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# **DYNAMIC PROGRAMMING FOR OPTIMIZATION OF CAPACITOR ALLOCATION IN POWER DISTRIBUTION NETWORKS**

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**CTW 2008**

7th Cologne-Twente Workshop on Graphs and Combinatorial Optimization

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## Albert Einstein & James Maxwell



## Summary

- Introduction
- Problem Formulation
- Durán's DP Approach
- The New DP Approach
- How to solve it?
- A Flavor of Applications
- Discussion

As energy travels from generation plants to customers, electrical resistance in transmission and distribution lines causes dissipation of energy (*technical losses*).

Typically figures for these losses amount to around 7% of total energy production, 2% in transmission and 5% in distribution (according to ANEEL, technical losses in Brazilian distribution networks ranges from 2% to 18% with an average of 8%).

Loss reduction can be seen as a “hidden” source of energy.

Some tools for loss reduction:

- Network reconfigurations;
- ***Capacitor bank allocation;***
- Improvements in cables and equipments.

# Introduction

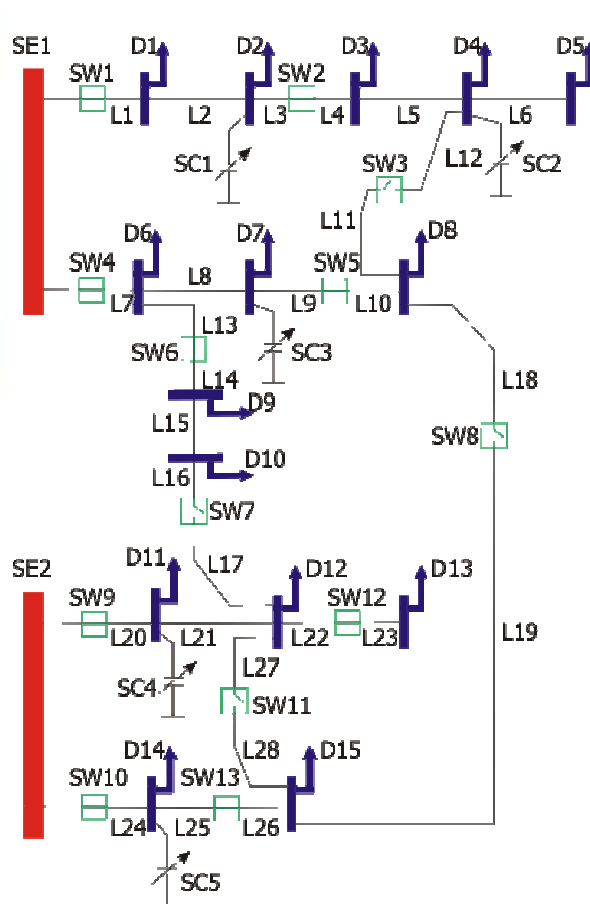
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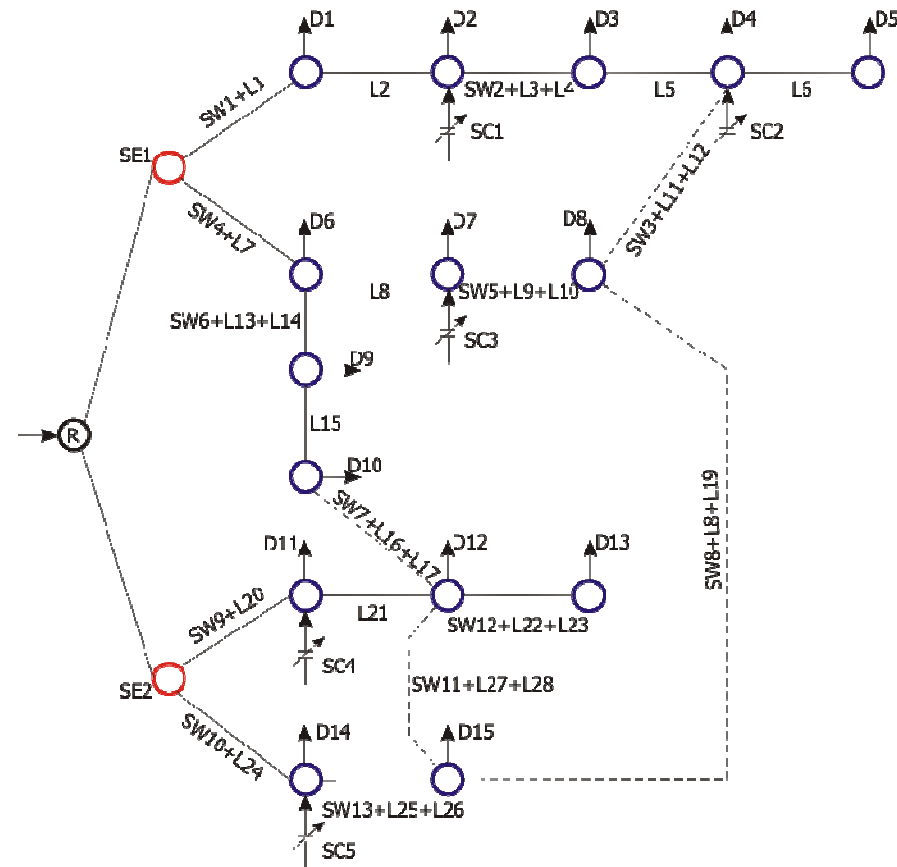
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## Main entities of a distribution network and its graph representation



 Closed Switch  
 Open Switch

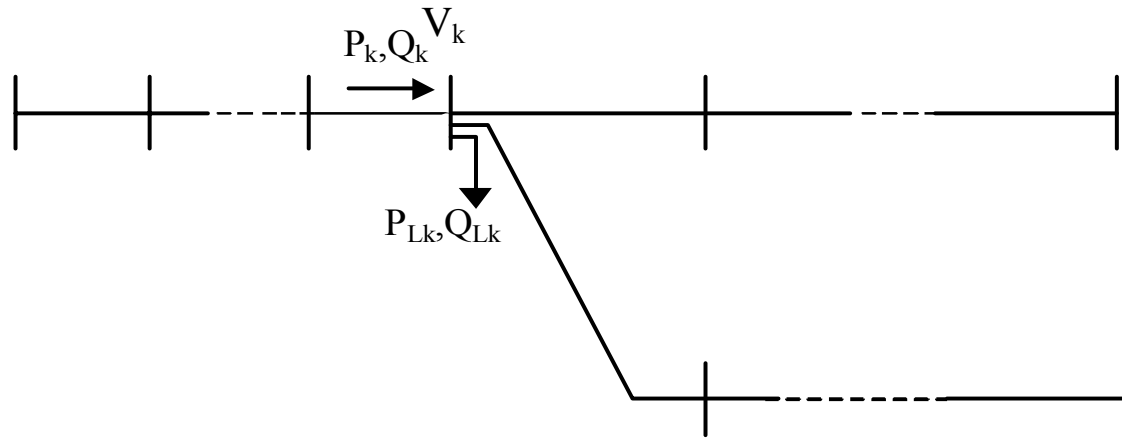


— Energized Arc

- - - Non-Energized Arc

In most of cases it operates with a radial configuration

A typical power distribution feeder with power flows in section  $k$



Technical losses ( $l_k$ ) in a section  $k$ :

$$l_k = r_k (i_{Pk}^2) + r_k (i_{Qk}^2) = r_k \left( \frac{P_k^2 + Q_k^2}{V_k^2} \right)$$

$i_{Pk}$  is the in-phase current component

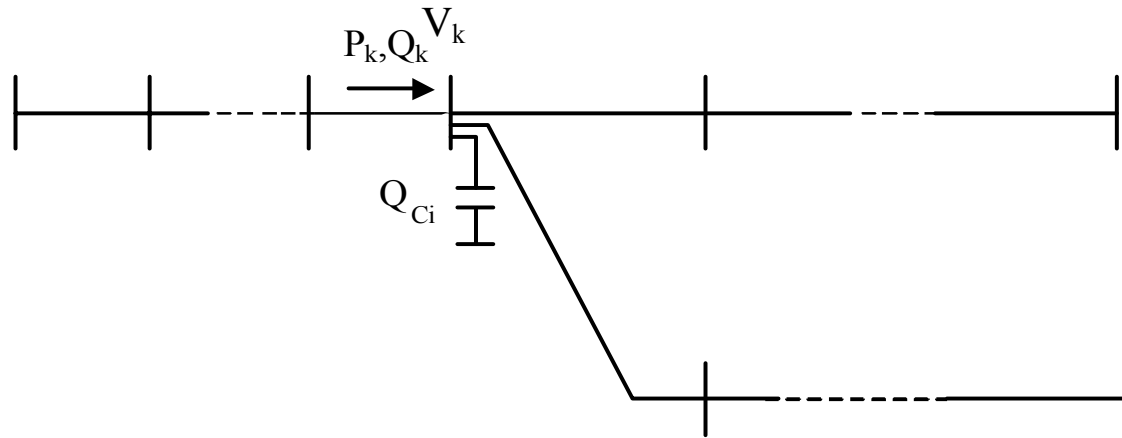
$i_{Qk}$  is the quadrature current component

$r_k$  is the line resistance in section  $k$

$P_k$  is the active power (produces work)

$Q_k$  is the reactive power

## Decreasing losses with capacitor banks



$$l_k = r_k (i_{Pk}^2) + r_k (i_{Qk}^2) = r_k \left( \frac{P_k^2 + (Q_k - Q_{ci})^2}{V_k^2} \right)$$

$Q_{ci}$  is the reactive power injected at bus  $k$  by capacitor  $C_i$

**Capacitors can decrease the *reactive power* flowing back and forth in the network**

# Problem Formulation

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$$\text{Min}_{s \in S_C} \left\{ \sum_{i \in S_C} f(C_i) + \alpha_{et} \sum_{t \in T} \tau_t \sum_{k \in N} \sum_{j \in A_k} r_{kj} \frac{(P_{kj})^2 + (Q_{kj})^2}{V_k^2} \right\}$$

s. t:

- Active power flow equations
- Reactive power flow equations
- Voltage constraints

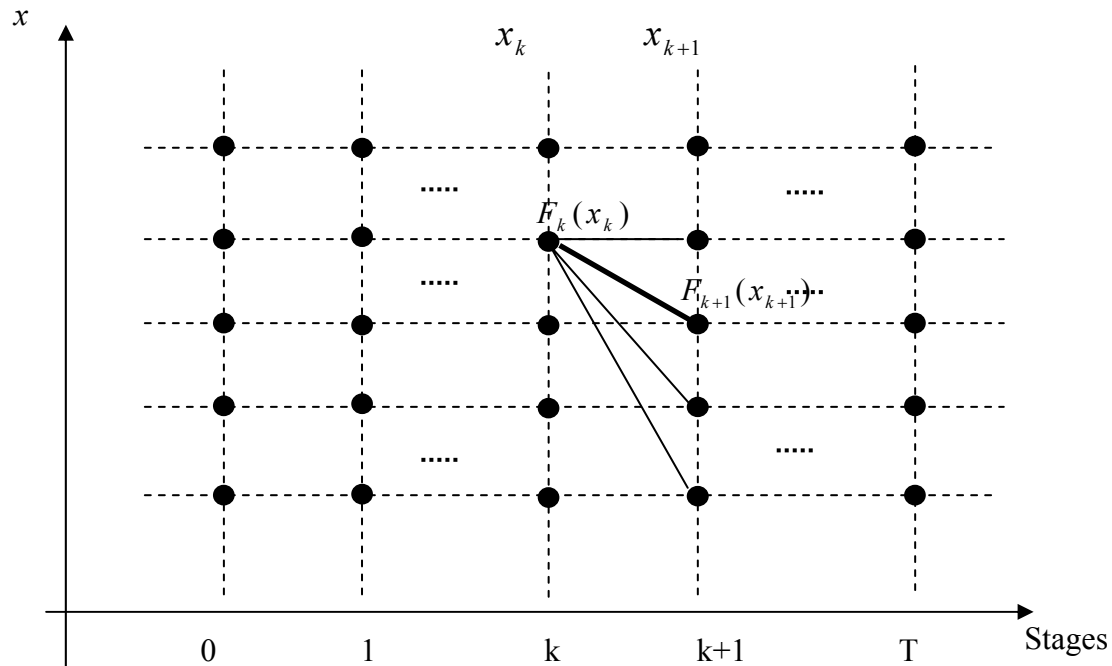


# Durán's DP Approach

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$$F_k(x_k) = \min_{u_k} \{ \varphi_k(x_k, u_k) + F_{k+1}(x_{k+1}) \}$$

# Durán's DP Approach

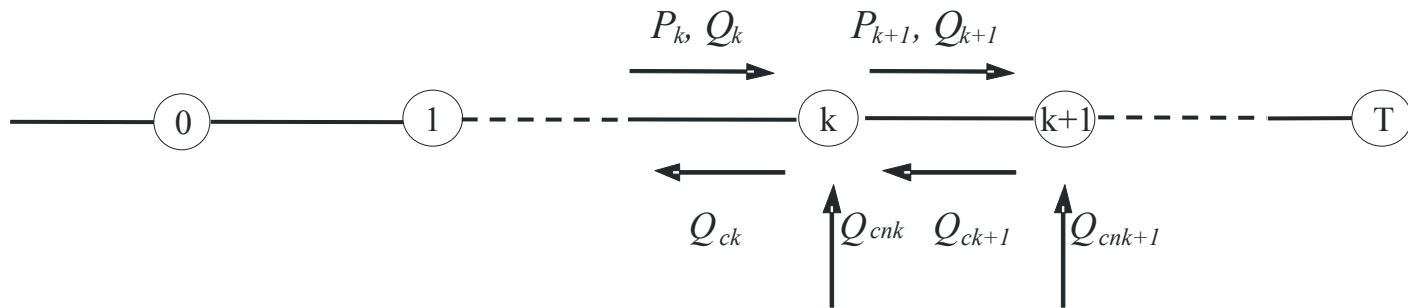
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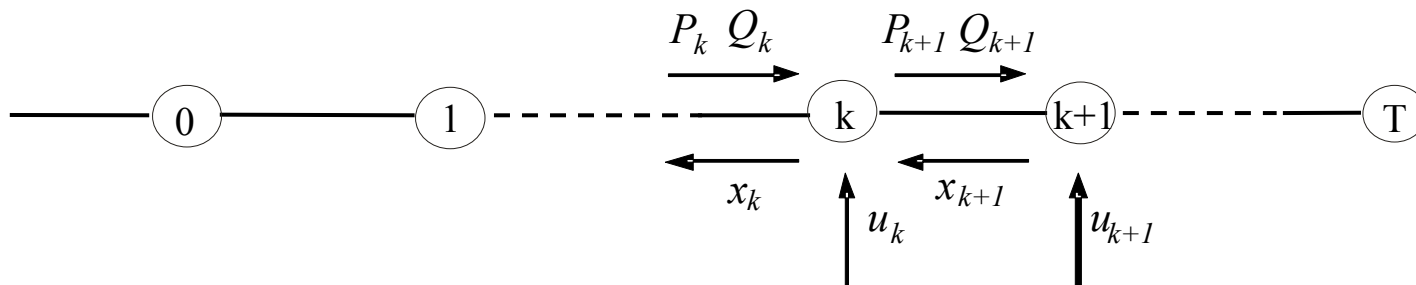


Durán (1968) proposed a DP approach to address the capacitor allocation problem in power distribution networks without *lateral branches*



- **stages** – all nodes in the power distribution network.
- **control variable** at a node  $k$  ( $u_k$ ) - the capacitive reactive power ( $Q_{Ci}$ ) injected at node  $k$ .
- **state** ( $x_k$ ) – total capacitive power flowing upstream from node  $k$ .

A simple feeder with states and control variables at stages  $k$  and  $k+1$



At stage  $k$ :  $x_k = x_{k+1} + u_k$

If  $V_k \cong 1.0 \text{ p.u}$  the total loss reduction in a section  $k$  is:

$$l_k^r = r_k (Q_k^2 - (Q_k - x_k)^2)$$

The economical value of the loss in section  $k$  in a given period of is:

$$c_k = \alpha_{et} l_k^r$$

The net benefit in section  $k$  is:  $\varphi_k(x_k) = c_k - f(u_k)$

$f(u_k)$  is the cost of capacitor bank at node  $k$ .

The optimization problem can be formulated as follows:

$$\max_u \left\{ \sum_{k \in N_I} \varphi_k(x_k) + \sum_{j \in N_F} \psi_j(x_j) \right\}$$

s.t:

$$x_{k+1} = x_k - u_k$$

$$\underline{u}_i \leq u_i \leq \bar{u}_i$$

$$\underline{x}_i \leq x_i \leq \bar{x}_i$$

$N_I$ : set of inner nodes.

$N_F$ : set of leaf nodes.

$$\psi_j = c_j - f_j(x_j)$$

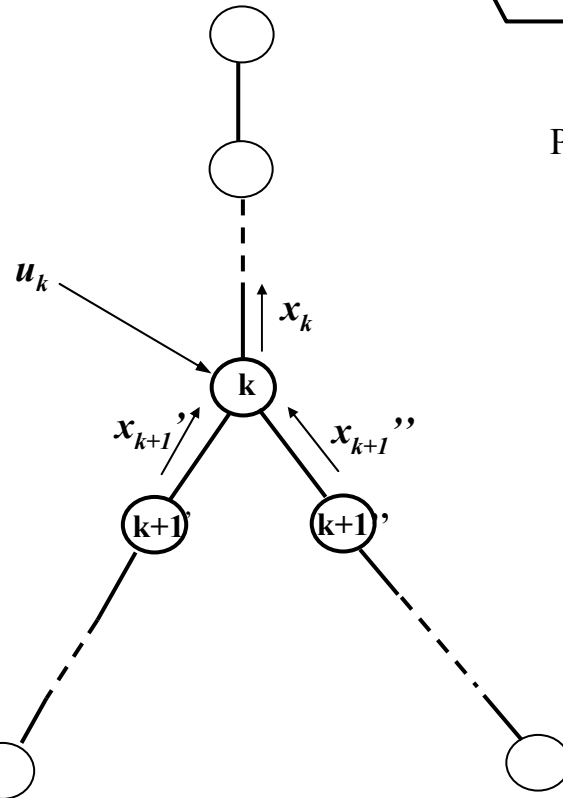
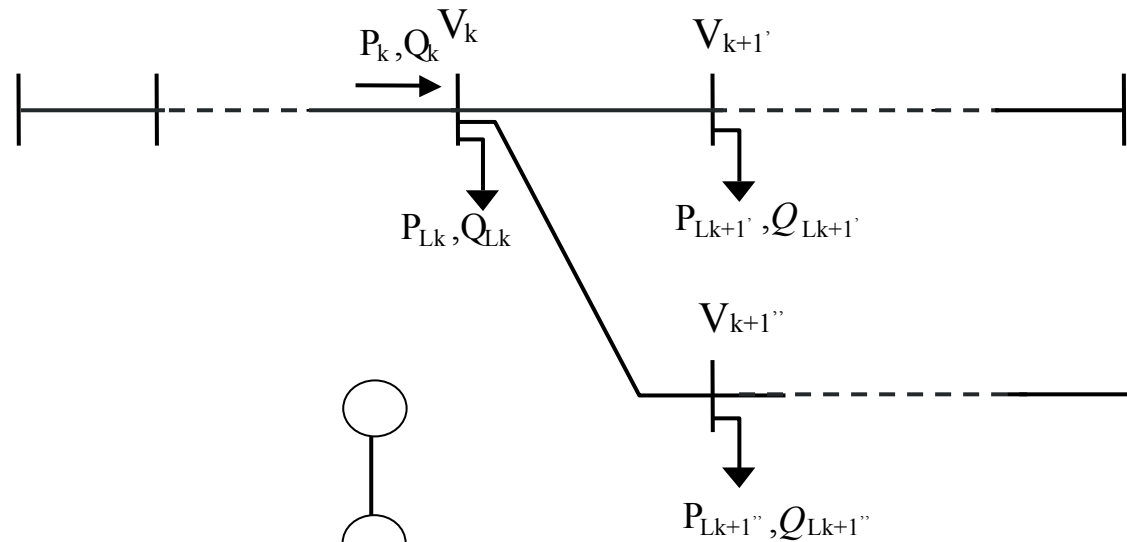
$$x_j = u_j$$

# The New DP Approach

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At node  $k$  we  
have a problem!

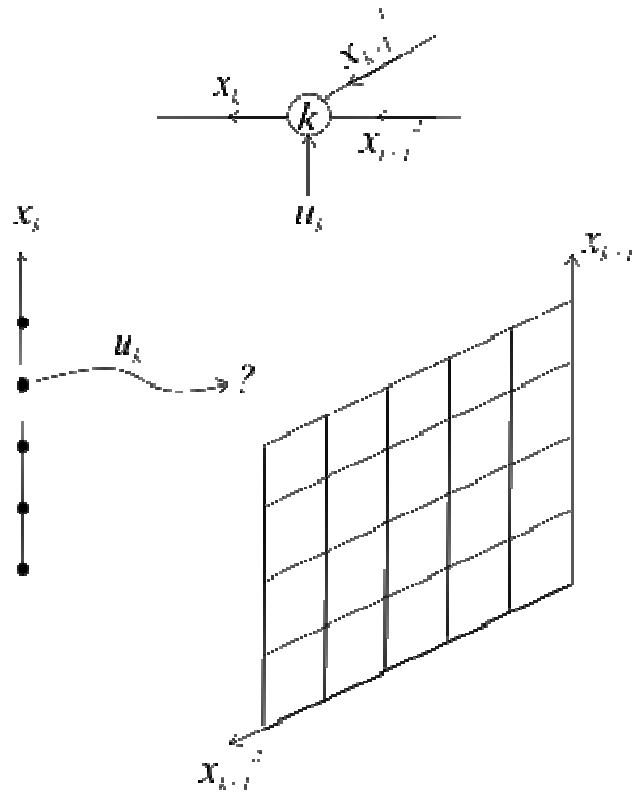
How to compute the  
contributions of stages  $k+1'$   
and  $k+1''$ ?

# The New DP Approach

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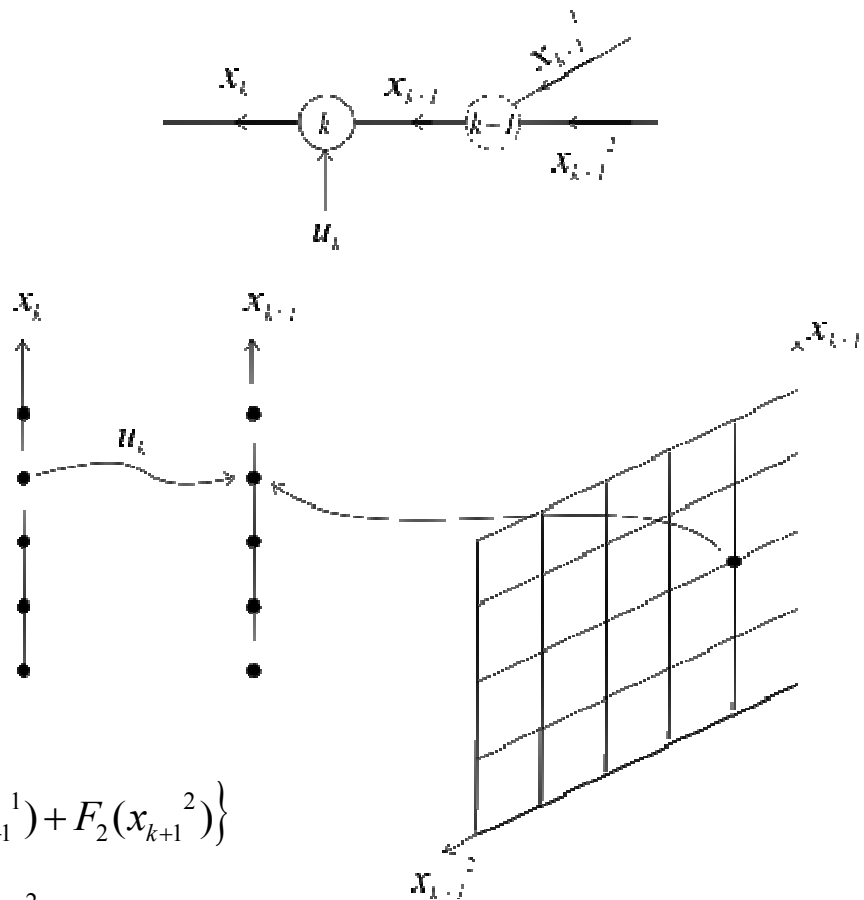
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Does it need a multidimensional DP algorithm?

# The New DP Approach

The capacitor allocation problem for networks with lateral branches is a “*false*” multidimensional DP problem.



$$F(x_{k+1}) = \min_{x_{k+1}^1, x_{k+1}^2} \{F_1(x_{k+1}^1) + F_2(x_{k+1}^2)\}$$

$$x_{k+1} = x_{k+1}^1 + x_{k+1}^2$$

# The New DP Approach

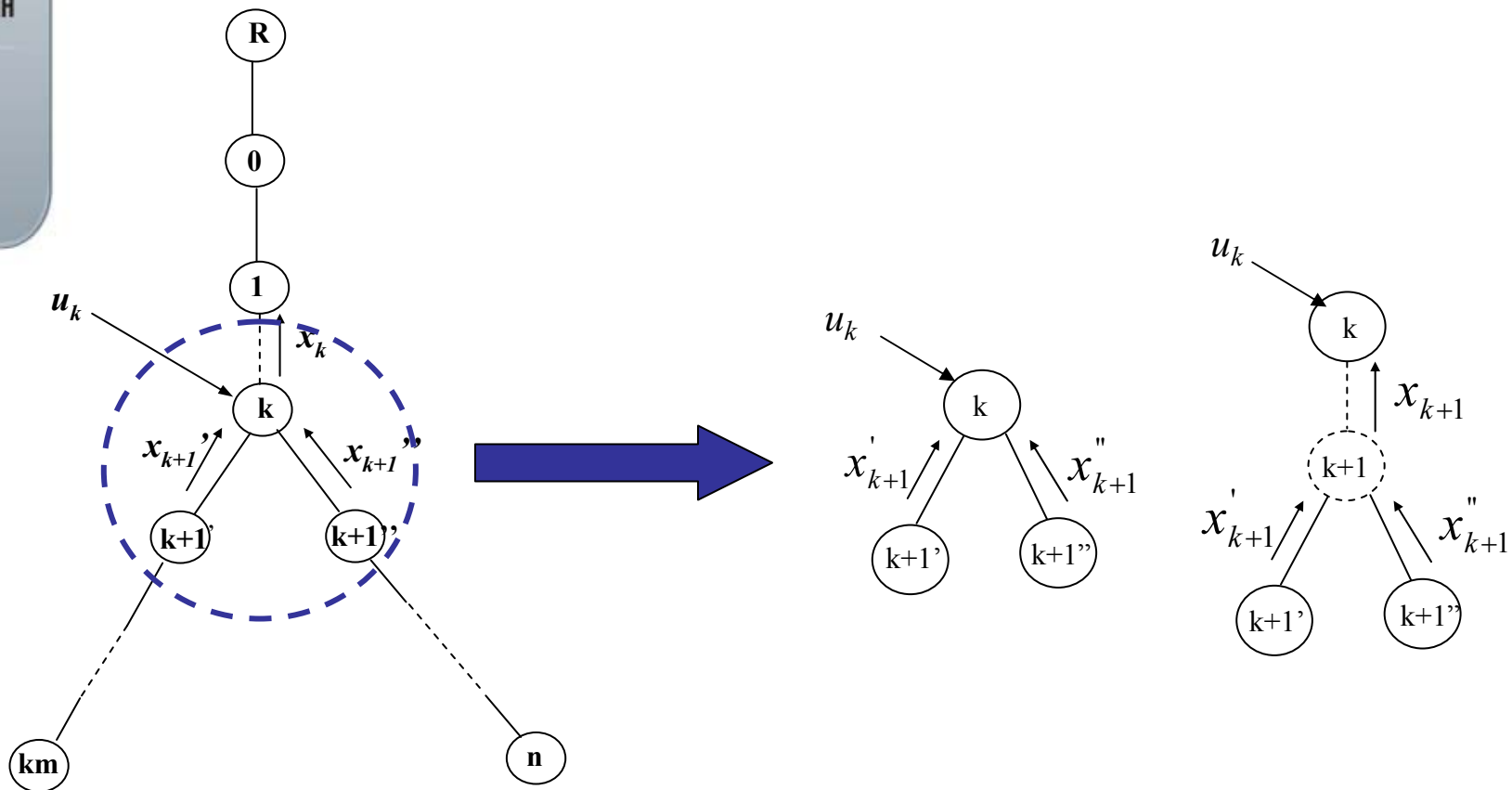
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Projecting the problem into the virtual stage  $k+1$  avoids the need of more dimensions in the DP approach





# How to solve it?

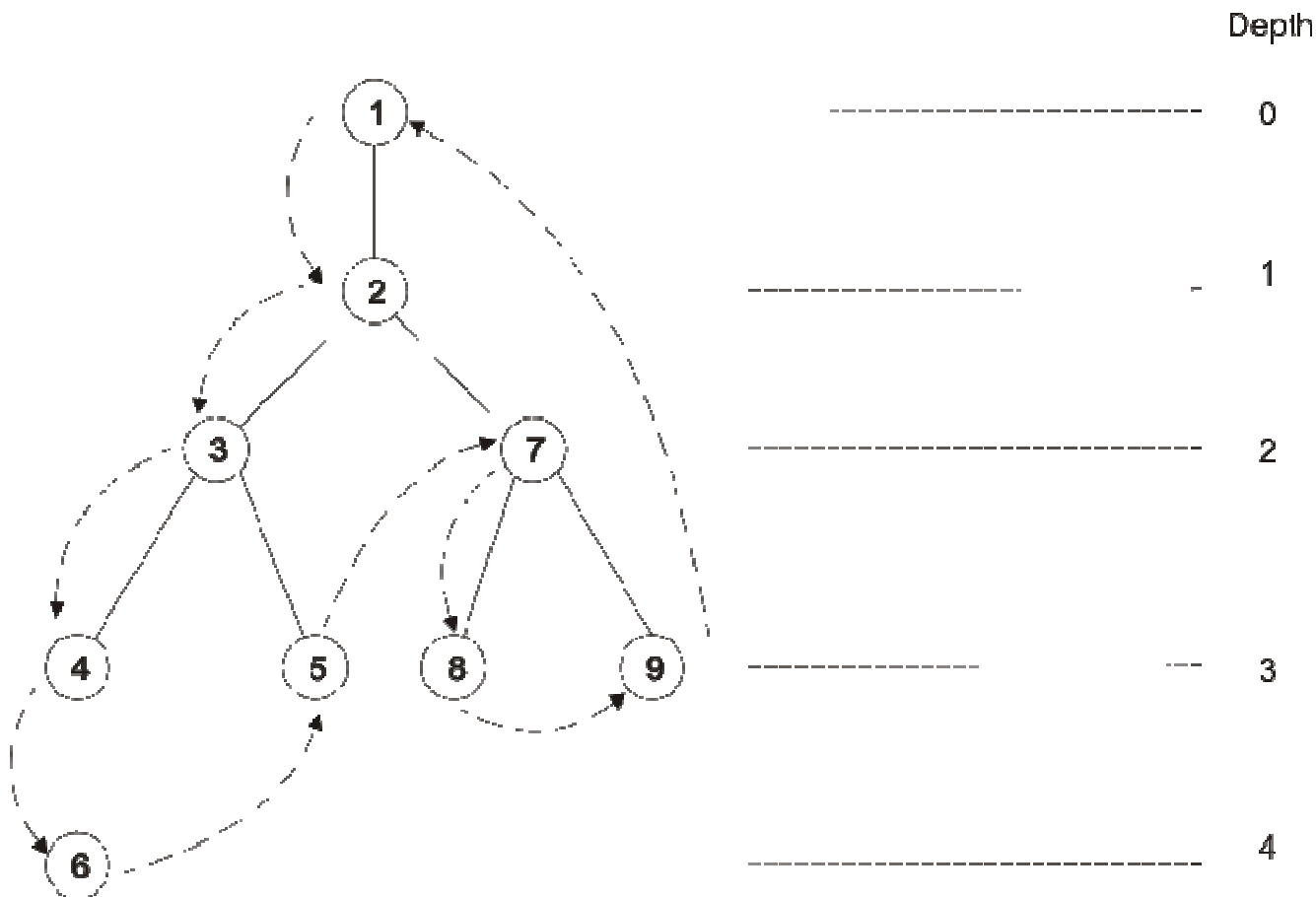
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Borrowing ideas from NF algorithms.



The backward DP procedure traverses the network with paths inverse to preorder. In this example: 9-8-7-5-6-4-3-2-1

# How to solve it?

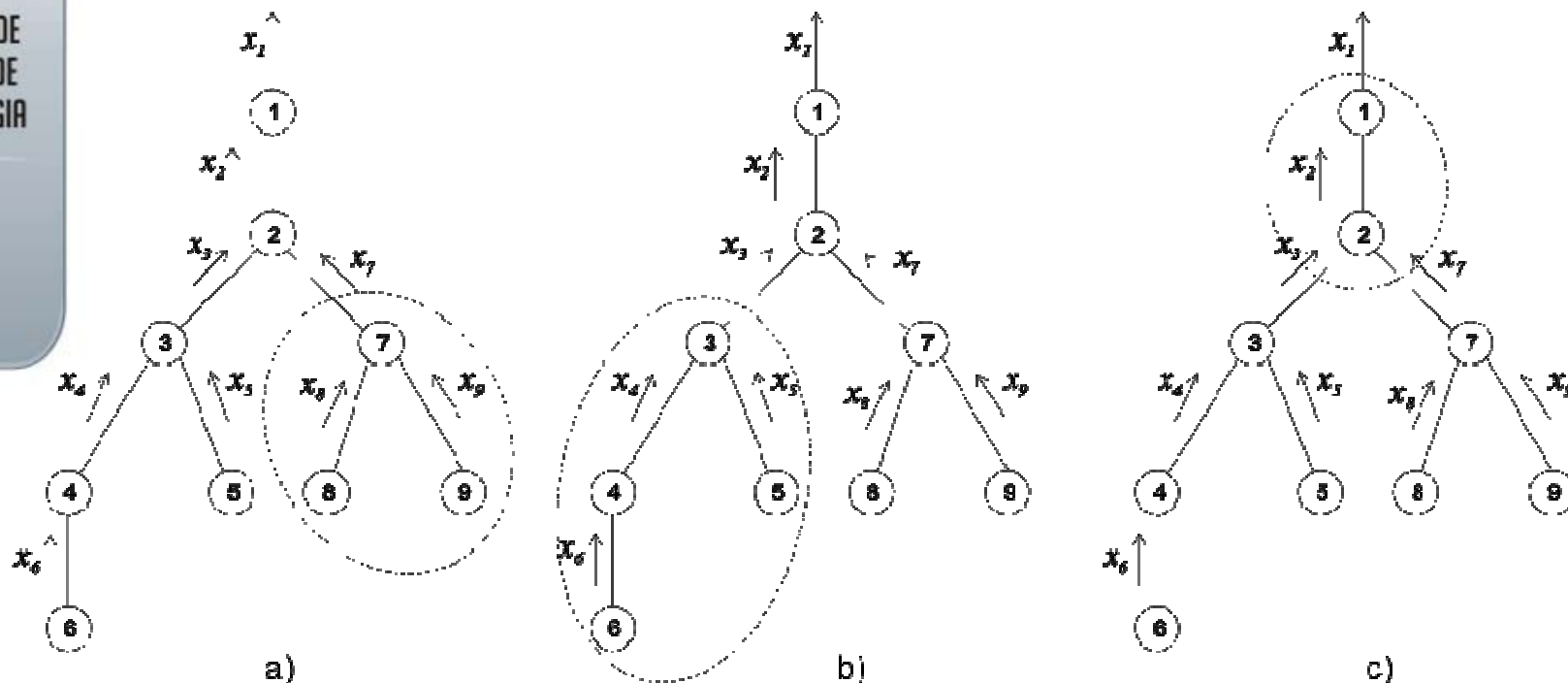
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DP applied to the example



- Compute  $F_9(x_9)$ ,  $F_8(x_8)$  e  $F_7(x_7)$ ;
- Compute  $F_5(x_5)$ ,  $F_6(x_6)$ ,  $F_4(x_4)$  and  $F_3(x_3)$ ;
- Compute  $F_2(x_2)$  e  $F_1(x_1)$ ;
- Go forward (in preorder) finding the optimal solution.

The algorithms was coded in C++ (Borland C++ 5.5) and ran under Windows 2000™ in a Pentium 4 2.2 GHz system.

Instances A and B, with 1596 and 2448 nodes, respectively.

Energy cost:  $\alpha_{et}=0,08 \text{ R\$/kwh}$

Capacitor cost:  $k_c=5,00 \text{ R\$/kVAr}$

One year, with intervals:  $\tau_0=1000$ ,  $\tau_1=6760$  e  $\tau_2=1000$  hours

Capacitors banks used: 150, 300, 450, 600, 900 and 1200 kVAr

## Results

Instance	Initial Cost (R\$)	Solution Cost (R\$)	Installed Capacity (kVAr)	Savings (%)
<i>A</i>	197.335	186.907	1800	5,28
<i>B</i>	451.092	386.008	5400	14,43

Computational times were 0,172s and 0,297s, for *A* for *B*.

- DP can be used to solve the fixed capacitor allocation problem (under the usual assumption of  $V_k = 1$  pu).
- Borrowed key ideas from NF problems.
- It can address real scale systems.
- DP gives a global optimal solution.
- With an additional dimension the approach can be generalized to the switched capacitor allocation problem.
- What to do if  $V_k \neq 1$  pu?

# Acknowledgments

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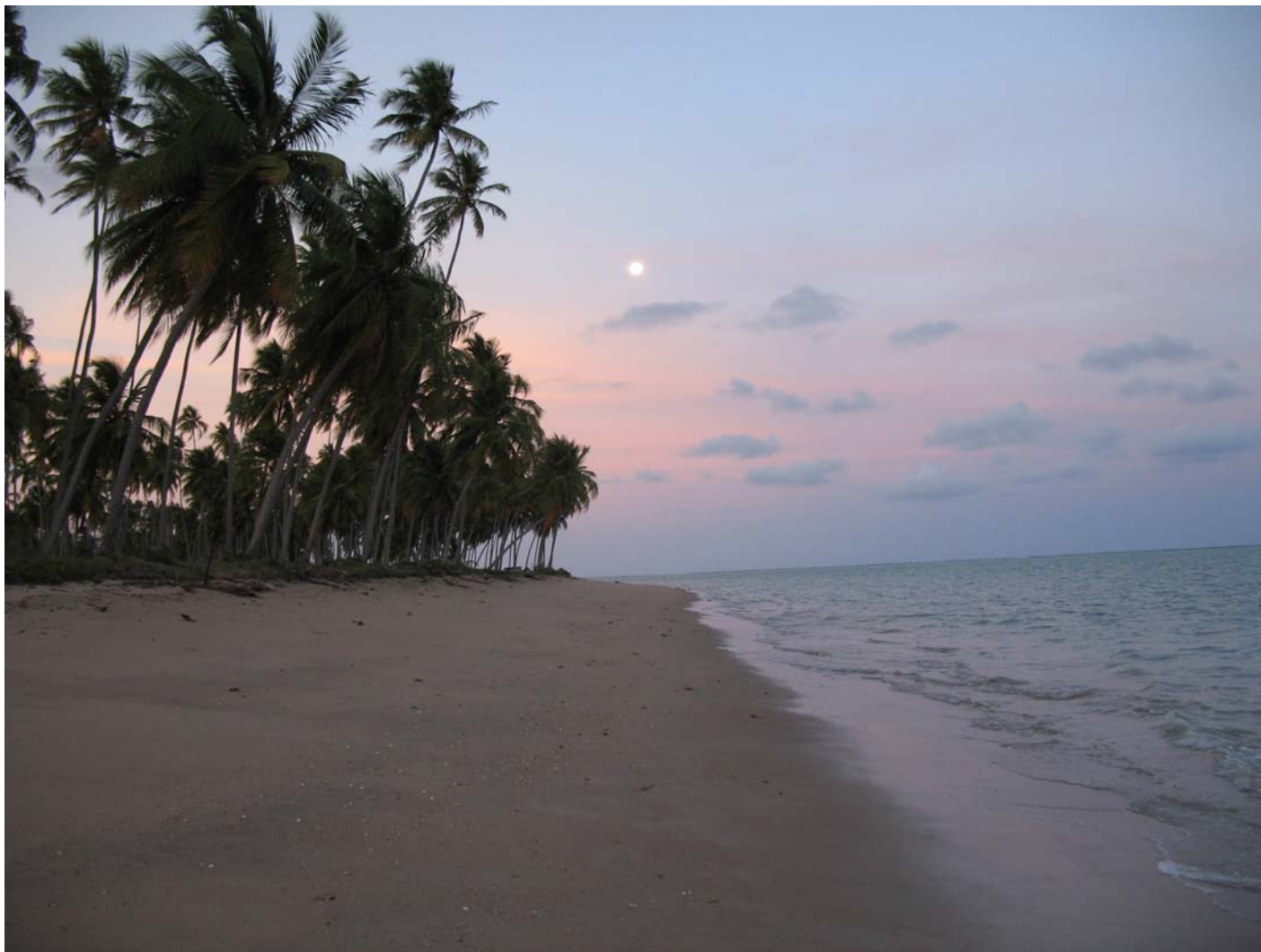
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*Grazie!*



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