SMART PRODUCTION SYSTEMS: THEORETICAL FOUNDATIONS, COMPUTATIONAL TOOLS, and PRACTICAL DESIGN

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Seminar Series:



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Control Problems of Autonomous Robotic Complexes

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- 1. SPS Definition and Architecture
- 2. Production System Types and PSE Toolbox®
- 3. IU: Theoretical Foundation and Computational Tools
- 4. AU: Theoretical Foundation and Computational Tools
- 5. OU: Theoretical Foundation and Computational Tools
- 6. SPS AT: Architecture, Design, Operation, and Verification
- 7. Concluding Remarks

1 SPS DEFINITION AND ARCHITECTURE

Smart Production Systems (SPS) – production systems capable of self-diagnosing and designing optimal continuous improvement projects, leading to the desired productivity improvement.

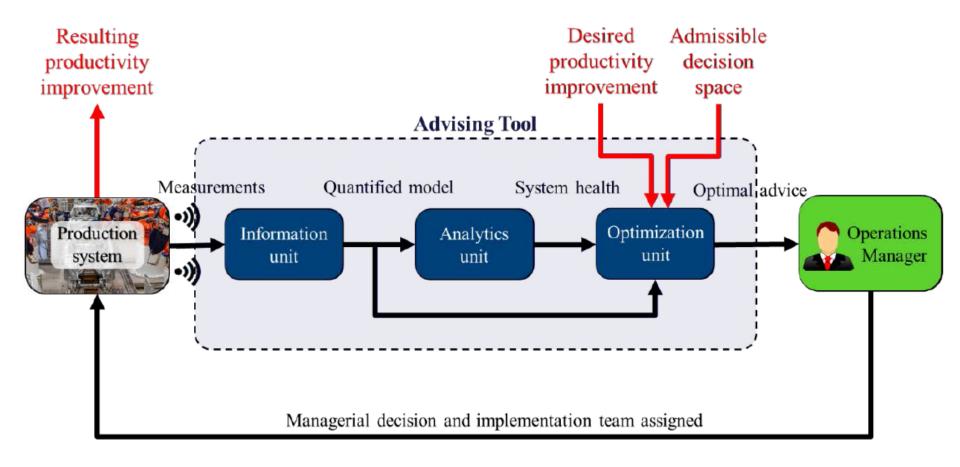
- SPS may operate in two modes *semi-autonomous* and *autonomous*.
 - Semi-autonomous: The SPS computes the optimal advice, while the Operations Manager authorizes its implementation (manager-in-theloop)
 - Autonomous: The SPS-designed continuous improvement project is autonomously authorized for implementation.
- The current work addresses the semi-autonomous regime.

• To be "smart", a production system must be equipped with an *Advising Tool* (AT) consisting of:

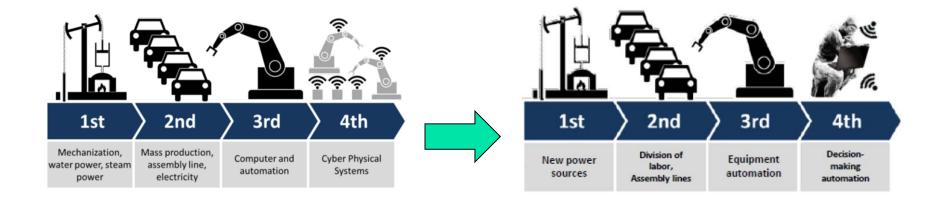
- Information Unit (IU)
- Analytics Unit (AU)
- Optimization Unit (OU)
- IU utilizes sensing/computing/communication devices (e.g., Industry 4.0 technology) to monitor performance metrics.
- AU utilizes the theory of Production Systems Engineering (PSE) in order to analyze system's health and investigate various "what if" scenarios of potential improvement.
- OU utilizes methods of Artificial Intelligence to select the optimal advice for achieving the desired productivity improvement (if at all possible).

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• SPS architecture, developed in this work is as follows:



SPS connection with Industry 4.0



- SPS contributes to automation of decision-making processes.
- SPS could be viewed as a part of a major concept of Industry 4.0
 Smart Factory.

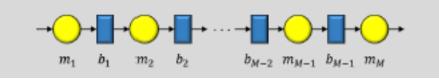
- SPS connection with Control Theory
 - Major concepts of control:
 - Plant system to be automated (e.g., a boiler at power plant)
 - Sensors devices to monitor process variables (e.g. temperature)
 - Reference signal the desired values of process variables
 - Controller algorithm for calculating appropriate plant inputs
 - Actuators devices to actuate process variables.
 - Major concepts of SPS:
 - Plant production system
 - Sensors PLC and others performance monitoring devices
 - Reference signal the desired productivity improvement
 - Controller SPS Advising Tool
 - Actuator Operations Manager and improvement project implementation team.

- SPS connection with Control Theory (cont)
 - Similar to control systems, designing SPS requires a process consisting of:
 - Developing a model of the production systems at hand
 - Designing Information Unit
 - Designing Analytics Unit
 - Designing Optimization Unit
 - Designing the structure and format of the advice to the Operations Manager.
 - Also similar to control systems, this process may take a relatively long period of time before full functionality of SPS is reached.
 - This talk is intended to outline major steps of this development process.

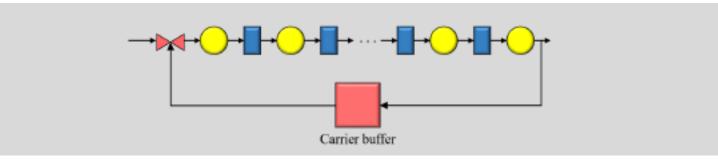
2 PRODUCTION SYSTEM TYPES AND PSE TOOLBOX

Types of production systems considered:

Serial lines



Closed serial lines

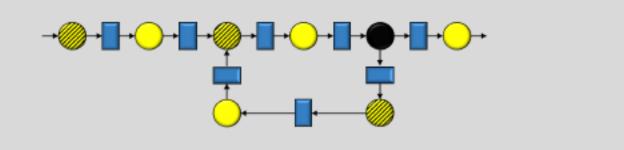


Serial lines with product quality inspection

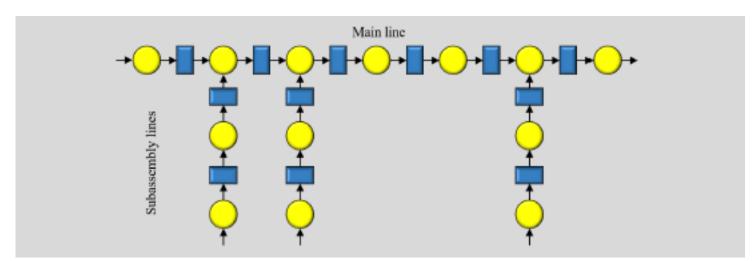


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- 2 PRODUCTION SYSTEM TYPES AND PSE TOOLBOX (CONT)
- Types of production systems considered (cont):
 - Serial lines with re-work



Assembly systems



2 PRODUCTION SYSTEM TYPES AND PSE TOOLBOX (CONT)

- Performance metrics of importance:
 - Throughout (*TP*)
 - Work-in-process (*WIP*)
 - Probabilities of blockage and starvation (*BL* and *ST*)
 - Production lead time (*LT*)
- Analytical methods for their evaluation have been developed in J. Li and S.M. Meerkov,

Jingshan Li Serryon M. Meerkov

Production

Engineering

Svstems

Production Systems Engineering, Springer 2009 (in Chinese, 2011).

- While PSE uses standard terms, such as *bottlenecks, leanness, lead time*, etc., it infuses them with rigorous quantitative meaning and provides analytical formulas for their evaluation.
- To facilitate applications, we developed a web-based *PSE Toolbox*[®]

These methods and tools allow to make a production system "smart".

- 2 PRODUCTION SYSTEM TYPES AND PSE TOOLBOX (CONT)
- *PSE Toolbox*[®] architecture (home page):



2 PRODUCTION SYSTEM TYPES AND PSE TOOLBOX (CONT)

The process of *PSE Toolbox*[®] utilization begins with "Create a new system" (or "Selecting existing" system):

Crea	te new sy	stem					C X						
Serial	line Expo	nential reliability	у Ор	en line	Single	production							
Syste	System name My system M 5 Refresh												
Selec	Select units:												
MTB	F / MTTR	Minutes				Cycle times Seconds	•						
	Machine na	me Cycle time	MTBF	MTTR	N								
1	m1	59	9.2	0.8	2								
2	m2	60	19.5	1.1	2								
3	m3	58	18.4	1.3	2								
4	m4	62	21.2	0.7	2								
5	m5	55	18.0	0.9									
						💾 Save							

2 PRODUCTION SYSTEM TYPES AND PSE TOOLBOX (CONT)

- Then, various *PSE Toolbox*[®] modules can be applied:
 - For example, using "Performance analysis" module, we obtain:

ACTIVE SYSTEM:	My system 🔒 You 😽	۲ ک	ŵ <	×		Create n	ew syster	m Select e	xisting sys	stem Select sr	ared systen	n Select example
Performance	analysis											<i>ଅ</i> 🗙
		\rightarrow		*(2)-	→	(3)-	→	*(4)-	→	*(5)→		
	Machine name	m1		m2		m3		m4		m5		
	Cycle time (Seconds)	59.0		60.0		58.0		62.0		55.0		
	MTBF (Minutes)	9.20		19.5		18.4		21.2		18.0		
	MTTR (Minutes)	0.80		1.10		1.30		0.70		0.90		
	Efficiency	0.92		0.95		0.93		0.97		0.95		
	Stand-alone TP	56.1		56.8		58.0		56.2		62.3		
	Buffer capacity		2		2		2		2			
	Starvation	0		0.025		0.051		0.034		0.13		
	Blockage	0.036		0.023		0.015		0.0060		0		
	Work-in-process		1.14		0.62		0.97		0.20			
				Through	put 53.9) JPH						

Other *PSE Toolbox*[®] modules are described in subsequent sections.

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Theoretical foundations of IU:

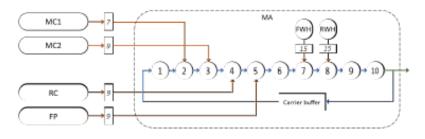
 Theoretical foundations of IU stem from the coupling between IU and AU. This is because the model employed by AU dictates "what to measure" and "how to measure" by IU. Thus, the issue of production systems modeling is at the core of IU design.

Computational tools of IU:

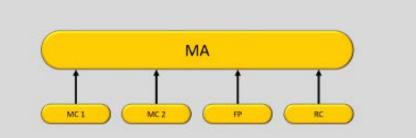
- These tools are based on the algorithms for model simplification, represented in *PSE Toolbox*[®] by the Modeling module.
- As far as modeling is concerned, there are three types of productions system models:
 - Part flow model (PFM)
 - Mathematical model (MM)
 - Computer simulations model (CSM).

Part flow model:

- PFM is intended to represent *major departments* of a systems and their interconnection from the point of view of parts flow.
- Example: Underbody assembly system:
 - Layout:

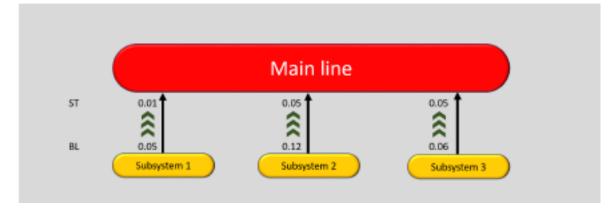


• PFM:



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- PFM primary utilization: BN identification based the "arrow method" developed in PSE.
- Example: Underbody assembly system:



Thus, IU measurements in the framework of PFM must be *blockages and starvations* of production system departments.

- Mathematical model:
 - MM is intended to represent production system's *simplified version*, *but still capturing its main features*.
 - MM consist of a block-diagram, which includes machines and buffer, along with their parameters.
 - Primary utilization: Evaluation of system's health and efficacy of "what if" continuous improvement scenarios. To carry out such calculations, PSE theory is used.
 - The process of MM development consist three steps:
 - Structural modeling
 - Parametric modeling
 - Model validation
 - Each step is repeated until the desired accuracy is achieved.

- IU measurements necessary for AU in the framework of MM:
 - Machine parameters: τ , T_{up} (MTBF), $T_{down}(MTTR)$, BL, ST, g
 - System parameters (for validation purpose): TP, CR, WIP, LT.
 - Using these measurements, IU calculates:
 - machine efficiency: $e = \frac{T_{up}}{T_{up} + T_{down}}$;
 - machine capacity: $c = 1/\tau$;
 - machine stand-alone throughput: *SAT* = *ce*.
- In addition, IU must provide information on *buffers capacities*, N_j.

- Example: LED mathematical model:
 - Structural model:

Parametric model:

	Op. 1	Op. 2	Op. 3	Op. 4	Op. 5	Op. 6	Op. 7
MTBF (min)	4.13	4.01	1.9	2.82	1.65	3.88	3.37
MTTR (min)	1.5	1.35	0.82	0.75	0.95	1.85	1.53
Cycle time (min)	1.1	1.05	0.98	0.87	0.92	0.95	1.05

Buffer	N_1	N_2	N_3	N_4	N_5	N_6
Capacity	4	4	4	3	3	4

■ Model validation: Average error ~2%.

	→ ①	*]- *2		┝	•		•5		•6)-	-	*⑦→
Machine name	Op. 1	Op. 2	Op.	3	Op. 4		Op. 5		Op. 6		Op. 7
Cycle time (Minutes)	1.10	1.05	0.96	1	0.87		0.92		0.95		1.06
MTBF (Minutes)	4.13	4.01	1.90)	2.82		1.65		3.88		3.37
MTTR (Minutes)	1.50	1.35	0.82	2	0.75		0.95		1.85		1.53
Efficiency	0.73	0.75	0.70)	0.79		0.63		0.68		0.69
Stand-alone TP	40.0	42.8	42.8	1	54.5		41.4		42.8		39.3
Buffer capacity		4	4	4		3		3		4	
Starvation	0	0.036	0.02	1	0.0080		0.0029		0.067		0.083
Blockage	0.10	0.11	0.12	2	0.28		0.10		0.070		0
Work-in-process		1,52	0.50	2.83		2.41		0.52		0.054	

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Computer simulation model:

- CSM is intended to represent a production system's "*digital twin*" (i.e., capturing **all** features of its behavior).
- If such a model were created, performance metrics and efficacy of potential improvement projects could be evaluated by computer simulations (*with no need of analytical theory*).
- Since CSM is intended to represent "everything" in system's behavior, *IU must measure "everything*", if AU utilizes CSM.
- Many believe that creating a "digital twin" is impossible and, moreover, unnecessary – since "*everything*" cannot be measured.
- If this is true, "incomplete digital twin" or "incomplete measuring" could lead not only to quantitative errors, but to qualitative ones as well.

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• Summary of the production system model properties:

	Part flow model (PFM)	Mathematical model (MM)	Computer simulation model (CSM)
Modeling	Easy	Difficult	Very difficult
Complexity of IU	Simple	Complex (requires real-time measurements of machine and buffer parameters in- volved in the block- diagram)	Very complex (requires real-time measurements of pa- rameters of every element of the pro- duction system in the factory floor)
Utilization Existing sys- tems	BN identifica- tion	Performance analysis & BN identification	Performance analysis & BN identification
Continuous improvement projects	Cannot be used	Efficacy analysis (using analytical techniques)	Efficacy analysis (using statistical tools)
Accuracy	Relatively high	Relatively high	High (if the digital twin is sufficiently precise)

Based on the above, SPS Advising Tool developed in this work uses IU to support MM employed by AU.

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- Theoretical foundations of AU: Theory of Production Systems Engineering
- Computational tools of AU: PSE Toolbox[®]
- Utilization of these tools in AU requires knowledge of methods developed in *PSE 2009* and subsequent publications.
- Therefore, these methods and computational tools (utilized in AU) are briefly outlined next.

Bottlenecks:

• Definition: BN is the machine with the largest effect on the system throughput:

$$\frac{\partial TP}{\partial c_i} > \frac{\partial TP}{\partial c_j}, \forall j \neq i.$$

- Since the derivatives involved cannot be evaluated analytically, the following approximation method has been developed:
 - Using *SPS Toolbox*, evaluate *BL* and *ST* of all machines.
 - Assign arrows between each two machines according to the rule: If $BL_i > ST_{i+1}$, assign arrow from m_i to m_{i+1} ; if $BL_i < ST_{i+1}$, assign arrow from m_{i+1} to m_i . The machine with no emanating arrows in the BN (in the above sense).
 - If there are multiple machines with no emanating arrows, the one with the largest severity S_i is the primary BN:

$$S_{1} = |ST_{2} - BL_{1}|,$$

$$S_{i} = |ST_{i+1} - BL_{i}| + |ST_{i} - BL_{i-1}|, \quad i = 2, \cdots, M - 1$$

$$S_{M} = |ST_{M} - BL_{M-1}|.$$

- Bottlenecks (cont):
 - *PSE Toolbox* module "Bottleneck identification":

Bottleneck identif	ication										C :
	ICation										
Machine name			2 m2	→	*3) m3					Bottleneck machi peak	ne(s) quick
			1112		1115		1114			Machine name	m2
Cycle time (Seconds)	59.0		60.0		58.0		62.0		55	MTBF	19.50
MTBF (Minutes)	9.20		19.5		18.4		21.2		18		1.10
MTTR (Minutes)	0.80		1.10		1.30		0.70		0.	MTTR	
Efficiency	0.92		0.95		0.93		0.97		0.	Availability	94.7%
Stand-alone TP	56.1		56.8		58.0		56.2		62	ST	0.03
Buffer capacity		2		2		2		2		BL	0.02
Starvation	0		0.025		0.051		0.034		0.	Severity	0.04
Blockage	0.036	>>>	0.023	~~~	0.015	~~~	0.0060	~~~	(Stand-alone TP	56.80
Work-in-process		1.14		0.62		0.97		0.20		Upstream WIP	1.14 / 2
•									Þ	Downstream WIP	0.62 / 2
		Thro	ughput	53 0 IDH	4						

Note that BN is not the machine with the smallest stand-alone throughput. © 2017 S.M. Meerkov

Smart Production Systems

- Buffering potency:
 - Definition: Buffering is:
 - *weakly potent* if BN is the machine with the smallest stand-alone throughput; otherwise, the buffering is *not potent*;
 - *potent* if it is weakly potent and, in addition, the stand-alone throughput of the BN machine is close to system's throughput, *TP*.
 - *strongly potent* if BN is potent and the system has the smallest buffering necessary to ensure this throughput.
- Measurement-based Management (MBM):
 - A method for production systems management based on measuring machines' *BL* and *ST*, identifying the BN, and, on this basis, making managerial decisions.

• *PSE Toolbox* module "Measurement-based Management":

ACTIVE SYSTEM:	LED Streetlight system	占 You 💿		~ ×				
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Measuremen	t-based managem	ent						<i>C</i> X
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	ST BL	0.000	< <	0.361 0.032	• 0.250 0.000			
	Thr	oughput: 29.16		BN	department: A	ssembly OPs		
			JEN		nachines	SSEIIDIY OFS		
Bolt			Cover		ght driver	Wiring		
ST 0.00	0 0.043		0.033		0.361	0.163	0.250	
BL 0.19		>>>	0.005	~ ~ ~ ~	0.011	0.183	0.025	~~~
4								•

Leanness of buffering:

- To define lean buffering, the following parametrization is introduced:
 - System efficiency:

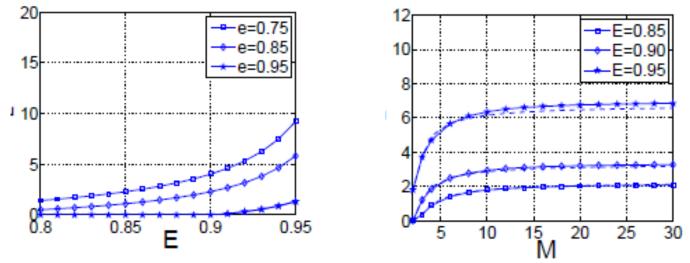
$$E = \frac{TP_N}{TP_\infty}$$

• Level of buffering:

$$n = \frac{N}{T_{down}^{cycle}}$$
, where $T_{down}^{cycle} = \frac{T_{down}}{\tau}$.

- Definition: Lean level of buffering (n_E) is the smallest level of buffering necessary and sufficient to ensure the desired system efficiency, *E*.
- *PSE 2009* provides methods and algorithms for n_E calculation for various types of system.
- Given n_E , the lean buffer capacity is calculated as $N_E = T_{down}^{cycle} n_E$.

- Leanness (cont)
 - Lean buffers capacity a function of *e*, *E*, and *M*:



Rule-of-thumb for selecting lean buffering:

e	E = 0.85	E = 0.90	E = 0.95
0.85	3.4	5	9.8
0.90	2.7	3.9	7.2
0.95	1.6	2.4	4.3

• *PSE Toolbox* module "Leanness":

ACT	IVE SYSTEM	1: My system	A You	۲ ۲	ŵ <	×		Create ne	ew system S	Select existi	ng system	Select shared sys	tem Select example
L	eanness.												₽ X
	Гуре <mark>in</mark> des	sired line efficie	ncy or (desired th	roughpu	t.							
	Desired E	0.98			Calc	ulate!	OR	Desired T	P Desi	red throug	Jhput (mus	t be less than	Calculate!
				\rightarrow		*2			*			\rightarrow	
		Machine nam	ne	m1		m2		m3		m4	m	15	
		Stand-alone		56.1		56.8		58.0		56.2	62	2.3	
		Suggested le	an buffer		6		4		4		2		
						Through	nput 55	.0 JPH					

- Just-Right vs. Just-in-Time operation:
 - JIT is often understood as having no buffer between each pair of consecutive operations. This leads to low *WIP* and, unfortunately, low *TP* as well.
 - The opposite of JIT is having very large buffers. This leads to the largest *TP* but, unfortunately, to very large *WIP*.
 - The method of lean buffer design, discussed above, provides a compromise: It offers a possibility for calculating the smallest buffer capacity, which is necessary and sufficient to guarantee the desired throughput.
 - That is why we referred to it as *Just-Right* buffer capacity allocation.

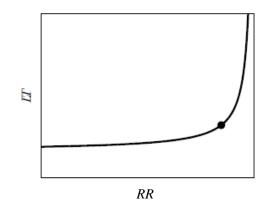
Production lead time:

- Definition: *Production lead time (LT)* is the time a part spends in the system, being processed or waiting for processing.
- *LT* is of particular importance in systems with large ("infinite") buffers, where it may be orders of magnitude larger than the total processing time.
- Control of *LT* can be accomplished by throttling the raw material release rate (*RR*) so that desired lead time is obtained.
- Since in systems with infinite buffers TP = RR, this implies that TP is also "throttled".
- The relationship *LT* vs. *RR* or, equivalently, *LT* vs. *TP* is referred as *characteristic curve* (CC) of a production system.
- Analytical expression for CC has been derived in a paper by S. Meerkov and C.-B. Yan (*M&Y* 2016), *IEEE Transactions on Automation Science and Engineering*, vol. 13, Issue 2, pp. 663-675, 2016.

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- Production lead time (cont):
 - It has been shown that CC has a knee-type shape:



- Having *RR* below the knee is undesirable because *TP* can be increased without a substantial increase of *LT*; operating above the knee is also undesirable, since *TP* is almost constant, but *LT* becomes large.
- Thus, the desirable operating point is at the knee the "*sweet point*".
- In *M&Y 2016*, the position of the sweet point is quantified as the CC point with the largest curvature.

- Production lead time (cont):
 - Also, *M*&*Y* 2016 provides analytical expressions for *RR*, which ensures operation at the sweet point (or at any other desired point of CC). These expressions depend on the machine parameters.
 - If machine parameters are not known precisely, *M&Y2016* provides a feedback control law for raw material release specified by

$$E(s+1) = \begin{cases} \hat{E}_{RI}^*, & \text{if } WIP_{total}(s) \leq \widehat{WIP}_{nominal} \\ 0, & \text{otherwise,} \end{cases}$$

where

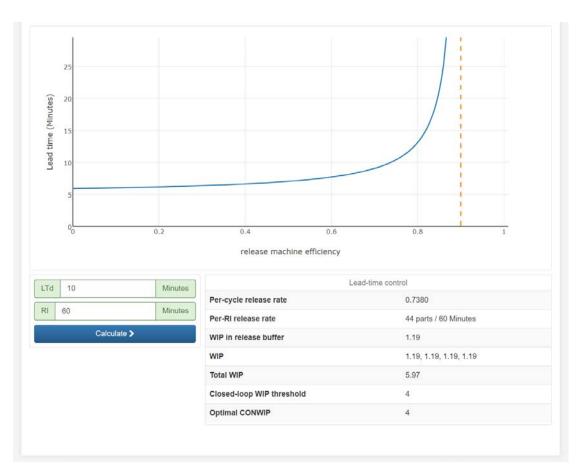
$$\hat{E}_{RI}^* = \left\lfloor \frac{RI}{\tau} \hat{e}_0^*(lt_d) \right\rfloor \qquad \qquad \widehat{WIP}_{nominal} = \frac{\hat{e}_0^*}{\tau}(LT_d - M\tau).$$

• It has been shown that this closed-loop control ensures *LT* close to the desired, even when the open-loop control leads to infinite *LT* (due to variations of the machine parameters).

- *PSE Toolbox* module "Lead time analysis and control":
 - *LT* analysis:

Lea	d time analysis							2 X
Lea	ad time unit for analy	sis: O Seconds 💿 I	Minutes O H	ours			Cycle time: 1	.00 Minute
			2-	}		}		
	Machine name	Release machine	m1	m2	m3		m5	
	MTBF		9.00	9.00	9.00	9.00	9.00	
	MTTR		1.00	1.00	1.00	1.00	1.00	
	Efficiency		0.90	0.90	0.90	0.90	0.90	
			Le	ad time > 5.90 (M	inutes)			

- *PSE Toolbox* module "Lead time analysis and control":
 - *LT* control:



4 AU: THEORETICAL FOUNDATIONS AND COMPUTATIONAL TOOLS (CONT)

Multi-job production systems:

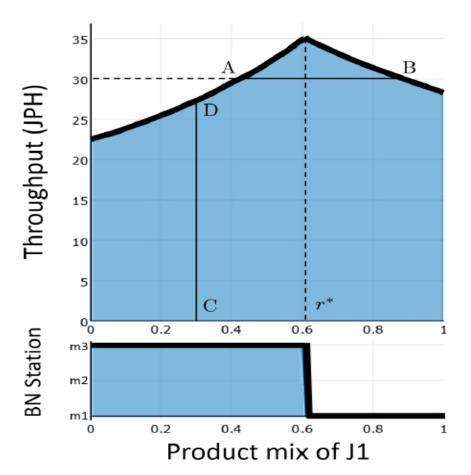
- Definition: MJP is a class of flexible production systems intended to produce several job-types using the same sequence on manufacturing operations.
- MJP systems are defined not only by the machine and buffer parameters, but also by the desired product-mix, $r = [r_1, ..., r_S], \sum_{i=1}^{S} r_i = 1$ (which may be changing on a daily basis).
- All characteristics of MJP systems performance (e.g., *TP*, BN, *WIP*) depend on *r*.
- A theory of MJP systems has been developed in P. Alavian, P. Denno, and S.M. Meerkov (*A&D&M 2017*), accepted for publication in *IJPR* (<u>http://www.tandfonline.com/doi/pdf/10.1080/00207543.2017.133877</u> <u>9?needAccess=true</u>)
- A major part of this theory is Product-mix Performance Portrait (PMPP), which represents MJP systems BN and TP as functions of *r*.

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Smart Production Systems

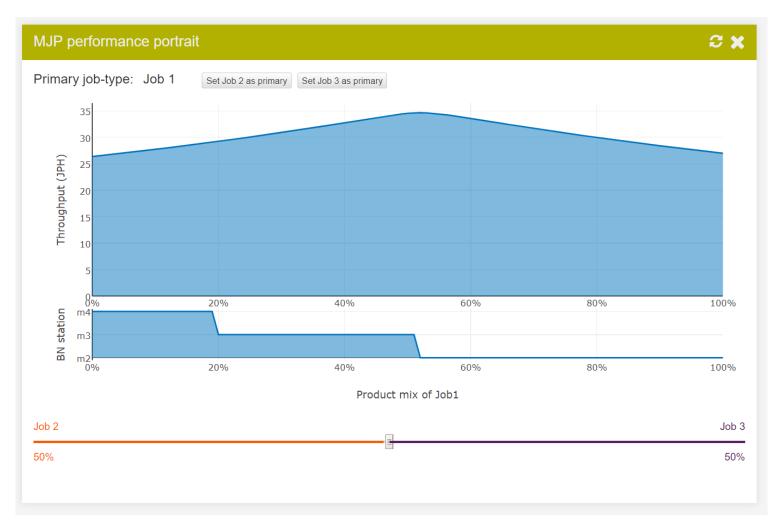
4 AU: THEORETICAL FOUNDATIONS AND COMPUTATIONAL TOOLS (CONT)

- Multi-job production systems (cont):
 - PMPP for S = 2:



4 AU: THEORETICAL FOUNDATIONS AND COMPUTATIONAL TOOLS (CONT)

• *PSE Toolbox* module "MJP performance portrait":



5 OU: THEORETICAL FOUNDATIONS AND COMPUTATIONAL TOOLS

Theoretical foundation of OU:

- Based on optimization techniques in the space of production system parameters.
- More precisely, given a desired system improvement and the current status of the system at hand (provided by AU), OU is supposed to find the most efficient way of modifying the machine and buffers parameters so as to transfer the system from its current to the desired state.
- This is accomplished using the *PSE Toolbox* to quantify the utility of various points in the parameter space and various search techniques.

Computational tools of OU:

• OU uses all modules of *PSE Toolbox* to find optimal continuous improvement project.

• *SPS Advising Tool*[®] architecture (home page):





SPS Advising Tool[®] design:

- Develop (off-line) and upload into the "System" block a MM of the production at hand
- "Connect" IU with the sensors monitoring the performance of the machines and buffers involved into MM
- "Connect" AU with the *PSE Toolbox*[®] modules necessary for performance analysis of the system at hand
- Develop and upload into OU search algorithms necessary for developing optimal improvement advice.
- Develop and upload into the "Measured productivity improvement" block algorithms for the required calculations
- Train factory floor personnel in carrying out required managerial functions.

SPS Advising Tool[®] operation:

Selecting "System" block:



System	≈ x
Please select a system:	
Underbody Assembly LED streetlight	

- *SPS Advising Tool*[®] operation (cont):
 - Selecting "Information Unit":



ta collection peri-	od:							
			10-	┛┓┛	LA	J-A-		2
	\mathbf{U}	1~1		1			<u>п</u> .М.	
Machine name	Fix bolt	Label attach	Cover	Light driver	Wiring	Testing	Packaging	
Cycle time	66.0	63.0	59.0	52.0	52.0	57.0	63.0	
MTBF	253.4	255.7	117.1	170.0	99.7	244.3	204.6	
MITE	88.4	79.5	48.0	45.2	54.5	109.4	93.1	
Buffer capacity		4	4	4	3	3	4	
			Ouria fim	e units (Second	ah i			

- *SPS Advising Tool*[®] operation (cont):
 - Selecting "Analytics Unit":

Performa	nce ar	ralvsis	Svs	tem he	alth	Curren	t statu	s W	hat-if a	malvsis		
1 011011100			~)~			001101	1. 10 000 100		11015 11 1			
			Per	FORM	ANCE	ANALYI	3					
→ ()	-	1					-	()				
\cup		\smile		\bigcirc		\bigcirc		$\mathbf{\overline{v}}$		\bigcirc		\bigcirc
Fix bolt		Label attai	chi	Cover	1	Light drive	IT .	Wiring		Testing		Packaging
66.0		63.0		59.0		52.0		52.0		57.0		63.0
253.4		266.7		117.1		170.0		99.7		244.3		204.8
88.4		79.5		48.0		45.2		54.5		109.4		93.1
0.74		0.76		0.71		0.79		0.65		0.69		0.69
40.4		43.6		43.3		54.7		44.8		43.6		39.3
	4		4		4		3		3		4	
0		0.038		0.020		0.0087		0.0034		0.044		0.057
0.091	>>>	0.11	>>>	0.11	>>>	0.27	} }	0.13	>>>	0.091	>>>	0
	2.47		2.77		3.00		2.63		1.89		2.19	
		Fix bolt 66.0 253.4 88.4 0.74 40.4 4 0 0.091	66.0 63.0 253.4 255.7 88.4 79.5 0.74 0.75 40.4 43.6 4 0 0.038 0.091 0.038	PEF 	PERFORM Image: Constraint of the state of the stat	PERFORMANCE Image: Strain S	Performance Analyse Image: Stress of the	PERFORMANCE ANALYIS Image: problem of the strength of the strenge strength of the strength of the strength of the stre	PERFORMANCE ANALYIS Image: Description of the state	PERFORMANCE ANALYIS	PERFORMANCE ANALYIS Image: problem of the state of the sta	PERFORMANCE ANALYIS \rightarrow \rightarrow \rightarrow

- *SPS Advising Tool*[®] operation (cont):
 - Selecting "Analytics Unit" (cont):

		Performance analysis	System health	Current status	What-if analysis
			System H	IEALTH	
hrougt	hput Losse	15 ses due to machine breakdow	πt	ottleneck ie system has one bottlen imary Bottleneck Reinige	
		ses due to buffering	В	uffer potency	
	50 40	15-25			P
	30	3,85			WP Weakly potent
	20				NP
	0	TP			

- *SPS Advising Tool*[®] operation (cont):
 - Selecting "Analytics Unit" (cont):

F	Performance analysis	System health	Current status	What-if analysis	
		CURRENT S	TATUS		
Throughput: 35.48 JPH		Line efficiency: 0.65	D	Buffering efficiency: I	0.903
Bottieneck(s): Packa	iging (m7)	Total WIP: 15.0 Jobs		Buffering potency: W	leakly potent
Production lead time	: 32.2 min	Scrap rate: 0.0 JPH			

- *SPS Advising Tool*[®] operation (cont):
 - Selecting "Analytics Unit" (cont):

ANALYTICS UNI	т				c x
	Performance analysis	System health	Current status	What-If analysis	
		WHAT-IF AN	ALYSIS		
Select input param	eters				
Cycle time MTBF	MTTR Buffer				
Select one or more	from the list				
All machines 1: Fix bi	olt 2: Label attach 3: Cover 4	: Light driver 6: Wiring	6: Testing 7: Packa	aina	
Enter parameter ra Type in the range (in un	inges rs of the selected parameter)				
Current value: 63.000	(Seconds) Change from 6	4	to	54	Flot
37 36.5 P 36 35.5	68		7: Packaging (NOLLE) NB er Tecting 55	60	
	Cycle time			Cycle time	

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- *SPS Advising Tool*[®] operation (cont):
 - Selecting "Managerial input" block:

ANAGER	IAL INPL	л			
		Desire	ed performance improvement	Admissibile decision	space
lect a perf	ormance r	netric to im	prove:		
Throughput	Lead time	Leanness	Quality		

- *SPS Advising Tool*[®] operation (cont):
 - Selecting "Managerial input" block (cont):

		Desired pe	erformance imp	ovement Admissibile	tecision space	
.ine	Machine	Name	Current cycle time of Job 1	Min cycle time of Job1	Current MTTR	Min MTTR
Asin	1	Fix bolt	66.0	59	68.3	80.0
ðain.	2	Label attach	63.0	56	79.6	72.0
őain -	з	Cover	59.0	53	48.0	43.0
nain	4	Light driver	52,0	46	45.2	40.0
Azin	5	Wining	52.0	46	54.4	49.0
Azin	6	Testing	87.0	51	109.4	96.0
Aain.	7	Packaging	63,0	56	93.1	84.0

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- *SPS Advising Tool*[®] operation (cont):
 - Selecting "Optimization unit":

🕑 Th	e goal of reachin	g TP of 37.50 JF	PH can be sati	sfied.				
Testing (Max	chine: 6)			Packaging (Machine: 7)				
Parameter	Current value	Improvement	New value	Parameter	Current value	Improvement	New value	
Cycle time	57	5	51	Cycle time	63	2	61	
MTTR	109.3733	11	96.3733					

• *SPS Advising Tool*[®] operation (cont):

• Selecting "Managerial approval" block:

MANAGERIAL APPR	OVAL	e x
The goal of read	ching TP of 37.50 JPH can be satisfied.	
The following action plan achiev utton to see the obtained TP w	es 37.79 JPH. If you do not agree with any of the actions listed below, please uncheck the thout those actions.	em and click on the recalculate
Morrove machine Ter	sting (Machine 6), Cycle mention 1 by 6 seconds.	
Minimprove machine Pa	ckaging (Machine 7). Cycle time of Add 1 by 2 seconds.	
Mimprove machine Te	sting (Machine 6). MITR by 11 seconds.	
C Expected throughput	ubmit for implementation 💿	
he selected actions are estimative in accentable	red to achieve TP of 37.7858. e click on Submit actions button.	
	WANAGERIAL APPROVAL	0
	The goal of reaching TP of 37.50 JPH can be sati	isfied.
	The following action plan achieves 37.79 JPH. If you do not agree with any obution to see the obtained TP without those actions.	of the actions listed below, please uncheck them and click on the recalculate
	Improve machine Testing (Machine 6). Cystetime of July 6 se	econds.
	Improve machine Packaging (Machine 7). Cystemer (2.641) by	2 seconds.
	Improve machine Testing (Machine 6). MITE by 11 seconds.	
	C Expected throughput Submit for implementation O	

- *SPS Advising Tool*[®] operation (cont):
 - Selecting "Managerial approval" block (cont):

Mana	GERIAL APPROVAL			a	×	
0	The goal of reaching TP	of 37.50 JPH can be s	atisfied.			
	wing action plan achieves 37.79 J see the obtained TP without those		ny of the actions listed below, please uncheck them an	d click on the recalculat	e	
1	Improve machine Testing (Mac	the 6), Cycle time of July 1 by	seconds.			
	Improve machine Packaging ().	achine 7). Cycle trae of Adv 1	by 2 seconds.			
1	Improve machine Testing (Mac	ine 6). MITR by 11 second				
The sele	ected throughput Submit for in cled actions are estimated to achiv provement is acceptable click on S	IVIANAGERIAL AP	PROVAL reaching TP of 37.50 JPH can be satisfied			C X
		button to see the obtained		099990000000000000000000000000000000000	ase uncheck them and click or	i the recalculate
			e Testing (Machine 6). Cycletime of Job 1 by 6 second e Packaging (Machine 7). Cycletime of Job 1 by 2 seco			
		Improve machin	e Testing (Machine 6). MTTR by 11 seconds.			
			Submit for implementation O stimated to achieve TP of 36.4407. ptable click on Submit actions button.			

- *SPS Advising Tool*[®] verification:
 - Experimental verification procedure:
 - Design a discrete-event simulation model (DESM) of the system at hand
 - Run DESM with machine parameters approved by the Operations Manager
 - Statistically evaluate the resulting performance metrics
 - Compare the results obtained with those predicted by OU.
 - Results obtained (selecting the "Measured productivity improvement" block)

MEASURED PRO	DUCTIVITY IMPRO	OVEMENT	ວ x
Comparison of TP b	etween periods 1 and	2	
	Period 1		Period 2
Estimated TP	35.48JPH	Expected improvement: 6.5%	37.79JPH
Actual TP	33.26JPH	Obtained improvement: 5.9%	35.23JPH

7 CONCLUDING REMARKS

SPS potential impact: theoretical

 The SPS potential theoretical impact is due its effect on Control Theory. While this theory contributed substantially to automation of machine tools and material handling devices, it had almost no effect on decision-making in manufacturing environment. Analysis and design of Smart Production Systems may lead to a new page in Control Theory – automation of decisionmaking.

SPS potential impact: practical

The SPS potential practical impact is on the productivity improvement. In dozens of continuous improvement projects carried out in the last 30 years, we observed that throughput losses of 10%-20% are quite common in practice. This implies that reducing these losses, for instance, in half (which SPS brings in the realm of possibility), would result in 5%-10% of productivity improvement. That is why we believe that development and deployment of SPSs is of singular practical importance.

7 CONCLUDING REMARKS (CONT)

The results included in this talk are described in more details in the forthcoming book:

Smart Production Systems

Theoretical Foundations, Computational Tools, and Practical Design

Preliminary edition



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Smart Production Systems

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 This research has been carried out jointly with Pooya Alavian (University of Michigan), Peter Denno (Institute of Standards and Technology) and Liang Zhang (University of Connecticut).







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