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# State Splitting in Continuous Time STN-models

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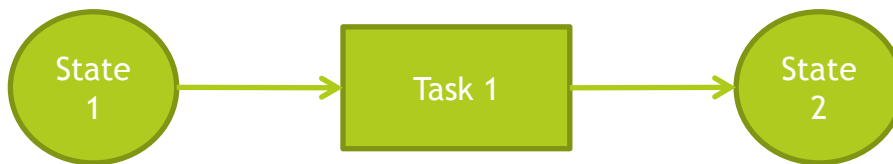
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# State Task Network models

- ▶ STN models
  - ▶ Are used for modeling batch process in both discrete and continuous time
- ▶ An STN graph consists of
  - ▶ Task nodes described as rectangles
  - ▶ State nodes described as circles
  - ▶ Directed arches
- ▶ States represent commodities
- ▶ Tasks transform one or more states into a new state
  - ▶ Tasks are preformed on units
- ▶ Arches describe batches of commodities moving through the graph

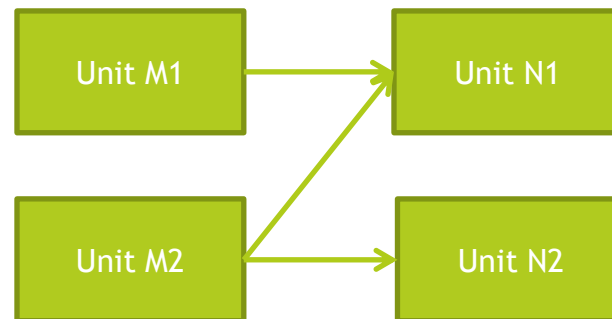
## Example: A simple STN graph



# Limited equipment connectivity

- ▶ Limited equipment connectivity
  - ▶ When at least one unit in a production stage is not connected to all units in the next stage
  - ▶ Common in many industries

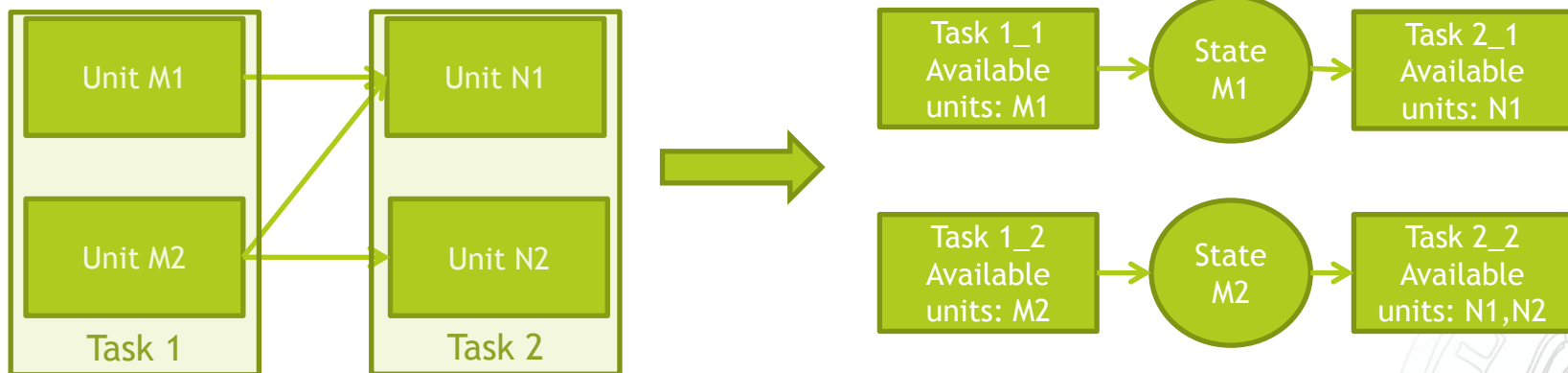
## Example: Limited equipment connectivity



# Task Splitting

- ▶ Kondili et al. proposed task splitting for including limited equipment connectivity in STN models
- ▶ Task Splitting does the following:
  - ▶ Duplicates tasks for units in the later stage to include limited connectivity
  - ▶ Task Splitting does not require any modifications to the mathematical model, only additional tasks are required
- ▶ The method has two drawbacks:
  - ▶ Increases the number of binary variables
  - ▶ Prohibits merging of batches

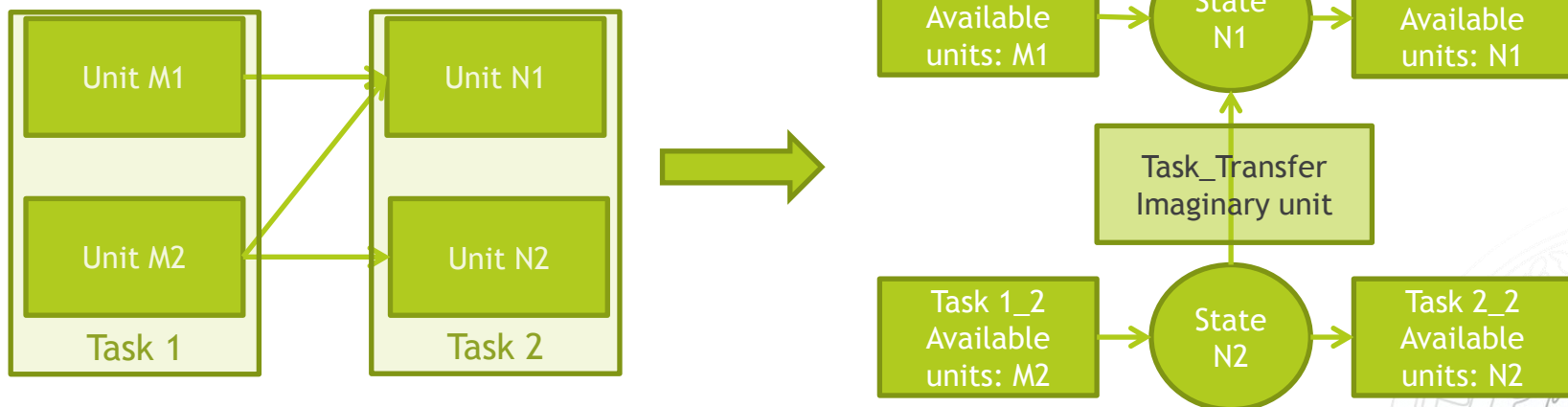
## Example: Task Splitting



## State splitting

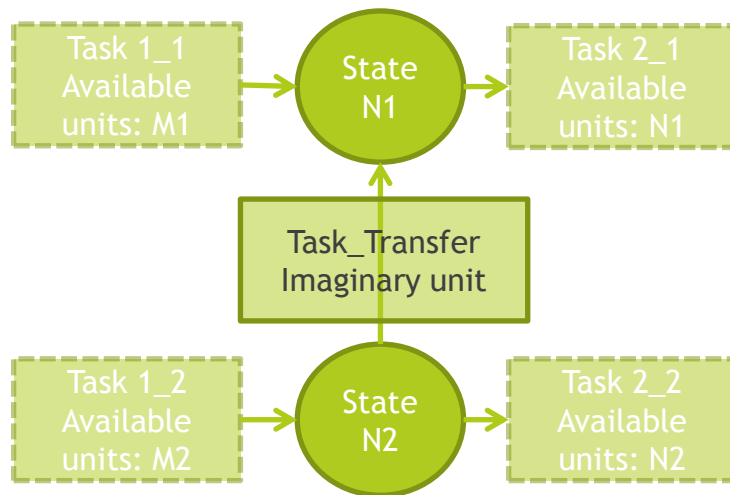
- ▶ Includes limited connectivity by splitting states and connecting them instead of splitting tasks
- ▶ Requires:
  - ▶ A new set of “imaginary” transfer tasks and units
  - ▶ Inclusion of the new task(s) into the material balance constraint
  - ▶ Reformulated batch size constraint for transfer tasks

### Example: State Splitting



## Imaginary transfer unit and task

- ▶ For every unit configuration with limited connectivity State Splitting adds a imaginary unit and task connecting two States
  - ▶ The transfer task is instantaneous, costless, lossless and does not require any utilities or resources to be executed
    - ▶ The only constraints affected by the new task is the material balance and the batch size constraints
      - ▶ Adds two new continuous variables/time point to the model
      - ▶ Assignment and timing constraints are unaffected
- ▶ The mathematical formulation reduces the transfer unit and task to a one-way flow between two states



Variables associated with tasks:

$W_{s_{transfer,n}}$  - binary variable

$W_{f_{transfer,n}}$  - binary variable

$B_{s_{transfer,n}}$  - batch size variable

$B_{p_{transfer,n}}$  - batch size variable

$B_{f_{transfer,n}}$  - batch size variable

$T_{f_{transfer,n}}$  - timing variable



## Mathematical formulation

- ▶ State Splitting for a continuous time STN model
  - ▶ STN model by Maravelias and Grossmann 2003

### New sets

$I^{trans}$  - imaginary transfer tasks

$U^{trans}$  - imaginary transfer units

### Reformulated mass balance constraint

$$S_{s,n} = S_{s,n-1} + \sum_{i \in I^c_s} B_{S_{i,n}} - \sum_{i \in I^p_s} B_{f_{i,n}} \quad \forall s, n > 1$$

### Batch size constraint

$$B_{S_{i,n}} = B_{f_{i,n}} \quad \forall i \in I^{trans}, n$$



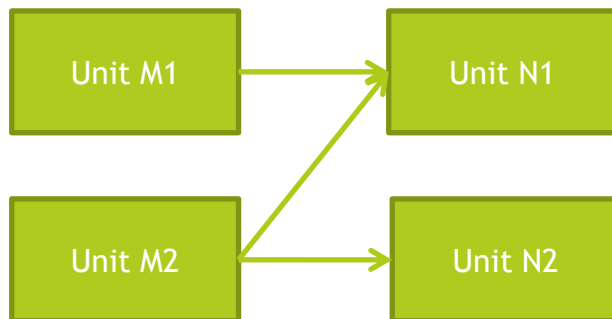


## Benefits of State Splitting

- ▶ State Splitting overcomes both drawback of Task Splitting as:
  - ▶ Only continuous variables are added to the model
    - ▶ The addition of only continuous variables reduces the increase in computation time compared to Task Splitting
    - ▶ The number of additional variables is less than for Task Splitting
  - ▶ Merging (and splitting) of batches is possible
    - ▶ The possibility to merge batches increases the flexibility of the mathematical model
    - ▶ In some cases this improves the solution quality
- ▶ The only drawback of State Splitting is a slight increase in model complexity

### Comparison: Number of variables

#### Unit configuration



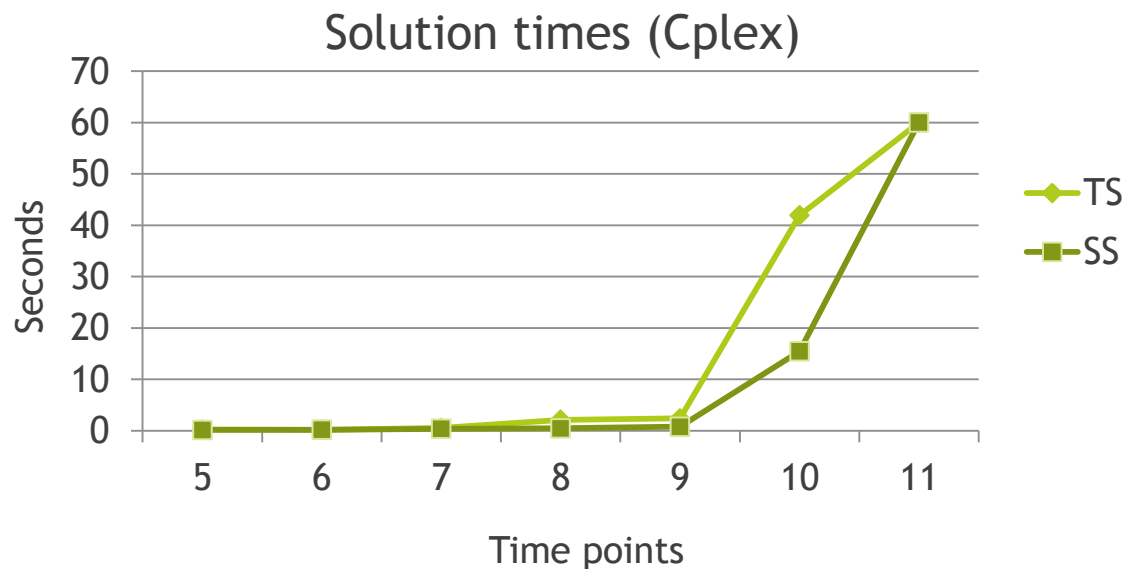
Method	# of binary *	# of cont. *
Task Splitting	10	41
State Splitting	8	37

\*Number of variables / time point



# Computational results for a continuous time STN model using State Splitting

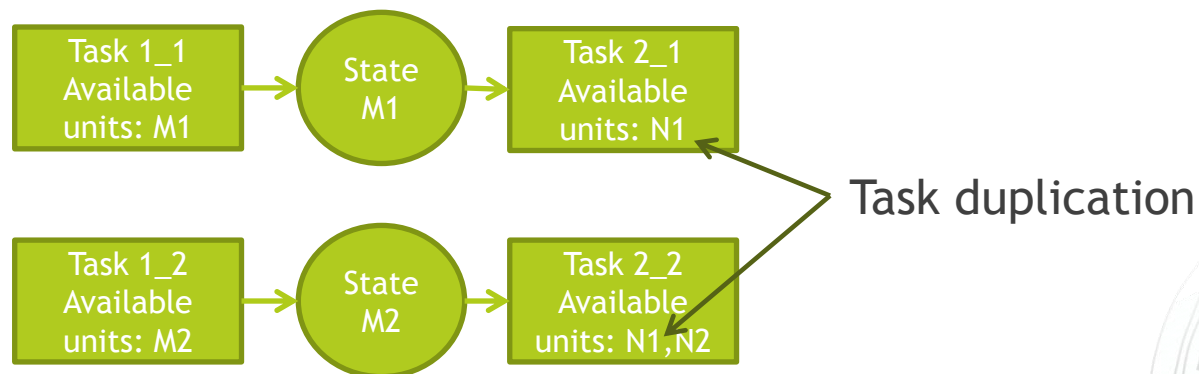
- ▶ A simple 1-commodity production planning problem with a two-stage limited connectivity unit setup
  - ▶ Objective function: maximize profit
  - ▶ Fixed time horizon (196 hours)
    - Incremental number of time points



## Improving solution quality

- ▶ State Splitting is able to produce better results than Task Splitting when:
  - ▶ The optimal solution includes at least one occurrence of batch merging
  - ▶ This is not possible in Task Splitting due to the following:
    - ▶ Tasks are duplicated
    - ▶ The allocation constraint only allows one task to be executed on each unit
  - ▶ In State Splitting this can be done because no tasks have been duplicated

### Example: Task duplication



# Improving solution quality

**State Splitting**

**Objective value: 94240**

Total production: 58900

M1	9000							
M2		13500		12900		13500		
N1			6300		6300		6300	
N2	10000		10000		10000		10000	
	0	24	43,5	67,5	86,5	110,5	129,9	192
S1		9000	2700	2700	2800	2800		
S2			3500	3500				
Transfer S2->S1				6400		3500		

**Task Splitting**

**Objective value: 90880**

Total production: 56800

M1		6300						
M2	13500			13500		13500		
N1			6300		6300		4200	
N2	10000		10000		10000		10000	
	0	19,5	43,5	67,5	86,9	110,9	130,4	192
S1								
S2	10000	13500	3500	3500	700	700		



# Conclusions

- ▶ State Splitting produces smaller optimization problems than a corresponding Task Splitting formulation
- ▶ Solution times
  - ▶ Task Splitting vs. State Splitting
    - ▶ State Splitting produced faster results than Task Splitting
    - ▶ The results are consistent regardless of solver
- ▶ Solution quality
  - ▶ If the optimal solution includes splitting or merging a batch to/from a unit with limited equipment connectivity State Splitting will find a better solution than Task Splitting



**Thank you!**

Questions?

