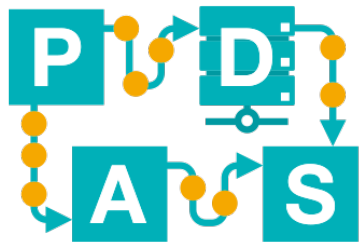


Process Mining - Instruction

Lecture 13

IDS-L13-I



Chair of Process
and Data Science

RWTHAACHEN
UNIVERSITY

Process Discovery



Process Discovery

In the lecture you have seen the key concepts of Process Discovery:

- Process data often comes in form of events (**event logs**), recorded with a timestamp, case ID, and activity of the event
- Doing **Process Discovery** means creating a model representing the behavior in the event data
- Many formalisms for models (**Petri nets, process trees, others**)

Process Discovery

How do people create process models without Process Mining?

By hand!

Process models are often designed by hand. Usually, these models are drawn by experts of a certain process and reflect how thing *should* go in reality (**normative process model**).

Process Discovery

Process Discovery is hard even when a human and a computer work together. Two (of many) reasons:

- As it is also the case in Machine Learning, **you only get to observe a part of reality**. Your model has to balance between fitting both the data you have and also unseen process instances.

Process Discovery

Process Discovery is hard even when a human and a computer work together. Two (of many) reasons:

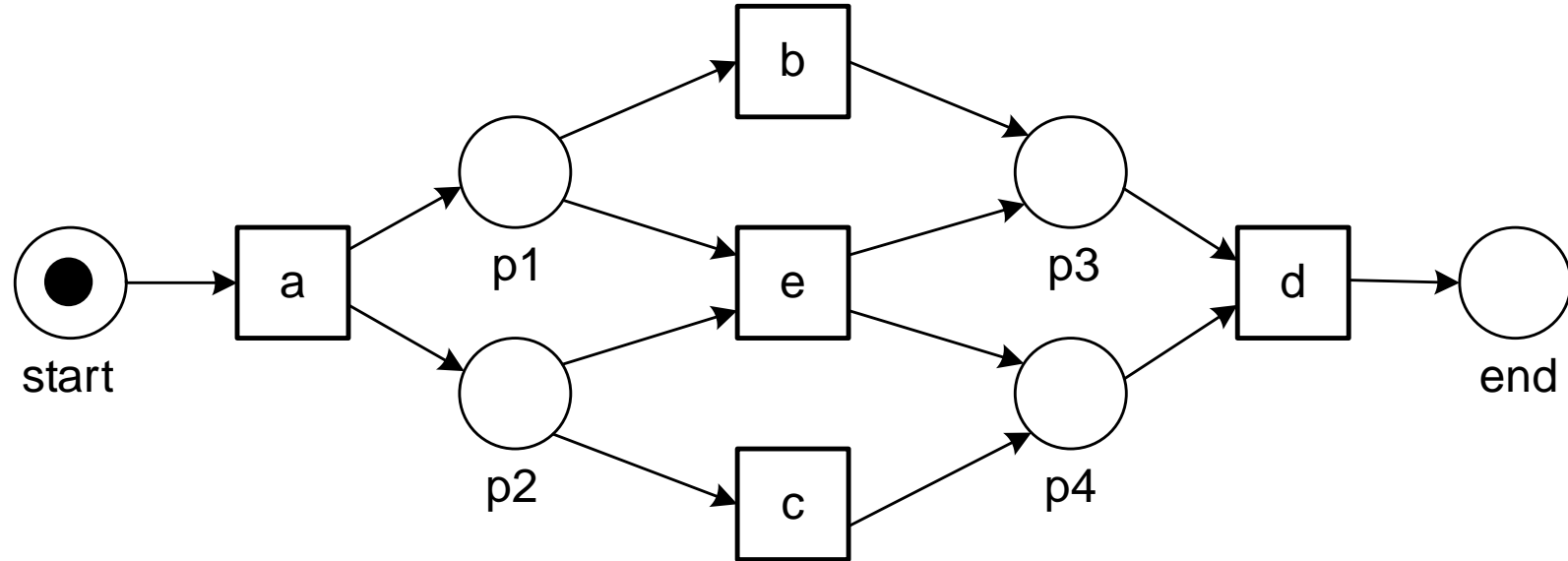
- A problem more specific to Process Mining: **you only get to observe positive behavior**. Event logs cannot contain negative examples, and you do not have examples of what *cannot happen*.

Process Models: Petri Nets

Recall from the lecture:

- Petri nets are composed by directed **arcs**, **places**, and **transitions**.
- Places contain **tokens**. A specific configuration of tokens in a net is called a **marking**.
- Transition can **fire**, consuming a token from the input places, putting a token in the output places, and “producing” an event.
- **Initial** and **final markings** define the start and end of a trace.

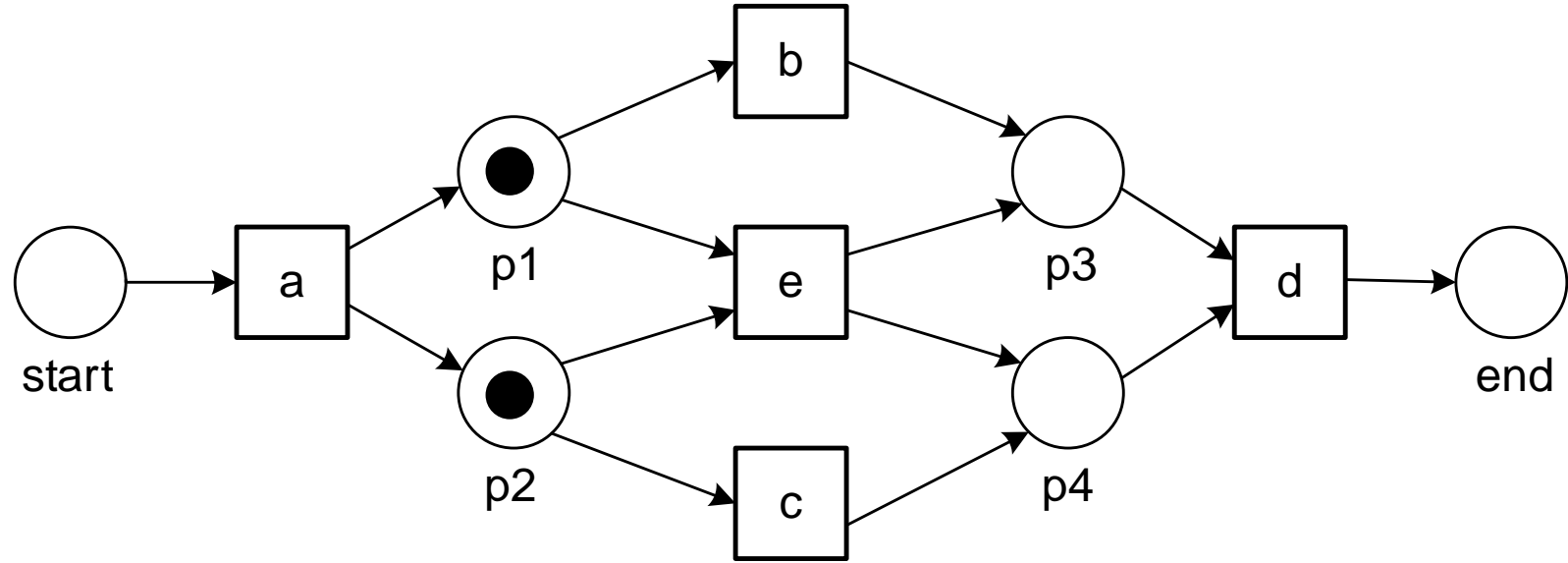
“Playing out”



Initial marking

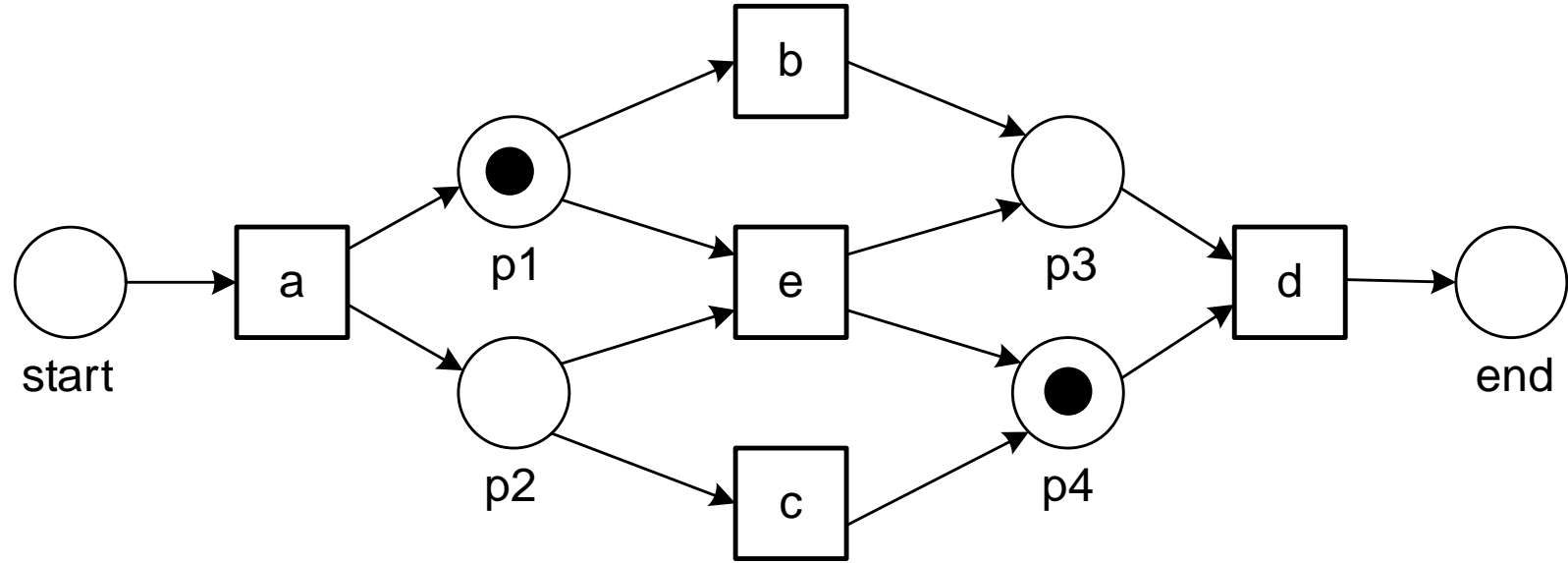


“Playing out”



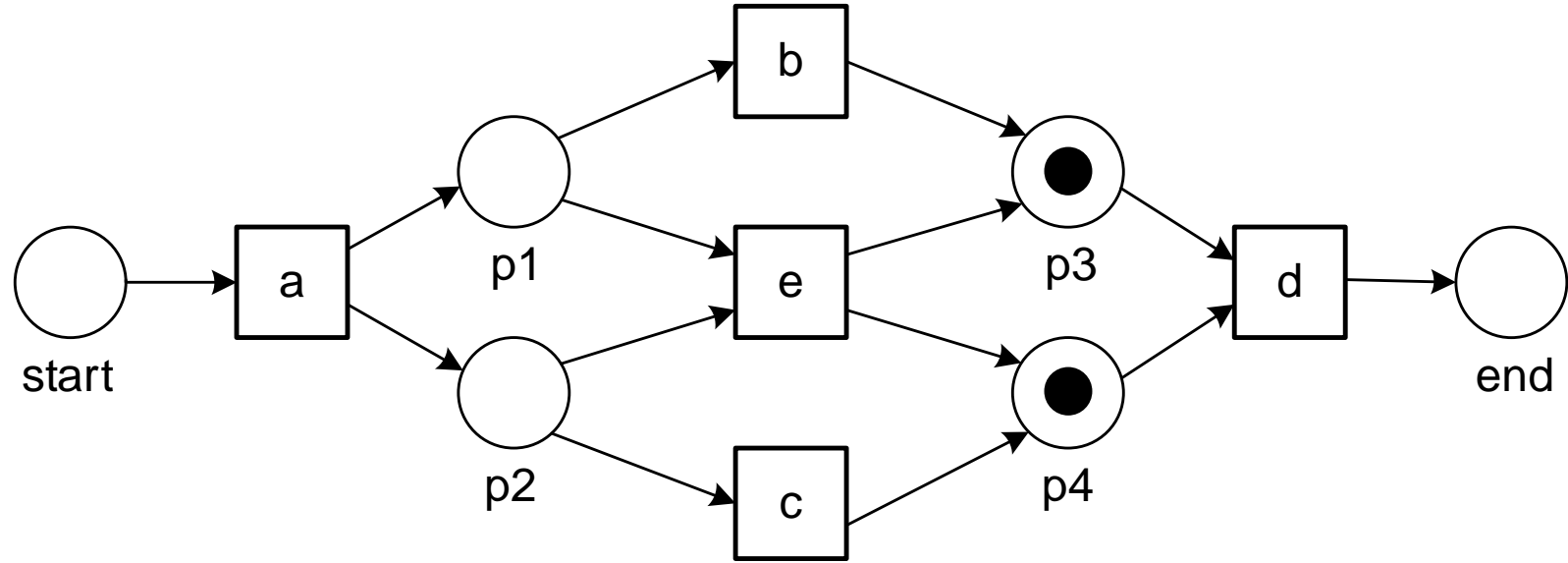
<a>

“Playing out”



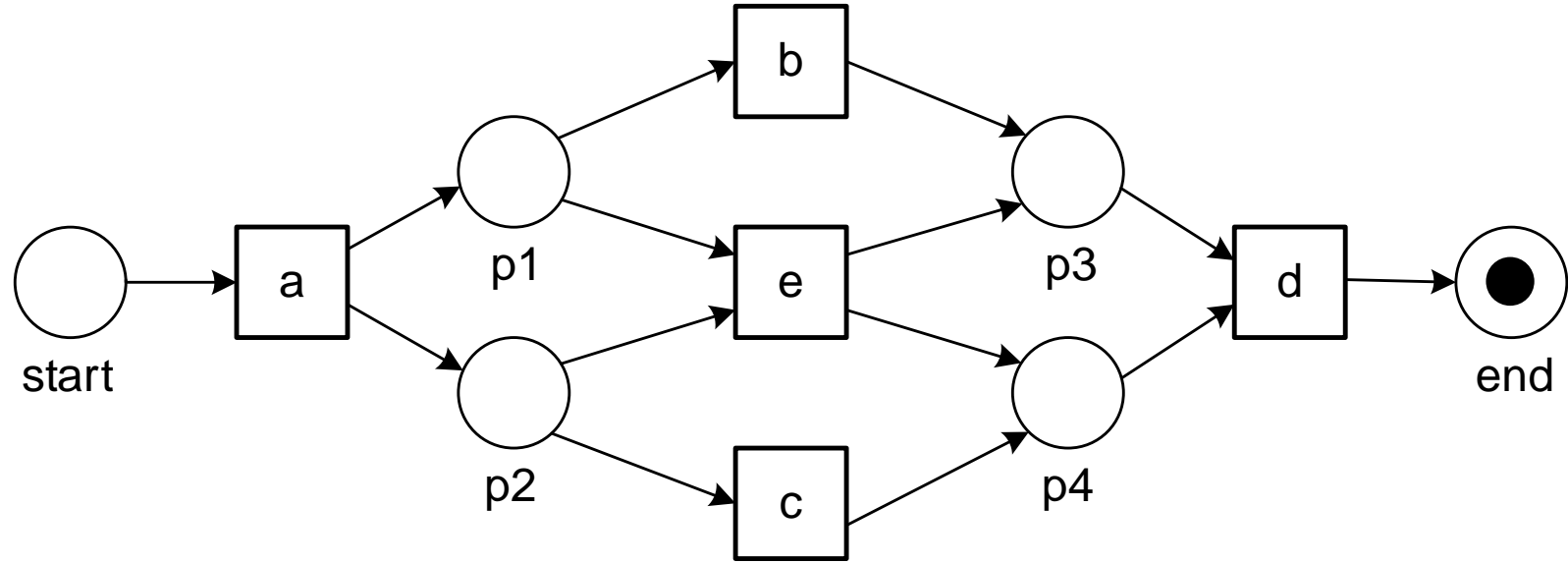
<a,c>

“Playing out”



<a,c,b>

“Playing out”



<a,c,b,d>

Final marking

Process Discovery

Given some traces, can you come up with a Petri net that can replay all of them?

$\langle a, b, d, e, f, h \rangle$

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

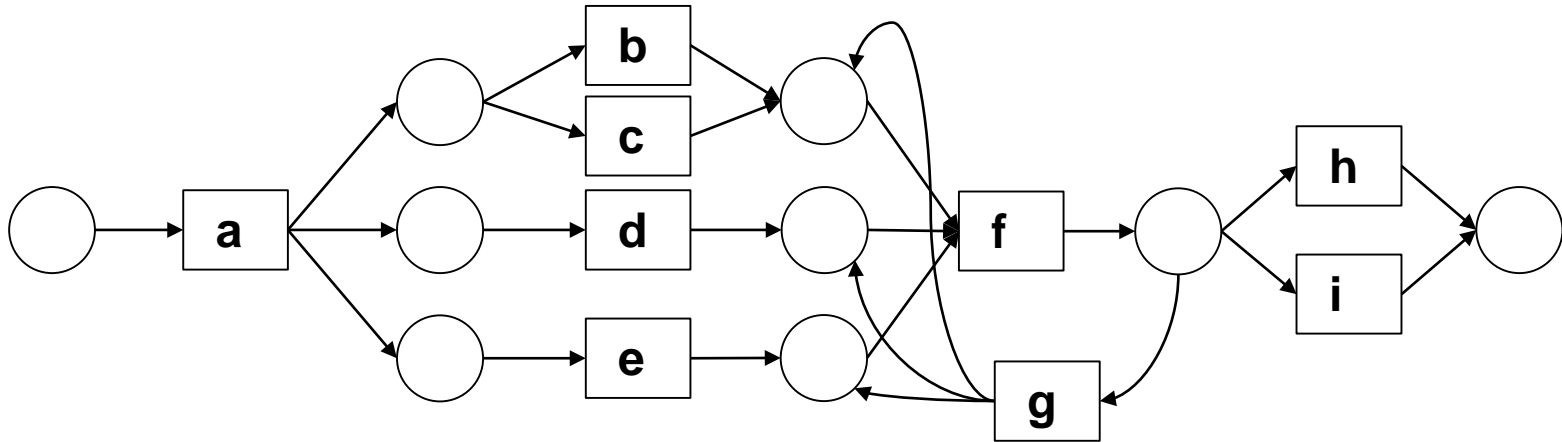
$\langle a, d, e, b, f, g, f, g, f, h \rangle$

Process Discovery: solution

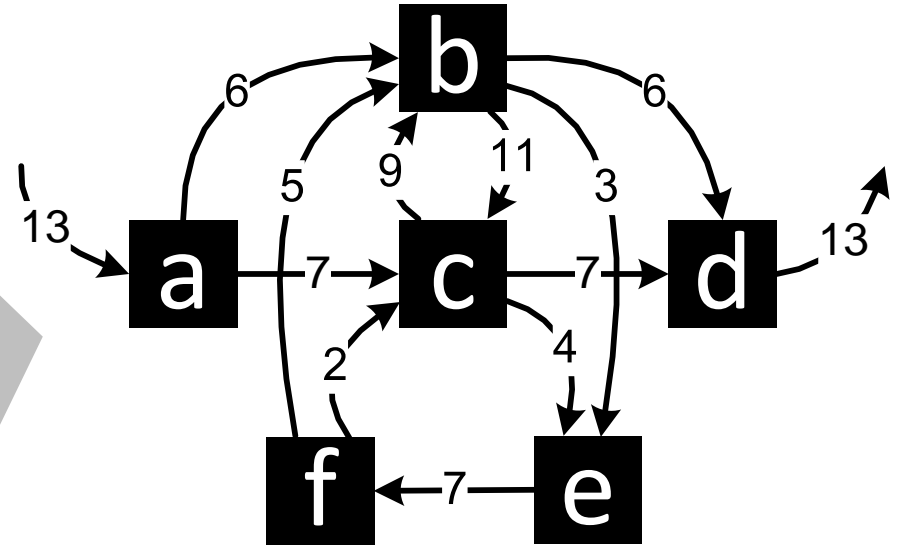
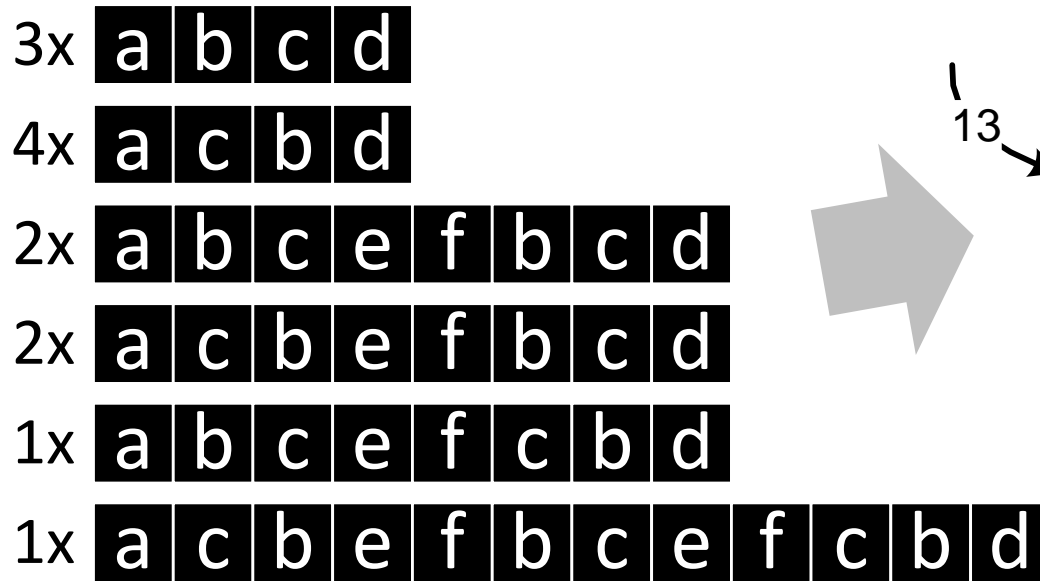
<a,b,d,e,f,h>

<a,e,c,d,f,g,f,i>

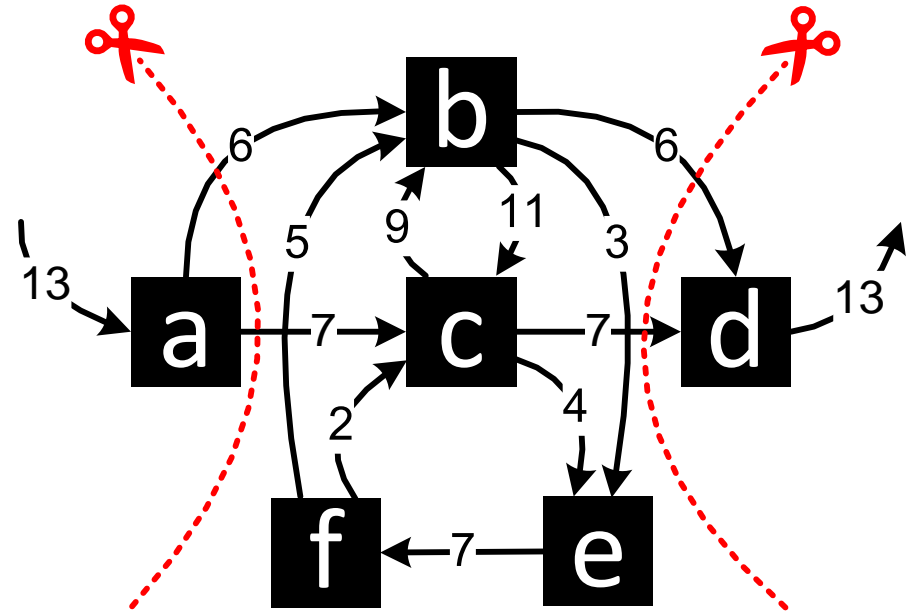
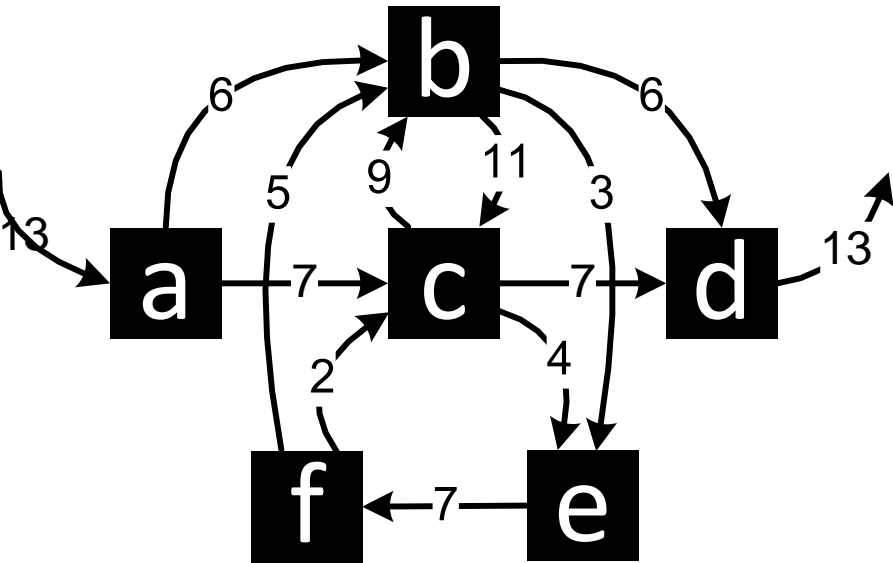
<a,d,e,b,f,g,f,g,f,h>



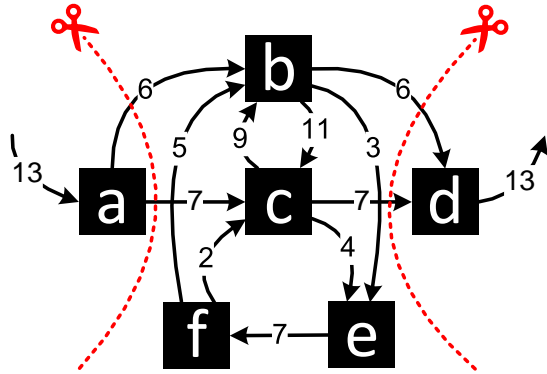
Directly-follows graph based on event log



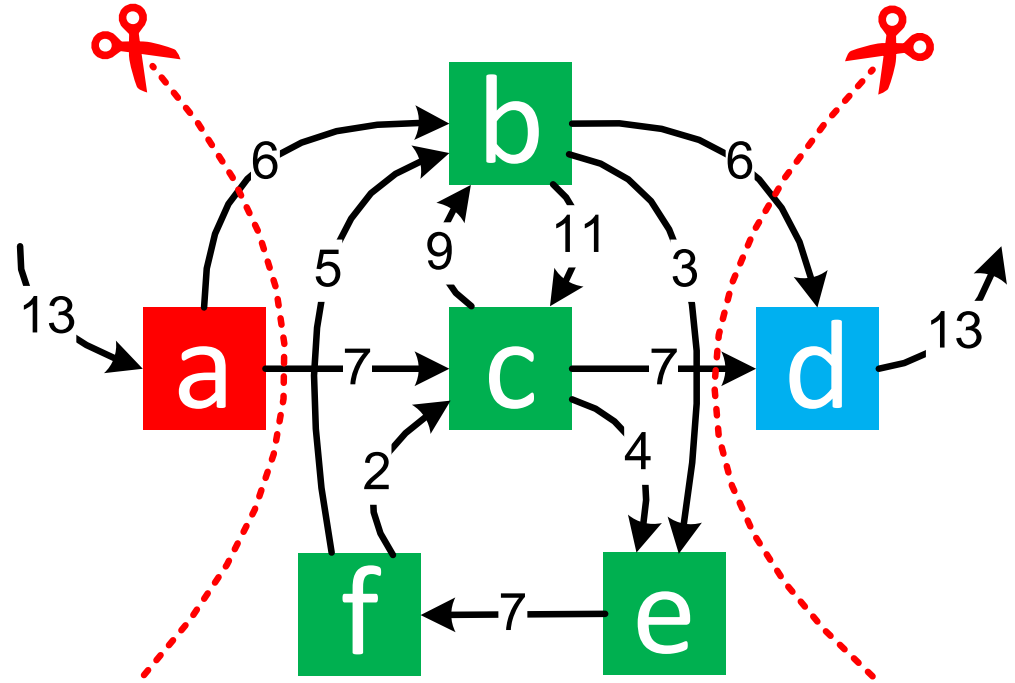
Sequence cut



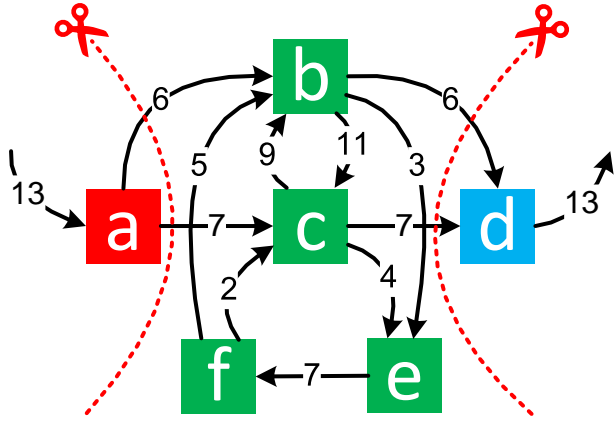
Partition activities based on sequence cut



{a} , {b,c,e,f} , {d}



Partition events based on sequence cut



{a} , **{b,c,e,f}** , **{d}**

3x **a** **b** **c** **d**

4x **a** **c** **b** **d**

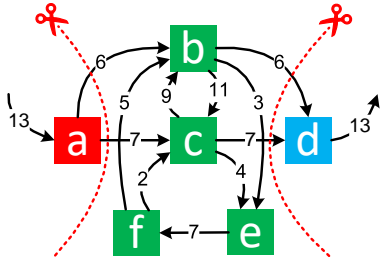
2x **a** **b** **c** **e** **f** **b** **c** **d**

2x **a** **c** **b** **e** **f** **b** **c** **d**

1x **a** **b** **c** **e** **f** **c** **b** **d**

1x **a** **c** **b** **e** **f** **b** **c** **e** **f** **c** **b** **d**

Partition events based on sequence cut



3x

a	b	c	d
---	---	---	---

 4x

a	c	b	d
---	---	---	---

 2x

a	b	c	e	f	b	c	d
---	---	---	---	---	---	---	---

 2x

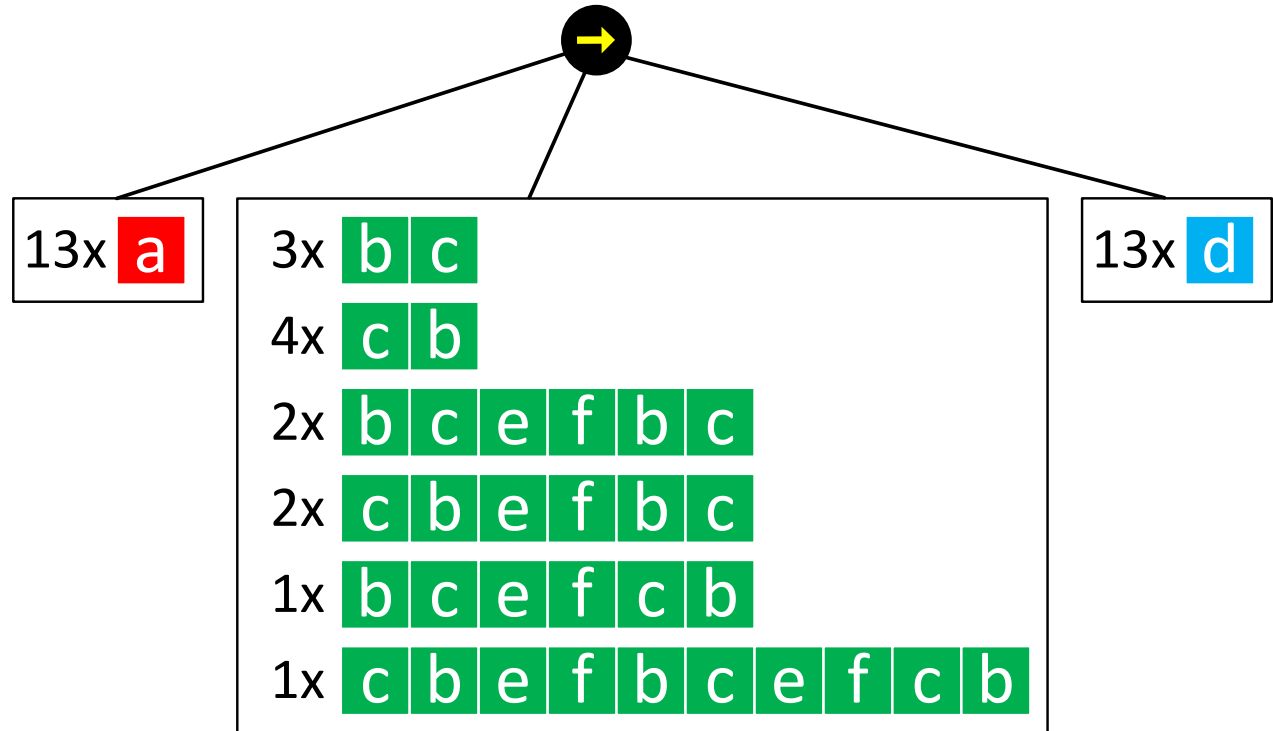
a	c	b	e	f	b	c	d
---	---	---	---	---	---	---	---

 1x

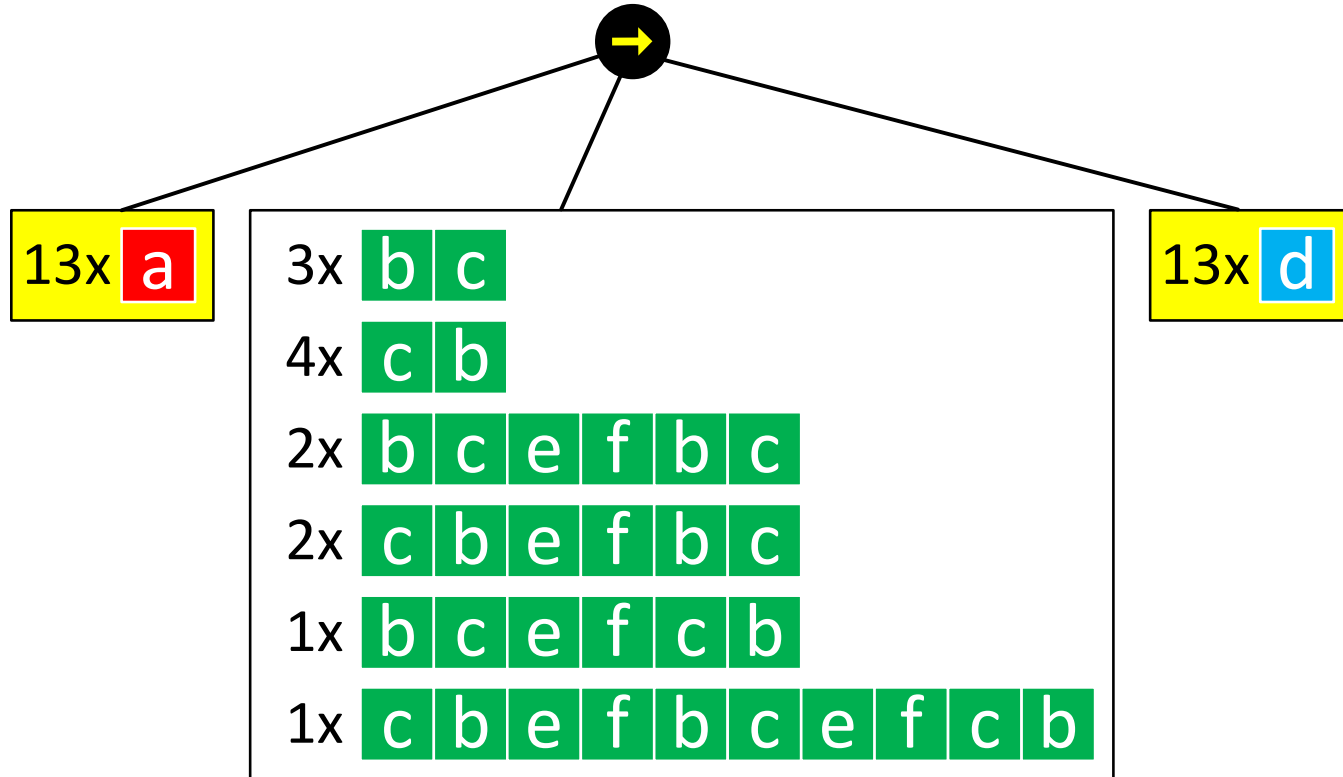
a	b	c	e	f	c	b	d
---	---	---	---	---	---	---	---

 1x

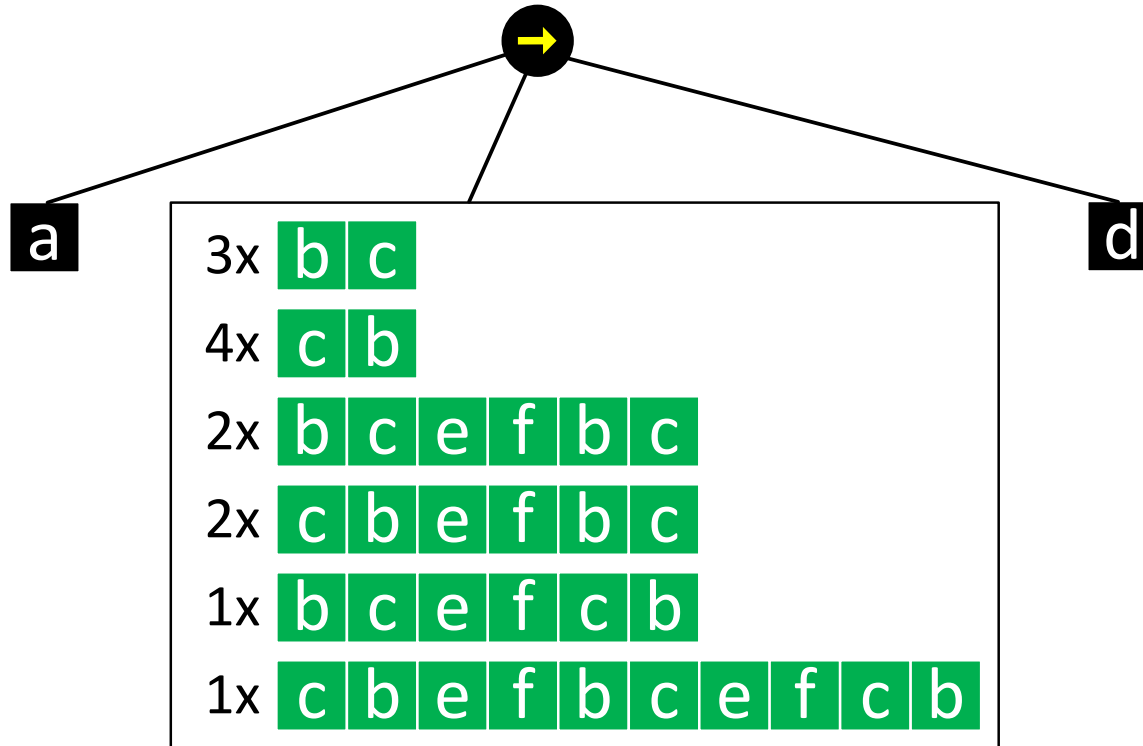
a	c	b	e	f	b	c	e	f	c	b	d
---	---	---	---	---	---	---	---	---	---	---	---



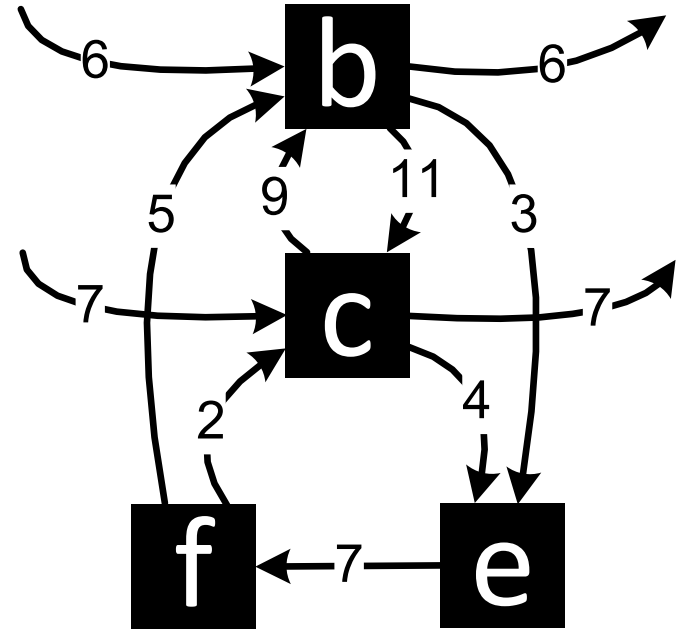
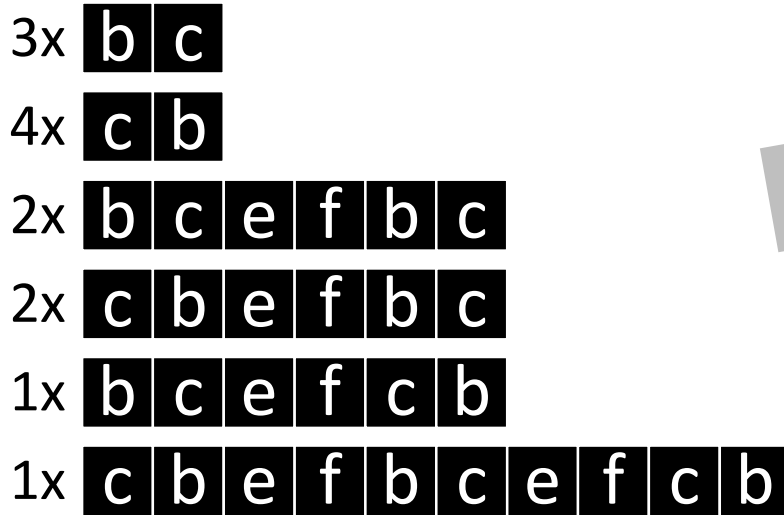
Handle base cases



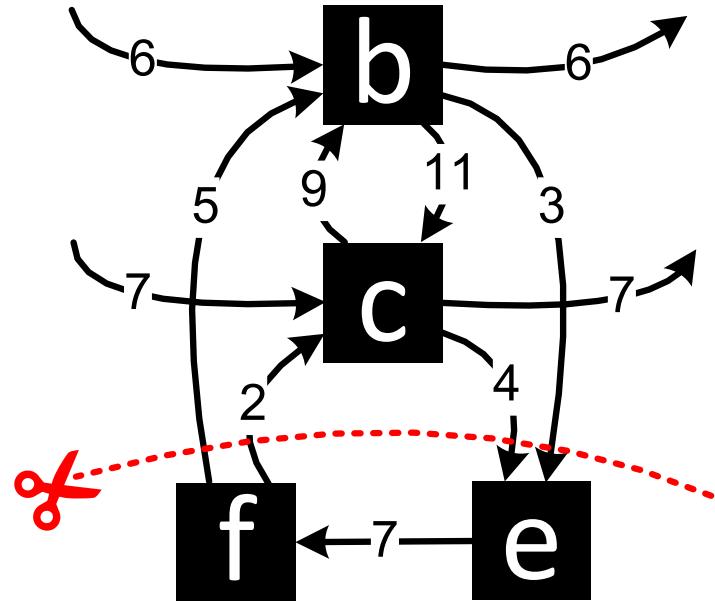
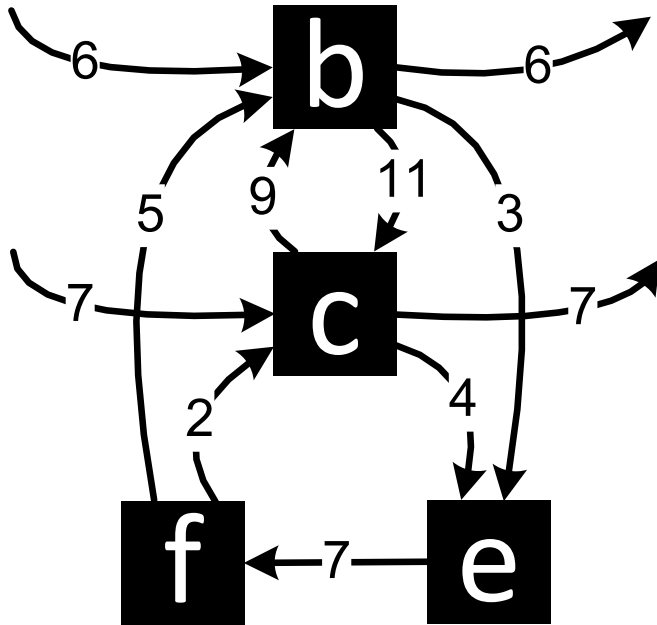
Recurse on non-base cases



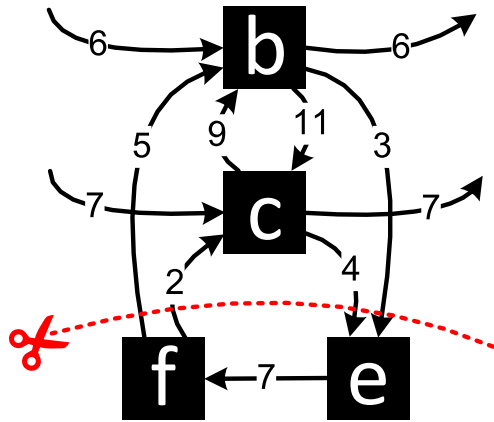
Directly-follows graph based on sublog



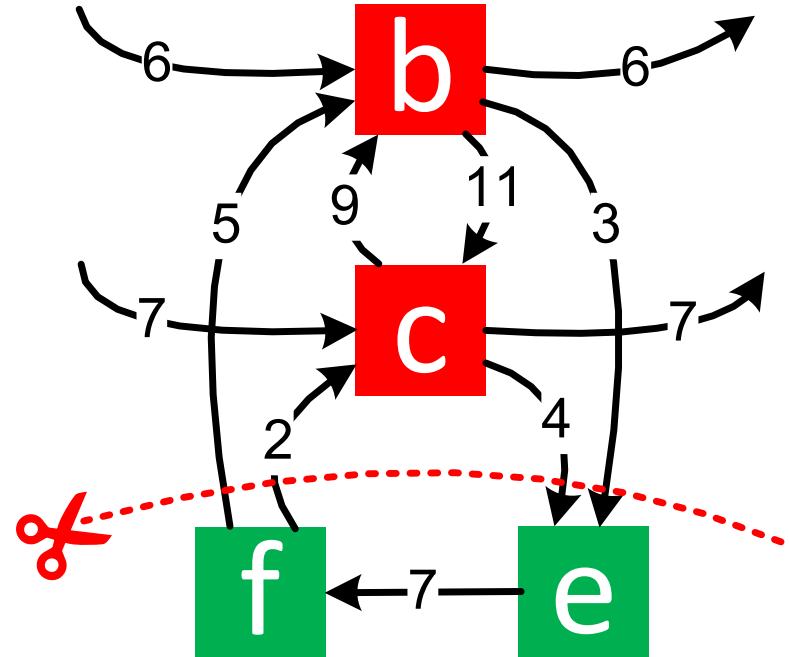
Loop cut



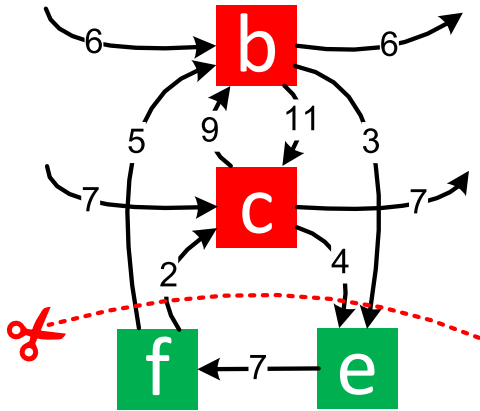
Partition activities based on loop cut



{b,c} , {e,f}



Partition events based on loop cut



$\{b, c\}$,
 $\{e, f\}$

3x $\begin{bmatrix} b & c \end{bmatrix}$

4x $\begin{bmatrix} c & b \end{bmatrix}$

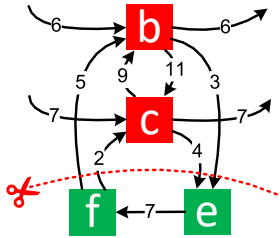
2x $\begin{bmatrix} b & c & e & f & b & c \end{bmatrix}$

2x $\begin{bmatrix} c & b & e & f & b & c \end{bmatrix}$

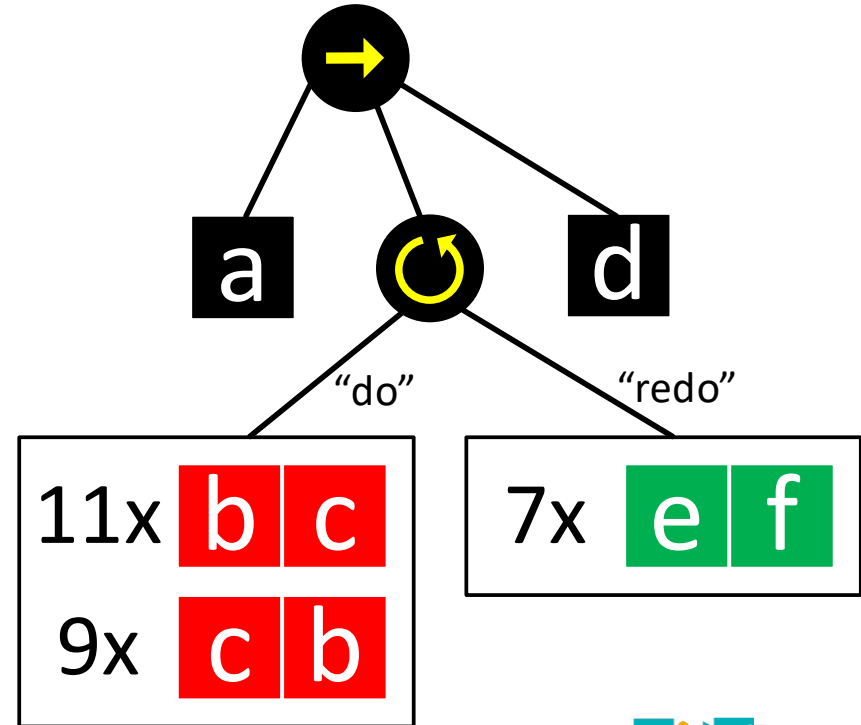
1x $\begin{bmatrix} b & c & e & f & c & b \end{bmatrix}$

1x $\begin{bmatrix} c & b & e & f & b & c & e & f & c & b \end{bmatrix}$

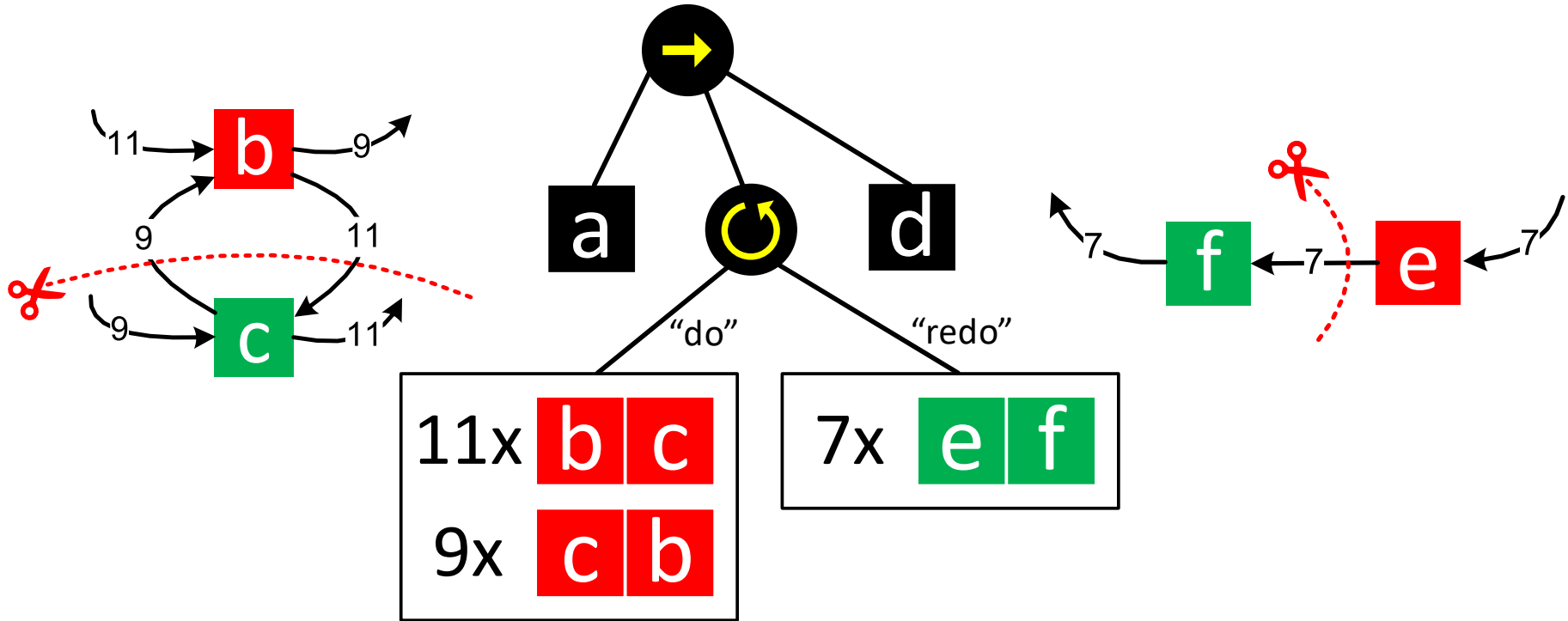
Partition events based on loop cut



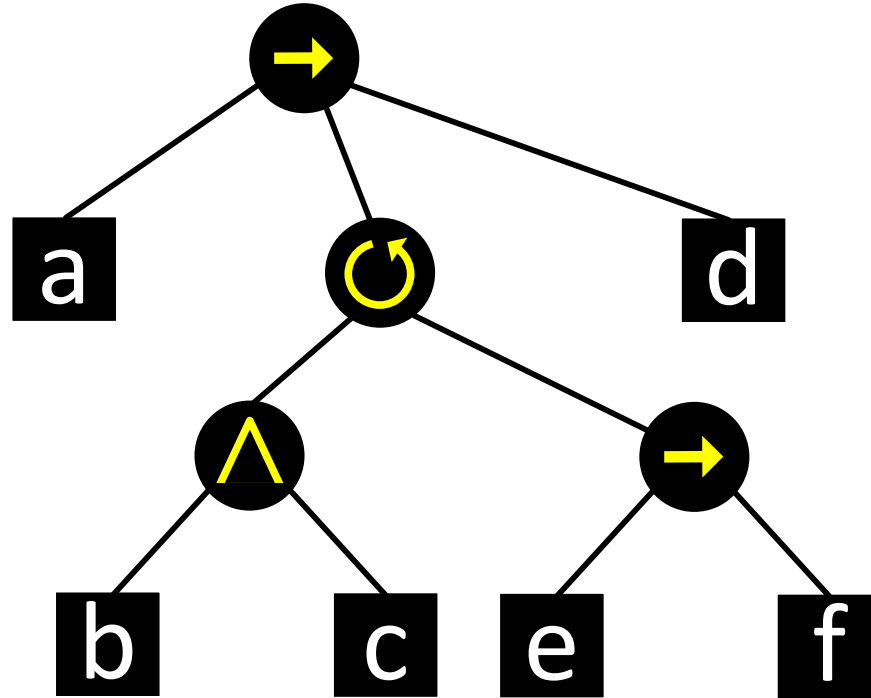
3x **b c**
 4x **c b**
 2x **b c e f b c**
 2x **c b e f b c**
 1x **b c e f c b**
 1x **c b e f b c e f c b**



Recurse on the two sublogs



Final model



Your turn!

<a, d>

<a, d, e, d>

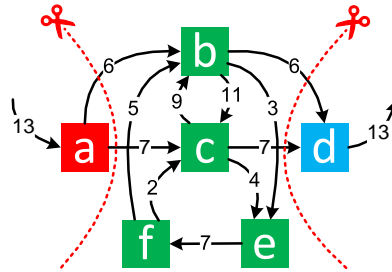
<b, c, d>

<b, c, d, e, d>

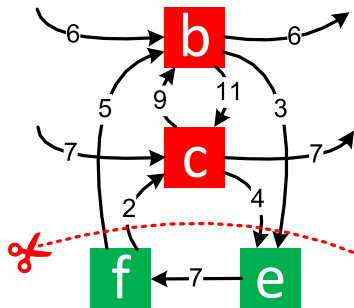
<c, b, d, e, d>

<c, b, d, e, d, e, d>

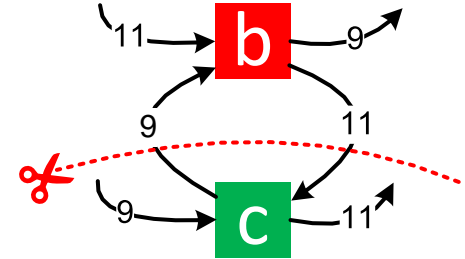
Sequence



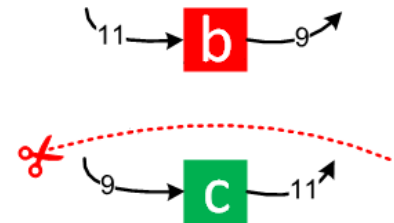
Loop



AND



XOR



Solution

Sequence cut: $\rightarrow(\{a, b, c\}, \{d, e\})$

XOR cut: $\rightarrow(\times(a, \{b, c\}), \{d, e\})$

AND cut: $\rightarrow(\times(a, \wedge(b, c)), \{d, e\})$

Loop cut: $\rightarrow(\times(a, \wedge(b, c)), \curlyvee(d, e))$