Petri Net Modeling, Scheduling and Real-Time Control of Cluster Tools in Semiconductor Manufacturing

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## Cluster Tools for Semiconductor Manufacturing



 An integrated manufacturing system
 process module (PM)
 transport module (TM)
 cassette module (CM)

#### Mechanically interconnected

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#### Why Use Cluster Tools?





#### **Cluster Tools**

#### Configuration

A robot
Single arm
Dual arm
Process modules (PM)
Loadlocks (LL)
No intermediate buffer





#### Wafer Flow Pattern

- Single wafer type
- n steps (operations)
- $(m_1, ..., m_i, ..., m_n)$ :  $m_i$  parallel PMs for Step i



#### **Scheduling Problem**

- To schedule the production cycle with minimal cycle time
- The problems
  - Residency time constraint: after being completed, a wafer should be unloaded from a PM in a given time
  - Activity time variation
  - Schedulability
  - Scheduling algorithm
- Key: robot activity scheduling including robot waiting



## Petri Net Modeling of Single Arm Cluster Tools (SACT)

- p<sub>i</sub>: wafer processing at step i
- $x_0$ : unload wafer from LL and move to step
- $x_i$ : move from step i to i+1
- $x_n$ : return wafer from step n to LL
- $y_i$ : move from step i+2 to i
- $y_{n-1}$ : move from step 0 to n-1
- $\mathbf{y}_n$ : move from step 1 to n
- Robot waiting at  $p_i: q_i$
- Load and unload from and to  $p_i$ :  $s_{i1}$  and  $s_{i2}$
- Scheduling: determining wait time in q<sub>i</sub>



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## Time Modeling of SACT

Symbol	Transition or place	Actions	Allowed time duration
λ	s <sub>i1</sub>	Robot loads a wafer into step i, $i \in \Omega$	
λ	s <sub>i2</sub>	Robot unloads a wafer from step i, $i \in N_n$	
$\lambda_0$	s <sub>02</sub>	Robot unloads a wafer from a loadlock and aligns it	
μ	X <sub>i</sub>	Robot moves from step i to step i+1, i $N_{n-1}$	
μ	x <sub>n</sub>	Robot moves from step n to step 0	
μ	y <sub>i</sub>	Robot moves from step i+2 to step i, $i \in N_{n-2}$	
μ	У <sub>п-1</sub>	Robot moves from step 0 to step n-1	
μ	y <sub>n</sub>	Robot moves from step 1 to step n	
$\tau_{i}$	p <sub>i</sub>	A wafer being processed and waiting in $p_i, i \in N_n$	$[\alpha_i^{},\alpha_i^{}+\delta_i^{}]$
ω <sub>i</sub>	q <sub>i</sub>	Robot waits before unloading a wafer from step i, $i \in \Omega$	$[0,\infty]$
	Z <sub>ij</sub>	No robot activity is associated	0



#### Wafer Cycle Time of SACT

- ξ<sub>i</sub>: the time for completing one wafer at step i (cycle time)
- The interval of  $\xi_i = [\theta_i, \beta_i]$  determined by residency time constraint for step i
  - $> \theta_1 (\alpha_1 + 3\lambda + 3\mu + \lambda_0)/m_1$
  - $\succ \beta_1 = (\alpha_1 + 3\lambda + 3\mu + \lambda_0 + \delta_1)/m_1$
  - $\geq \theta_i = (\alpha_i + 4\lambda + 3\mu)/m_i, i = 2, \dots, n$
  - $> \beta_i = (\alpha_i + 4\lambda + 3\mu + \delta_i)/m_i, i = 2, ..., n$
  - $\succ \alpha_i$  = processing time for step i
  - $> \lambda =$  wafer load/unload time
  - $\geq \delta_i$  = the longest time delay after processed
  - > m<sub>i</sub> = the parallel PMs for step i

Cycle time  $\xi = \xi_i = \xi_j$ 

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#### **Robot Cycle Time of SACT**

- Robot cycle time  $\psi = \psi_1 + \psi_2$  where
  - $\succ \psi_1 = 2(n+1)\mu + (2n+1)\lambda + \lambda_0$
  - $\gg \mu$  time for moving from a step to another
  - $>\lambda$  = time for loading a wafer to a PM, or unloading from a PM
  - $> \lambda_0$  = time for unloading a wafer from a LL and aligning it
  - $\succ \omega_i$  = robot waiting time at step i

 $\psi = \xi$ 



 $\succ \Psi_2 = \sum_{i=0}^{n+1} \omega_i$ 

## **Schedulable Case 1 of SACT**

- $\cap_i \xi_i \neq \emptyset$ : the intersection of feasible time interval for all steps is not empty
- $\Psi_1 \leq \prod_{\text{Lmax:}}$  in a cycle, the robot has idle time



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#### **Schedulable Case 2 of SACT**

- □  $\cap_i \xi_i \neq \emptyset$ : the intersection of feasible time interval for all steps is not empty
- Transportation-bounded, but the robot cycle is in the intersection of feasible time interval for all steps



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## **Schedulable Case 3 of SACT**

- $\cap_i \pi_i = \emptyset$ : the intersection of feasible time interval for all steps is empty
- $\psi_1 < \prod_{Lmax}$ : robot has enough idle time for waiting before unloading wafers at some steps



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#### **Scheduling Algorithm of SACT**

Case 1: simply set  $\omega_n - \psi_2 - \Pi_{Lmax} - \psi_1$ Case 2: simply set  $\omega_k = 0, k = 0, ..., n$ Case 3:  $\psi_2 = \psi_{21} + \psi_{22}, \psi_{21} = \omega_0 + ... + \omega_{n-1}$ , and  $\psi_{22} = \omega_n$ ,

$$\omega_{i-1} = \begin{cases} 0, i \in F \\ m_i \times \prod_{L \max} -\alpha_i - \delta_i - 4\lambda - 3\mu, i \in E \cap \{2, 3, \dots, n\} \\ m_1 \times \prod_{L \max} -\alpha_1 - \delta_1 - 3\lambda - \lambda_0 - 3\mu, i \in E \cap \{1\} \end{cases}$$

The schedule is optimal in terms of cycle timeIt is a closed-form algorithm

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#### Petri Net Modeling for Dual Arm Cluster Tools (DACT)

Robot wait: q<sub>i3</sub>
 Swap: s<sub>i1</sub> and s<sub>i2</sub>
 Wait during swap: q<sub>i2</sub> and q<sub>i3</sub>
 Scheduling: determining wait time in q<sub>ij</sub>



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## Time Modeling of DACT

Symbol	Transition or place	Actions	Allowed time duration
μ <sub>0</sub>	x <sub>0</sub>	Robot unloads a wafer from a loadlock and moves to $p_1$	
$\mu_i = \mu$	x <sub>i</sub>	Robot moves from $p_i$ to $p_{i+1}$ , $i \in N_{n-1}$	
$\mu_n$	x <sub>n</sub>	Robot moves to a loadlock and returns a wafer	
τ	$P_{i}$	A wafer being processed and waiting in $p_i$ , $i \in N_n$	$[a_i, a_i + \delta_i]$
λ	$s_{i1}$ and $s_{i2}$	Simple swap operation at $p_i$ , $i \in N_n$	
ω <sub>i</sub>	$q_{i2}$ or $q_{i3}$	Robot waits during swap at $p_i$ , $i \in N_n$	[0, γ]
ω <sub>i1</sub>	q <sub>i1</sub>	Robot waits at $p_i$ , $i \in N_n$	$[0,\infty]$
ω <sub>i4</sub>	$q_{i4}$	The end of swap operation at $p_i$ , $i \in N_n$	0



#### Wafer Cycle Time of DACT

- $\pi_i$ : the time for completing one wafer at step I (cycle time)
- The interval of  $\pi_i = [\alpha_i, \beta_i]$  determined by residency time constraint for step i

$$\succ \alpha_i = (a_i + \lambda)/m_i$$

$$> \beta_i = (a_i + \lambda + \delta_i)/m_i$$

- >  $a_i$  = processing time for step i
- $> \lambda =$  swapping time
- $\geq \delta_i$  = the longest time delay after processed
- > m<sub>i</sub> = the parallel PMs for step i

Cycle time  $\pi = \pi_i = \pi_i$ 



#### **Robot Cycle Time of DACT**

Robot cycle time  $\psi = \psi_1 + \psi_2$  where  $\mathbf{\mathbf{\mathcal{V}}}_{1} = \mathbf{n} \times \mathbf{\lambda} + \sum_{k} \mathbf{\mu}_{k}$  $\mathbf{\nabla} \Psi_2 = \sum_k (\omega_{k1} + \omega_k))^T$  $\geq \mu_0$  – time for unloading a wafer from an LL  $\geq \mu_i$  = move from step i to step i+1  $\gg \mu_n$  = return a wafer to an LL  $> \lambda =$  time for swapping  $\succ \omega_{k1}$  = time for waiting at place  $q_{k1}$  $\triangleright \omega_k$  = time waiting during swapping at step k  $\Psi = \pi$ 

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#### **Schedulable Case 1 of DACT**

- Non-empty intersection of feasible time intervals for all steps
- Robot has idle time in a cycle

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The feasible time interval and robot cycle are different from single arm cluster tools



## **Schedulable Case 2 of DACT**

- Non-empty intersection of feasible time intervals for all steps
- Transportation-bounded, but the robot cycle is in the intersection of feasible time interval for all steps
- The feasible time interval and robot cycle are different from single arm cluster tools





## **Schedulable Case 3 of DACT**

- Non-empty intersection of feasible time intervals for all steps
- Robot has enough idle time for waiting before unloading wafers at some steps
- The feasible time interval and robot cycle are different from single arm cluster tools



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#### **Scheduling Algorithm**

Case 1: simply set  $\psi_2 = \Pi_{Lmax} - \psi_1$ Case 2: simply set  $\psi_2 = 0$ 

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Case 3:  $\psi_2 = \psi_{21} + \psi_{22}$ ,  $\psi_{21}$  is for waiting during swap operations, and  $\psi_{22}$  is for other waiting

$$\Psi 21 = \sum_{k=1}^{n} \omega_{k} \qquad \qquad \Psi_{22} = \sum_{k=1}^{n} \omega_{k1}$$
$$\omega_{i} = \begin{cases} 0, i \in F \\ m_{i} \times \Pi_{L \max} - a_{i} - \delta_{i} - \lambda, i \in E \end{cases}$$

The schedule is optimal in terms of cycle timeIt is an analytical algorithm

#### **Modeling DACT with Activity Time Variation**

- p<sub>i</sub>: wafer processing at step i
  - x<sub>0</sub>: unload wafer from LL and move to step 1
- $x_i$ : move from step i to i+1
- x<sub>n</sub>: return wafer from step n to LL
- q<sub>i1</sub>: scheduled robot wait
   q<sub>i2</sub>: unscheduled robot wait
- Swap: s<sub>i1</sub> and s<sub>i2</sub>
- Robot wait during swap: q<sub>i3</sub>
- c: control place
- Scheduling: determining robot wait time in q<sub>ij</sub>





## Time Modeling

[A, B] means that, at normal condition, a task takes time A and can vary up to B.

Symbol	Transition or place	Actions	Allowed time duration
$\mu_0$	x <sub>0</sub>	Robot unloads a wafer from a loadlock and moves to p <sub>1</sub>	$[Q_0, S_0]$
μ	x <sub>i</sub>	Robot moves from $p_i$ to $p_{i+1}$ , $i \in N_{n-1}$	[Q, S]
μ <sub>n</sub>	x <sub>n</sub>	Robot moves to a loadlock and returns a wafer	$[Q_n, S_n]$
$\tau_{i}$	p <sub>i</sub>	A wafer being processed and waiting in $p_i, i \in N_n$	$([A_i,B_i],\delta_i]$
$\lambda_{i}$	$s_{i1}$ and $s_{i2}$	Simple swap operation at $p_i$ , $i \in N_n$	[C, D]
ω	q <sub>i3</sub>	Robot waits during swap at $p_i$ , $i \in N_n$	[0, Γ]
ω <sub>i1</sub>	$q_{i1}$	Scheduled robot waits at $p_i, i \in N_n$	$[0,\infty]$
$\alpha_{i2}$	q <sub>i2</sub>	Unscheduled robot waits at $p_i, i \in N_n$	$[0,\infty]$
ω <sub>i4</sub>	$q_{i4}$	The end of swap operation at $p_i$ , $i \in N_n$	0

#### **Operation Architecture**

Two levels

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- > Upper level: off-line schedule
- Lower level: real-time control
- Find the off-line schedule under normal condition by determining  $\omega_{i1}$  and  $\omega_i$



#### **Real-Time Controller**

#### Under normal condition

$$\mu_{0}^{j} = Q_{0}$$
: j stands for an activity's jth occurrence  
$$\mu_{i}^{j} = Q$$
$$\lambda_{i}^{j} = C$$
$$\omega_{i1} \text{ and } \omega_{i} \text{ are scheduled to be constants}$$



#### **Real-Time Controller**

In real-time, let

$$\mu_0^j = Q_0 + \sigma_0^j$$
$$\mu_i^j = Q + \sigma_i^j$$
$$\mu_n^j = Q_n + \sigma_n^j$$
$$\lambda_i^j = C + \rho_i^j$$

Regulate  $\omega_{i1}$  in real-time as

$$\omega_{11}^{j} = Max\{0, \omega_{11} - (\sigma_{0}^{j} + \sigma_{n}^{j})\}$$

$$\omega_{i1}^{j} = Max\{0, \omega_{i1} - \sigma_{i}^{j}\}$$

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## **Control Policy**

- 1. Under the normal condition, find an off-line periodic schedule by determining  $\omega_{i1}$  and  $\omega_i$ ,  $i \in N_n$ .
- 2. Transition y<sub>1</sub> is enabled if the jth token stays in q<sub>11</sub> for  $\omega_{11}^{j} = Max\{0, \omega_{11} - (\sigma_{0}^{j} + \sigma_{n}^{j})\}$
- 3. Transitions  $y_i$ ,  $i \in N_n$ -{1} are enabled if the jth token stays in  $q_{i1}$  for  $\omega_{i1}^j = Max\{0, \omega_{i1} \sigma_i^j\}$
- 4. A token should stay in  $q_{i3}$  for ,  $i \in N_n$ , time units; and
- 5. Transitions  $s_{i1}$  and  $x_i$  fire once being enabled



#### **Illustrative Example**

#### Parameters

- Flow pattern: (1, 1)
- $\succ$  μ<sub>0</sub> ∈ [23, 40]
- $\succ$  µ<sub>1</sub> ∈ [2, 3]
- $\succ$  μ<sub>1</sub> ∈ [14, 16]
- $\succ \lambda \in [21, 23]$
- $> A_1 = A_2 = 120$
- $> B_1 = B_2 = 125$
- $\succ \delta_1 = \delta_2 = 20$

■ It is shown that it is not always schedulable

By our approach, it is always schedulable

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#### Conclusions

#### Contribution

- Compact and reusable PN model
- A novel operation architecture
- Schedulability analysis for deterministic activity time
- Closed-form optimal scheduling algorithms
- An effective real-time control policy
- Future work
  - real-time schedulability
  - > scheduling algorithm with activity time variations
  - Revisiting wafer pattern flow
  - Multiple cluster tools

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# Questions?



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