

# OPTIMAL INTERVAL PARTITIONING AT GIVEN POINTS

Mikhail Y. Kovalyov (Minsk, Belarus)

Sergey Sevastyanov (Novosibirsk, Russia),

Bertrand Lin (Hsinchu, Taiwan),

Feng-Jang Hwang (Sydney, Australia)



# OUTLINE

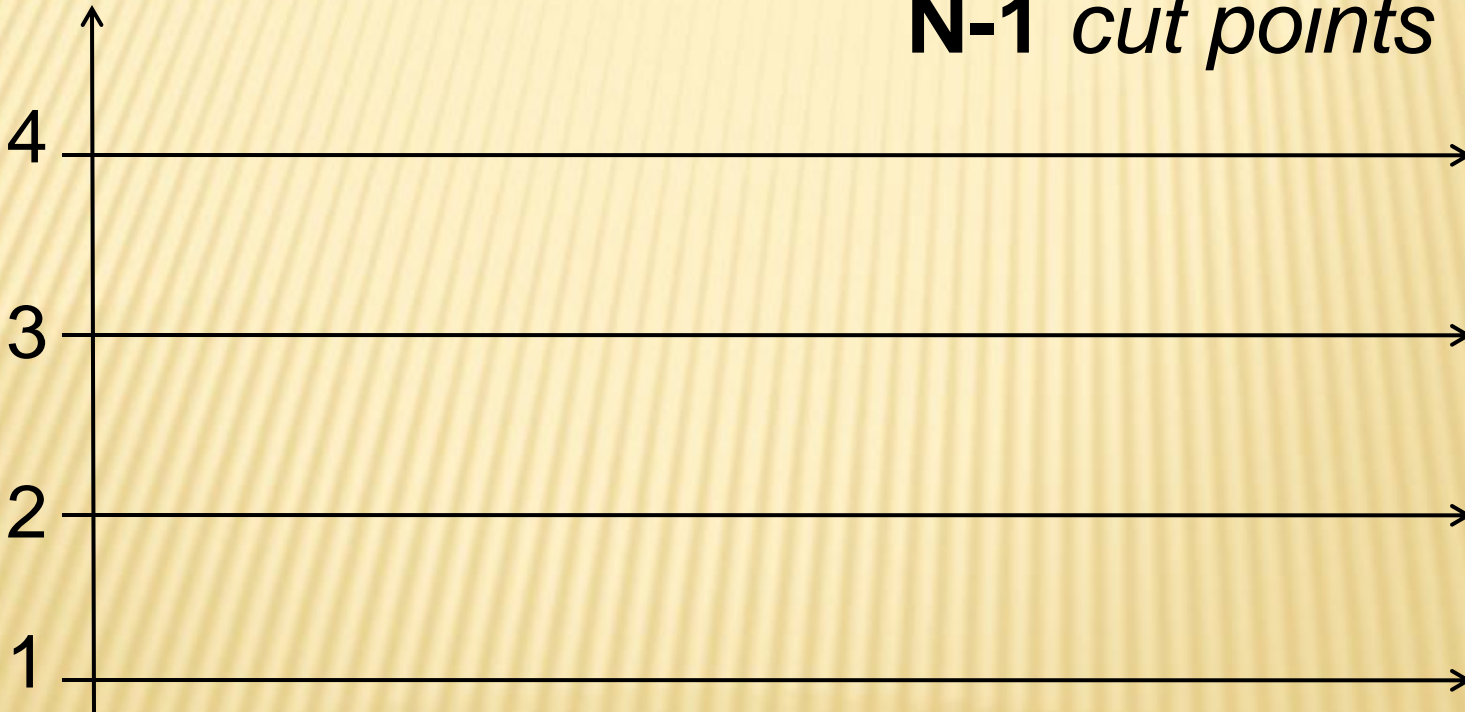
1. Formulation.
2. Scheduling interpretation.
3. Motivation.
4. Existing results.
5. Dynamic Programming 1.
6. Reducing to Series of Feasibility Problems.
7. Dynamic Programming 2 for Feasibility Problem.

# 1. FORMULATION

## Problem **K**-segments



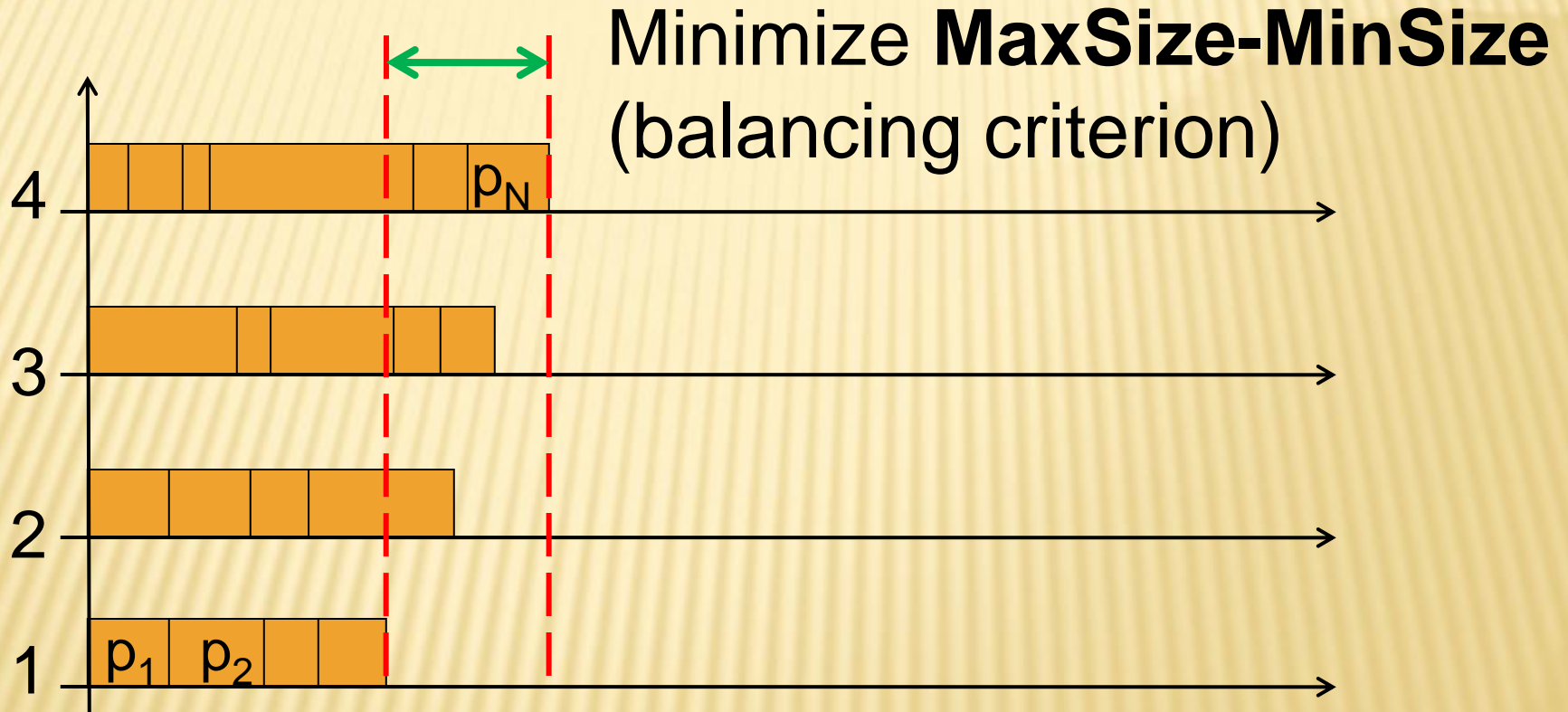
**N-1** *cut points*



Cut into **K** *segments*



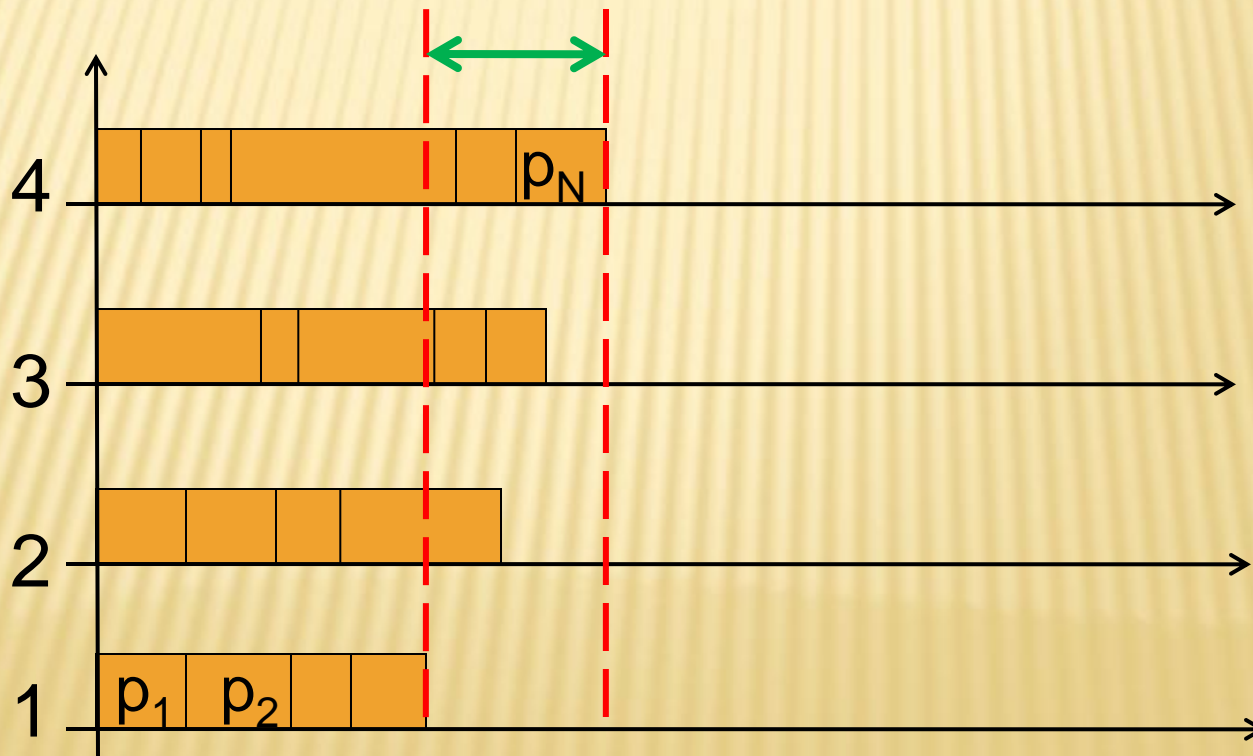
# 1. FORMULATION



## 2. SCHEDULING INTERPRETATION

Identical Parallel Machine Scheduling:  
Cut given job sequence  $(1, \dots, N)$  into  $K$  segments  
and assign each segment to a machine

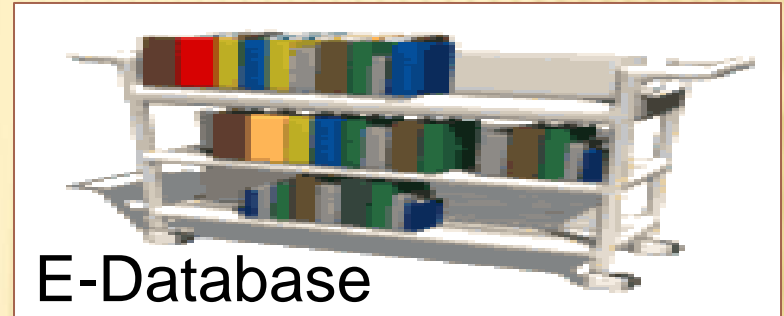
Minimize **MaxMachineLoad-MinMachineLoad**



### 3. MOTIVATION

## Efficient Retrieval of E-documents (Zobel et al. 1995)

Find E-docs containing  
(indexed) TEXT



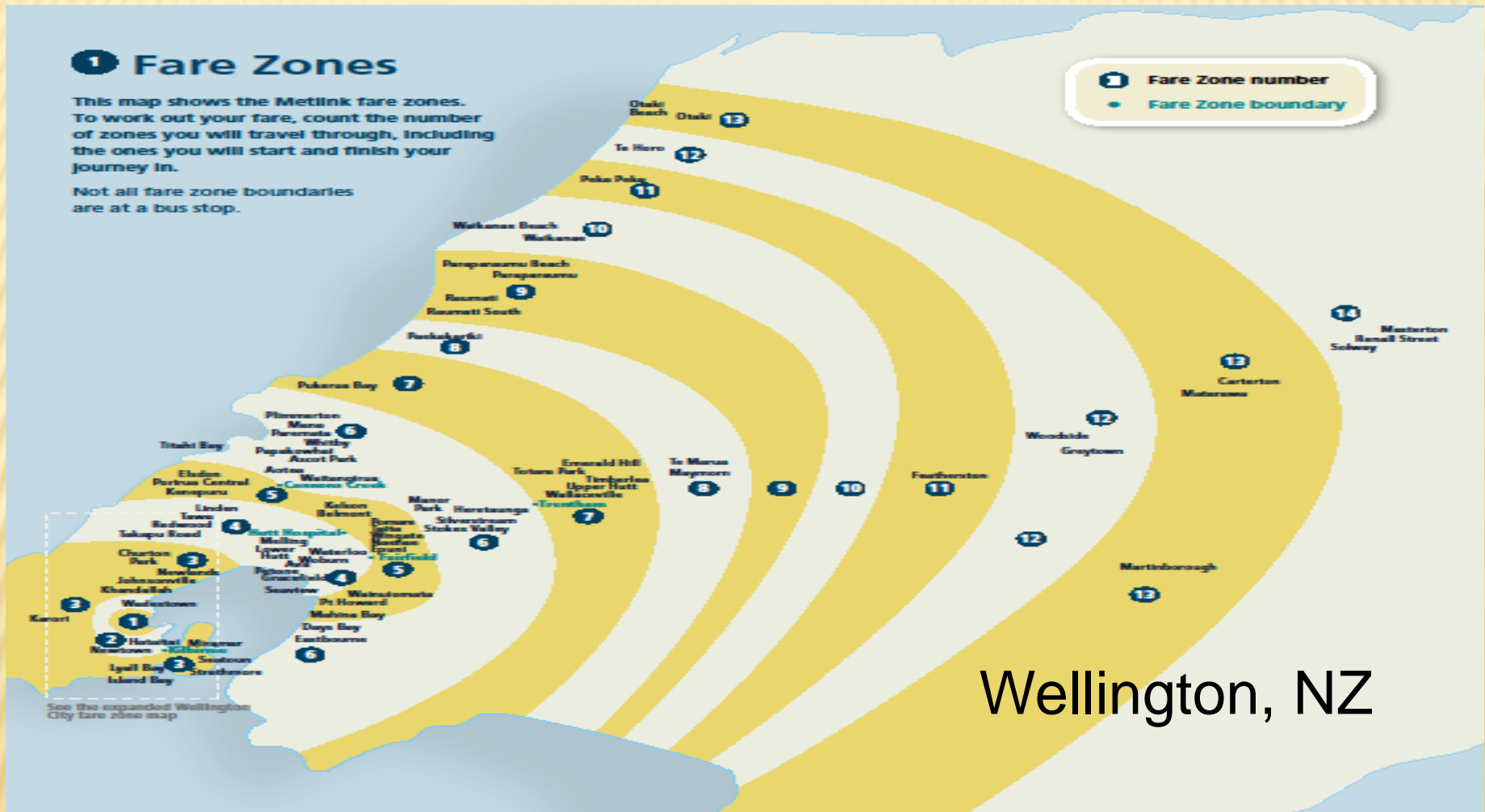
To answer queries effectively, E-docs are ranked. Ranking techniques are biased – some favor large docs, some small – and behave poorly if sizes vary. Experiments shown that partitioning large docs into “**almost equal**” parts improves retrieval effectiveness.

“War and Peace”:



Ends of paragraphs

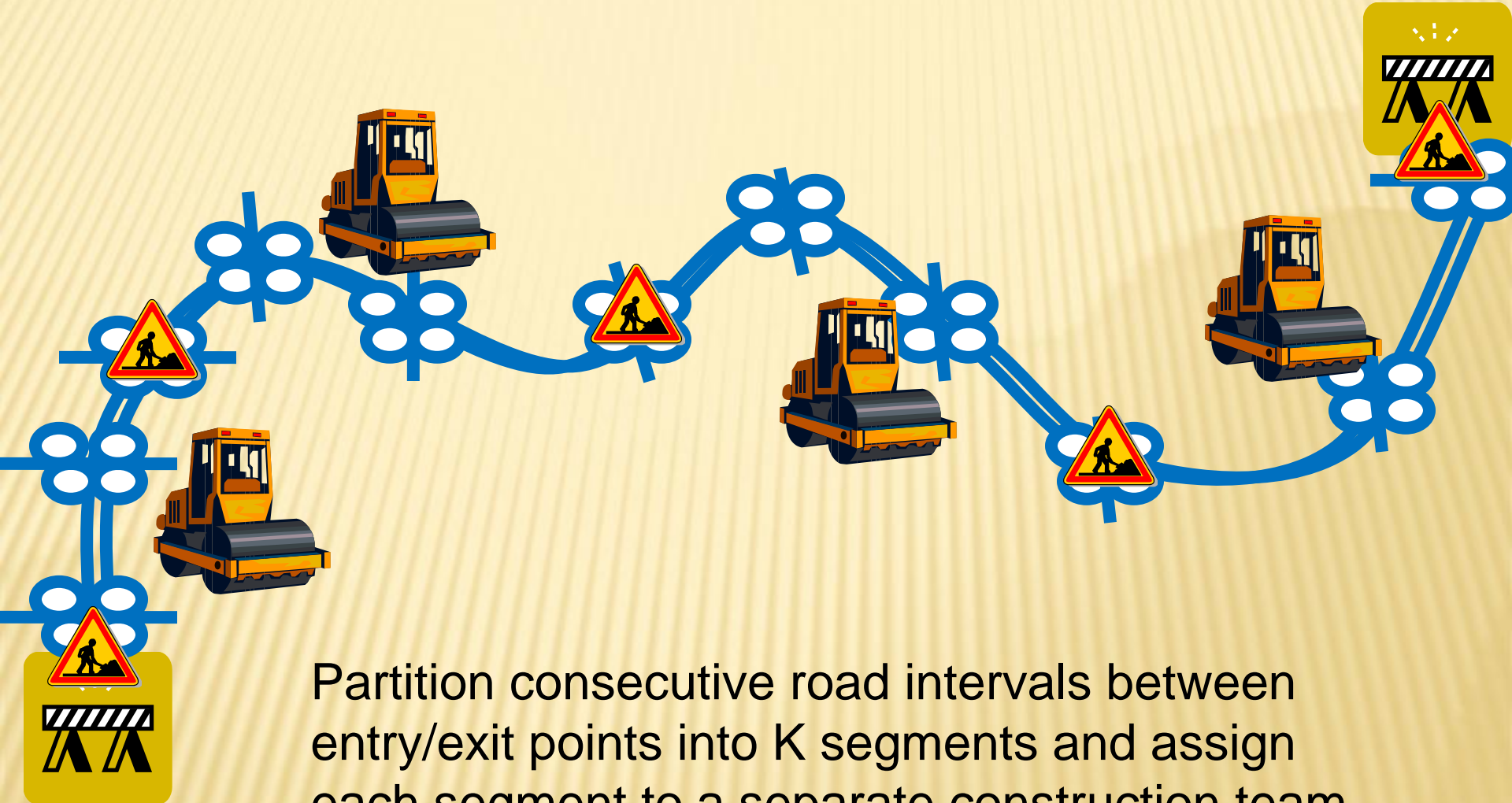
# Fare zoning for public transport



Partition sequence of consecutive route segments into  $K$  zones so that zone lengths are maximally close to each other.



## Road construction works

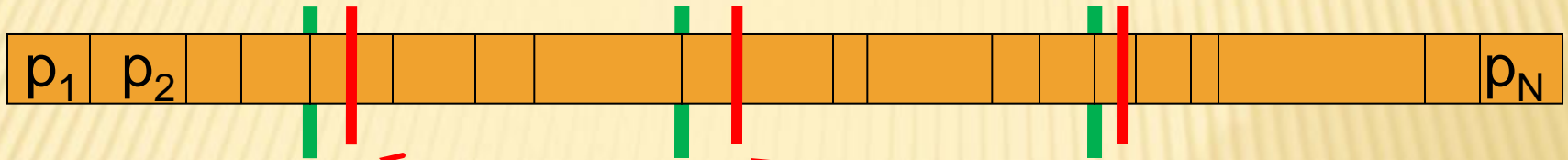


Partition consecutive road intervals between entry/exit points into  $K$  segments and assign each segment to a separate construction team such that team workloads are balanced.



# 4. EXISTING RESULTS

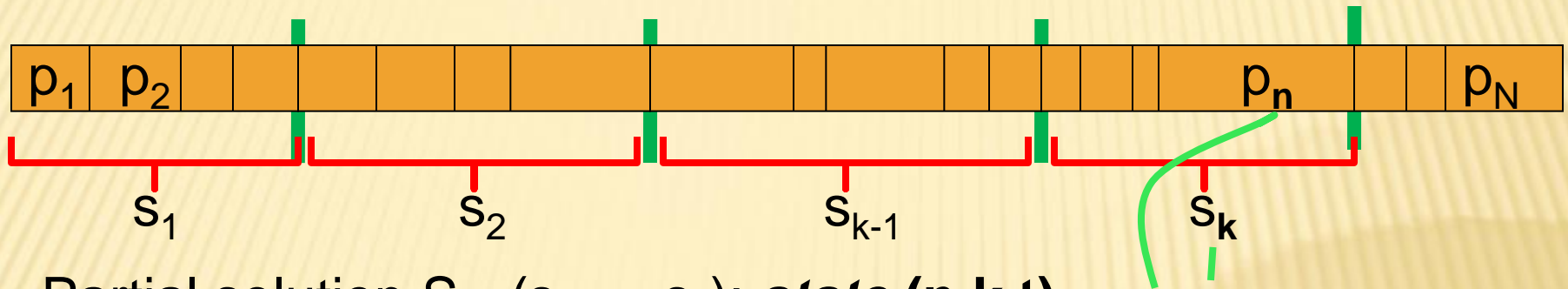
Imre Barany, Victor Goldberg (2013) **Block Partitions of Sequences** [arXiv:1308.2452v3](https://arxiv.org/abs/1308.2452v3) [math.CO]



**Scaled  $p_j \leq 1$ :**

- $(\text{MaxSize} - \text{MinSize}) \leq 2$ : round “**ideal**” cut points  $k \sum_{j=1}^N p_j / K$ ,  $k=1, \dots, K-1$ , down to the **nearest** ideal cut points
- $(\text{MaxSize} - \text{MinSize}) \leq 1$ :  $O(KN^3)$  algorithm
- **Optimal solution: ???**

# 5. DYNAMIC PROGRAMMING 1



Partial solution  $S_k = (s_1, \dots, s_k)$ : **state**  $(n, k, t)$

$t$  – future (upper bound on) max segment size,

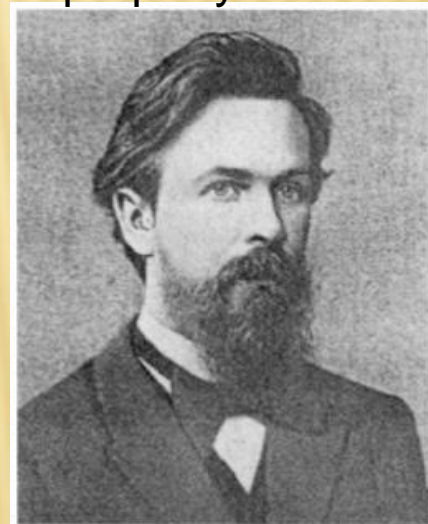
$$\Delta(n, k, t) = \min_{\text{MaxSize} \leq t} (t - \text{MinSize})$$

“Lack of memory”  
property

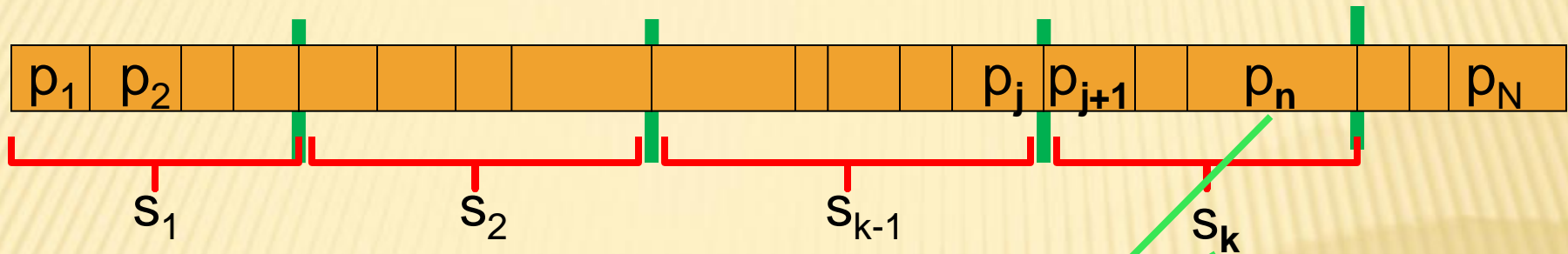
Richard Bellman (*Eye of the Hurricane*, autobiography): “I wanted to get across that this was dynamic, this was multi-stage, this was time-varying . . . . Let’s take a word that has an absolutely precise meaning, namely dynamic, in the classical physical sense. It also has a very interesting property that it is impossible to use the word, dynamic, in a pejorative sense . . . . It was something that not even a Congressman could object to. So I used it as an umbrella for my activities.”



(Courtesy the RAND Corporation)  
Richard Bellman  
1920–1984



Andrei A. Markov  
1856–1922



Partial solution  $S_k = (s_1, \dots, s_k)$ : **state**  $(n, k, t)$

$t$  – future (upper bound on) maximum segment size,

$$\Delta(n, k, t) = \min_{\text{MaxSize} \leq t} (t - \text{MinSize})$$

$$P(j, n) = \sum_{i=j}^n p_i, \quad \mathbf{B} = \{ P(j, n) \mid 1 \leq j \leq n \leq N \}, \quad t \in \mathbf{B}$$

$$\text{Init: } \Delta(n, 1, t) = \begin{cases} t - P(1, n), & \text{if } t \geq P(1, n) \\ \infty & \text{otherwise} \end{cases}$$

$$\mathbf{O}(KN^4)$$

$$\text{Recu: } \Delta(n, k, t) = \min_{\substack{0 \leq j \leq n, \\ P(j+1, n) \leq t}} \{ \max\{t - P(j+1, n), \Delta(j, k-1, t)\} \}$$

$$\mathbf{F}^* = \min_{t \in \mathbf{B}} \{ \Delta(N, K, t) \}$$



## 6. REDUCING TO A SERIES OF FEASIBILITY PROBLEMS

### Feasibility problem **K**-segments:

- Order all distinct segment sizes:  $L_1 < L_2 < \dots < L_A$ ,  $A \leq N^2$ .
- For interval  $[L_a, L_b]$ ,  $1 \leq a \leq b \leq A$ , in  $O(T)$  verify
- **Property**: All segment sizes  $\in [L_a, L_b]$ . Satisfied  $\Rightarrow$  feasible.

### Solving problem **K**-segments

- Find all **minimal** feasible intervals  $[L_a, L_b]$ ,  $1 \leq a \leq b \leq A$ . ( $\# \leq A$ )
- Optimal solution corresponds to a **minimum** feasible interval.

**$O(AT)$**

### Problem **AllMin**:

- Input: numbers  $1, \dots, A$ .
- Intrl  $[L_a, L_b]$ ,  $1 \leq a \leq b \leq A$ , can satisfy **Property**, verified in  $O(T)$ .
- Property satisfied for Intrl  $\Rightarrow$  satisfied for any surrounding Intrl.
- Find all minimal feasible intervals  $[L_a, L_b]$ ,  $1 \leq a \leq b \leq A$ .



## 6. REDUCING TO A SERIES OF FEASIBILITY PROBLEMS

Solving problem AllMin

		b								A
		1	2	3	4	5	6	7	8	9
a	1	0	0	1	1	1	1	1	1	1
	2	0	0	1	1	1	1	1	1	1
	3	0	0	0	0	1	1	1	1	1
	4	0	0	0	0	0	1	1	1	1
	5	0	0	0	0	0	0	1	1	1
	6	0	0	0	0	0	0	1	1	1
	7	0	0	0	0	0	0	0	0	1
	8	0	0	0	0	0	0	0	0	0
A	9	0	0	0	0	0	0	0	0	0

Matrix  $Y=(y_{ab})$ :  
 $y_{ab}=1$  iff  $[L_a, L_b]$  feasible

**Solution = red entries**

Sufficient to consider  
**“staircase”**

with  $\leq 2A-1$  entries  $\Rightarrow$

**$O(AT)$**

**$A \leq N^2$  for**

**K-segments**

# 7. DP2 FOR FEASIBILITY PROBLEM

Problem **Feasible(a,b)**:

All segment sizes belong to  $[L_a, L_b]$ ?

Feasibility of segment  $k$  depends  
on last job of previous segment

Equivalent definition:

$S = (s_1, \dots, s_K)$ ,  $s_k = (i_{k-1} + 1, \dots, i_k)$ ,  $k = 1, \dots, K$ ,  $i_0 = 0$ ,

is feasible iff

$$P(j, n) = \sum_{i=j}^n p_i$$

$i_k \in [A(i_{k-1}), B(i_{k-1})]$ ,  $k = 1, \dots, K$ , where

- $A(i_{k-1}) = \min_{n \in [i_{k-1} + 1, N]} \{ n \mid P(i_{k-1} + 1, n) \geq L_a \}$
- $B(i_{k-1}) = \max_{n \in [i_{k-1} + 1, N]} \{ n \mid P(i_{k-1} + 1, n) \leq L_b \}$

$[A(i_{k-1}), B(i_{k-1})]$ ,  $k = 1, \dots, K$ , belong to wider set of  
 $[A(j), B(j)]$ ,  $j = 0, 1, \dots, N-1$ , (some can be  $\emptyset$ )  
calculated in  $O(N)$  and enumerated in **DP2**

$[A(i_{k-1}), B(i_{k-1})]$ ,  $k=1, \dots, K$ , belong to wider set of  
 $[A(j), B(j)]$ ,  $j=0, 1, \dots, N-1$ , (some can be  $\emptyset$ )  
calculated in  $O(N)$  and enumerated in **DP2**

Non-empty  $[A(j), B(j)]$  satisfy  
 $A(j_1) \leq A(j_2) \leq \dots \leq A(j_h)$  and  $B(j_1) \leq B(j_2) \leq \dots \leq B(j_h)$



$O(N)$  to find  
 $A(j_1), A(j_2), \dots, A(j_h)$  and  $B(j_1), B(j_2), \dots, B(j_h)$

## Partial solution

$S=(1, \dots, n) = (s_1, \dots, s_k)$ ,  $s_r = (i_{r-1} + 1, \dots, i_r)$ ,  $r=1, \dots, k$ :  
**feasible state (k,n)** if  
 $i_r \in [A(i_{r-1}), B(i_{r-1})]$ ,  $r=1, \dots, k$

$X_k$  – set of feasible states  $(k,n)$ ,  $n=1, \dots, N$

$$P(j,n) = \sum_{i=j}^n p_i$$

$$n \in [A(0), B(0)]$$

Init:  $X_1 = \{ (1,n) \mid L_a \leq P(1,n) \leq L_b, n=1, \dots, N \}$

**$O(KN)$**

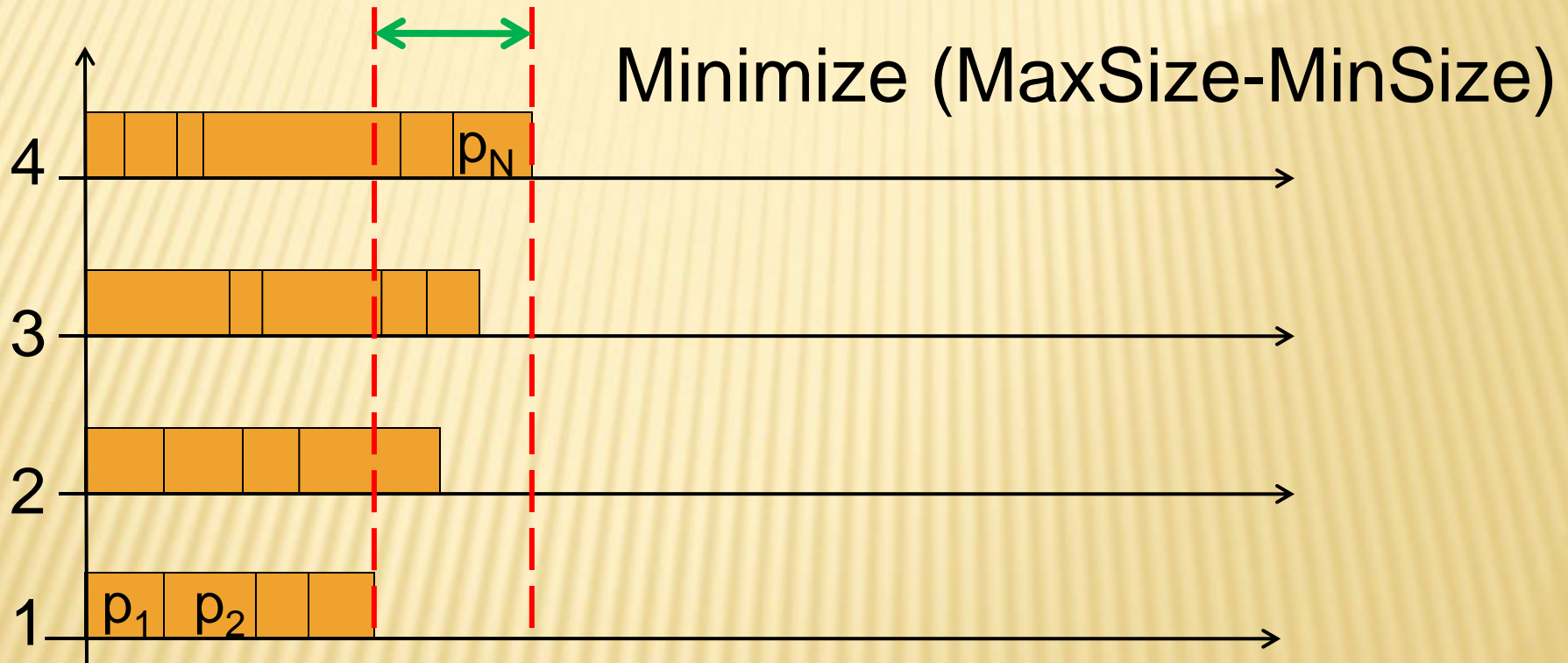
Recu:  $X_k = \{ (k,n) \mid n \in [A(j), B(j)], (k-1, j) \in X_{k-1} \}$

**If  $X_K = \{(K, N)\} \Rightarrow [L_a, L_b]$  feasible**



# CONCLUSION

$\leq N^2$  problems **Feasible**[a,b], each in  $O(KN) \Rightarrow$   
Problem **K-segments** can be solved in  $O(KN^3)$



Thank you