Business Process Intelligence (BPI) course

Conformance CheckingFootprint & Token-Based Replay

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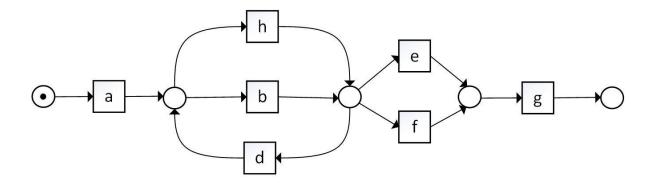
BPI-18



Chair of Process and Data Science



- Compute the footprint-based conformance for the event log *L* and the presented model.
 - $L = [\langle a, b, f, e, g \rangle^{45}, \langle a, b, d, b, e, f, g \rangle^{5}, \langle a, h, e, f, g \rangle^{25}, \langle a, h, f, e, g \rangle^{25}]$

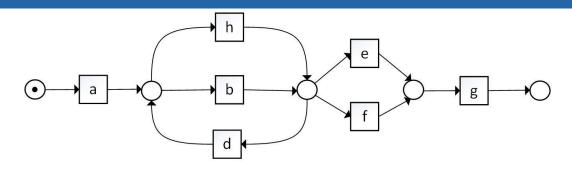




•
$$L = [\langle a, b, f, e, g \rangle^{45}, \langle a, b, d, b, e, f, g \rangle^{5}, \langle a, h, e, f, g \rangle^{25}, \langle a, h, f, e, g \rangle^{25}]$$

	а	b	d	е	f	g	h
а	#	\rightarrow	#	#	#	#	\rightarrow
b	←	#		\rightarrow	\rightarrow	#	#
d	#		#	#	#	#	#
е	#	←	#	#	Ш	\rightarrow	←
f	#	←	#		#	\rightarrow	←
g	#	#	#	←	←	#	#
h	←	#	#	\rightarrow	\rightarrow	#	#





	а	b	d	е	f	g	h
а	#	\rightarrow	#	#	#	#	\rightarrow
b	←	#	Ш	\rightarrow	\rightarrow	#	#
d	#	П	#	#	#	#	
е	#	←	#	#	#	\rightarrow	←
f	#	←	#	#	#	\rightarrow	+
g	#	#	#	←	←	#	#
h	+	#		\rightarrow	\rightarrow	#	#



Event log

	а	b	d	е	f	g	h
а	#	\rightarrow	#	#	#	#	\rightarrow
b	←	#	Ш	\rightarrow	\rightarrow	#	#
d	#	Ш	#	#	#	#	#
е	#	+	#	#	П	\rightarrow	+
f	#	+	#	П	#	\rightarrow	+
g	#	#	#	←	←	#	#
h	←	#	#	\rightarrow	\rightarrow	#	#

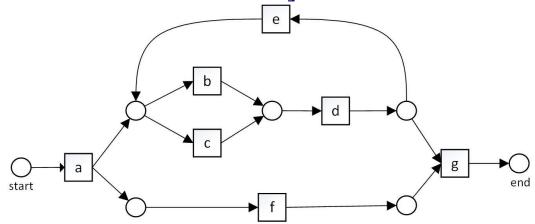
Process Model

	а	b	d	е	f	g	h
а	#	\rightarrow	#	#	#	#	\rightarrow
b	←	#		\rightarrow	\rightarrow	#	#
d	#		#	#	#	#	
е	#	←	#	#	#	\rightarrow	←
f	#	←	#	#	#	\rightarrow	+
g	#	#	#	←	←	#	#
h	←	#	П	\rightarrow	\rightarrow	#	#

Footprint-based conformance: $1 - \frac{4}{49} = 0.918$

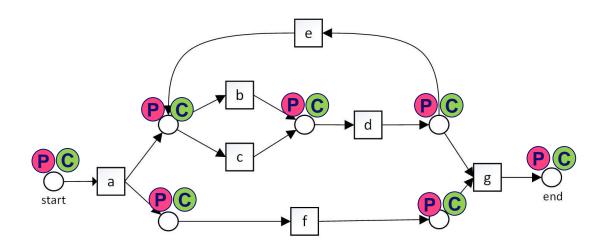


- Compute the token-based replay fitness for the event log L and the presented model.
 - $L = [\langle a, b, d, f, g \rangle^8, \langle a, c, d, e, b, f, g \rangle^4, \langle a, b, c, d, f, g \rangle^5, \langle a, b, f, g \rangle^1, \langle b, d, f, g \rangle^2]$



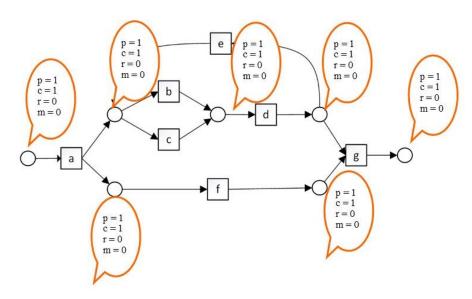


 $\langle a, b, d, f, g \rangle$





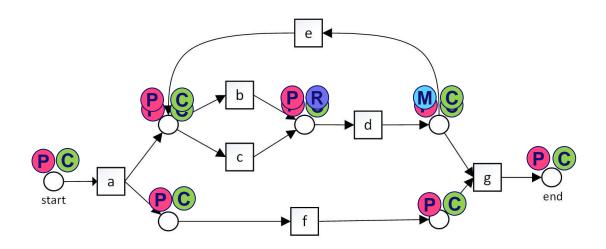
 $\langle a, b, d, f, g \rangle$



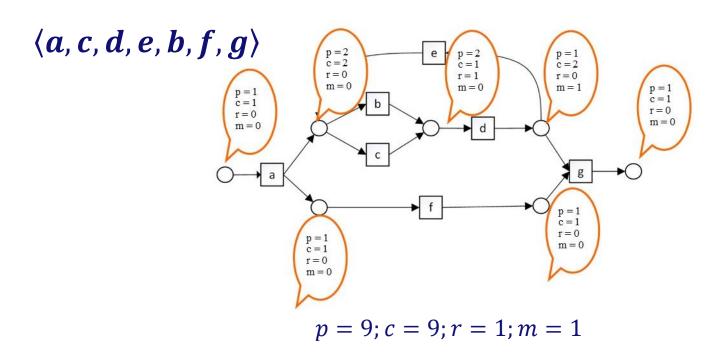
$$p = 7$$
; $c = 7$; $r = 0$; $m = 0$



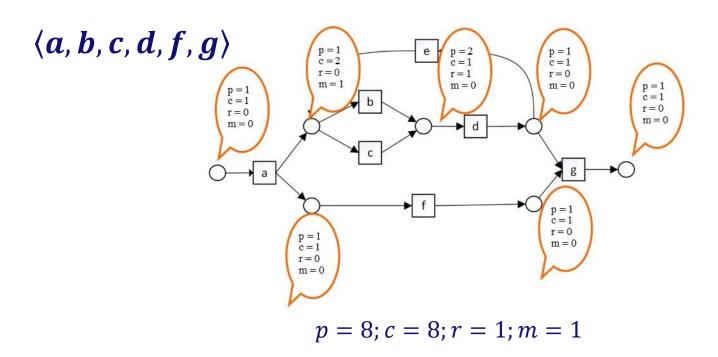
 $\langle a, c, d, e, b, f, g \rangle$





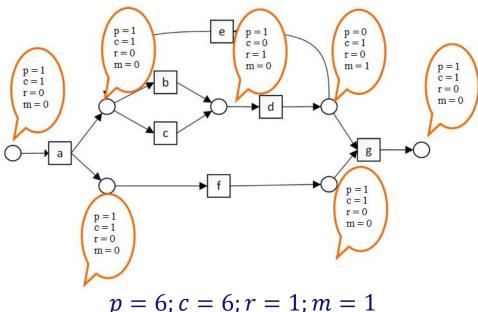








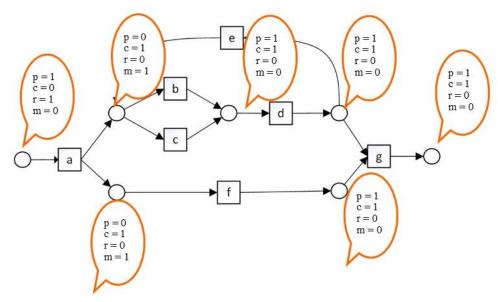
 $\langle a, b, f, g \rangle$



$$p = 6$$
; $c = 6$; $r = 1$; $m = 1$



 $\langle b, d, f, g \rangle$



$$p = 5$$
; $c = 6$; $r = 1$; $m = 2$



Token-Based Fitness:

$$fitness(L,N) = \frac{1}{2} \left(1 - \frac{\sum_{\sigma \in L} L(\sigma) \cdot m_{N,\sigma}}{\sum_{\sigma \in L} L(\sigma) \cdot c_{N,\sigma}} \right) + \frac{1}{2} \left(1 - \frac{\sum_{\sigma \in L} L(\sigma) \cdot r_{N,\sigma}}{\sum_{\sigma \in L} L(\sigma) \cdot p_{N,\sigma}} \right)$$

•
$$\sum_{\sigma \in L} L(\sigma) \cdot p_{N,\sigma} = (8 \cdot 7) + (1 \cdot 6) + (5 \cdot 8) + (2 \cdot 5) + (4 \cdot 9) = 148$$

•
$$\sum_{\sigma \in L} L(\sigma) \cdot c_{N,\sigma} = (8 \cdot 7) + (1 \cdot 6) + (5 \cdot 8) + (2 \cdot 6) + (4 \cdot 9) = 150$$

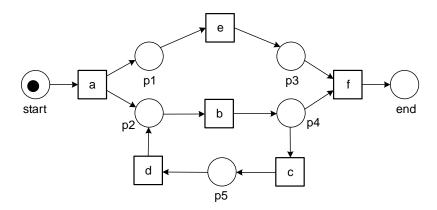
•
$$\sum_{\sigma \in L} L(\sigma) \cdot r_{N,\sigma} = (8 \cdot 0) + (1 \cdot 1) + (5 \cdot 1) + (2 \cdot 1) + (4 \cdot 1) = 12$$

•
$$\sum_{\sigma \in L} L(\sigma) \cdot m_{N,\sigma} = (8 \cdot 0) + (1 \cdot 1) + (5 \cdot 1) + (2 \cdot 2) + (4 \cdot 1) = 14$$

$$\frac{1}{2}\left(1 - \frac{14}{150}\right) + \frac{1}{2}\left(1 - \frac{12}{148}\right) = 0.912$$



- Compute the footprint and token-based replay fitness for the event log L and the presented model.
 - $L = [\langle a, b, e, f \rangle^2, \langle a, c, d, f \rangle^3]$





Exercise 3 SolutionFootprint

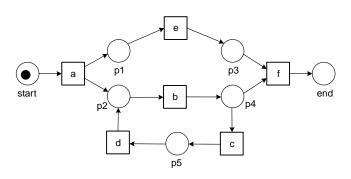
From the log

L	а	b	С	d	е	f
а	#	\rightarrow	\rightarrow	#	#	#
b	←	#	#	#	\rightarrow	#
С	←	#	#	\rightarrow	#	#
d	#	#	←	#	#	\rightarrow
е	#	←	#	#	#	\rightarrow
f	#	#	#	←	←	#

From the model

M	а	b	С	d	е	f
а	#	\rightarrow	<mark>#</mark>	#	<mark>→</mark>	#
b	←	#	<u>→</u>	←	II	<mark>→</mark>
С	<mark>#</mark>	(#	\rightarrow	II	#
d	#	<u>→</u>		#	II	<mark>#</mark>
е	(II	II	II	#	\rightarrow
f	#	(#	<mark>#</mark>	(#

$$L = \left[\langle a, b, e, f \rangle^2, \langle a, c, d, f \rangle^3 \right]$$

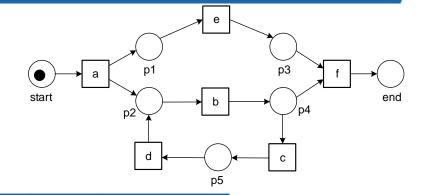


$$1-\frac{18}{36}=0.5$$



Token-based Replay

•
$$L = [\langle a, b, e, f \rangle^2, \langle a, c, d, f \rangle^3]$$



First trace?

Trace	Frequency	Р	R	С	M	P <all></all>	R <all></all>	C <all></all>	M <all></all>
<a, b,="" e,="" f=""></a,>	2	6	0	6	0	12	0	12	0
<a, c,="" d,="" f=""></a,>	3								
total									

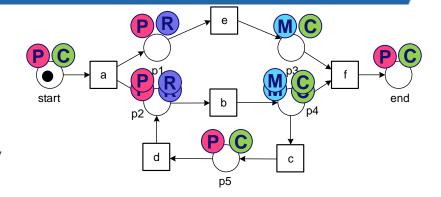
Why?



Token-based Replay

L = [<a, b, e, f>², <a, c, d, f>³] Second trace?

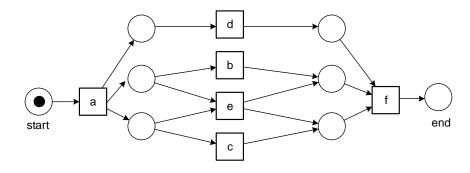
fitness =
$$\frac{1}{2} \left(1 - \frac{9}{30} \right) + \frac{1}{2} \left(1 - \frac{9}{30} \right) = 0.7$$



Trace	Frequency	Р	R	С	M	P <all></all>	R <all></all>	C <all></all>	M <all></all>
<a, b,="" e,="" f=""></a,>	2	6	0	6	0	12	0	12	0
<a, c,="" d,="" f=""></a,>	3	6	3	6	3	18	9	18	9
total						30	9	30	9



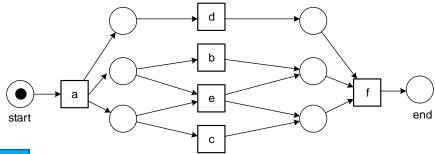
- Compute the footprint and token-based replay fitness for the event log L and the presented model.
 - $L = [\langle a, c, d, f \rangle, \langle a, c, b, d, f \rangle^2, \langle a, b, c, f \rangle, \langle a, e, f \rangle^2]$





Footprint

• $L = [\langle a, c, d, f \rangle, \langle a, c, b, d, f \rangle^2, \langle a, b, c, f \rangle, \langle a, e, f \rangle^2]$

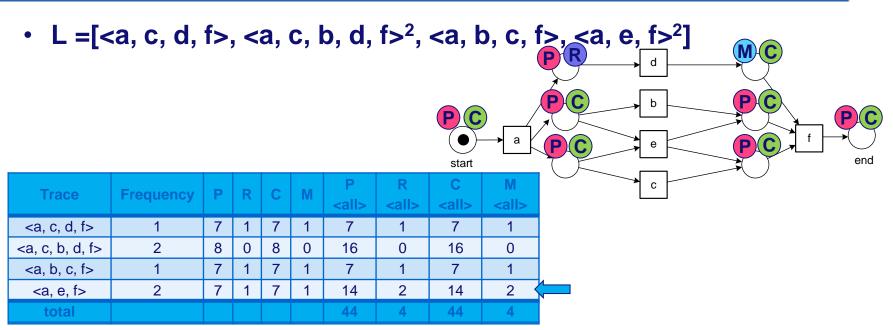


M:L	а	b	С	d	е	f
а	#	\rightarrow	\rightarrow	→ : #	\rightarrow	#
b	←	#		:→	#	→ : #
С	←		#	:→	#	\rightarrow
d	← : #	: ←	: ←	#	: #	\rightarrow
е	←	#	#	:#	#	\rightarrow
f	#	← : #	←	←	+	#

$$1 - \frac{10}{36} = 0.72$$



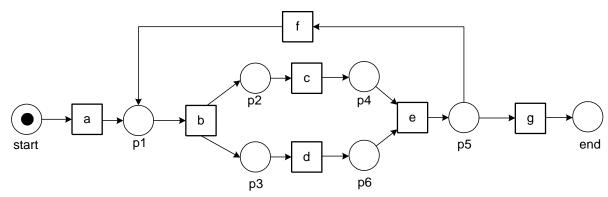
Token-based Replay



fitness =
$$\frac{1}{2} \left(1 - \frac{4}{44} \right) + \frac{1}{2} \left(1 - \frac{4}{44} \right) = 0.9$$



- Compute the footprint and token-based replay fitness for the event log L and the presented model.
 - $L = [\langle a, b, c, d, e, f, b, d, c, g \rangle, \langle a, b, d, c, e, g \rangle, \langle a, b, c, d, e, f, c, d, e, f, b, d, e, g \rangle]$





Footprint

L	a	b	С	d	е	f	g
а	#	\rightarrow	#	#	#	#	#
b	←	#	\rightarrow	\rightarrow	#	←	#
С	#	←	#		\rightarrow	←	\rightarrow
d	#	←		#	\rightarrow	#	#
е	#	#	←	←	#	\rightarrow	\rightarrow
f	#	\rightarrow	\rightarrow	#	←	#	#
G	#	#		#	←	#	#

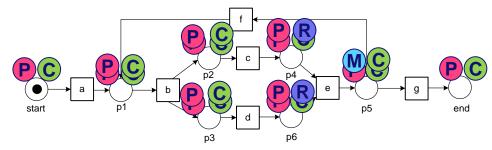
$$1 - \frac{4}{49} = 0.9184$$

M	а	b	С	d	Е	f	g
а	#	\rightarrow	#	#	#	#	#
b	←	#	\rightarrow	\rightarrow	#	←	#
С	#	←	#		\rightarrow	<mark>#</mark>	<mark>#</mark>
d	#	←		#	\rightarrow	#	#
е	#	#	←	←	#	\rightarrow	\rightarrow
f	#	\rightarrow	<mark>#</mark>	#	←	#	#
g	#	#	<mark>#</mark>	#	←	#	#



Token-based Replay

• L = [<a, b, c, d, e, f, b, d, c, g>, <a, b, d, c, e, g>,<a, b, c, d, e, f, c, d, e, f, b, d, e, g>]

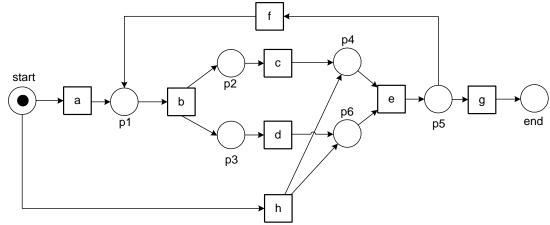


	Trace	Frequency	Р	R	С	M	P <all></all>	R <all></all>	C <all></all>	M <all></all>
	> <a, b,="" c,="" d,="" e,="" f,="" g=""></a,>	1	13	2	12	1	13	2	12	1
·	<a, b,="" c,="" d,="" e,="" g=""></a,>	1	8	0	8	0	8	0	8	0
	<a, b,="" c,="" d,="" e,="" f,="" g=""></a,>	1	17	2	18	3	17	2	18	3
	total						38	4	38	4

fitness =
$$\frac{1}{2} \left(1 - \frac{4}{38} \right) + \frac{1}{2} \left(1 - \frac{4}{38} \right) = 0.8947$$



- Compute the footprint and token-based replay fitness for the event log L and the presented model.
 - $L = [\langle a, b, c, e, f, b, d, c, e, g \rangle, \langle a, b, e, g \rangle, \langle h, e, g \rangle]$

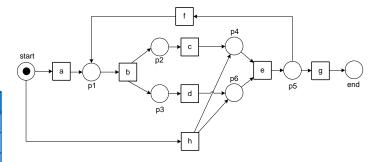




Footprint

$$L = [\langle a, b, c, e, f, b, d, c, e, g \rangle, \langle a, b, e, g \rangle, \langle h, e, g \rangle]$$

M:L	а	b	С	d	е	f	g	h
а	#	\rightarrow	#	#	#	#	#	#
b	←	#	\rightarrow	\rightarrow	# : →	←	#	#
С	#	←	#	: ←	\rightarrow	#	#	#
d	#	←	:→	#	→ : #	#	#	#
е	#	# : ←	←	←:#	#	\rightarrow	\rightarrow	←
f	#	\rightarrow	#	#	←	#	#	#
g	#	#	#	#	←	#	#	#
h	#	#	#	#	\rightarrow	#	#	#



Footprint-based Conformance:

$$1-\frac{6}{64}=0.906$$



Token-based Replay

 $L = [\langle a, b, c, e, f, b, d, c, e, g \rangle, \langle a, b, e, g \rangle, \langle h, e, g \rangle]$

Trace	Freque ncy	Р	R	С	M	P <all></all>	R <all></all>	C <all></all>	M <all></all>	PR	
<a, b,="" c,="" d,<br="" e,="" f,="">c, e, g></a,>	1	13	1	13	1	13	1	13	1	PC PC p2	
<a, b,="" e,="" g=""></a,>	1	6	2	6	2	6	2	6	2		₫
<h, e,="" g=""></h,>	1	5	0	5	0	5	0	5	0	p3	
total						24	3	24	3	<u> </u>	h

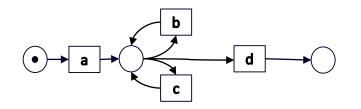
fitness =
$$\frac{1}{2} \left(1 - \frac{3}{24} \right) + \frac{1}{2} \left(1 - \frac{3}{24} \right) = 0.875$$



- Design a sound workflow net using all the activities $\{a, b, c, d\}$ and only those activities such that it can replay the following trace but the fitness score using footprint table is below 0.7.
 - $\langle a, b, c, d \rangle$
 - What will be the token-based replay fitness, higher or less than footprint? Why?



 $\langle a, b, c, d \rangle$



M:L	a	b	С	d
a	#	\rightarrow	→:#	→:#
b	←	:#	:→	→:#
С	←:#	:←	:#	\rightarrow
d	←:#	←:#	←	#

Footprint-Based Conformance: $1 - \frac{10}{16} = 0.375$

$$p = 5$$

$$c = 5$$

$$m = 0$$

$$r = 0$$

Token-Based Replay Fitness:
$$\frac{1}{2}\left(1-\frac{0}{5}\right)+\frac{1}{2}\left(1-\frac{0}{5}\right)=1.00$$

