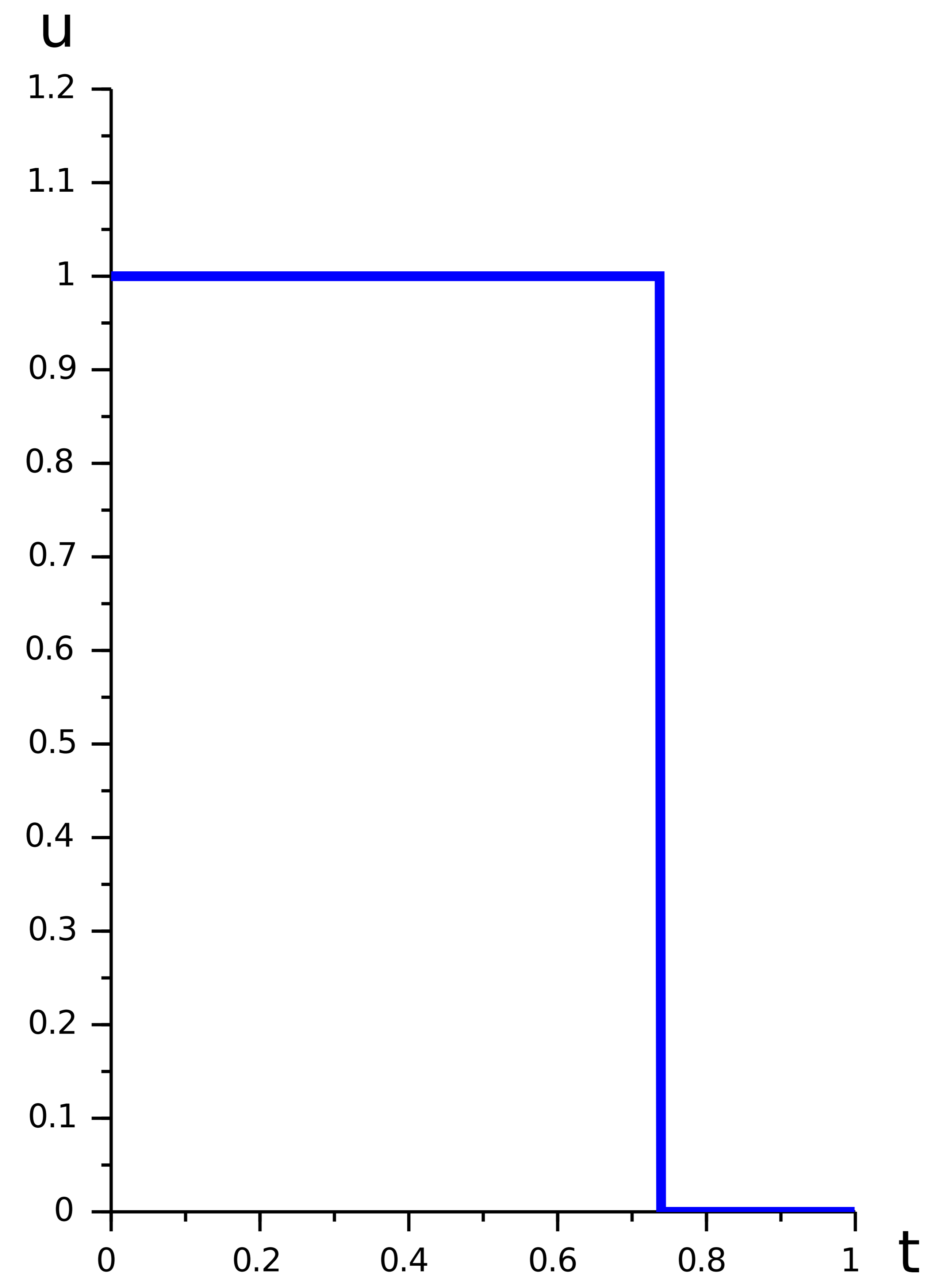
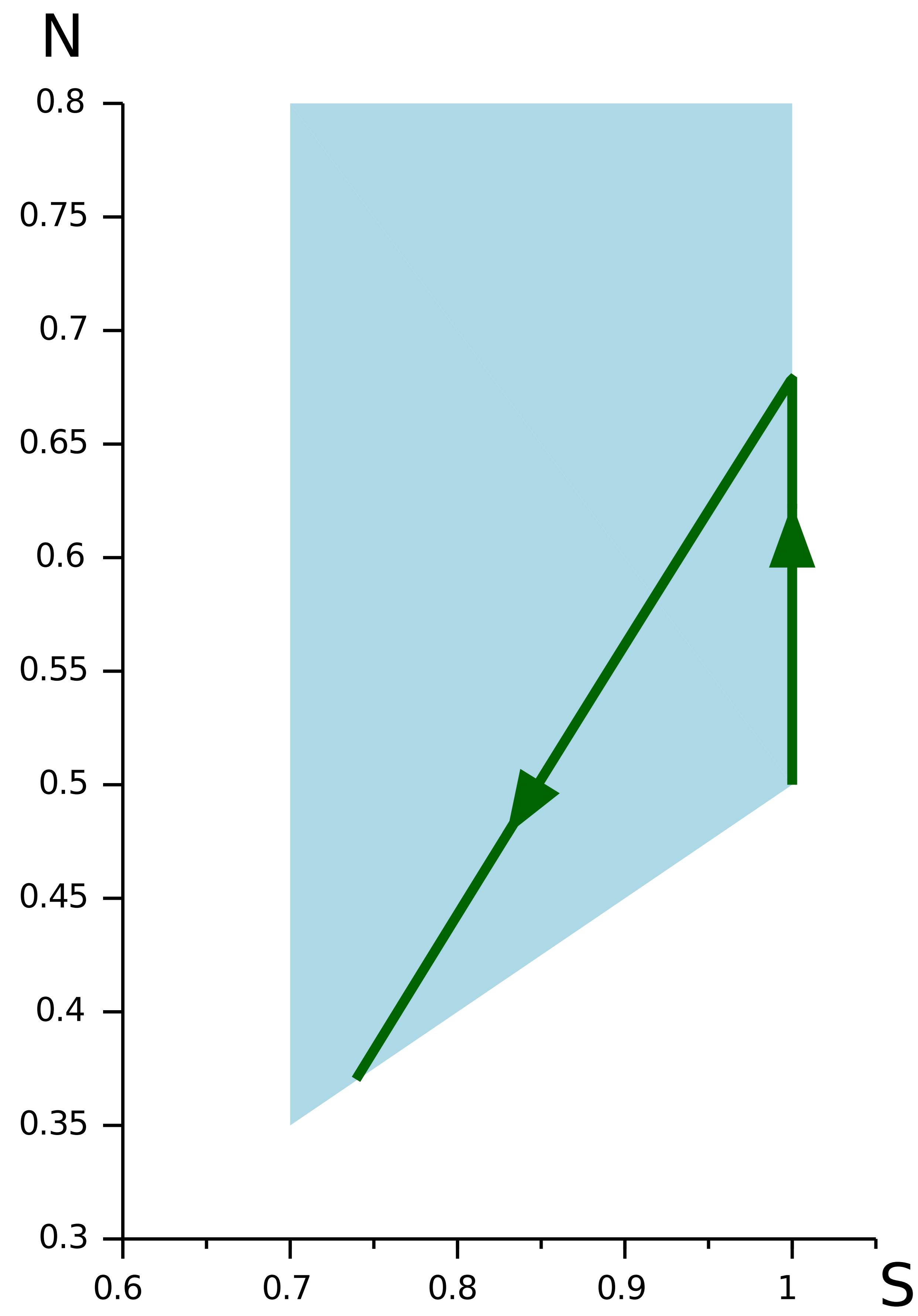
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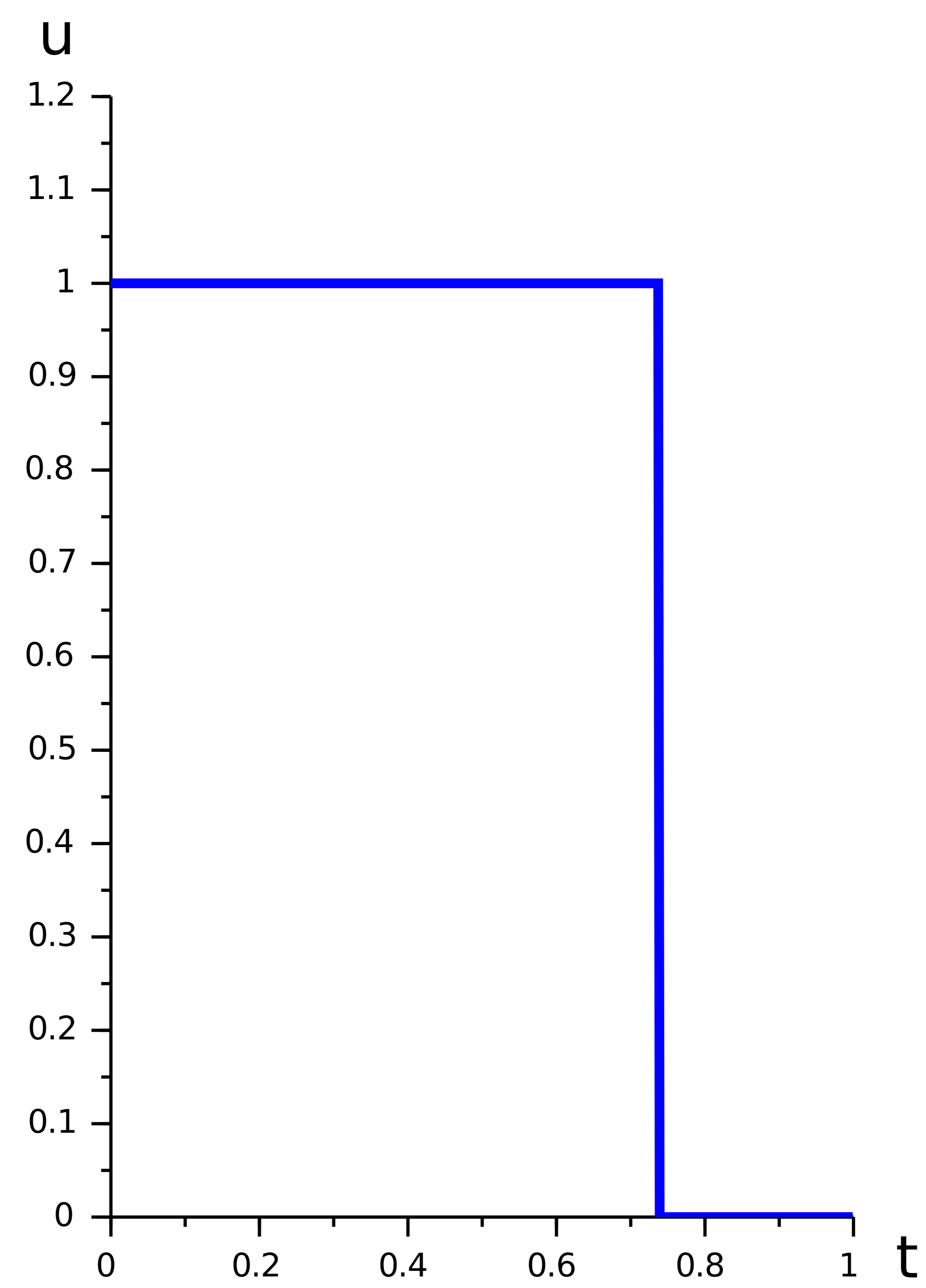
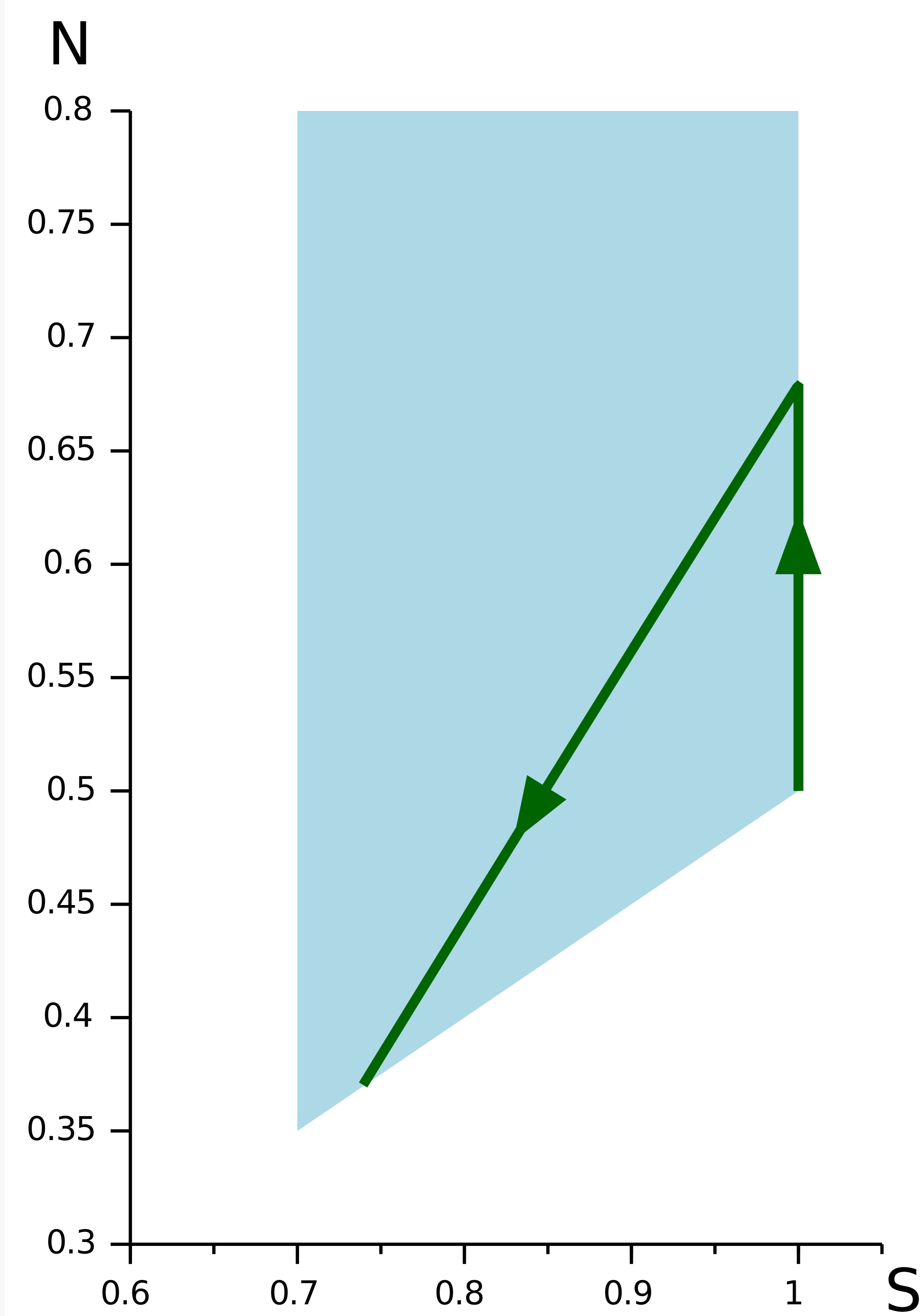
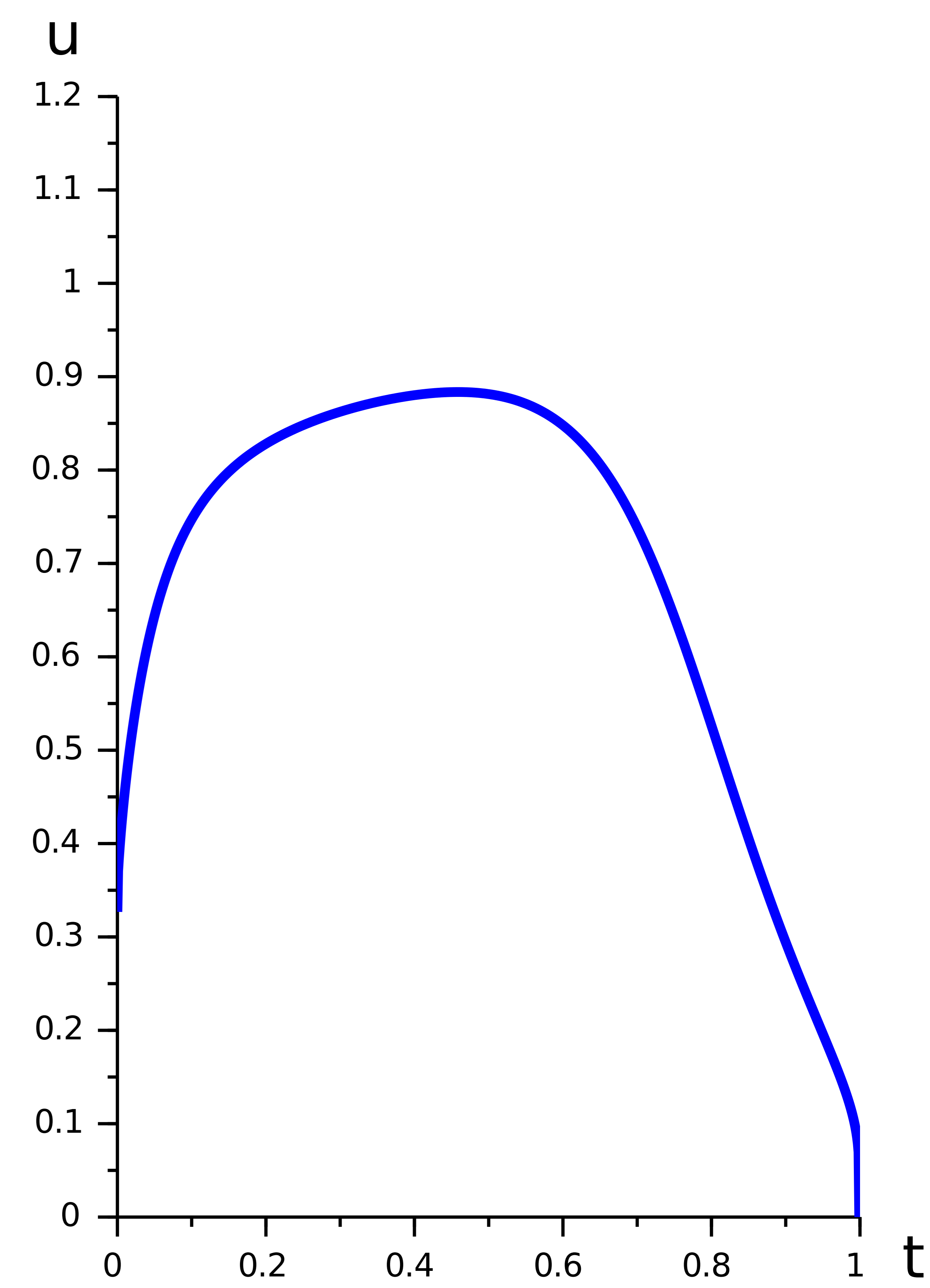
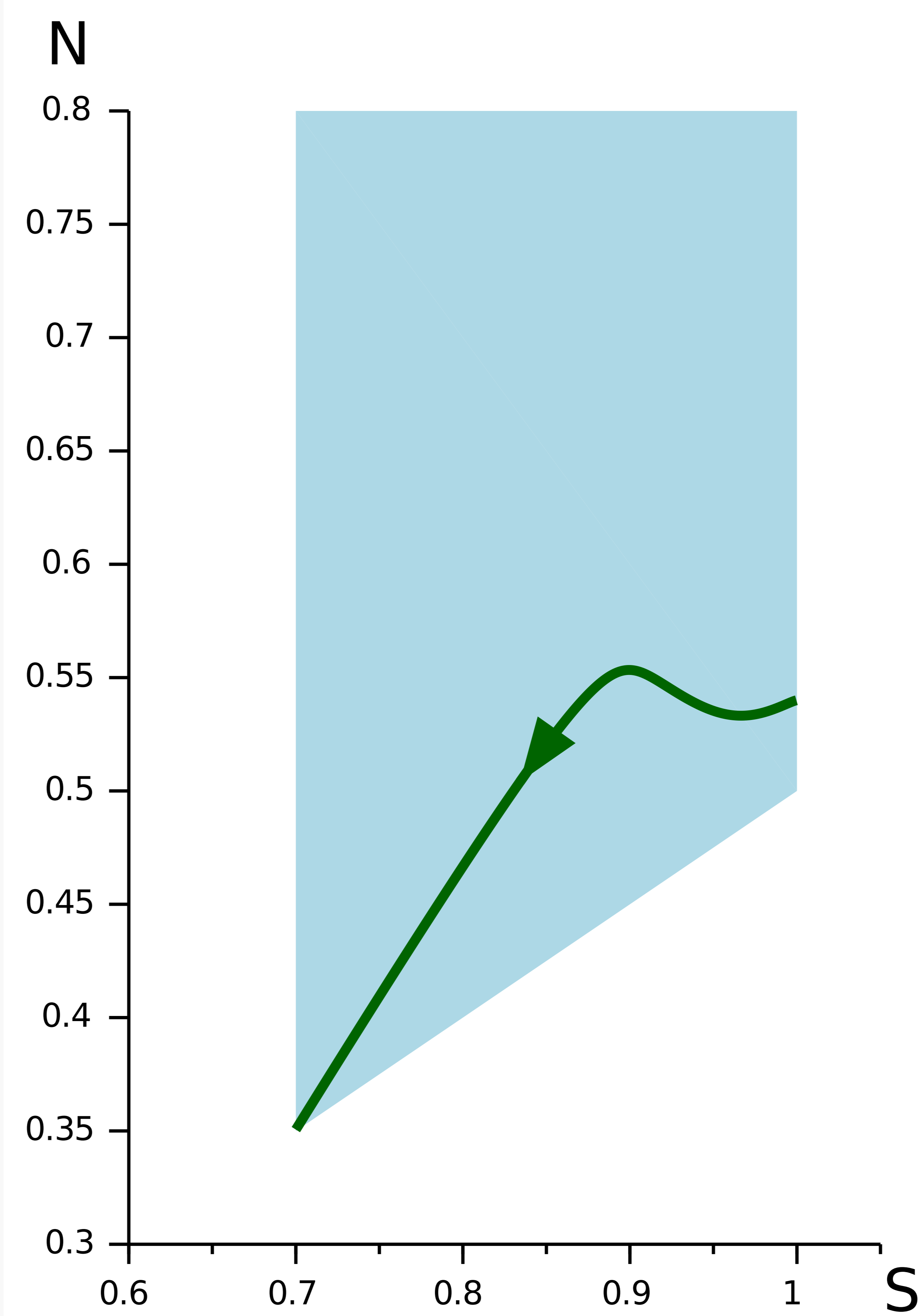


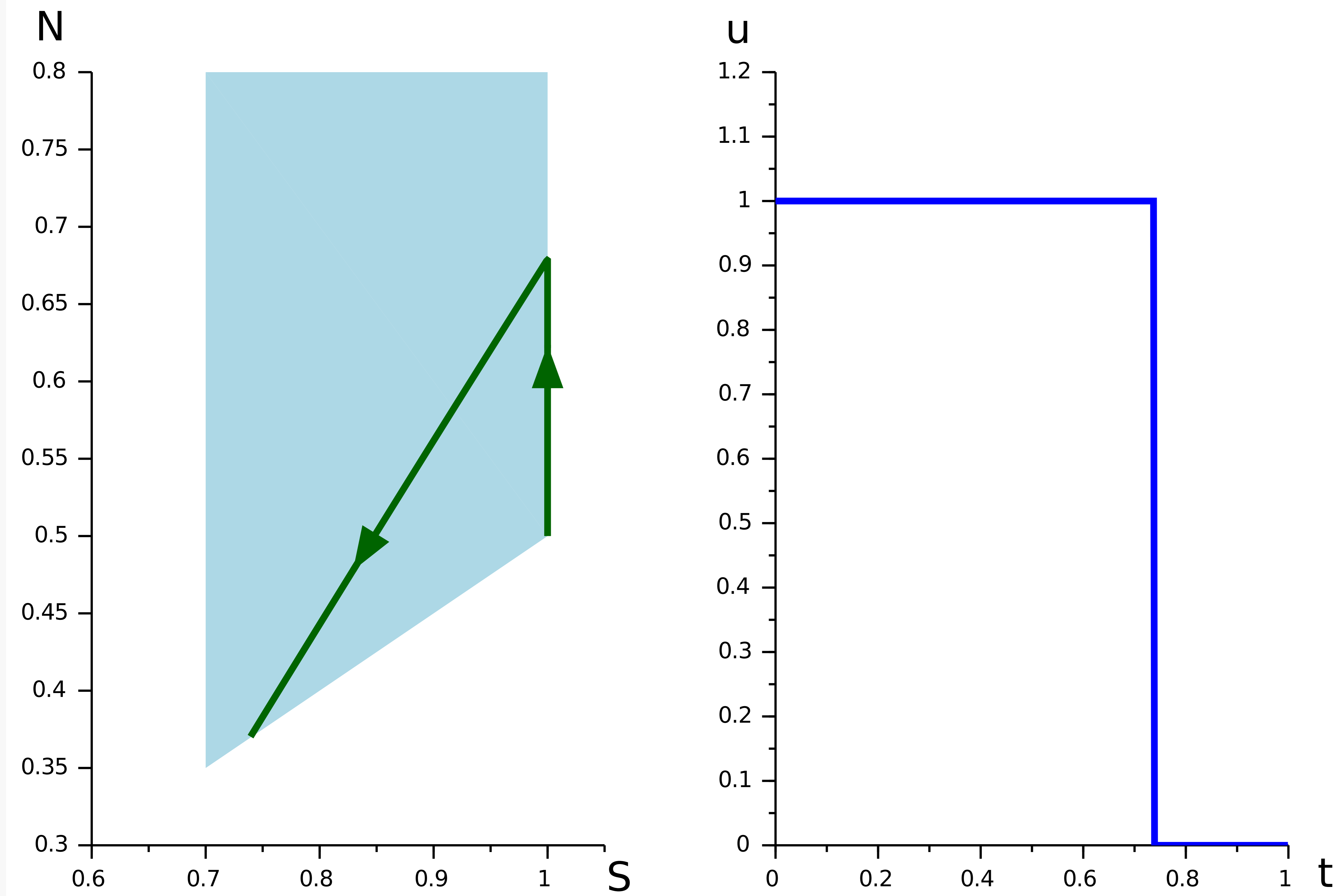
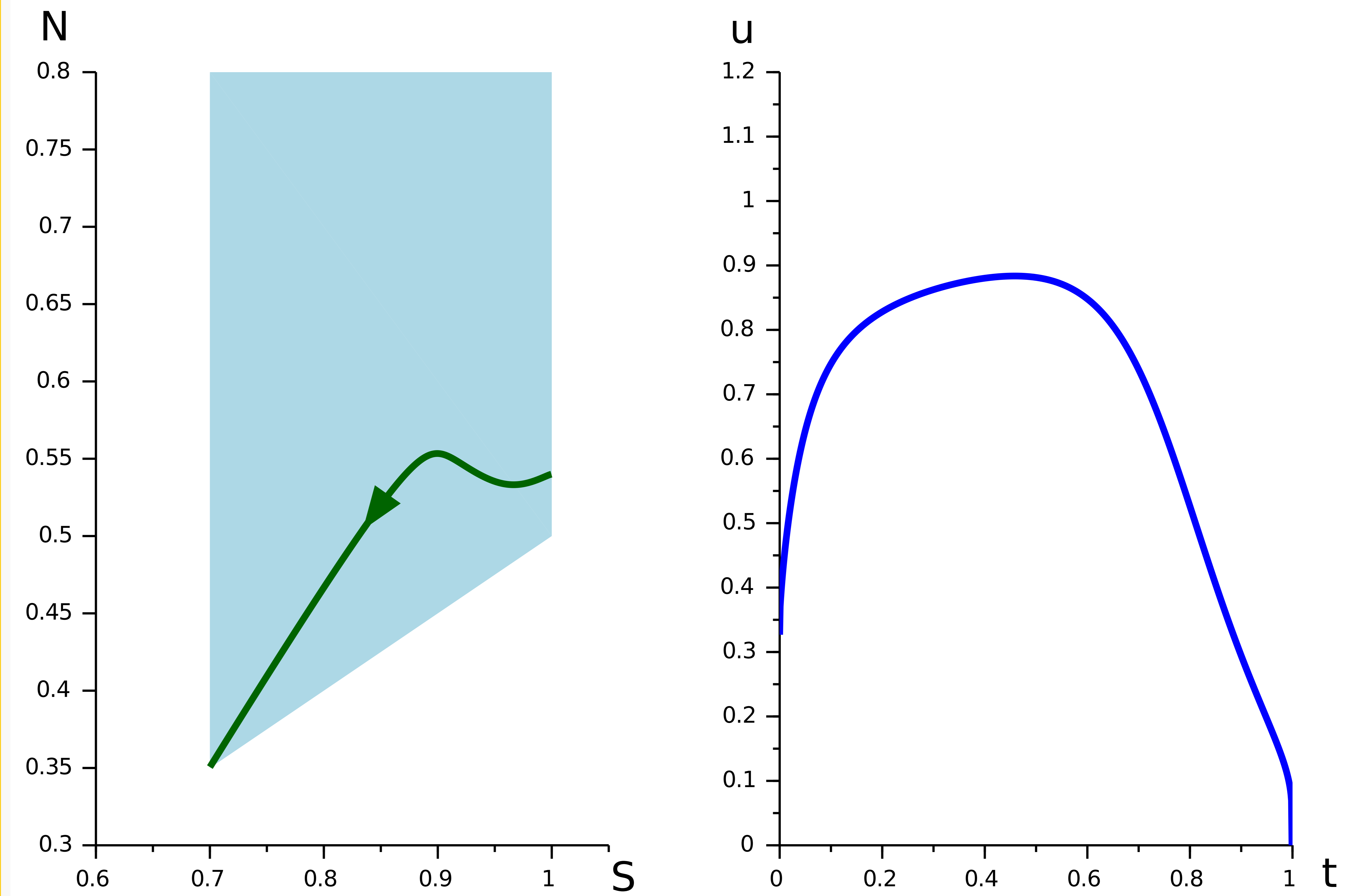
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# INTUITIVE STRAGIES

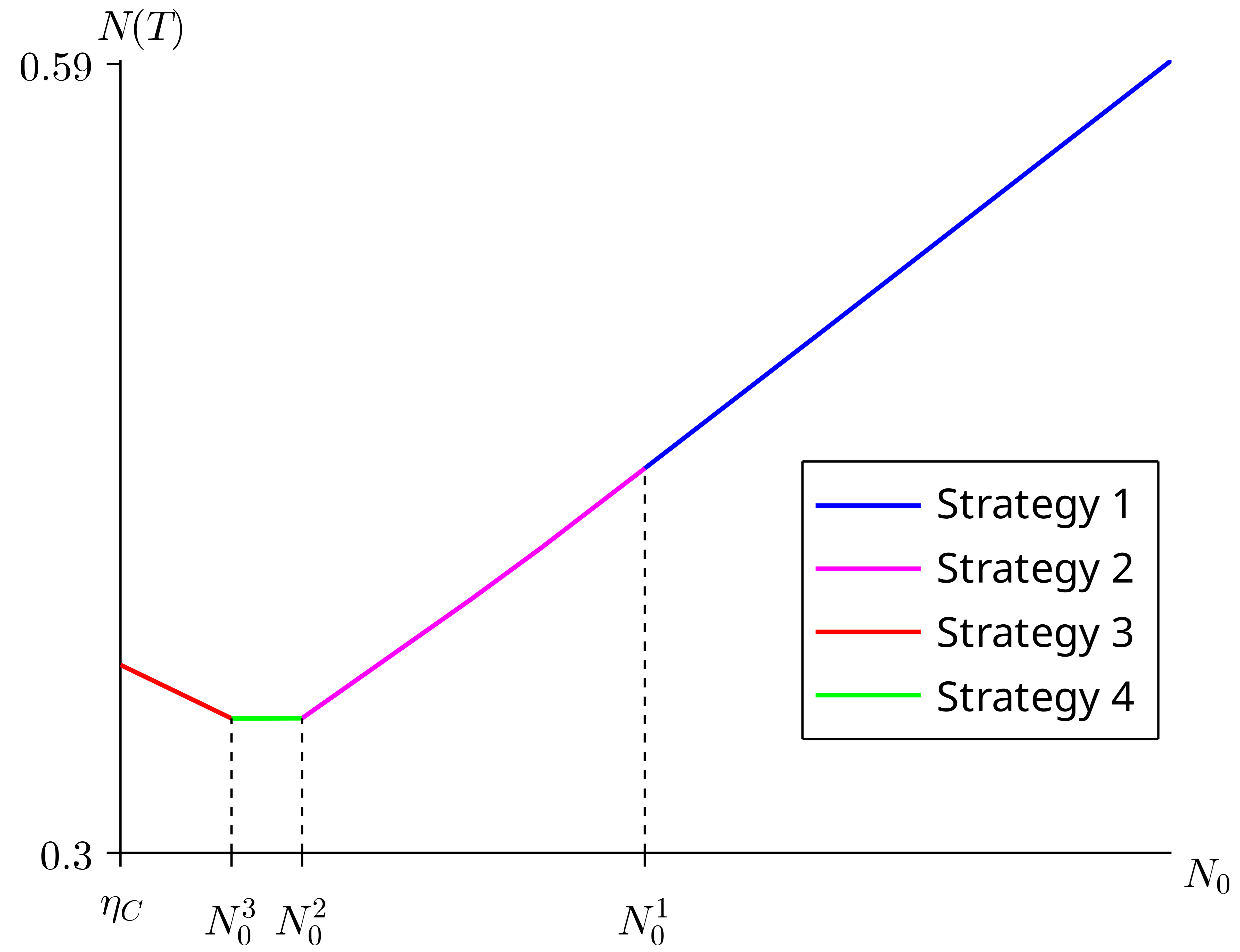
$\eta_c$  $N_0^3$  $N_0^2$  $N_0^1$  $N_0$ **STRATEGY 3**  $\rightarrow N_0 \in [\eta_c, N_0^3]$ 

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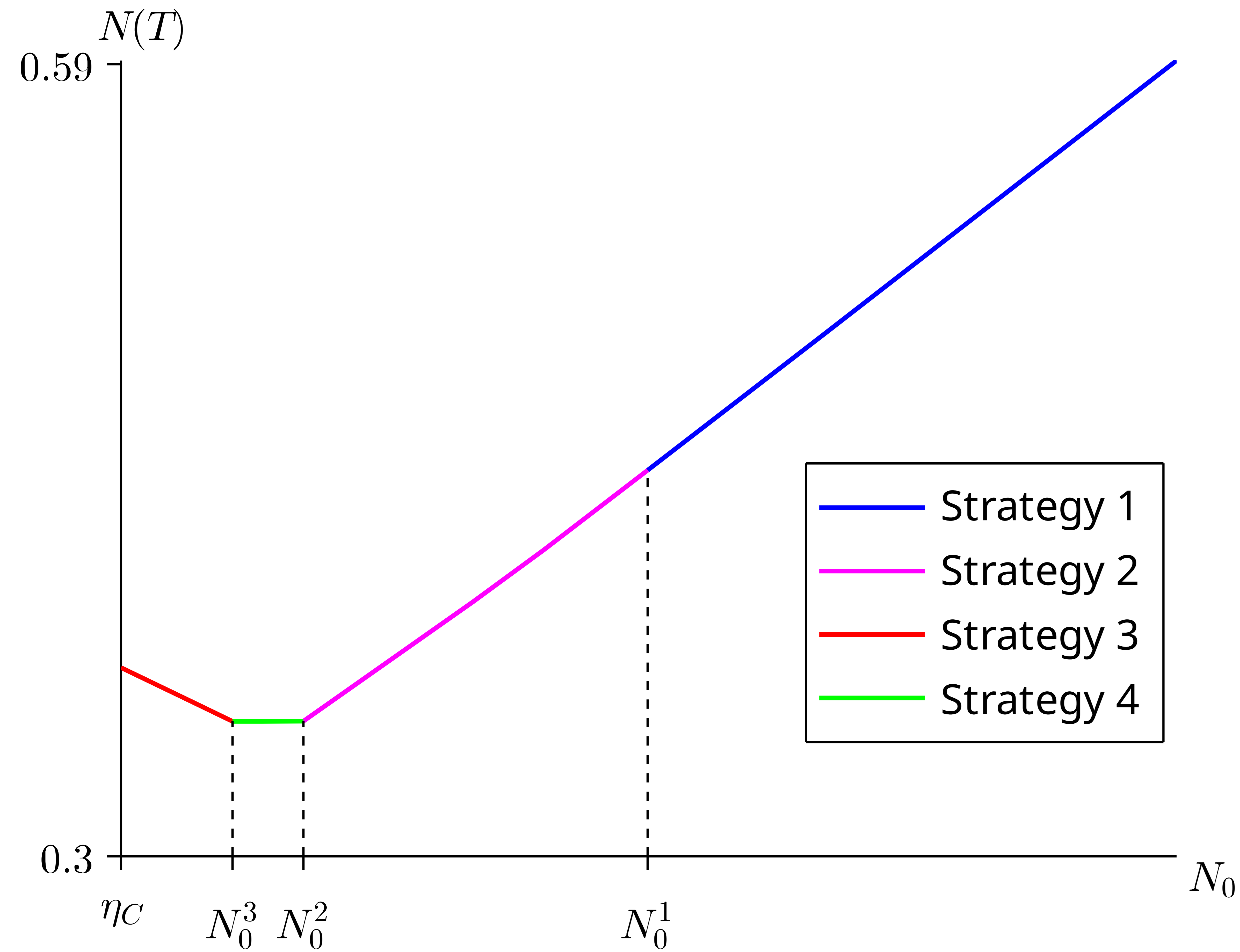


# FINAL NITROGEN

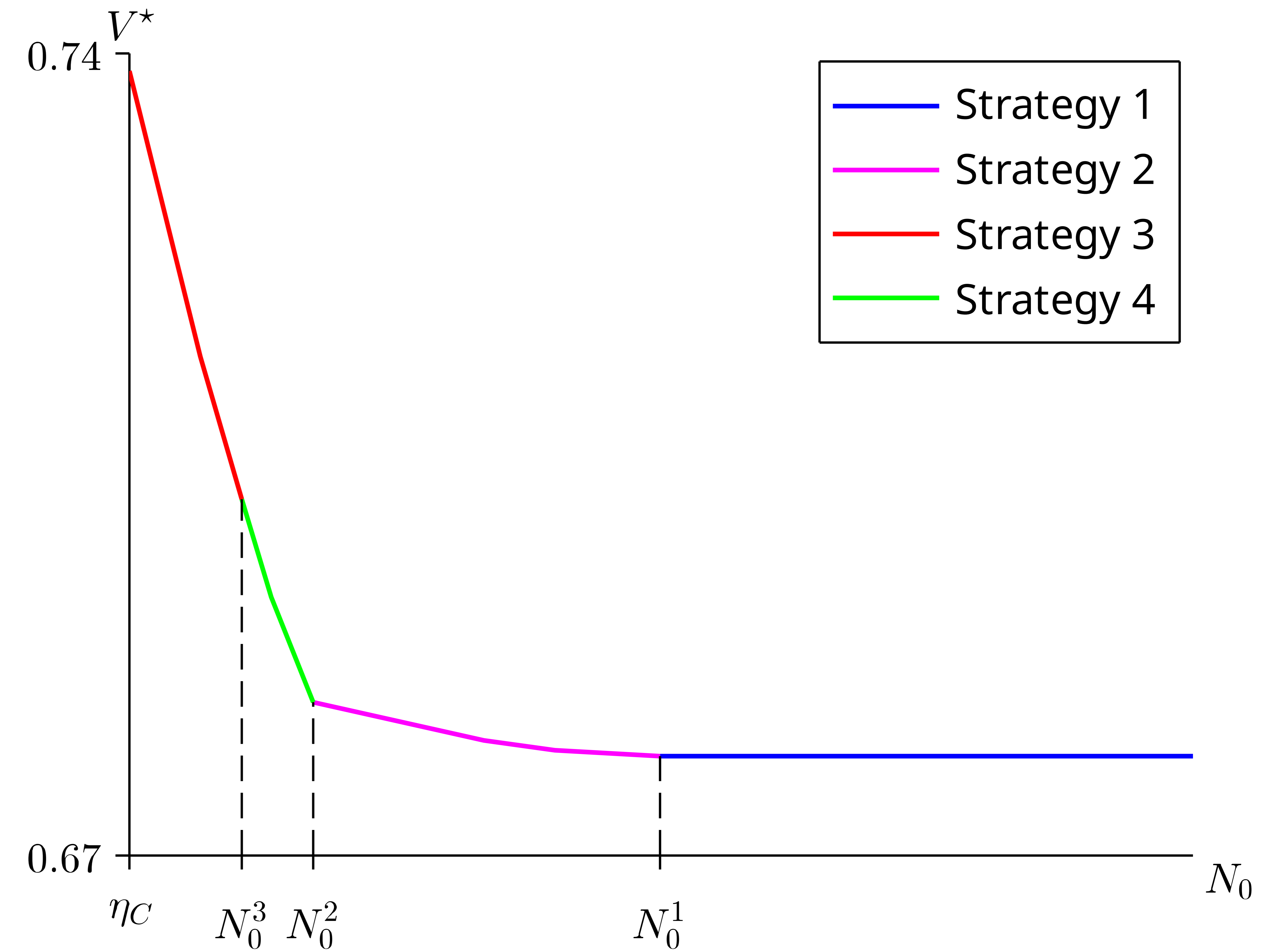




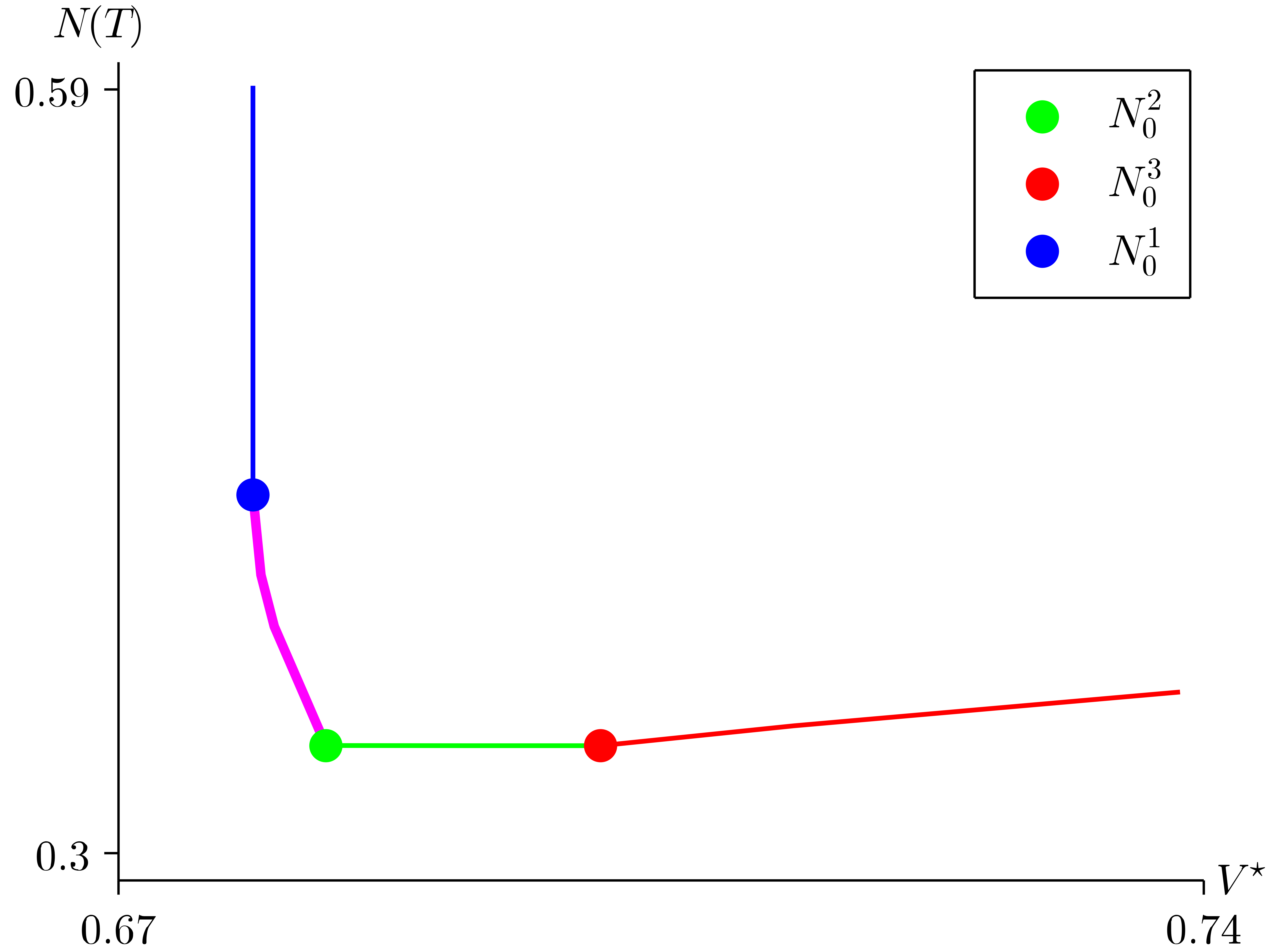
### FINAL NITROGEN



### MINIMAL WATER CONSUMPTION



# PARETO FRONT



## CONCLUSION



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- We proposed an optimized fertigation strategies based on a crop model, viability analysis, and optimal control techniques.
- If the initial nitrogen is high enough, wait for the right time to start irrigation.
- If the initial nitrogen is very low, irrigation must be anticipated from the start of the season.

## ACCESS TO THE PAPER



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Merci de votre attention !

