

# TAKING ADVANTAGE OF DEGENERACY IN MATHEMATICAL PROGRAMMING

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and many students and post-docs

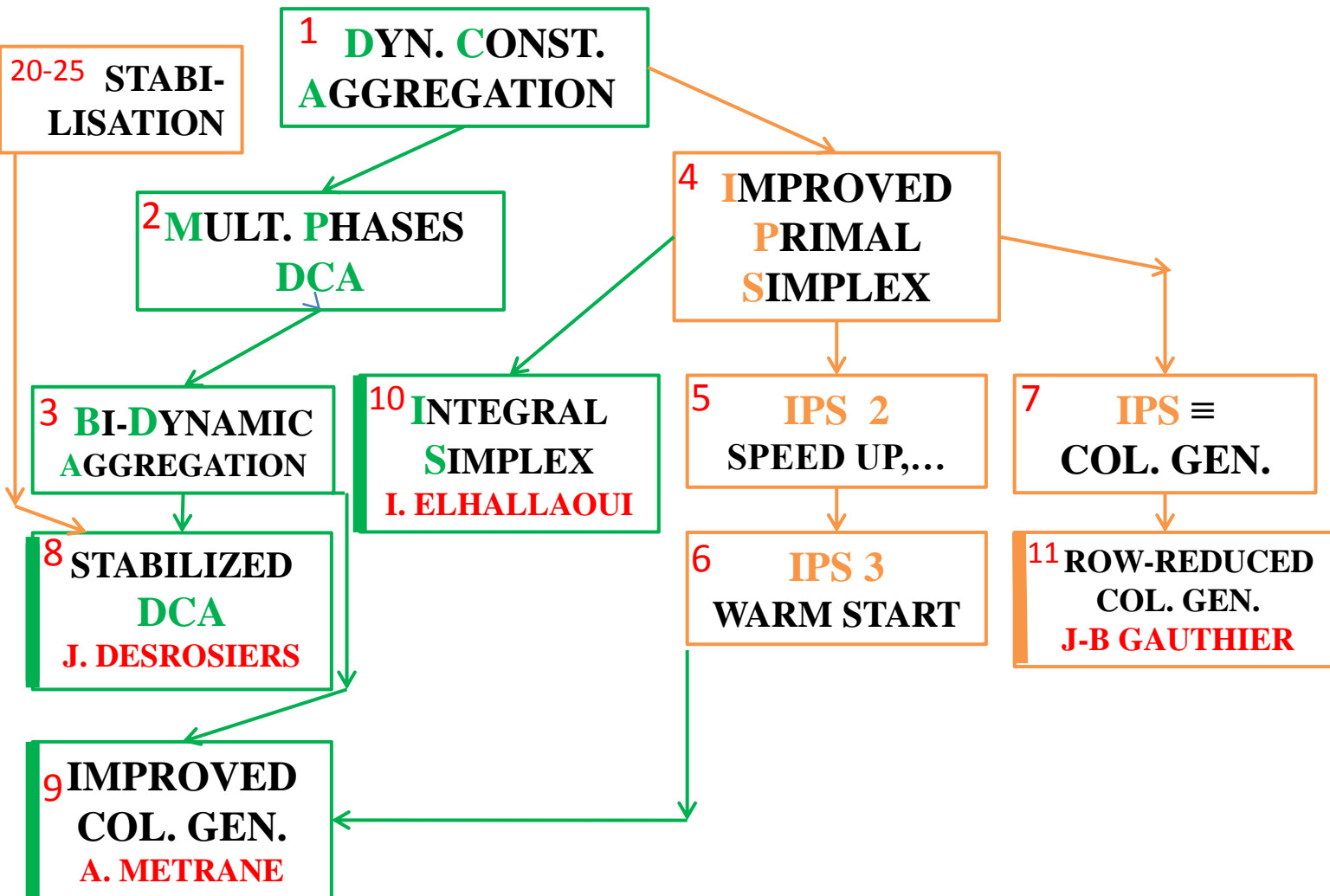
# OVERVIEW

- **THE TEAM PRESENTS 4 OTHERS TALKS IN THIS RESEARCH FIELD**
  - ROW REDUCED COLUMN GENERATION J.-B. GAUTHIER, ...
  - INTEGRAL SIMPLEX USING DECOMPOSITION I. ELHALLAOUI....
  - IMPROVED COLUMN GENERATION ... A. METRANE,...
  - STABILIZED DYNAMIC CONSTRAINT AGGREGATION... J. DESROSIERS,...
- **I START WITH A MOTIVATION OF THIS RESEARCH FIELD**
- **I PRESENT A SYNTHESIS OF THE PREVIOUS WORKS OF THE TEAM IN THIS FIELD**
- **I GIVE THE RELATIONS OF THE 4 TALKS WITH THE PREVIOUS WORKS**
- **I PRESENT A VIEW OF ON GOING WORKS**
- **I GIVE THE LIST OF THE PAPERS**

# MOTIVATION OF THIS RESEARCH FIELD

- POINTS TO IMPROVE IN THE PRIMAL SIMPLEX
  - AVOID THE EFFECT OF DEGENERACY
    - PERTURBATION AVOID CYCLING BUT PRODUCES SMALL STEP SIZE
    - INITIAL INTEGER SOLUTION CREATES DEGENERACY AND SLOW DOWN THE PROCESS
  - WORK WITH A SUBSET OF CONSTRAINTS
    - COLUMN GENERATION WORK WITH A SUBSET OF VARIABLES
    - THE NUMBER OF CONSTRAINTS HAS MORE EFFECT ON CPU TIME THAN NUMBER OF VARIABLES
  - START WITH INITIAL SOLUTION AND TAKE ADVANTAGE OF DEGENERACY TO REDUCE THE NUMBER OF CONSTRAINTS

# PREVIOUS WORKS

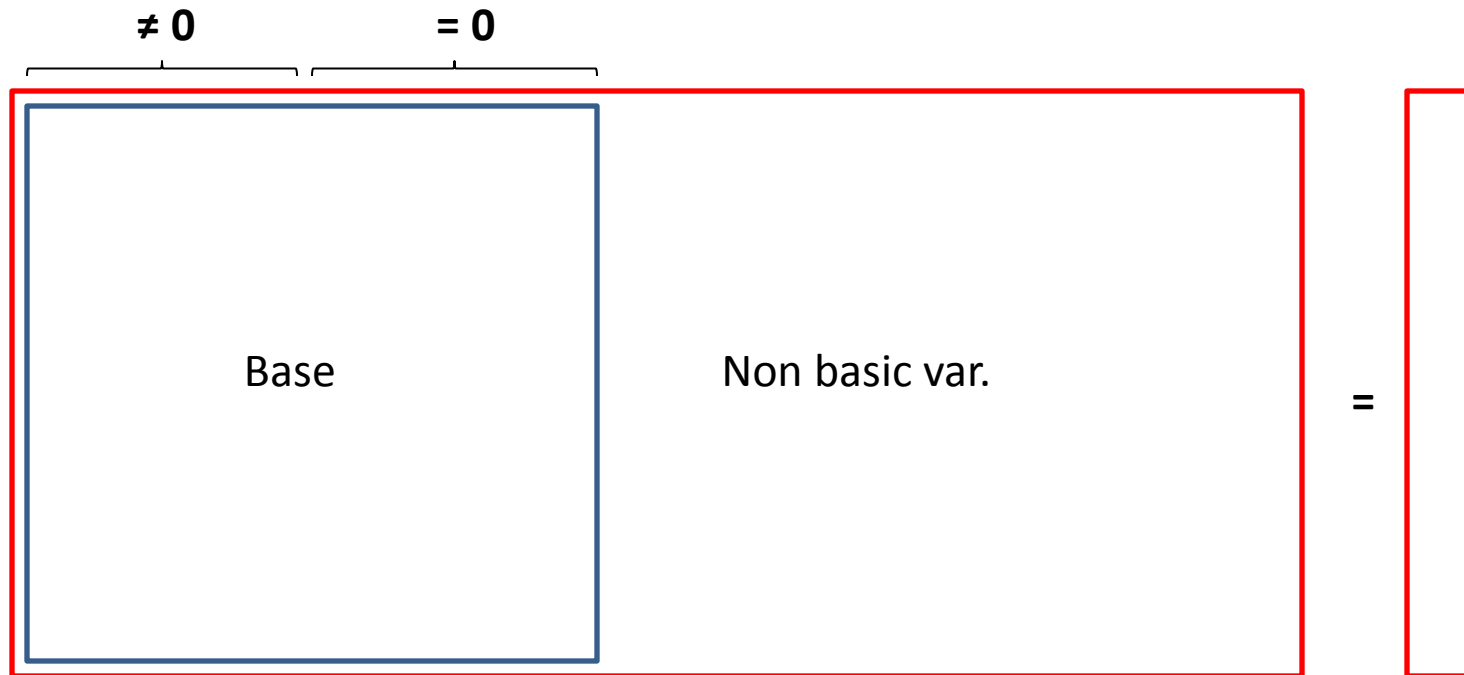


SET PARTITIONING

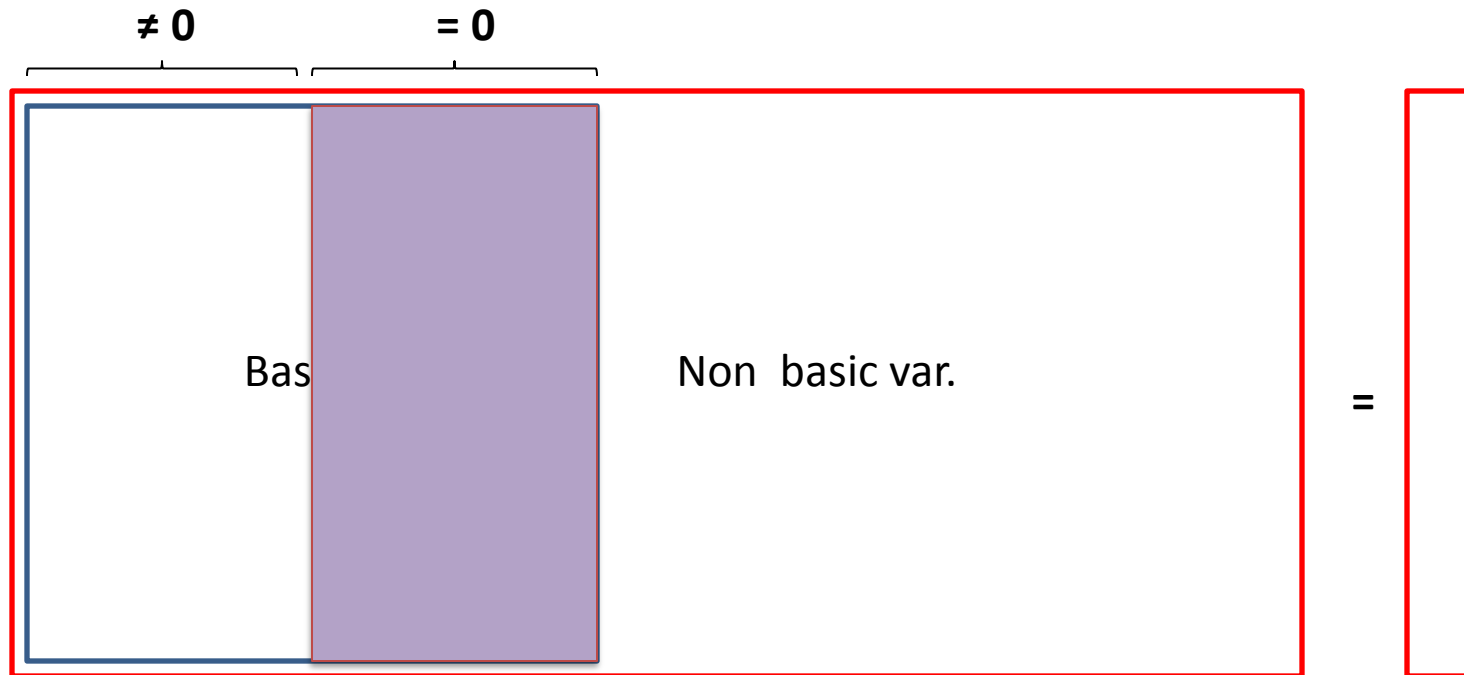
LINEAR PROGRAMING

MATH PROG.

# IPS ON A DEGENERATED LP



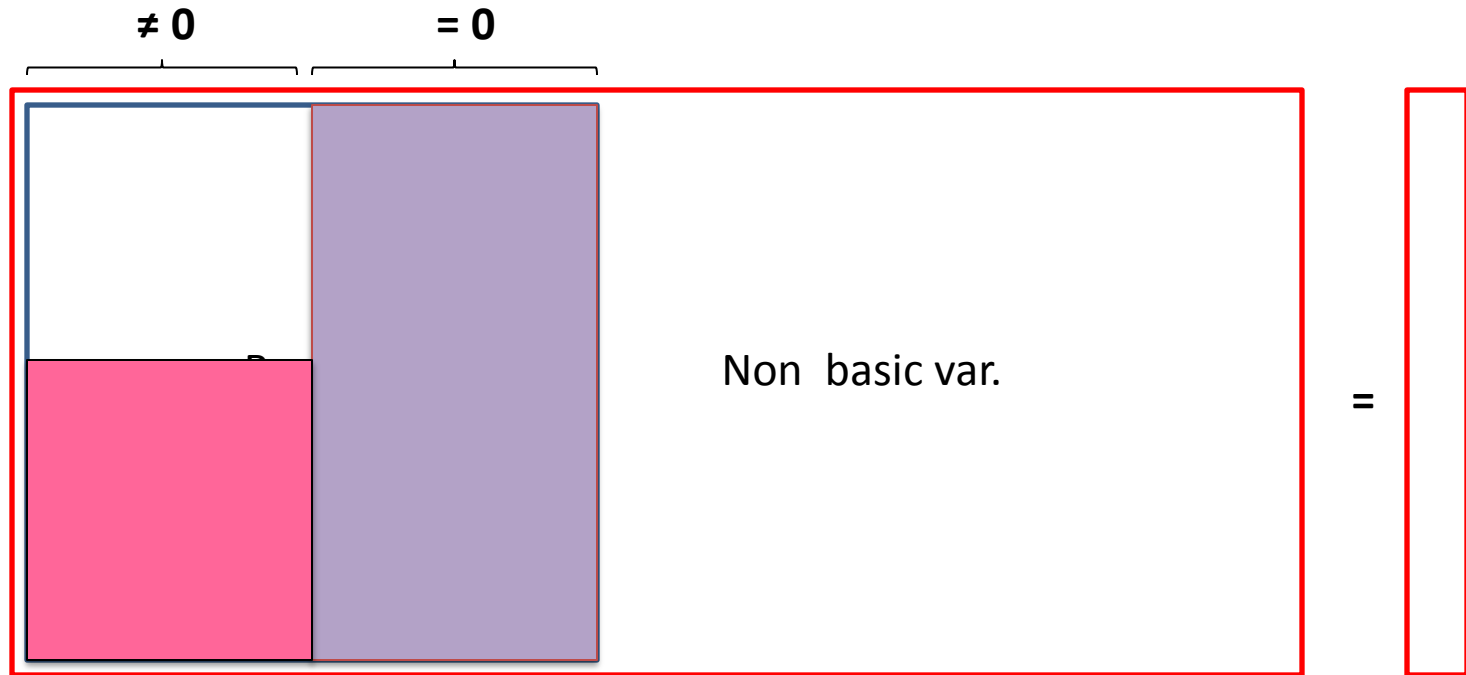
# IPS ON A DEGENERATED LP



- Remove the degenerate variables from the base



# IPS ON A DEGENERATED LP



- Remove the degenerate variables from the base
- Remove the dependant rows



# REDUCED AND COMPLEMENTARY PROBLEMS

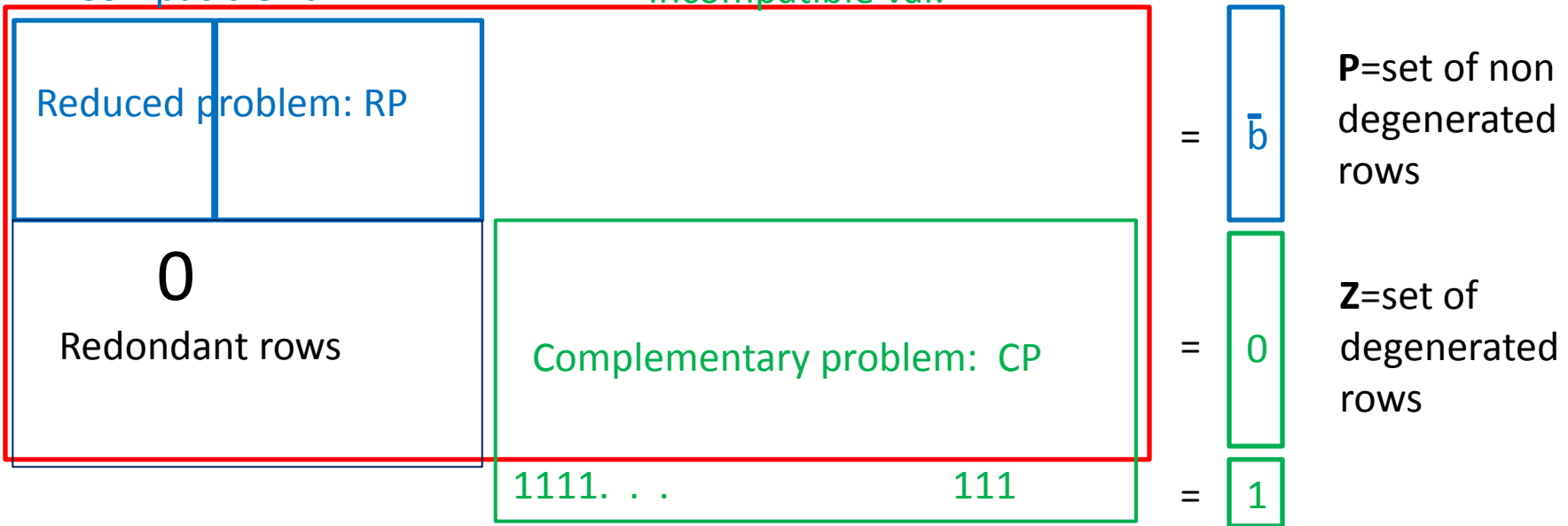
M: a compatibility matrix

$$\begin{array}{|c|} \hline M \\ \hline \end{array} \times \begin{array}{|c|} \hline \\ \hline \text{pink} \\ \hline \end{array} = \begin{array}{|c|} \hline 0 \\ \hline \end{array}$$

$$\begin{array}{|c|c|} \hline P & 0 \\ \hline \hline M & \\ \hline \end{array} \times \begin{array}{|c|c|c|} \hline \text{white} & \text{purple} & \\ \hline \text{pink} & \text{purple} & \\ \hline \end{array} = \begin{array}{|c|} \hline \\ \hline \end{array}$$

Compatible var.

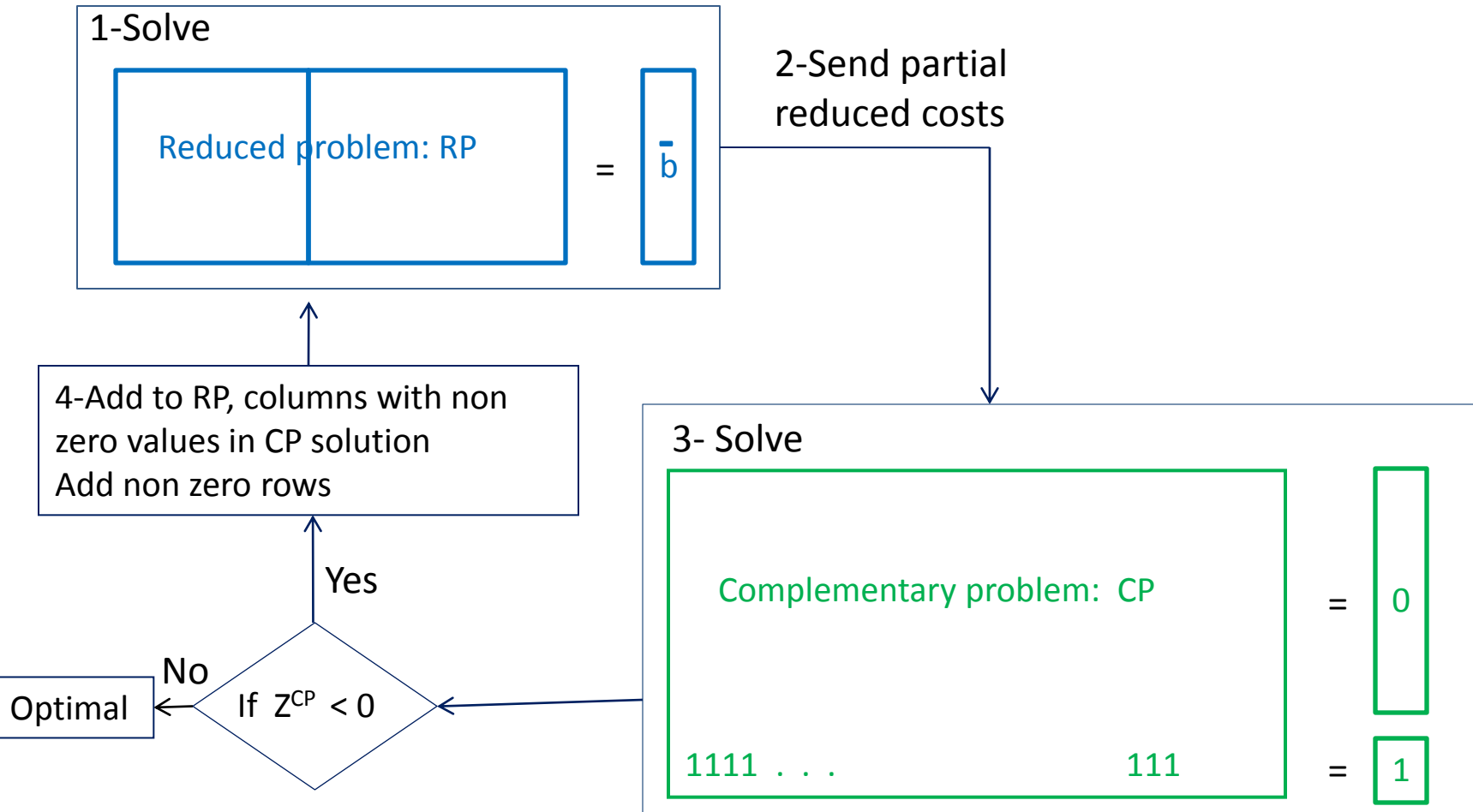
Incompatible var.



Compatible var.:  $(M A_j) = \bar{A}_j^Z = 0$



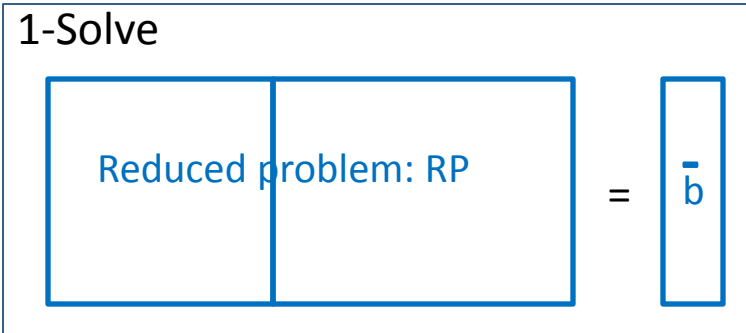
# IMPROVED PRIMAL SIMPLEX



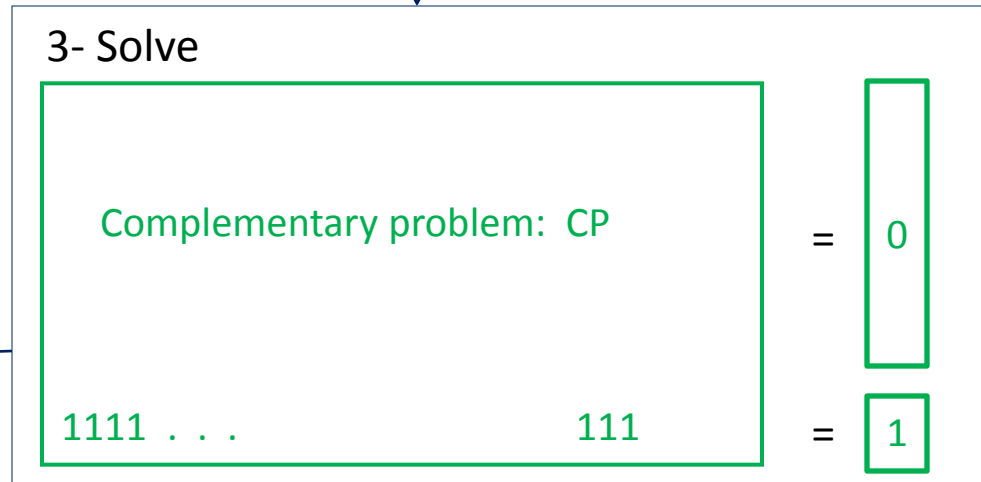
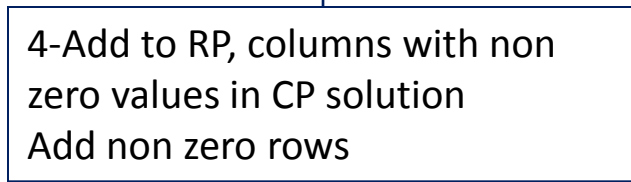
# IMPROVED PRIMAL SIMPLEX

The solution is improved by:

- each pivot of RP
- each iteration 2,3,4,1



2-Send partial reduced costs



Yes

No

If  $Z^{CP} < 0$

Optimal

# SUPPLEMENTARY RESULTS

4 IMPROVED  
PRIMAL  
SIMPLEX

5 IPS 2  
SPEED UP,...

6 IPS 3  
WARM START..

7 IPS =  
COL. GEN.

5 -USE PRESOLVE AND DUAL SIMPLEX,  
-SOLVE CP MANY TIME AT EACH ITERATION, ...

6 -WARM START, USE  $M = \begin{bmatrix} & \\ & I \end{bmatrix}$ ,  
- REMOVE DEGENERATED CONST. AT UPPER BOUND

7 COL. GEN. WITH ORIGINAL VARIABLES IN THE MASTER PROBLEM

- Löbel 1997, for Vehicle Routing Problem
  - Subproblem = shortest path
  - Add arcs of the shortest path in the master problem
- Degenerated const. are suppressed in the M.P., they are redundant
- Some of them are added to M.P. when incompatible variables are added. They are removed in S.P.

IPS is a Column Generation on the original formulation modified dynamically

# DCA and IMPROVEMENTS

## 1 DYN. CONST. AGGREGATION

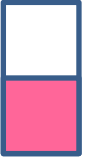
- 1 -REMOVE THE DEGENERATE VARIABLES
- REMOVE IDENTICAL ROWS  $\subset$  DEPENDENT ROWS
- SPECIALIZED PROCEDURES REPLACE CP
- INTEGRATED IN GENCOL

## 2 MULT. PHASE DCA

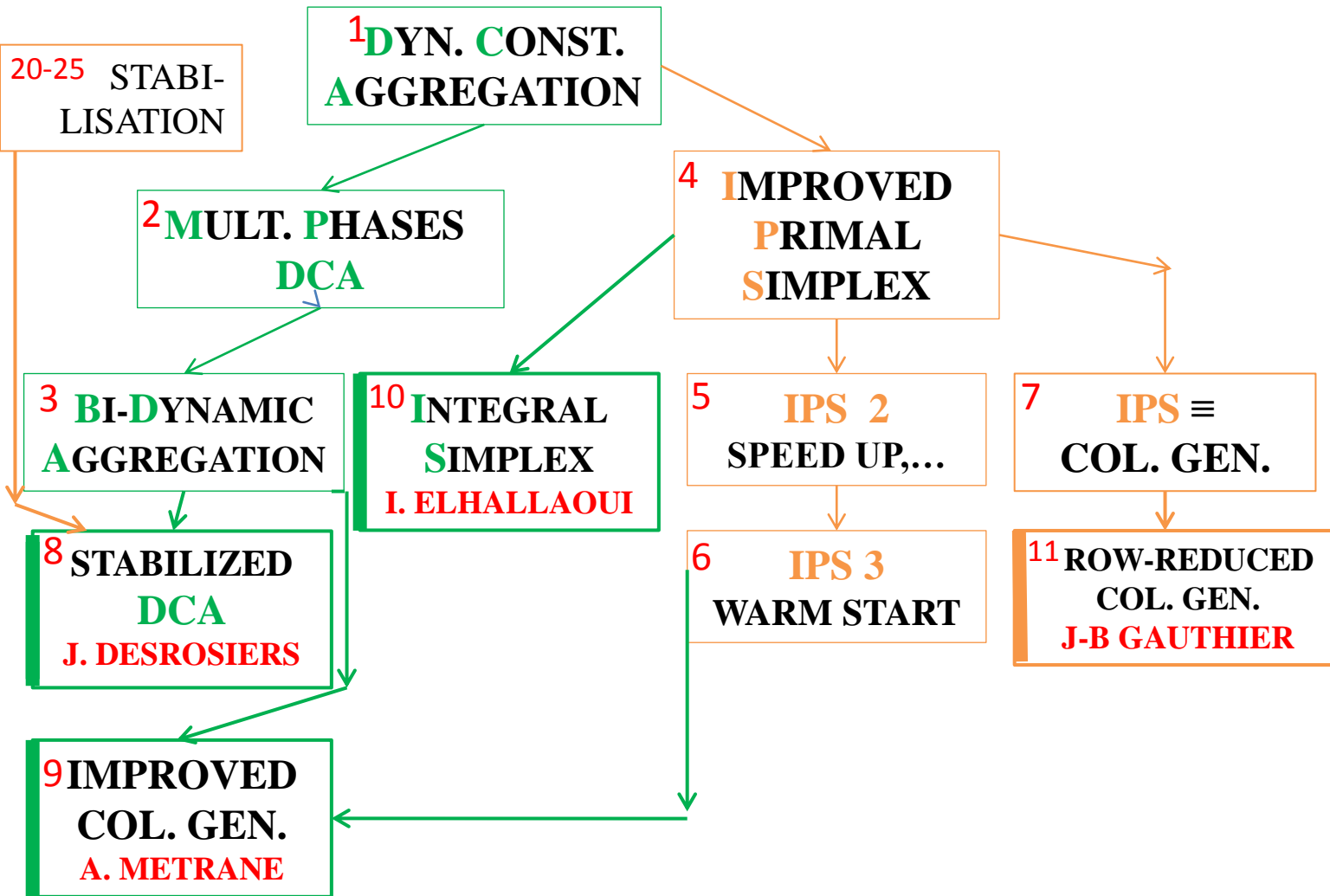
- 2 -PARTIAL PRICING IN THE SUBPROBLEM
- SELECT IN PHASE k COLUMNS WITH  $|\bar{A}_j^z|^{1 \leq k}$
- REDUCES CPU TIME BY 4 to 50

## 3 BI-DYNAMIC AGGREGATION

- 3 -DYNAMIC AGGREGATION IN THE MASTER PROBLEM AND IN THE SUBPROBLEM
- REDUCES CPU TIME UP TO 100



# IN THIS CONFERENCE

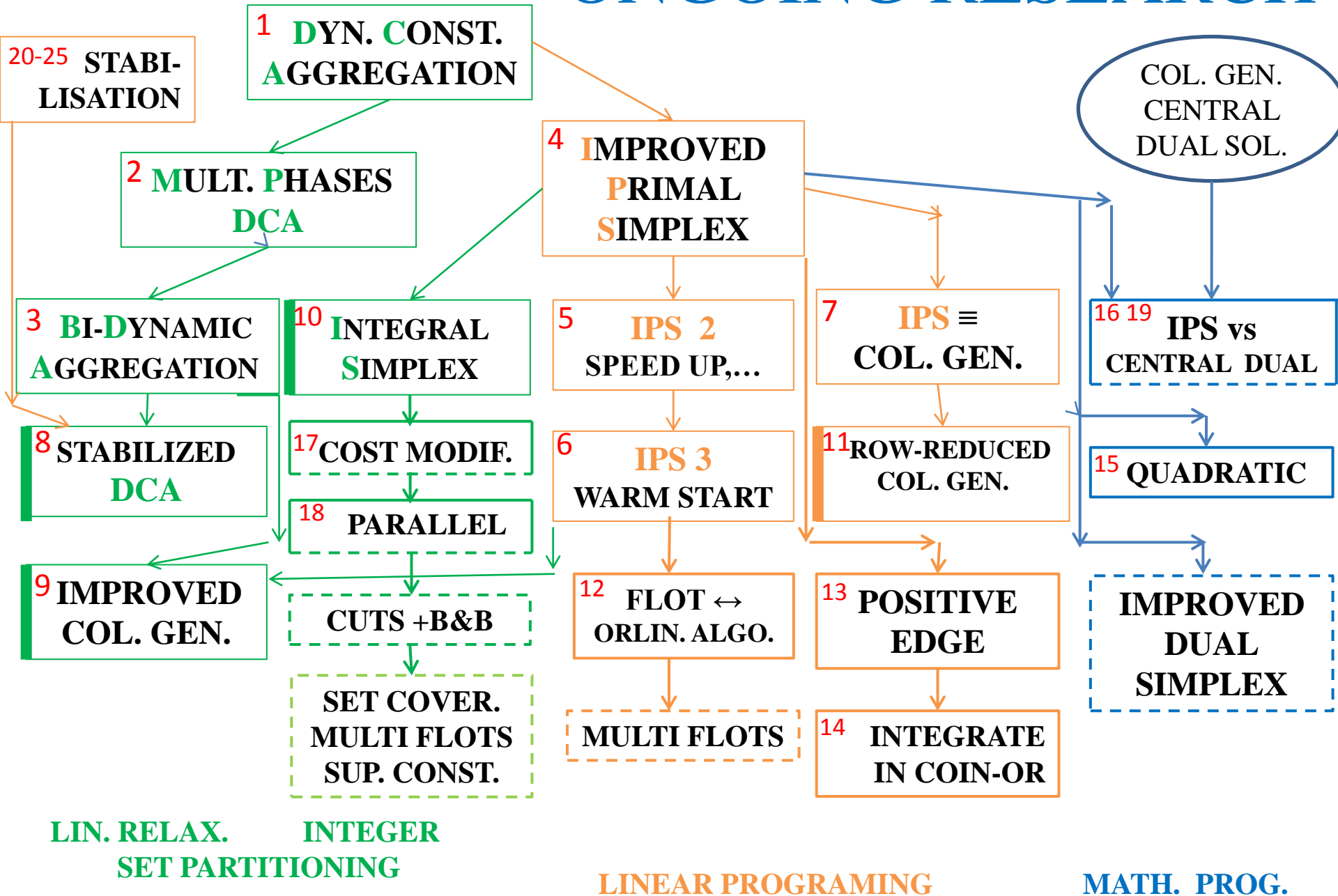


SET PARTITIONING

LINEAR PROGRAMING

MATH. PROG.

# ONGOING RESEARCH



# NEW PRICING RULE

## SELECTING NON DEGENERATE PIVOT

**13 POSITIVE  
EDGE**



**13** – SELECT FIRST THE COMPATIBLE VARIABLES

- $M \times A$  USES TOO MUCH TIME FOR LARGE PROBLEMS  
( $10^{15}$  OPERATIONS WITH  $A$  (100 000 x 400 000) )
- POSITIVE EDGE RULE WORKS DIRECTLY ON  $A_j$   
STOCHASTIC TEST WITH  $P(\text{error}) < 2^{-20}$   
(SAME COMPLEXITY THAN COMPUTING A REDUCE COST)

**14** – REDUCES CPU TIME BY 3 to 5

**14 INTEGRATED  
IN COIN-OR**

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# APPLICATIONS

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