

# Mining Workflow Recovery From Event Based Logs

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# Outlines

- Prerequisites
- Mining workflow patterns
- Mining transactional behavior
- Improving workflow recovery
- Conclusion

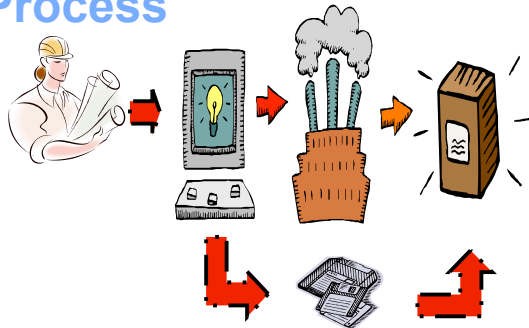


# Recovery mechanisms and transactional workflows

- Recovery mechanisms :
  - are applied in case of failures to resume correctly workflow execution from a consistent point;
  - use **transactional mechanisms** to guarantee reliable and consistent executions.
- Transactional workflows :
  - focus on issues of consistency from the business point of view rather than from the database point of view;
  - add additional mechanisms to support the automation of failure handling during runtime.

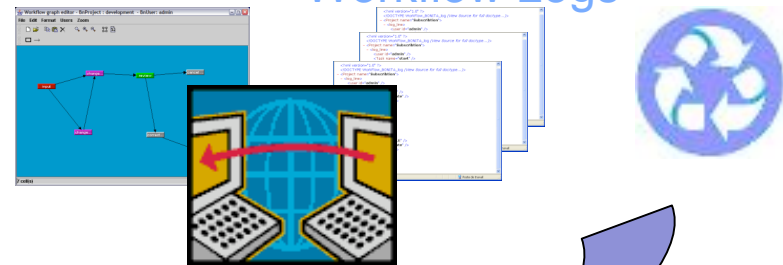
# Scope and objectives

Enterprise Process



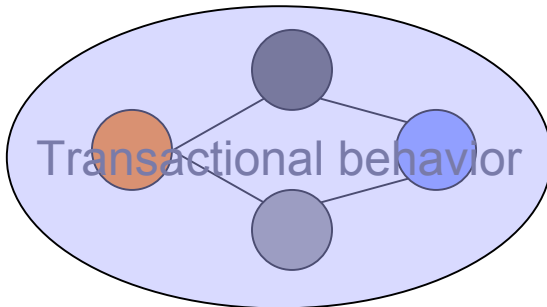
(1) Workflow patterns mining

Workflow Logs



Workflow in action

Transactional behavior

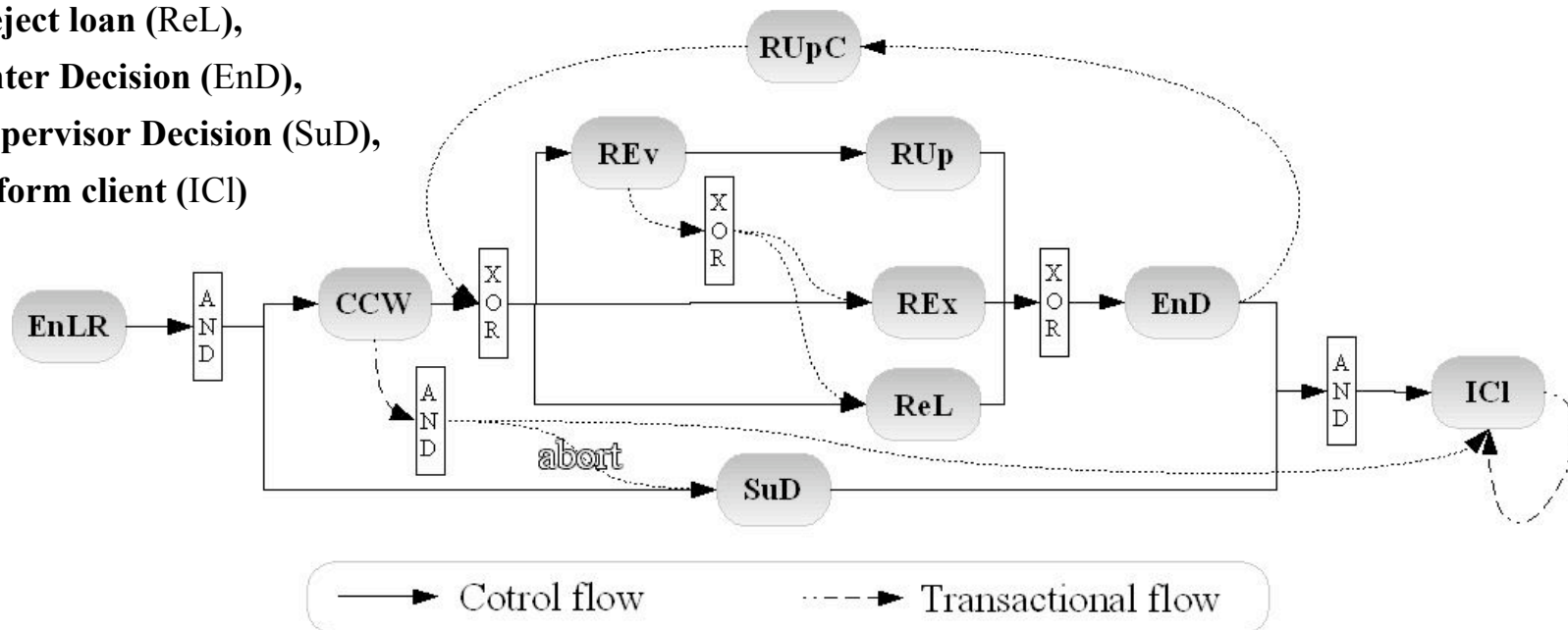


(2) Transactional Workflow behavior mining

# Motivating Example

- Enter loan terms (EnLR),
- Client credit worthness (CCW),
- Risk evolution (REv), Risk update (RU<sub>p</sub>)
- Risk exception (REx),
- Reject loan (ReL),
- Enter Decision (EnD),
- Supervisor Decision (SuD),
- Inform client (ICl)

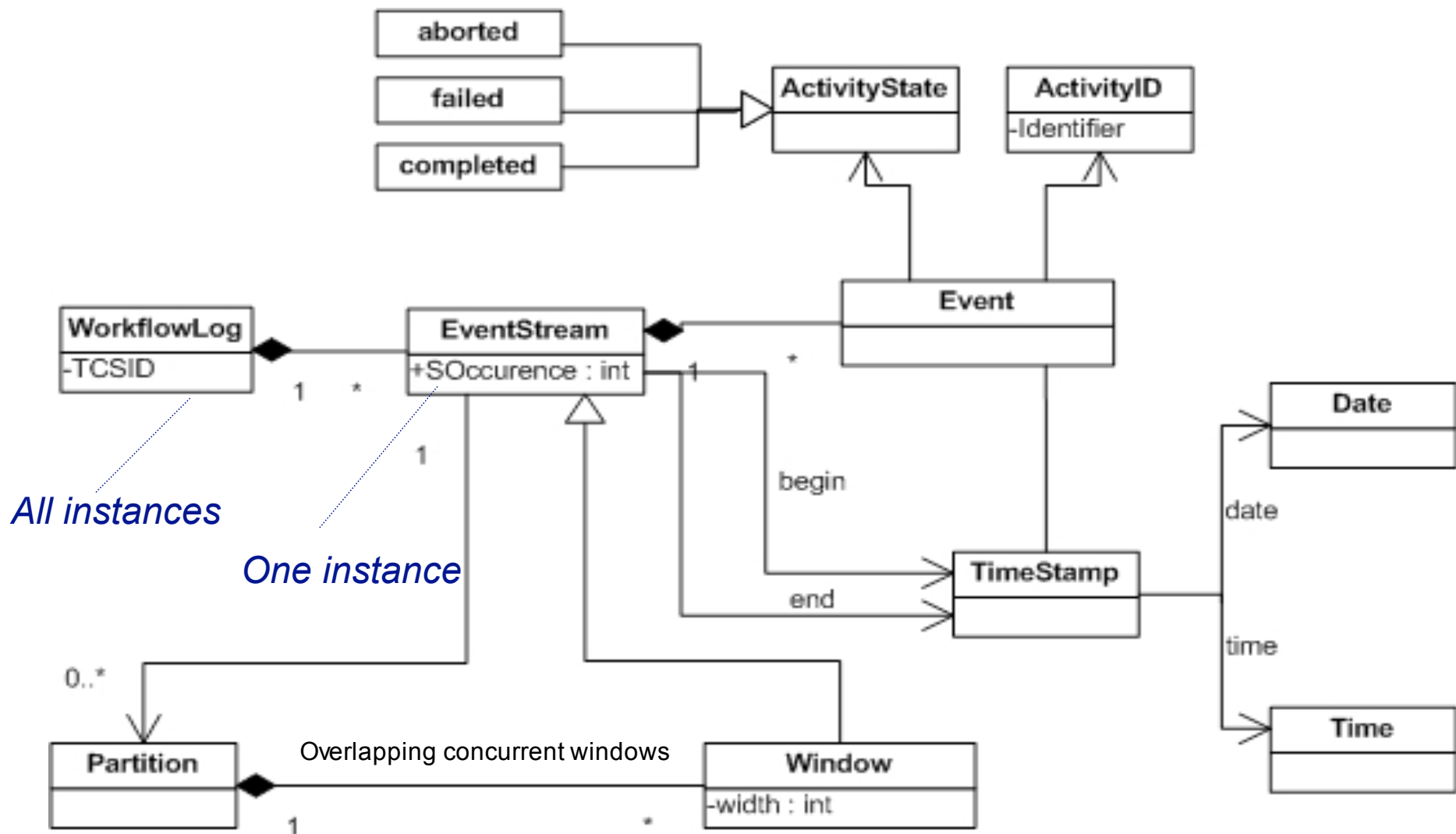
Additional transactional behavior specifies **recovery mechanisms**



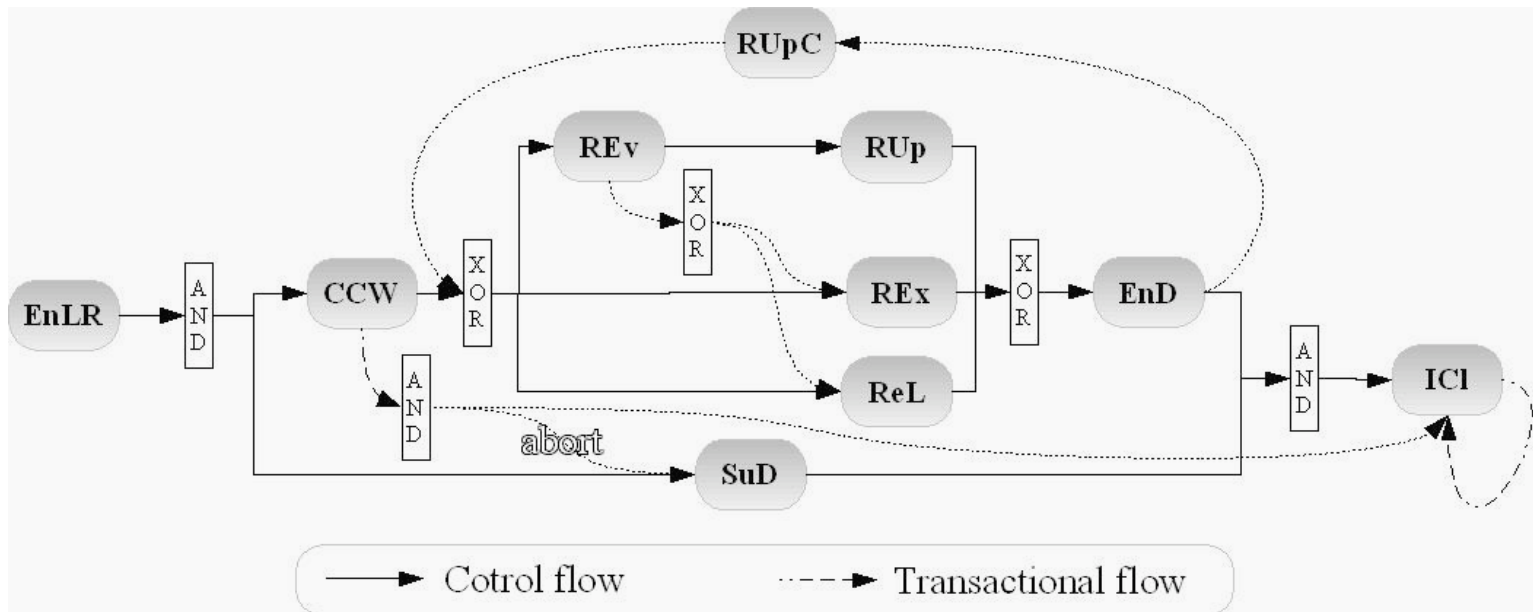
- **CCW never fails**
- **SuD can fail**

- No need to specify a recovery mechanism for CCW
- Abort concurrent activities of decision process and resume workflow execution

# Workflow Log Model

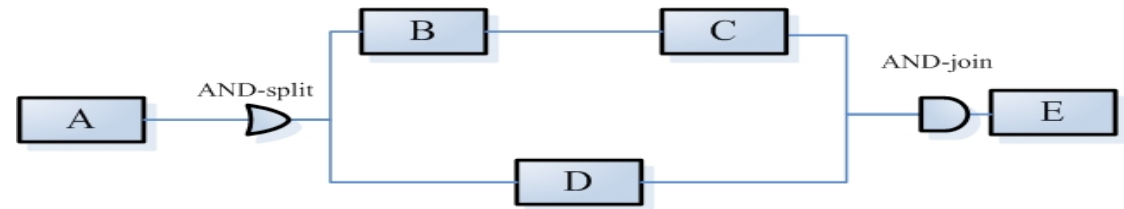


# A Workflow example and one of its instances **Event Stream**



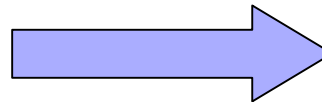
**EventStream(5, 13, [event(EnLR,5, terminated), event(CCW,7,terminated),  
 event(REv,7,failed), event(SuD,10,terminated), event(REx,11, terminated),  
 event(End,12, terminated), event(ICI,13, failed), event(ICI,13, terminated)])**

# Log Analysis



- For each activity  $A_i$  in workflow log :
  - $\#A_i$  : the overall occurrence of  $A_i$
  - $p(A_i | A_j)$  : the dependency of  $A_i$  to a “directly” previous activity  $A_j$

instance 1 : ABDCE  
 instance 2 : ADBCE  
 instance 3 : ABCDE



e.g.  $p(B | A) = 2 / 3$

$\#A = \#B = \#C = \#D = \#E = 3$

↖	A	B	C	D	E
A	0.0	0.0	0.0	0.0	0.0
B	$2/3 = 0.66$	0.0	0.0	$1/3 = 0.33$	0.0
C	0.0	$2/3 = 0.66$	0.0	$1/3 = 0.33$	0.0
D	$1/3 = 0.33$	$1/3 = 0.33$	$1/3 = 0.33$	0.0	0.0
E	0.0	0.0	$2/3 = 0.66$	$1/3 = 0.33$	0.0





# Log Analysis

- Problems :

- Erroneous Dependencies
- Undetectable Dependencies
- More details are given in our papers in CoopS' 04 or DEXA' 05 conferences

- Statistical properties :

- P1: Mutual exclusive dependency property
- P2: Concurrency property :
  - Global concurrency ,Partial concurrency, No concurrency.
- P3: Choice property:
  - Free choice, Single choice, No choice

# Patterns rules

Rules	workflow patterns
$(P3)(\sum_{i=0}^n (\#A_i)=\#B)$	xor-join pattern 
$(P3)(\sum_{i=0}^n P(B/A_i)=1) \wedge$ $(P2)(\forall 0 \leq i, j \leq n; P(A_i/A_j) = 0)$	
$(P3)(\forall 0 \leq i \leq n; \#A_i=\#B)$	and-join pattern 
$(P3)(\forall 0 \leq i \leq n; P(B/A_i) = 1) \wedge$ $(P2)(\forall 0 \leq i, j \leq n P(A_i/A_j) = -1)$	
$(P3)(m * \#B \leq \sum_{i=0}^n (\#A_i))$ $\wedge (\forall 0 \leq i \leq n; \#A_i \leq \#B)$	M-out-of-N-Join pattern 
$(P3)(m \leq \sum_{i=0}^n P(B/A_i) \leq n)$ $\wedge (P2)(\exists 0 \leq i, j \leq n; P(A_i/A_j) = -1)$	

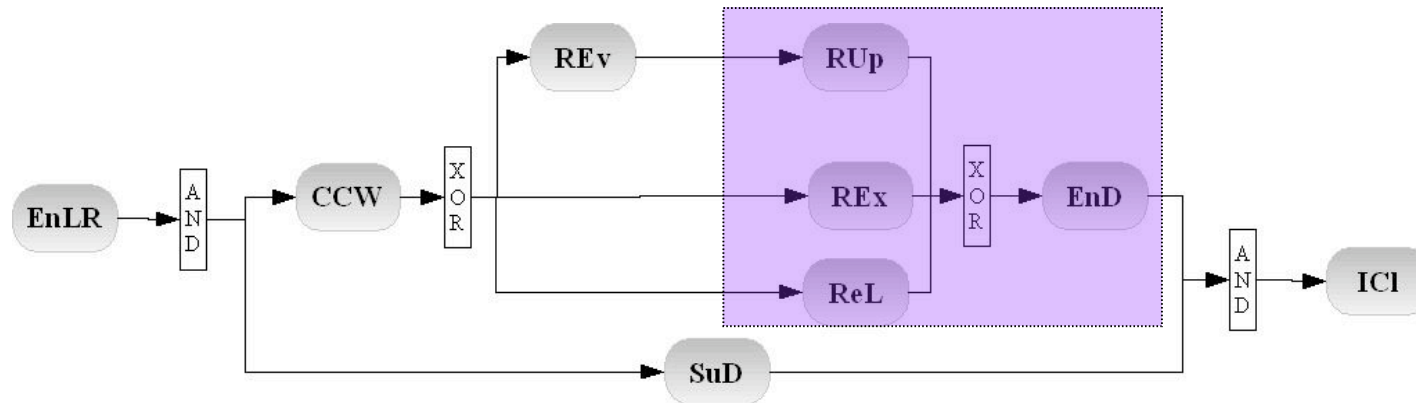
Table 4. Rules of join workflow patterns

# Patterns rules

P(x,y)	EnLR	CCW	REv	RU <sub>p</sub>	REx	ReL	EnD	SuD
EnLR	0	0	0	0	0	0	0	0
CCW	1	0	0	0	0	0	0	-1
REv	0	1	0	0	0	0	0	-1
RU <sub>p</sub>	0	0	1	0	0	0	0	-1
REx	0	1	0	0	0	0	0	-1
ReL	0	1	0	0	0	0	0	-1
EnD	0	0	0	0.58	0.23	0.19	0	-1
SuD	1	-1	-1	-1	-1	-1	-1	0

$$EnLR = CCW = EnD = SuD = 100$$

$$REv = RU_p = 69REx = 21ReL = 10$$



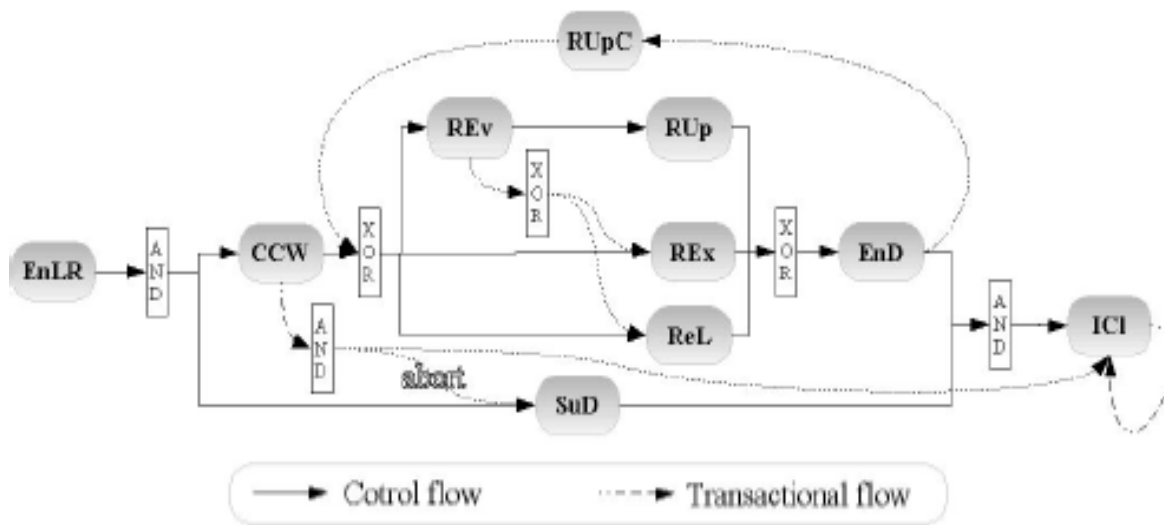


# Transactional Workflows

- Control flow : workflow patterns [van der Aalst]
- Transactional behavior :
  - Activities transactional properties :
    - Depending on transitions of internal states (aborted, failed and completed);
    - Transactional properties : retrievable, compensatable, pivot [Elmagarmid].
  - Transactional flow :
    - External transitions ensuring failure handling by resuming workflow execution from a **consistent point**
    - **Consistent point** represents an acceptable intermediate execution state from a business perspective where certain actions can be taken to fix the problem that caused the failure or choose an alternative execution path

# Mining inter activities transactional dependencies

- $ITR_A(e1, e2)$  table reports inter activities transactional dependencies after activity "A" failures where :
  - (ei.state= failed and ei.activity = "a"; i=1,2) **OR**
  - ei.activity; is a "new" activity (i.e not appear in control flow mining); i=1,2 )



$ITR_{EnD}$	EnD,f	RUpC,c	REv,c	REx,c	ReL,c	RUp,c
EnD,f	0	0	0	0.56	0.34	0.1
RUpC,c	1	0	0	0	0	0
REv,c	0	1				
REx,c	0	1				
ReL,c	0	1				
RUp,c	0	0				

# Mining transactional flow

## ■ Alternative Dependency:

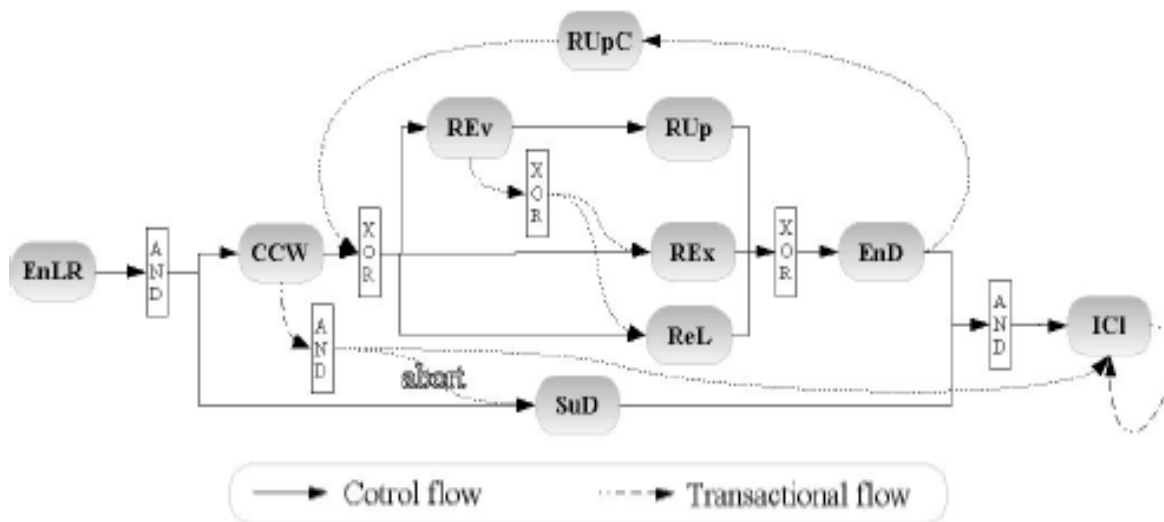
- $ITR_{a_2}(\text{"a1", completed}, \text{"a2", failed}) > 0$ ;
- We distinguished two kind of alternative dependencies:
  - a backward alternative : if the consistent state is located before the failed activity
  - a forward alternative : if the consistent state is located after the failed activity

## ■ Abortion Dependency:

- $ITR_{a_2}(\text{"a1", aborted}, \text{"a2", failed}) > 0$

# Mining intra activities transactional dependencies

- $ATR_{act}^A$  intra activities transactional dependencies table
  - Reports the intra states transitions of the "A" activity after "act"'s failures.
  - These transitions are extracted from a workflow logs projection that take only events of "A" after "act"'s failures.



$ATR_{End}^{REv}$	c	f	a	$ATR_{End}^{REx}$	c	f	a
c	1	0	0	c	1	0	0
f	0	0	0	f	0	0	0
a	0	0	0	a	0	0	0

$ATR_{End}^{RUp}$	c	f	a	$ATR_{End}^{ReL}$	c	f	a
c	1	0	0	c	1	0	0
f	0	0	0	f	0	0	0
a	0	0	0	a	0	0	0

# Mining activities transactional properties

- An activity “a” is said to be retrievable *iff*  $ATR_a^a(\text{completed, failed})=1 \wedge ITR_a((\text{“a”}, \text{completed}), (\text{“a”}, \text{failed})) = 1$ .
- An activity “a” is said to be pivot *iff*  $\forall \text{“act”} ATR_{act}^a(\text{“x”}, c) = 0$ ; (*“x”= completed or aborted or failed.*)

$ATR_{End}^{REv}$	c	f	a	$ATR_{End}^{REx}$	c	f	a
c	1	0	0	c	1	0	0
f	0	0	0	f	0	0	0
a	0	0	0	a	0	0	0

$ATR_{End}^{RUp}$	c	f	a	$ATR_{End}^{ReL}$	c	f	a
c	1	0	0	c	1	0	0
f	0	0	0	f	0	0	0
a	0	0	0	a	0	0	0



REv, Rex, RUp and ReL are not pivot





# Improving workflow recovery

## ■ Requirements :

- Workflow recovery depend on the semantics of the process ;
- Minimize the amount of effort resuming the workflow execution;
- Specify only to needed “failed activity” an “optimal” recovery mechanisms to resume workflow execution.


## ■ How :


- Correct or remove** the wrong transactional behavior;
- Suggest** relevant transactional behavior for a better failure handling and recovery.


# Improving workflow recovery


## Vital activity :

 if a **vital** activity fails then it must be recoverable

 All activities are vital for a workflow execution except in some **parallel threads of M-out-of-N Join and OR-Join patterns**;

 **For XOR-split, XOR-join, sequence patterns** : There is no abortion dependencies between the activities. An abortion dependency can exist only in case of failure and between parallel activities;

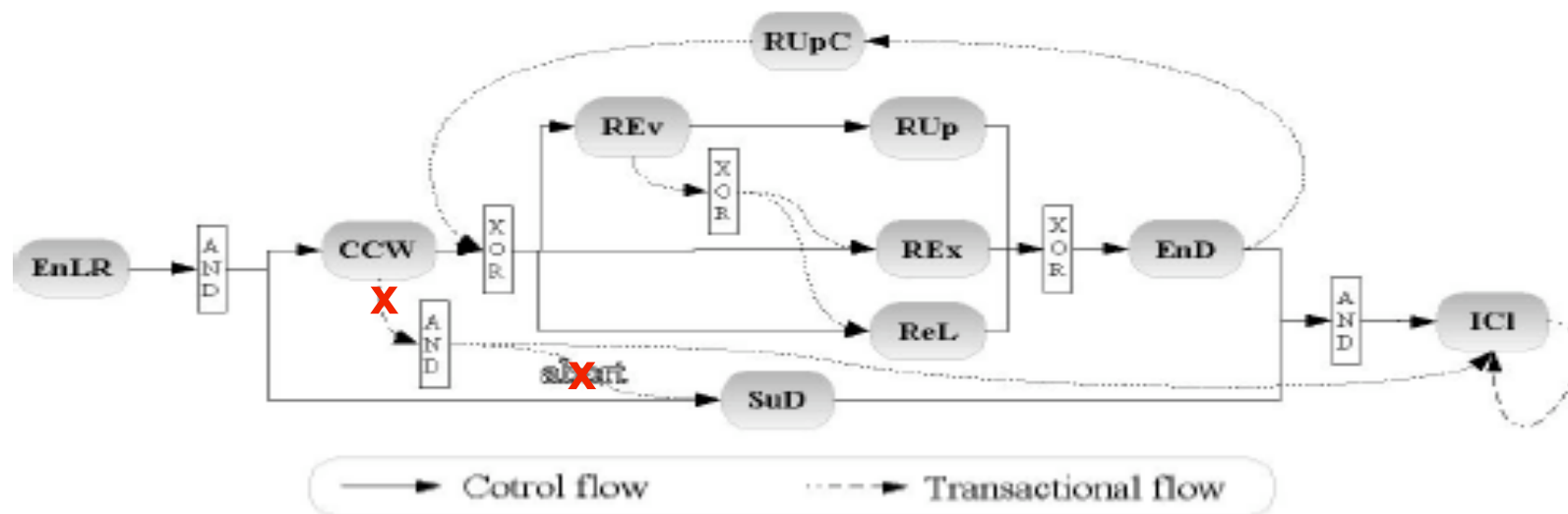
 **For AND-split, AND-join patterns combination** : If a **vital** activity fails then the consistent point must be out of the parallel threads between the "join" and "fork" point;

 **For all workflow patterns** : If we have a backward recovery then the consistent point cannot be before an executed pivot activity.

# Improving workflow recovery

We discovered that CCW never fails:

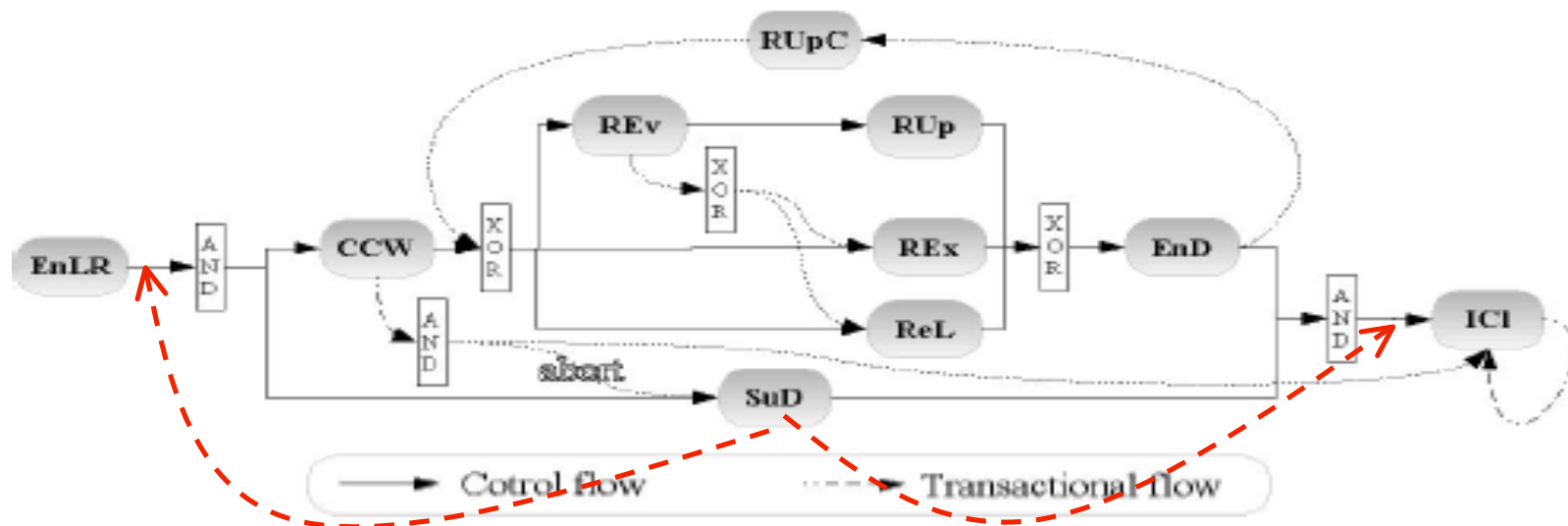
- By applying R1 there is no need for CCW to be recoverable.
- By applying R2 we remove the abortion dependency between CCW and SuD.



# Improving workflow recovery

We discovered that SuD can fail :

- By applying R3 the consistent point after SuD failure is localized just before ICI or just after EnLR;
- By applying R4 we can only suggest a forward recovery, after SuD failure, if EnD or CCW are pivot activities;
- By applying R2 we can suggest to specify abortion dependencies between SuD in one side and (CCW, REv, RUp, REx and ReL) activities in another side.





# Conclusion

- Our workflow patterns mining approach
  - Deals **dynamically** with concurrent behavior
  - Proceeds through a **local log analyzing** that allow us to recover partial results.
- Our mining transactional behavior approach
  - Discovers workflow transactional behavior
  - Identifies workflow recovery techniques
  - improves and corrects workflow failure handling using mining techniques



# Perspectives

## ■ Workflow mining:

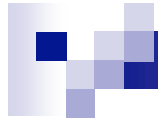
- Validate and test our approach on real workflow applications

*(WorkflowMiner over BONITA WfMS);*

- Discover more complex patterns by using more metrics;
- Discover more complex transactional characteristics.

## ■ Applying existing mining techniques to other problems

- Web service mining (*in progress*)



Thank You  
for your attention