

Considering Sequence-Dependent Stochasticity in Production Schedules

Michael Manitz

Tel.: (+49 203) 3 79 - 14 43

E-Mail: michael.manitz@uni-due.de

Duisburg/Essen University

Faculty of Business Administration (Mercator School of Management)

Department of Technology and Operations Management

Professor for Production & Supply Chain Management

Lotharstr. 65

47057 Duisburg

GERMANY

<http://www.msm.uni-due.de/pui>

Joint work with:

- ▶ **Frank Herrmann** (OTH Regensburg)
- ▶ **Maximilian Munninger** (Duisburg/Essen University)

A (simplest) example 2 Stages

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Index Sets

\mathcal{K} ... 3 products: $k = A1$ and $k = B1$ and $k = C1$

\mathcal{N}_k ... the components k that are needed for the final production process;
 $\mathcal{N}_{A2} = \{A1\}$, $\mathcal{N}_{B2} = \{B1\}$, $\mathcal{N}_{C2} = \{C1\}$, $\mathcal{N}_{A1} = \mathcal{N}_{B1} = \mathcal{N}_{C1} = \emptyset$

\mathcal{J} ... 2 bottleneck machines whose limited capacity concerns

Parameters

d_{kt} ... demand for product k in period t

s_k ... setup costs for product k

h_k ... holding costs for product k

tb_{jk} ... processing time per unit for product k on machine j

tr_{jk} ... setup time for product k on machine j

b_{jt} ... available capacity of machine j in period t

z_k ... pre-specified lead time for product k

MLCLSP

Minimize costs $Z = \sum_{k \in \mathcal{K}} \sum_{t=1}^T (h_k \cdot y_{kt} + s_k \cdot \gamma_{kt})$

subject to:

Initial inventory y_{k0} given due to a rolling planning horizon. $(k \in \mathcal{K})$

Demand in period t (inventory balance):

$$y_{k,t-1} + q_{k,t-z_k} - \sum_{i \in \mathcal{N}_k} a_{ki} \cdot q_{it} - y_{kt} = d_{kt} \quad (k \in \mathcal{K}; t = 1, 2, \dots, T)$$

Capacities in period t :

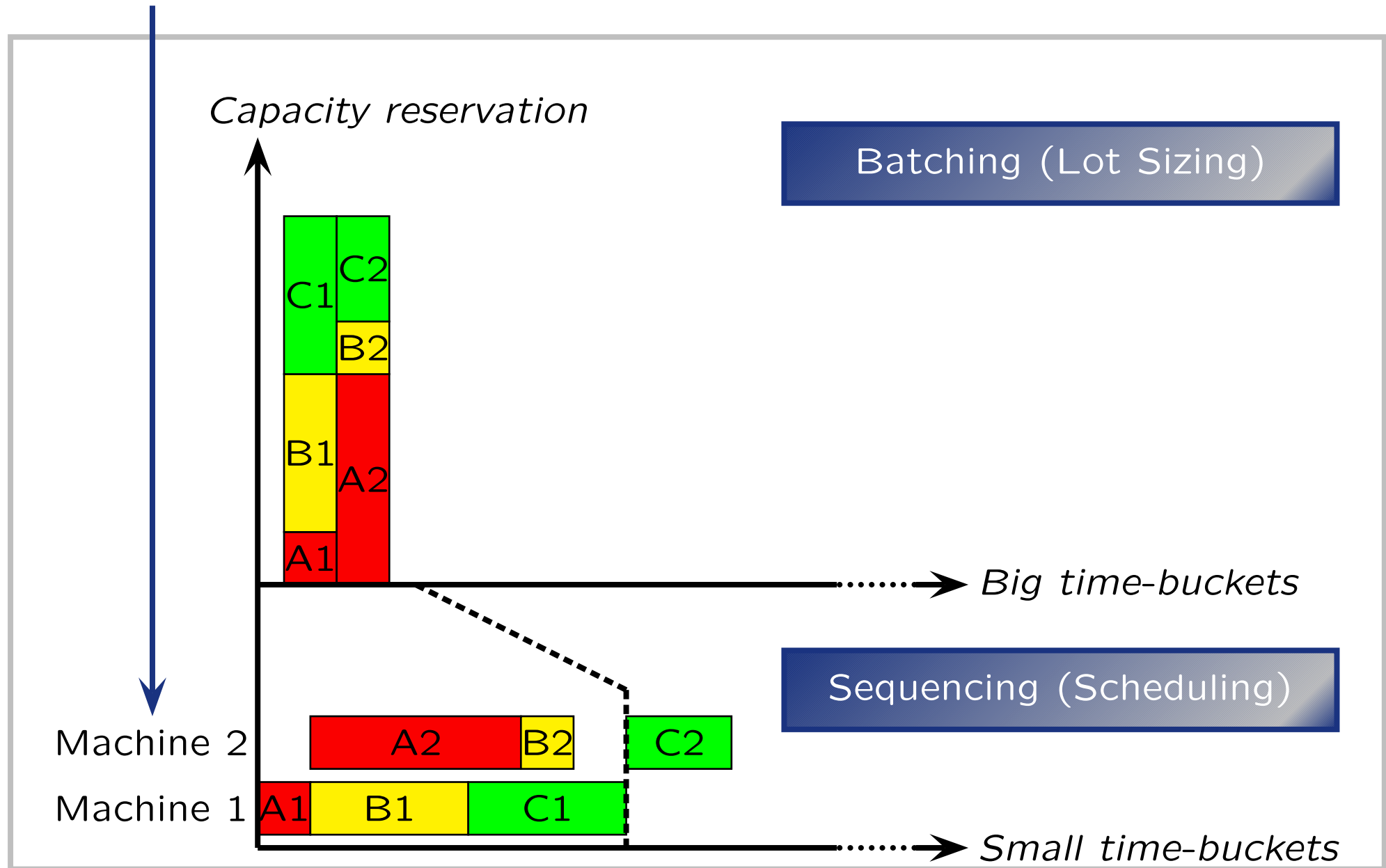
$$\sum_{k \in \mathcal{K}} (\text{tb}_{kj} \cdot q_{kt} + \text{tr}_{kj} \cdot \gamma_{kt}) \leq b_{jt} \quad (j \in \mathcal{J}; t = 1, 2, \dots, T)$$

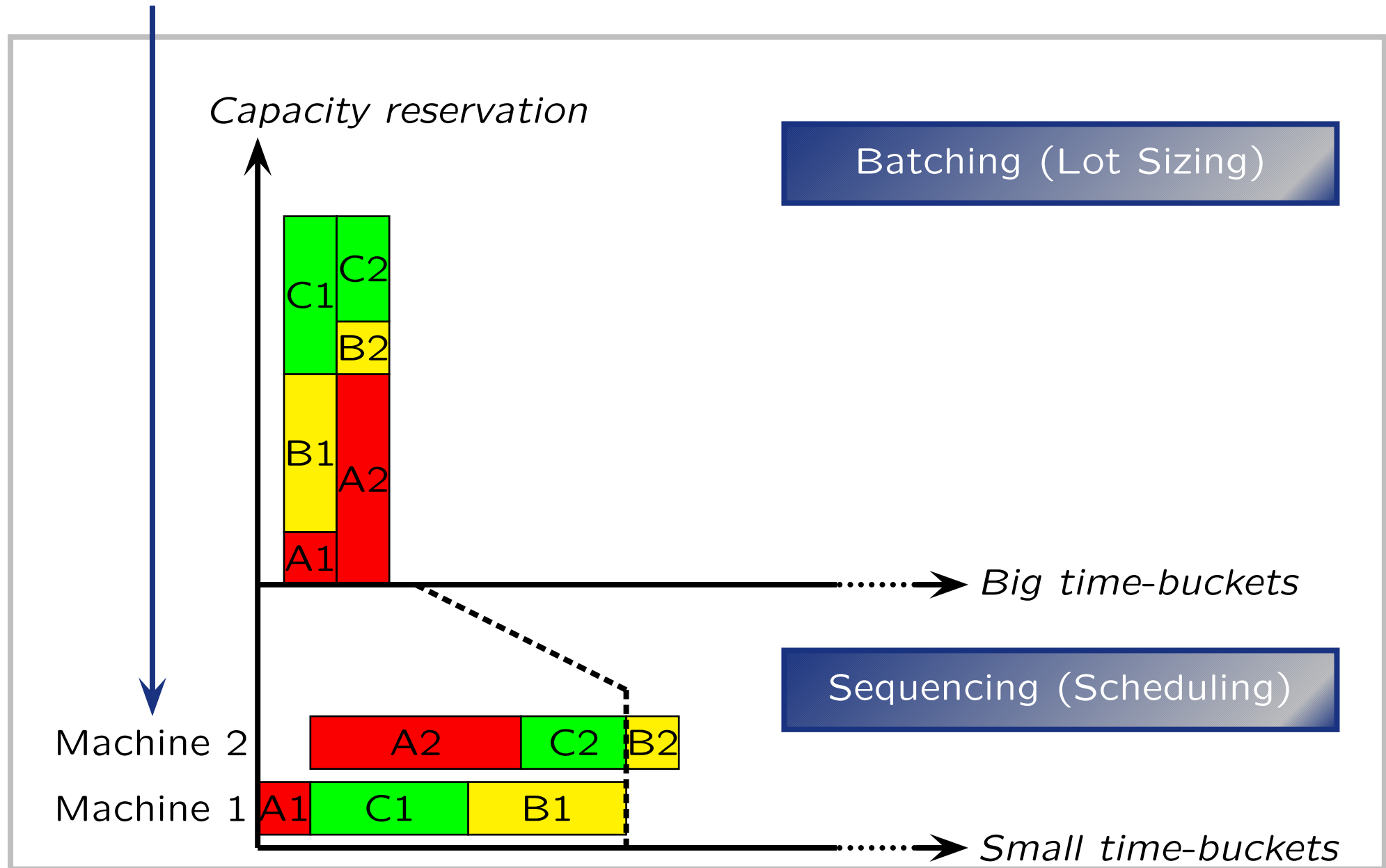
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Tardinesses cannot be avoided.

Why the implementation of the production schedules from a deterministic optimization model leads to stochastic results ?

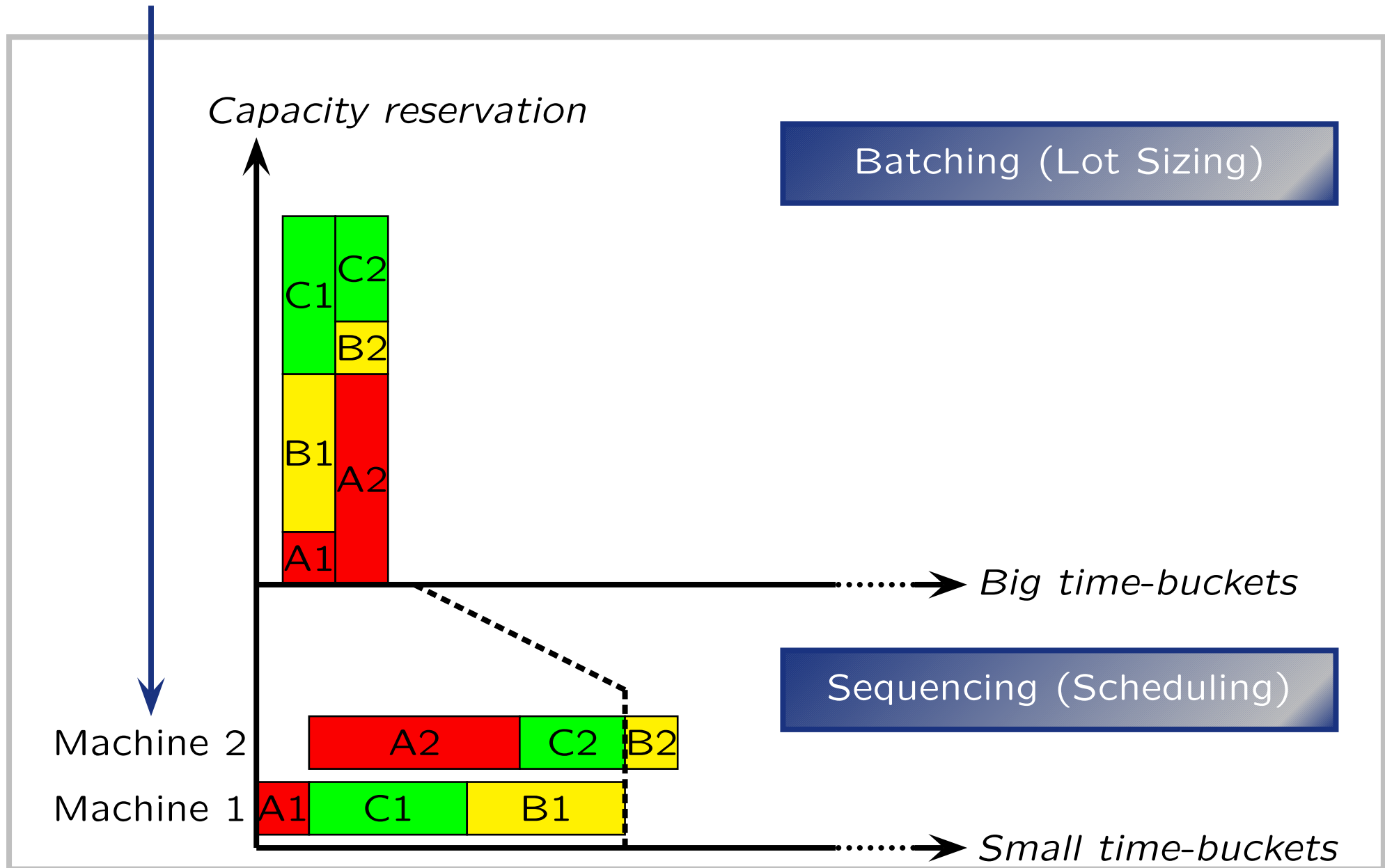
[Even if all the parameters are assumed to be deterministic !]

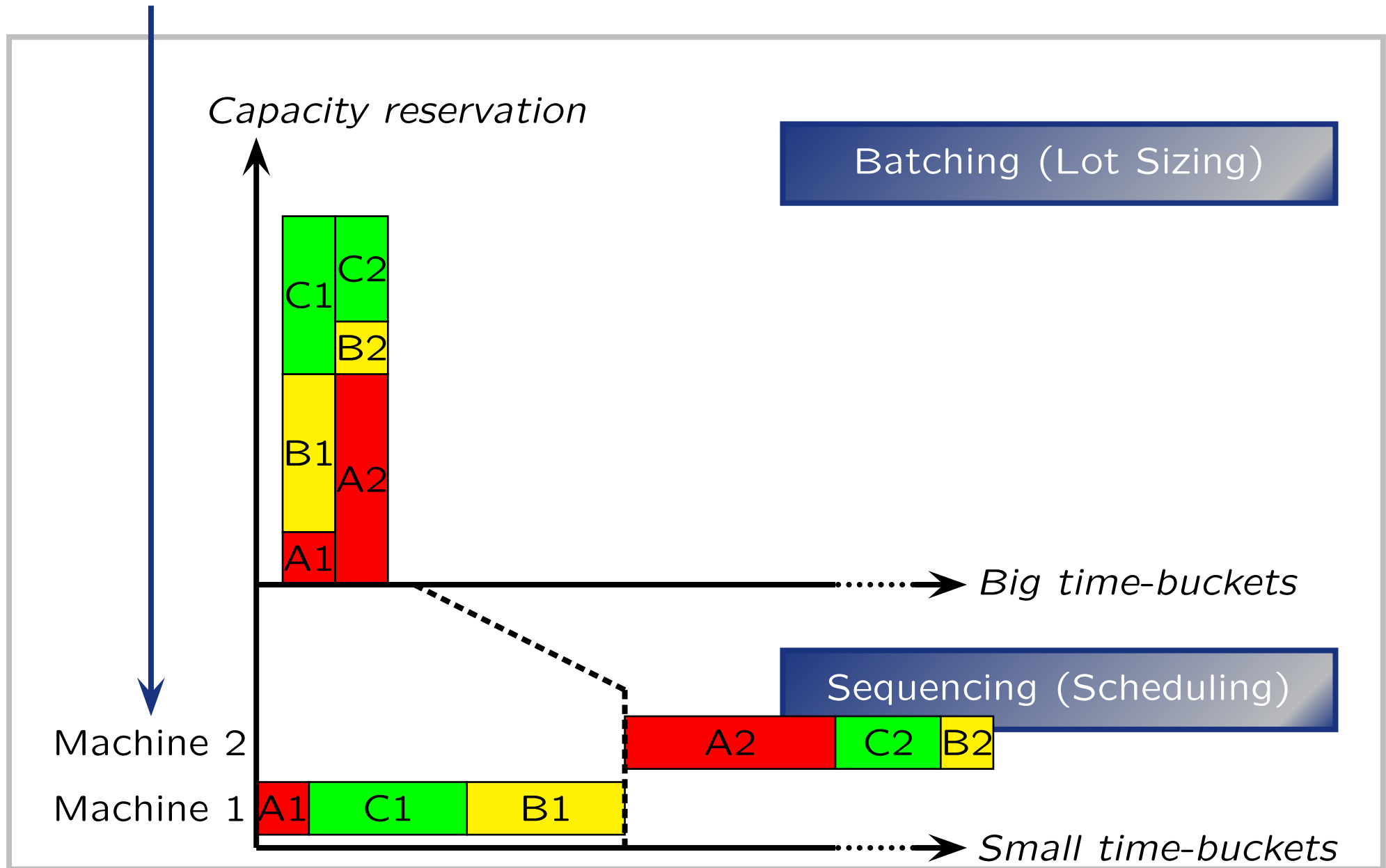
...

- ▶ sequencing rules
- ▶ sequencing constraints

The results of their application later on are not known during the rough-cut capacity planning (big-bucket model) and, hence, are unpredictable and—finally—stochastic.

Augmenting the planned lead times—with or without doing anything—is the wrong answer.





How to estimate the (expected) amount of backlog ?

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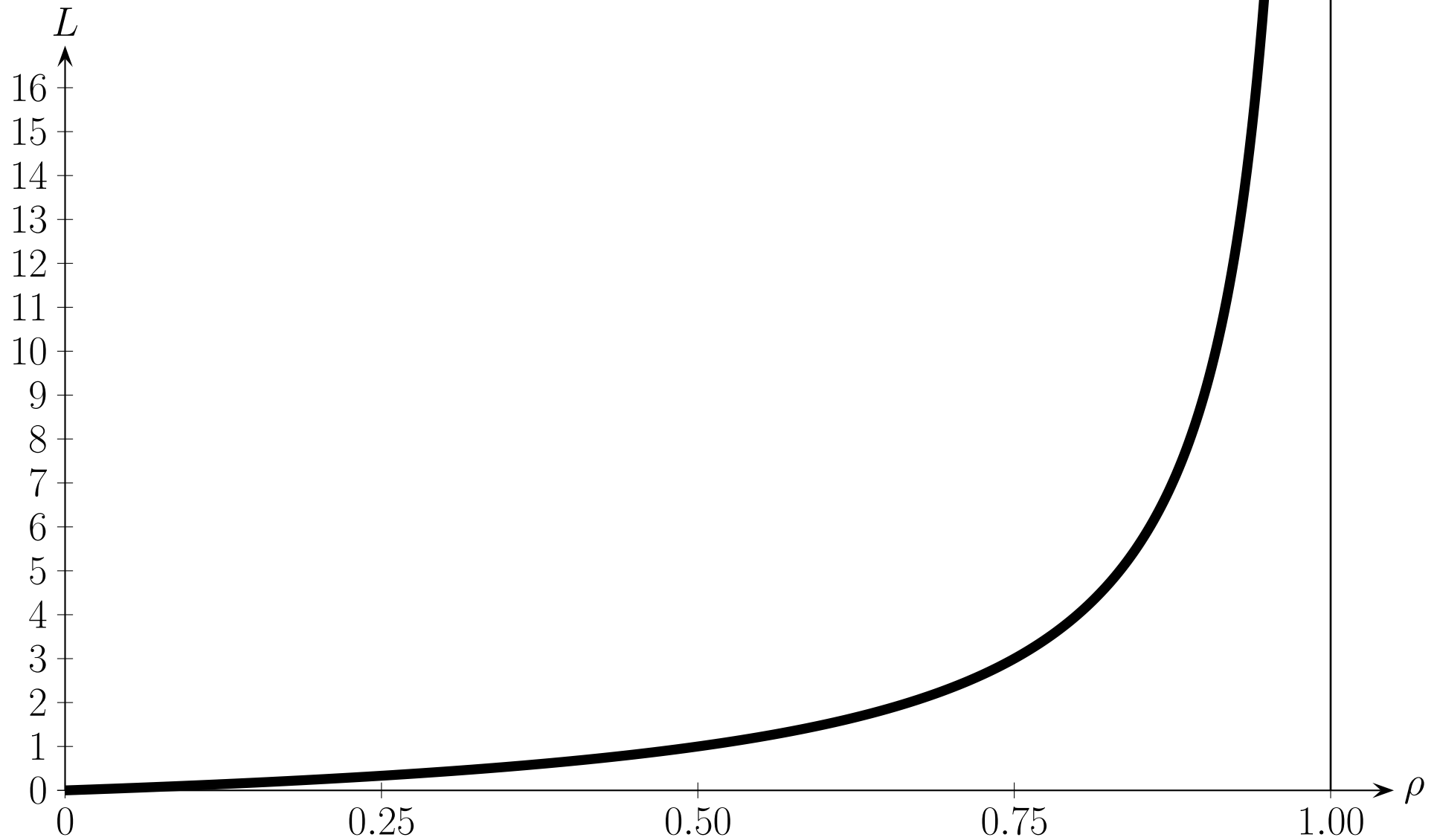
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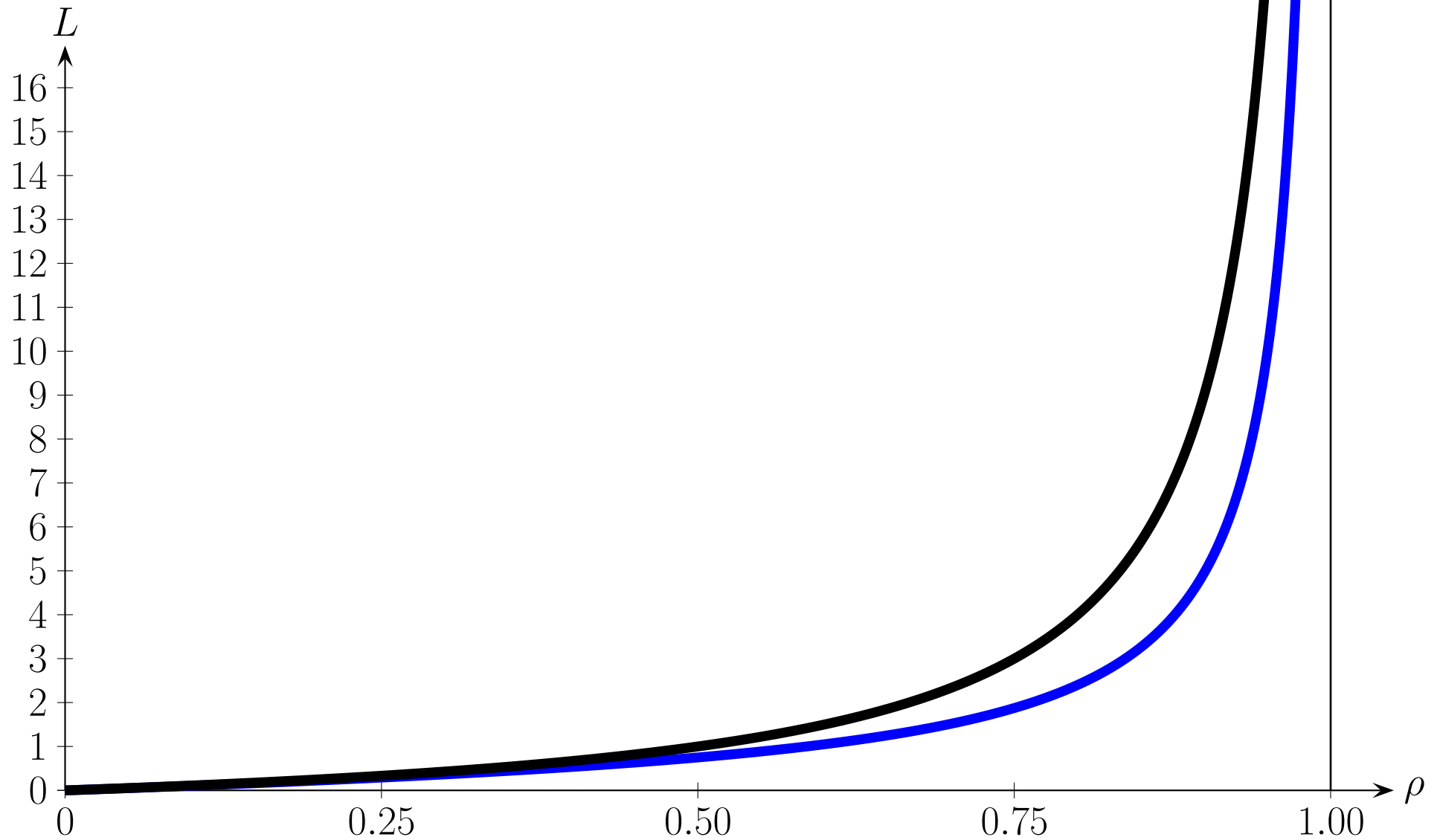
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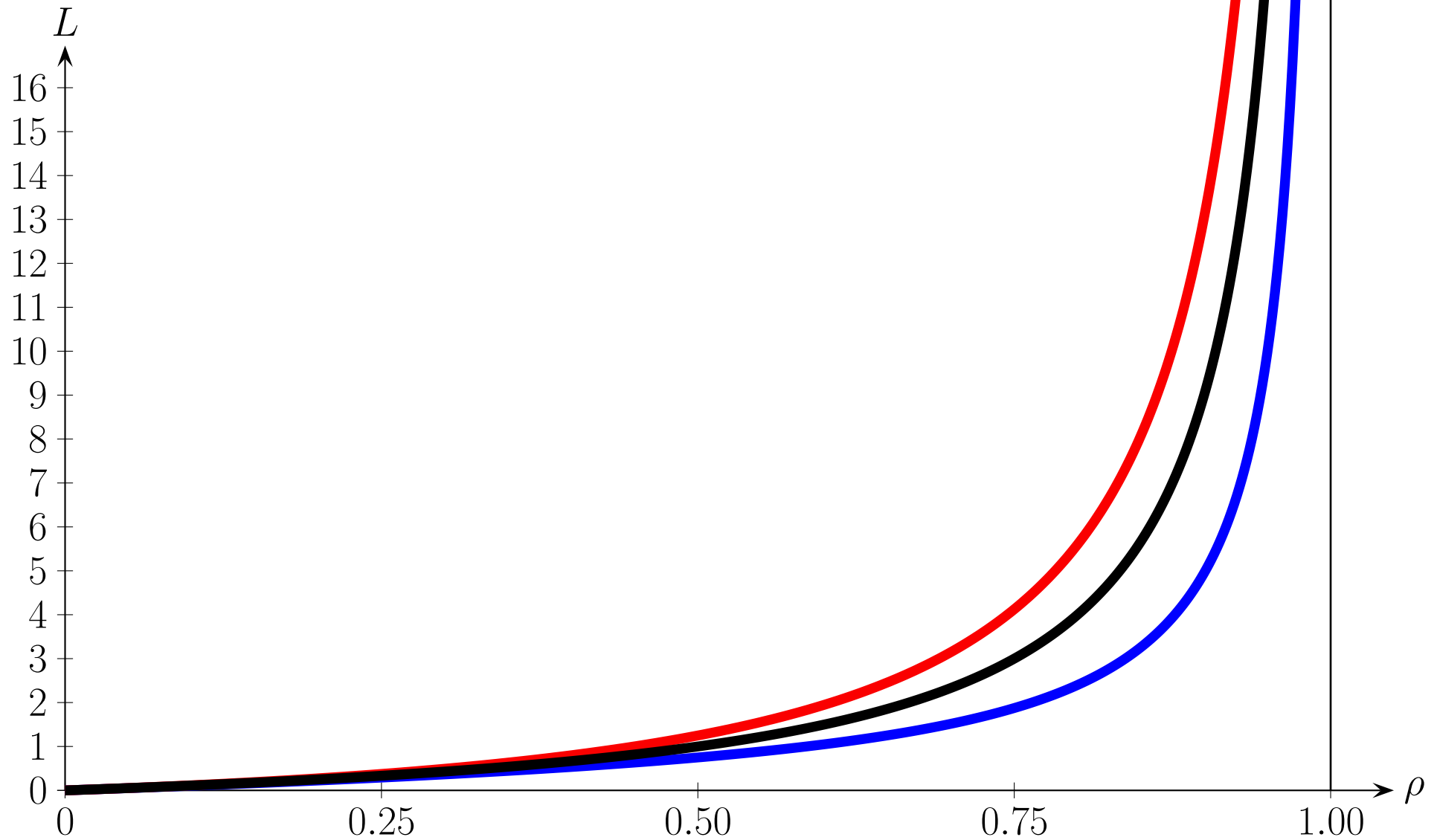
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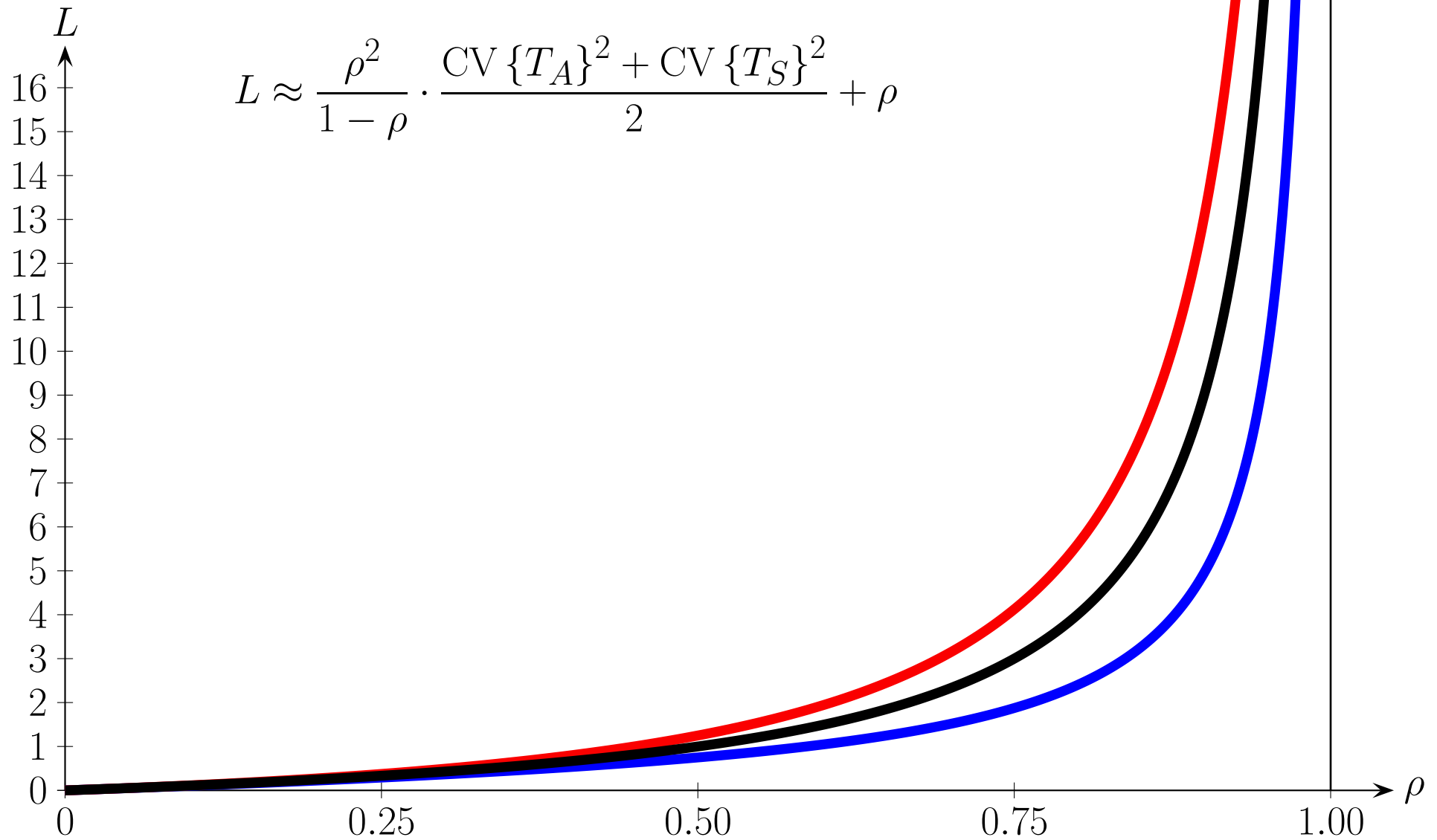
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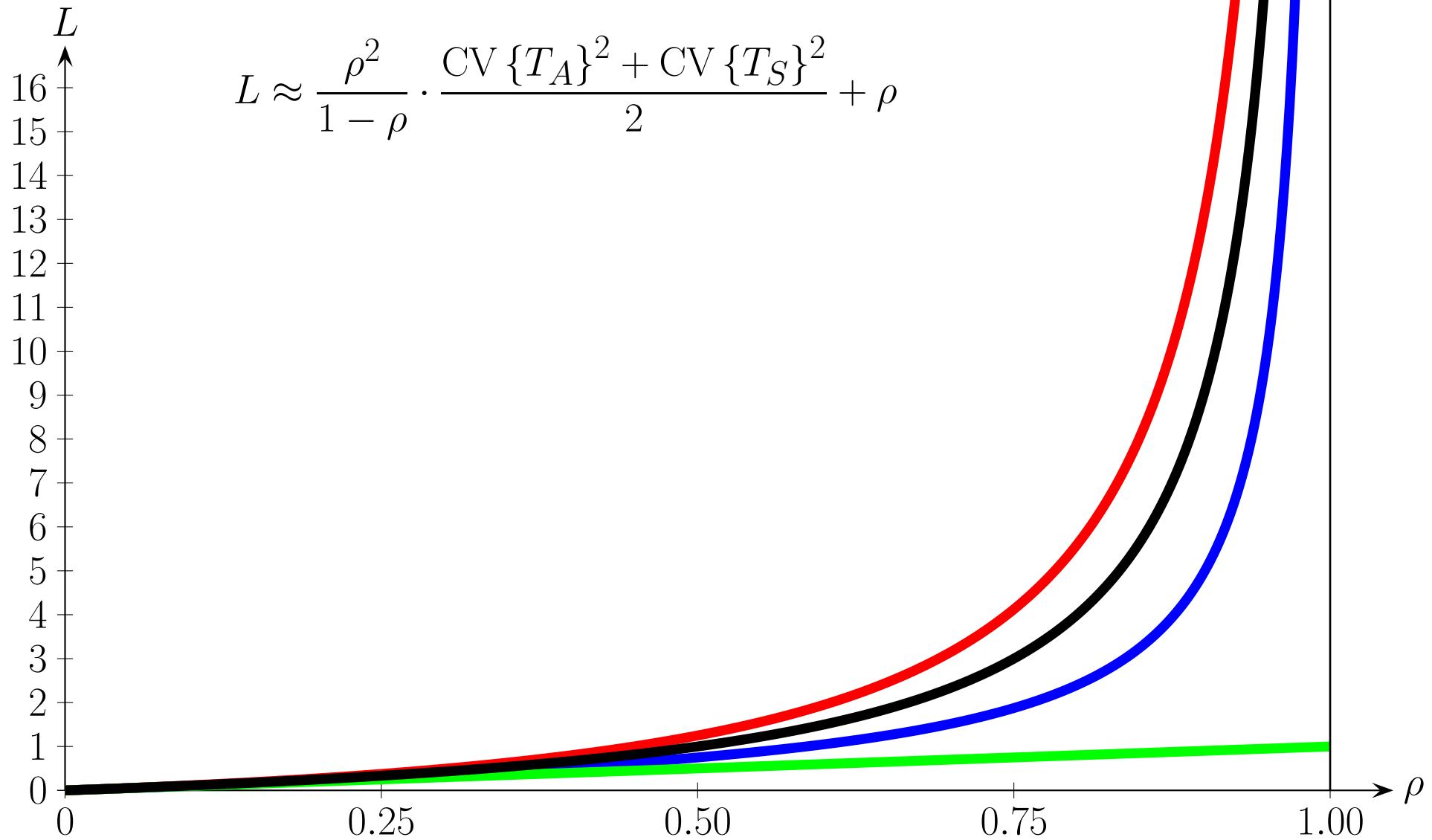
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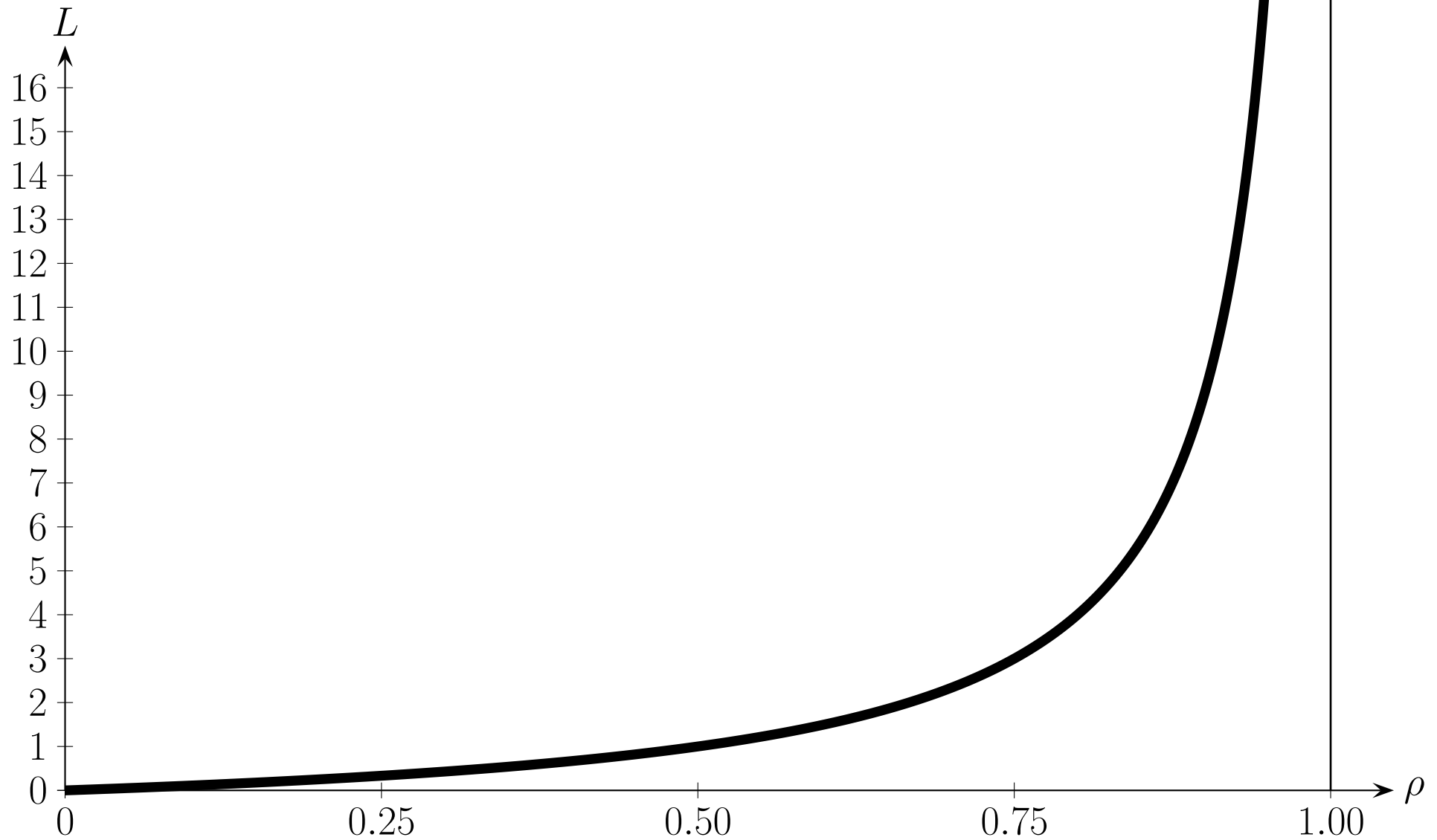
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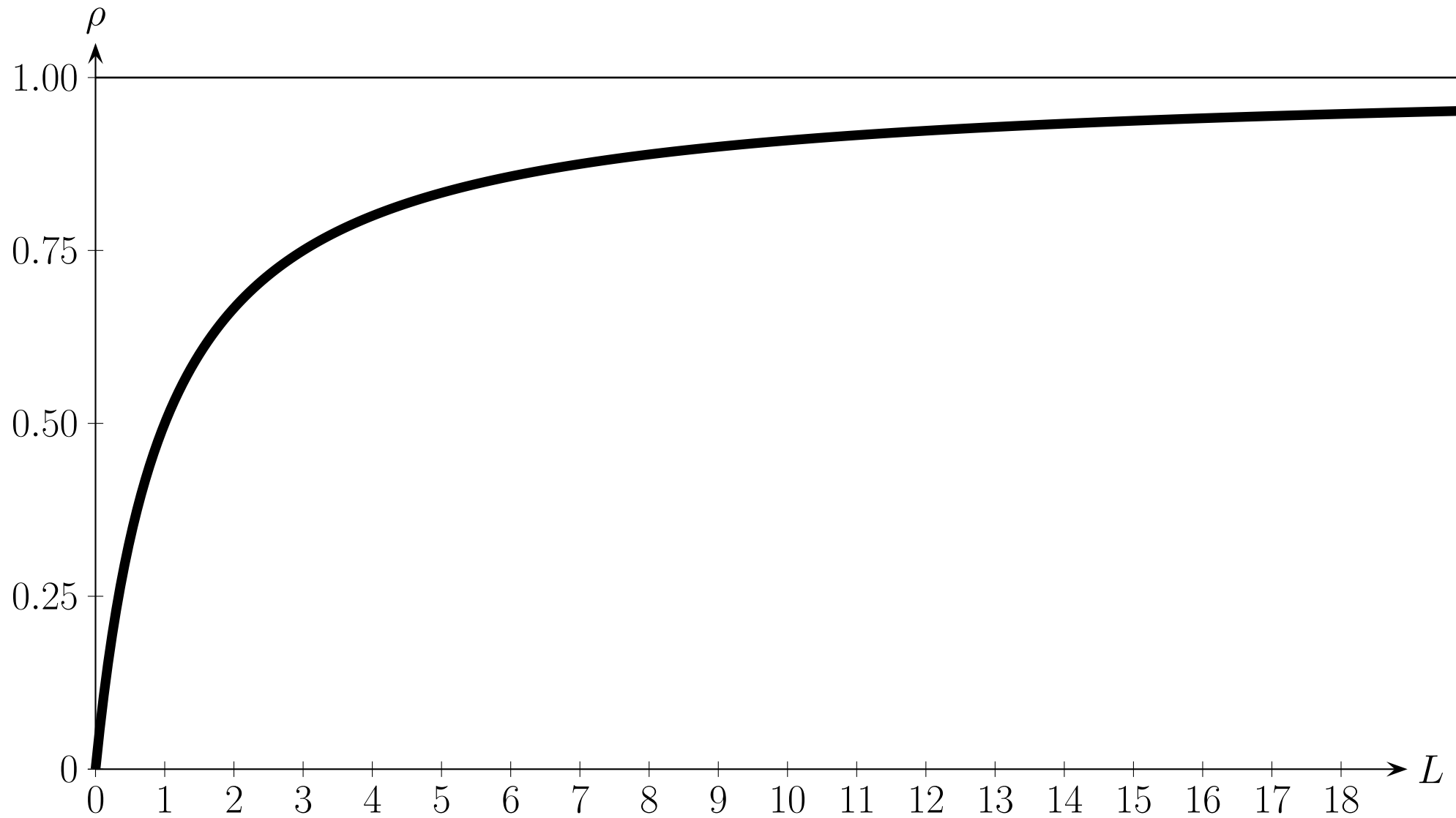
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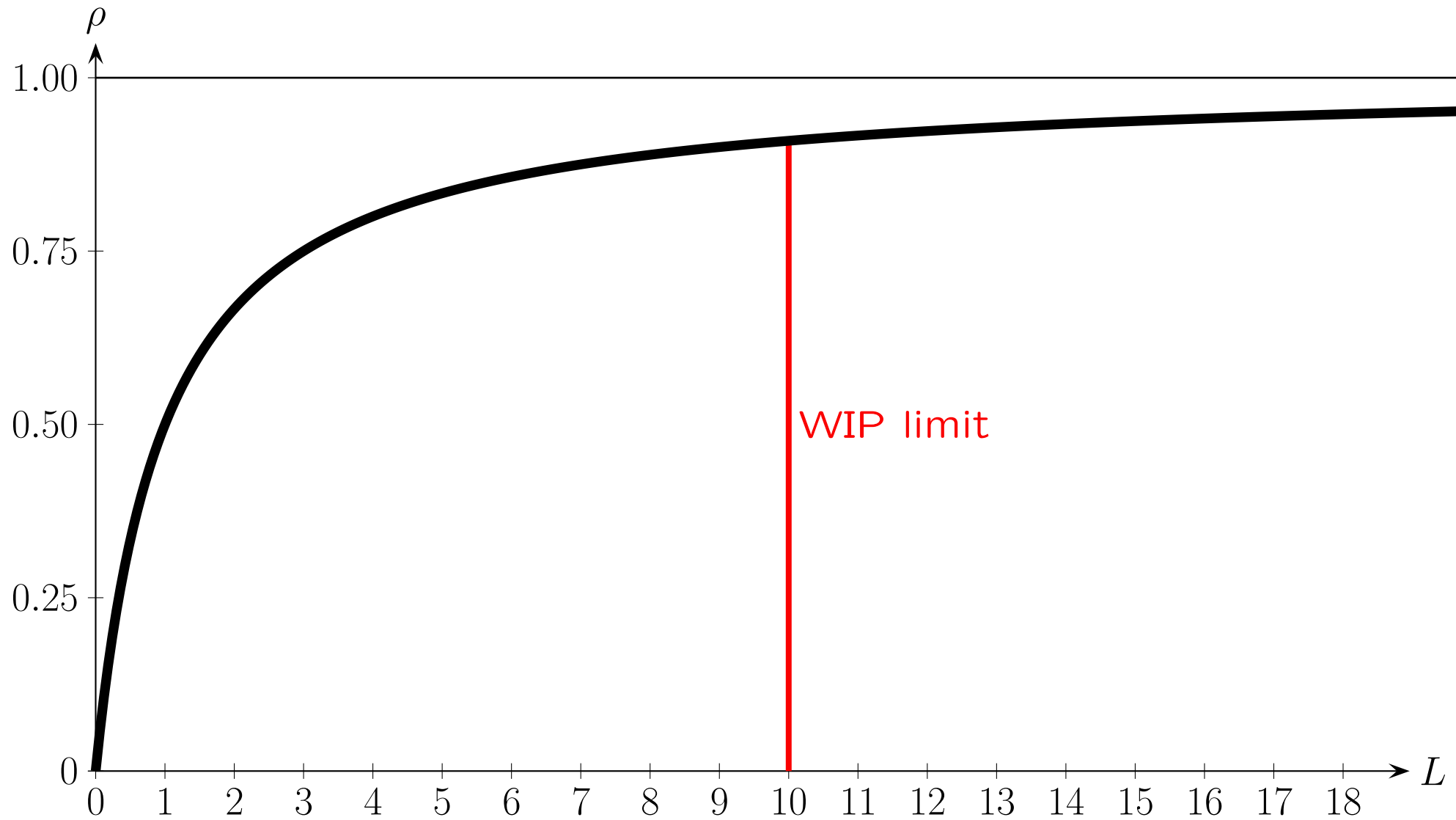
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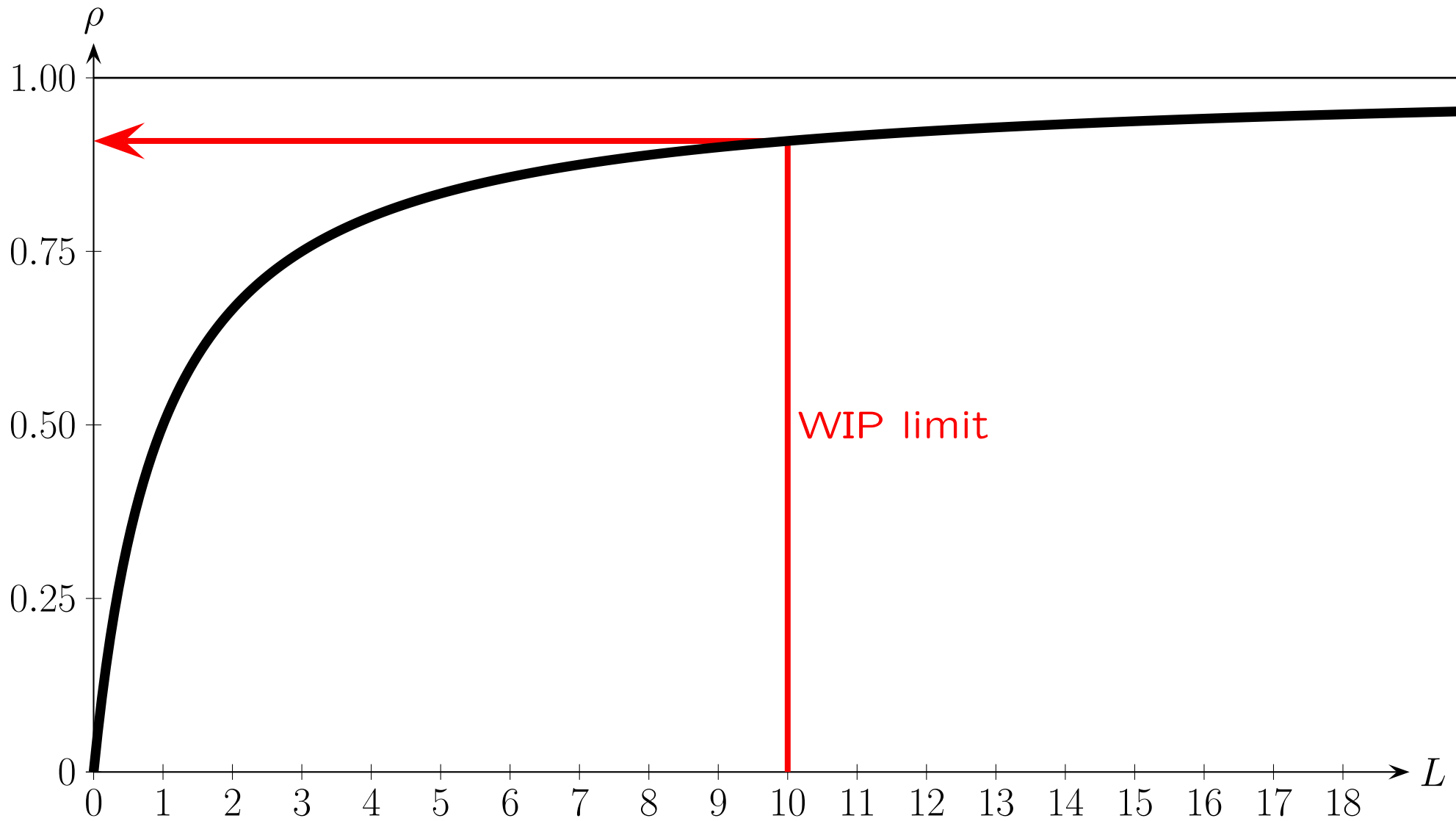
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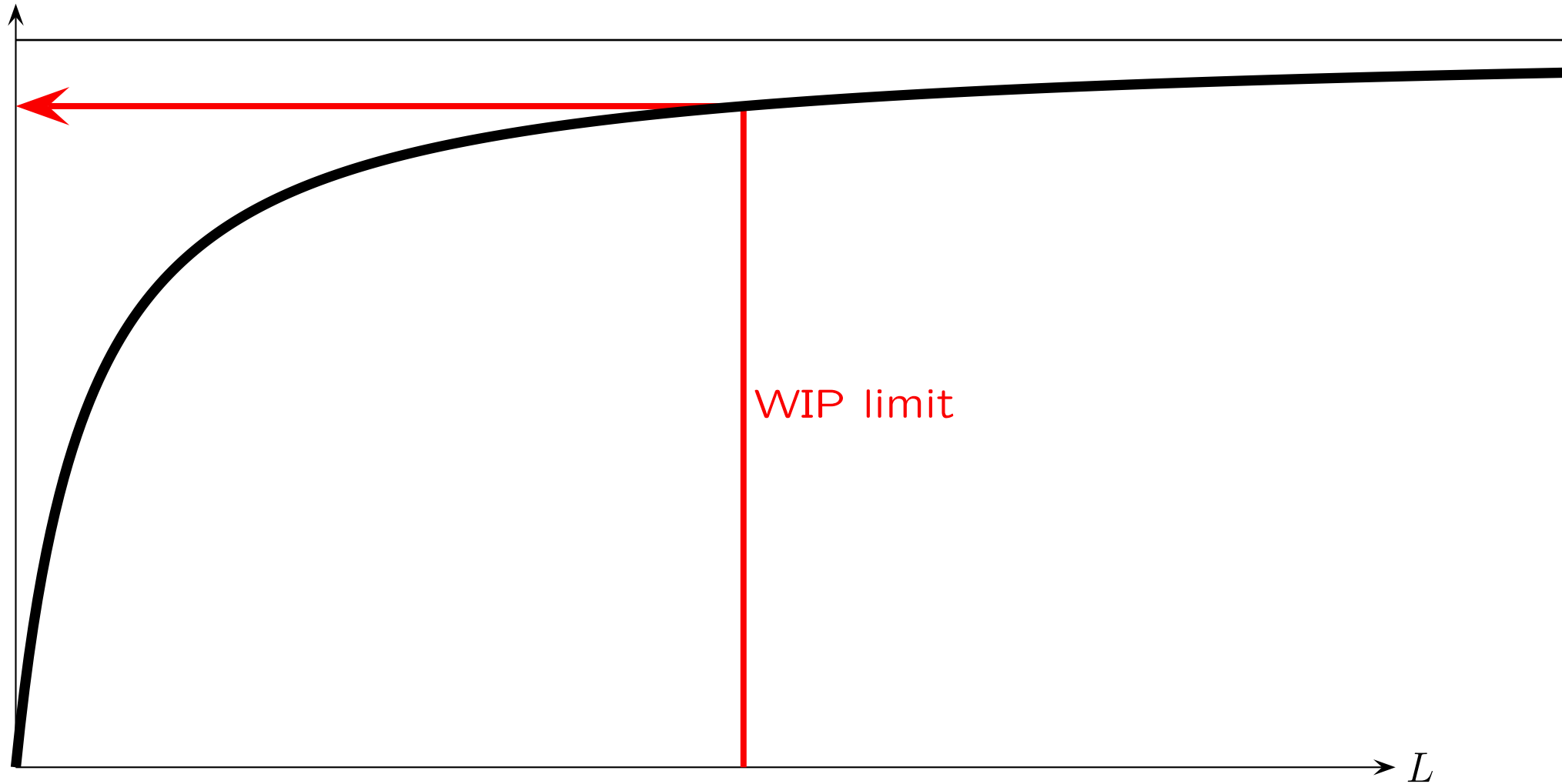
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$$X = \rho \cdot \mu$$



Production-quantity limit:

$$w_{kt} = q_{kt} - X(q_{kt}) \quad (k \in \mathcal{K}; t = 1, 2, \dots, T)$$

Effective capacity loss:

$$V_{jt} = \sum_{k \in \mathcal{K}} w_{kt} \cdot \text{tb}_{jk} \quad (j \in \mathcal{J}; t = 1, 2, \dots, T)$$

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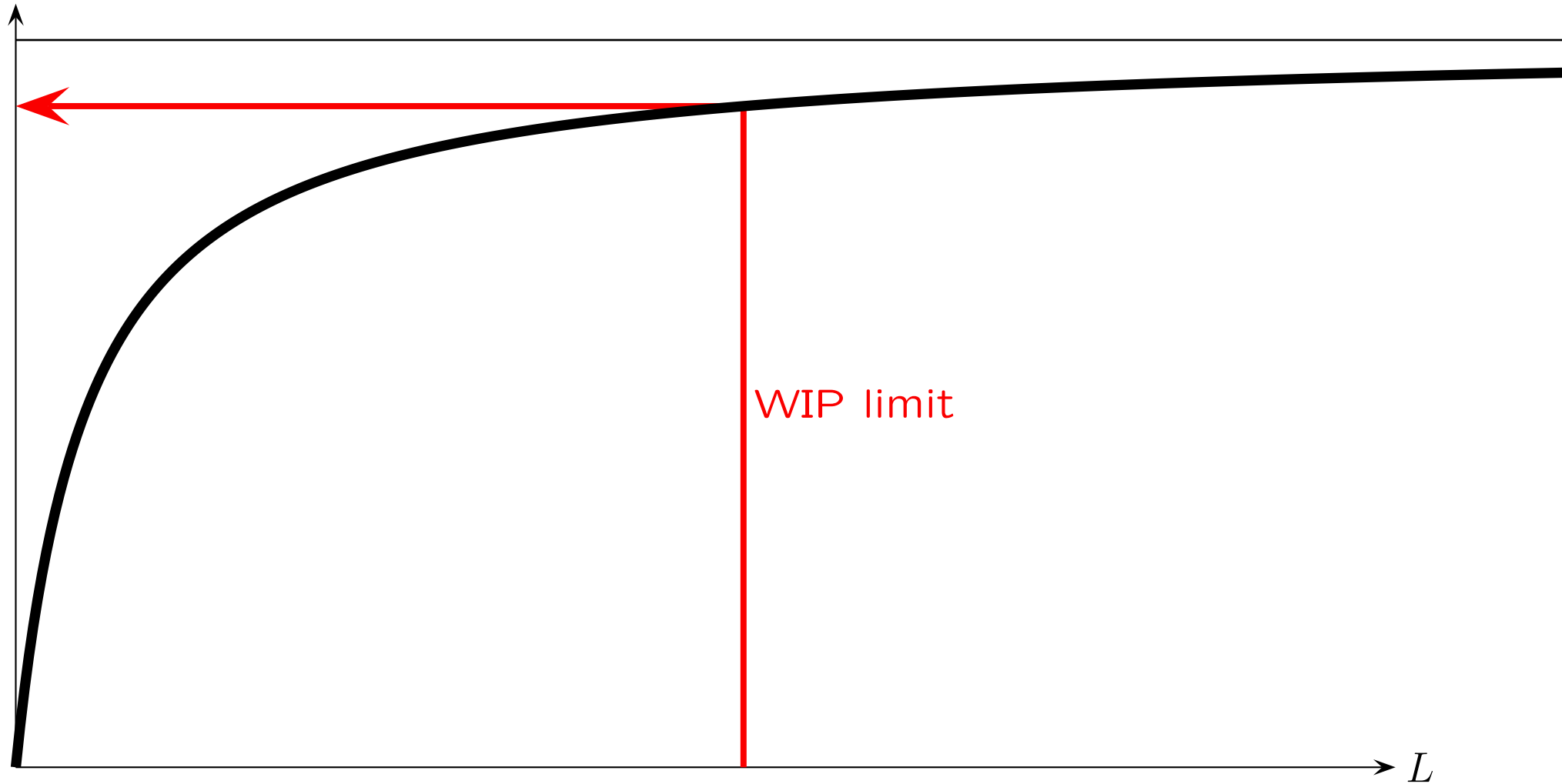
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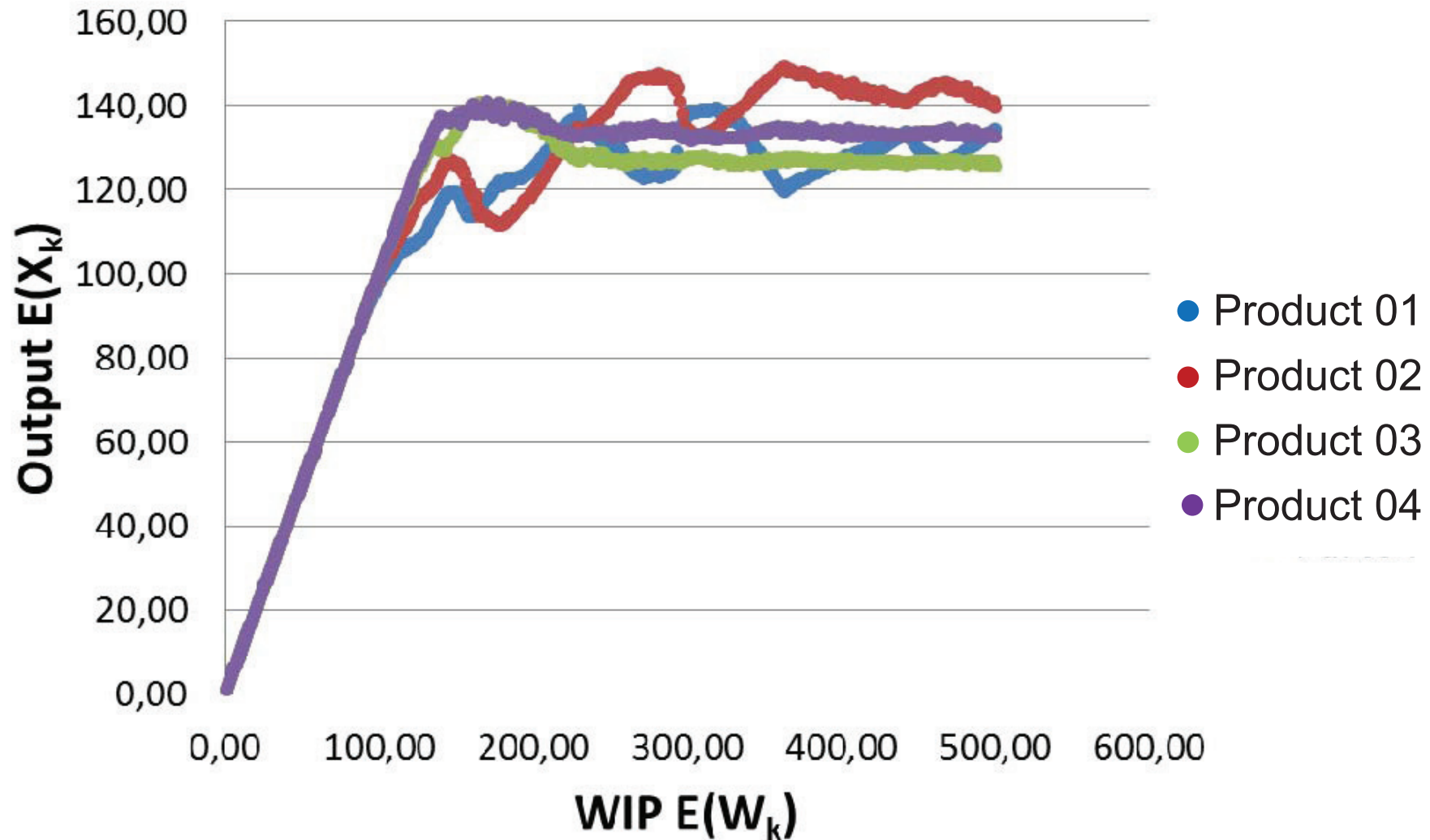
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Clearing Functions



What about doing integrated lot-sizing and scheduling ?

MLPLSP

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Too complicated !

MLPLSP

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▶ computational times

MLPLSP

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- ▶ computational times
- ▶ practical application

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We cannot guarantee a feasible solution for the scheduling problem.