

# A Novel Graph Based Approach for Automatic Composition of High Quality Grid Workflows

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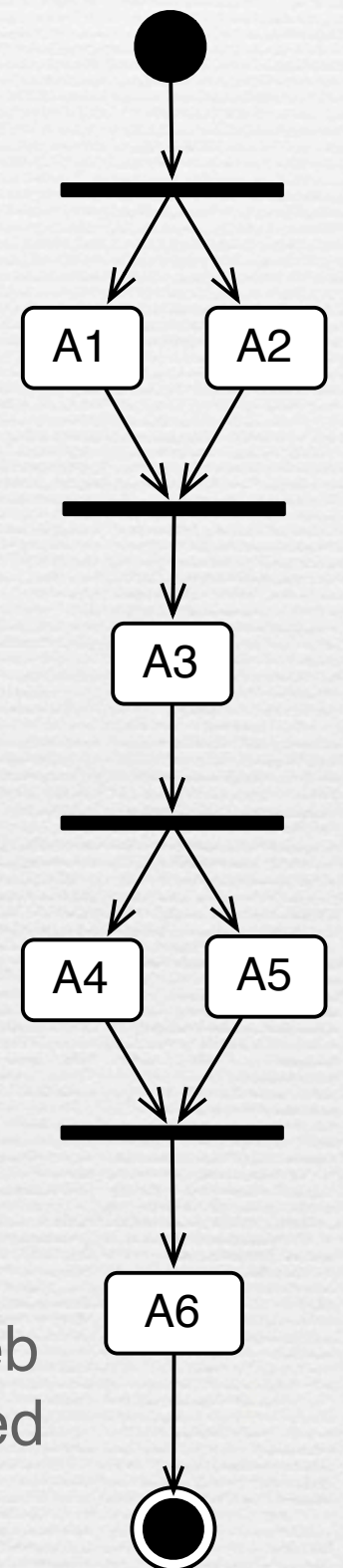


# Outline

- Introduction: Grid workflow & composition
- Comparison with existing work
- Background: ASKALON, AGWL
- Formal definition of the Grid workflow composition problem
- Grid workflow composition algorithm
  - ADD graph and its creation
  - Workflow extraction
  - Workflow optimization
  - Complexity analysis
  - Composition of Grid workflows with branches and loops
- Experimental results
- Summary and Future work

# Introduction

- Grid workflow is an important programming model for the Grid
  - a Grid workflow consists of a set of activities, and
  - a set of control flow/data flow dependences
- Grid workflow composition
  - selection of workflow activities
  - specification of control flow and data flow dependences
  - time consuming and error prone process, optimization takes longer time
- Abstract Grid workflow
  - using abstract activities reduces the user effort to select activities
  - the selection among hundreds abstract activities is still challenging
- Automatic Grid workflow composition
  - different from that in Business Process Management, Semantic Web Services, and requires high quality: portable, fault tolerant, optimized





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**A novel ADD graph based approach for automatic composition of high quality Grid workflows**

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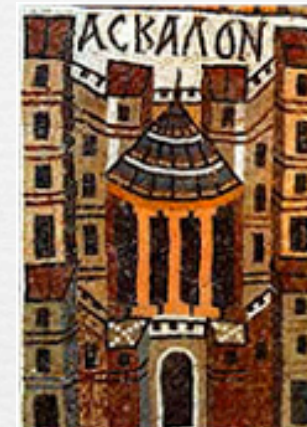
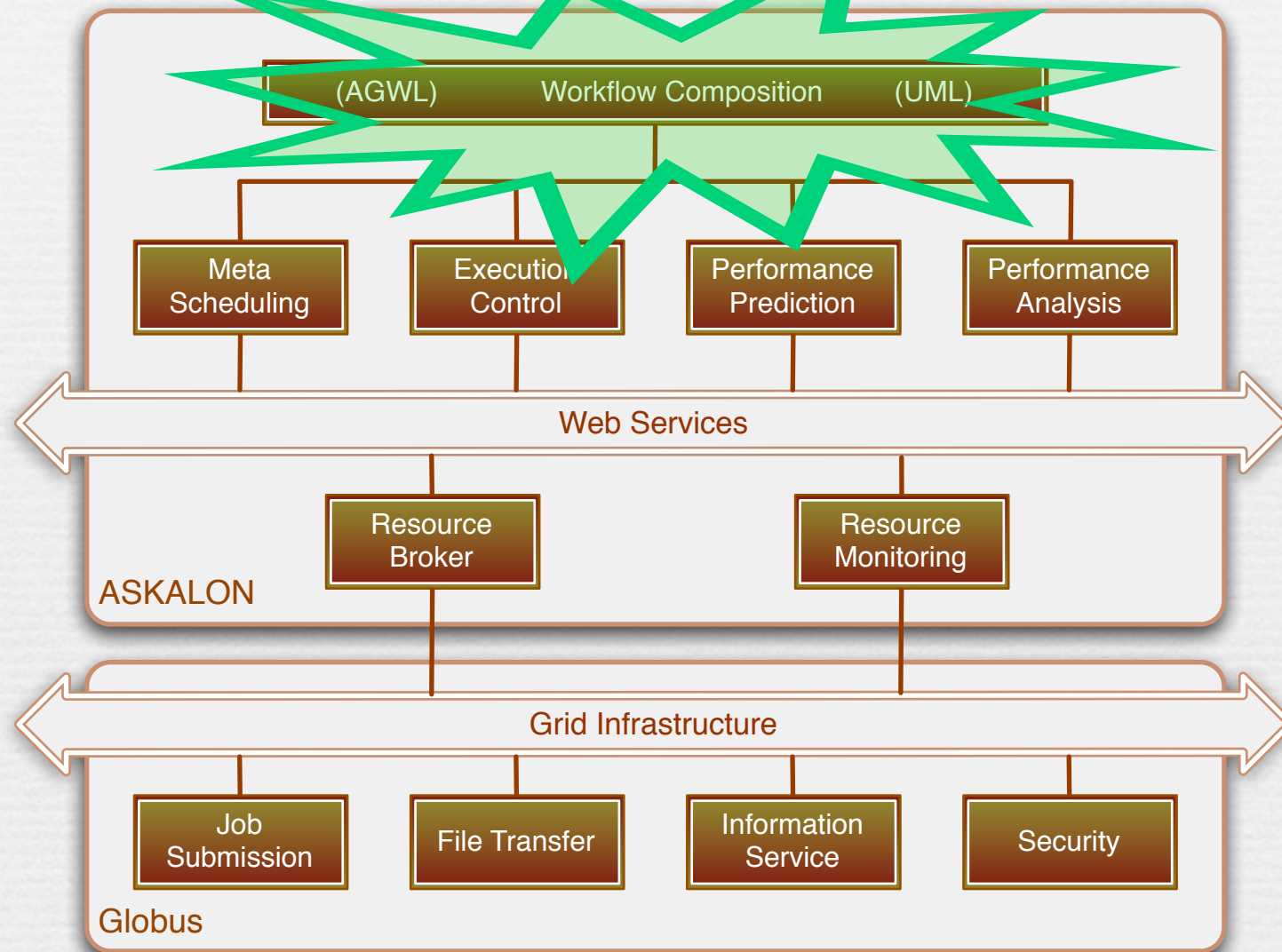
# Existing Work

- Existing work suffers from one of the following drawbacks:
  - Limiting to specific workflow notation systems such as Petri Nets
  - Focusing only on simple constructs like DAG
  - Cannot handle or do not consider alternative control flows
  - No workflow optimization
  - Only generating workflow instances from workflow templates
  - Assuming workflow tasks has ranks
- Our approach goes beyond existing work:
  - A general solution
  - Generation of alternative workflows, thus support fault tolerance
  - Considering workflow optimization
  - Generation of workflows with branches and parallel/sequential loops



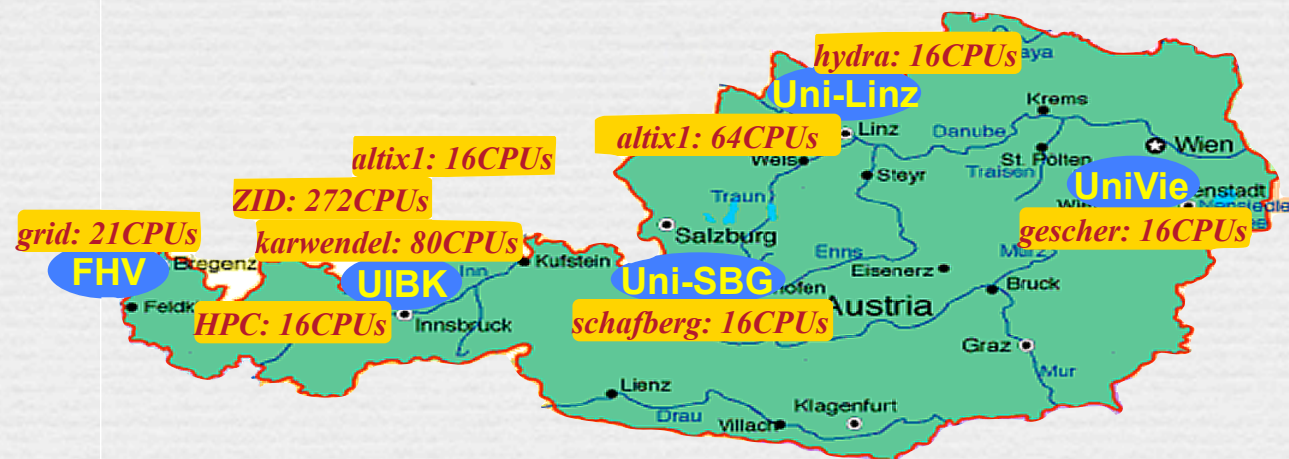
# ASKALON

## Grid Application Development and Computing Environment



Developed by the  
Univ. of Innsbruck,  
Austria

[www.askalon.org](http://www.askalon.org)



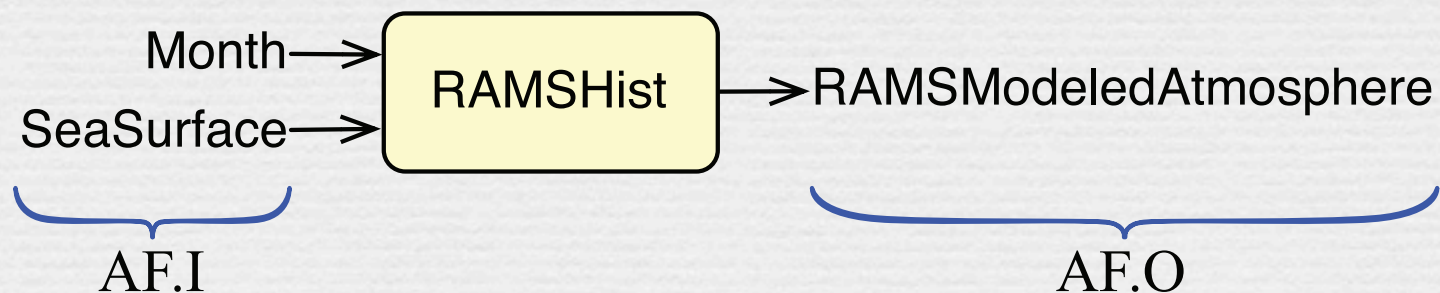
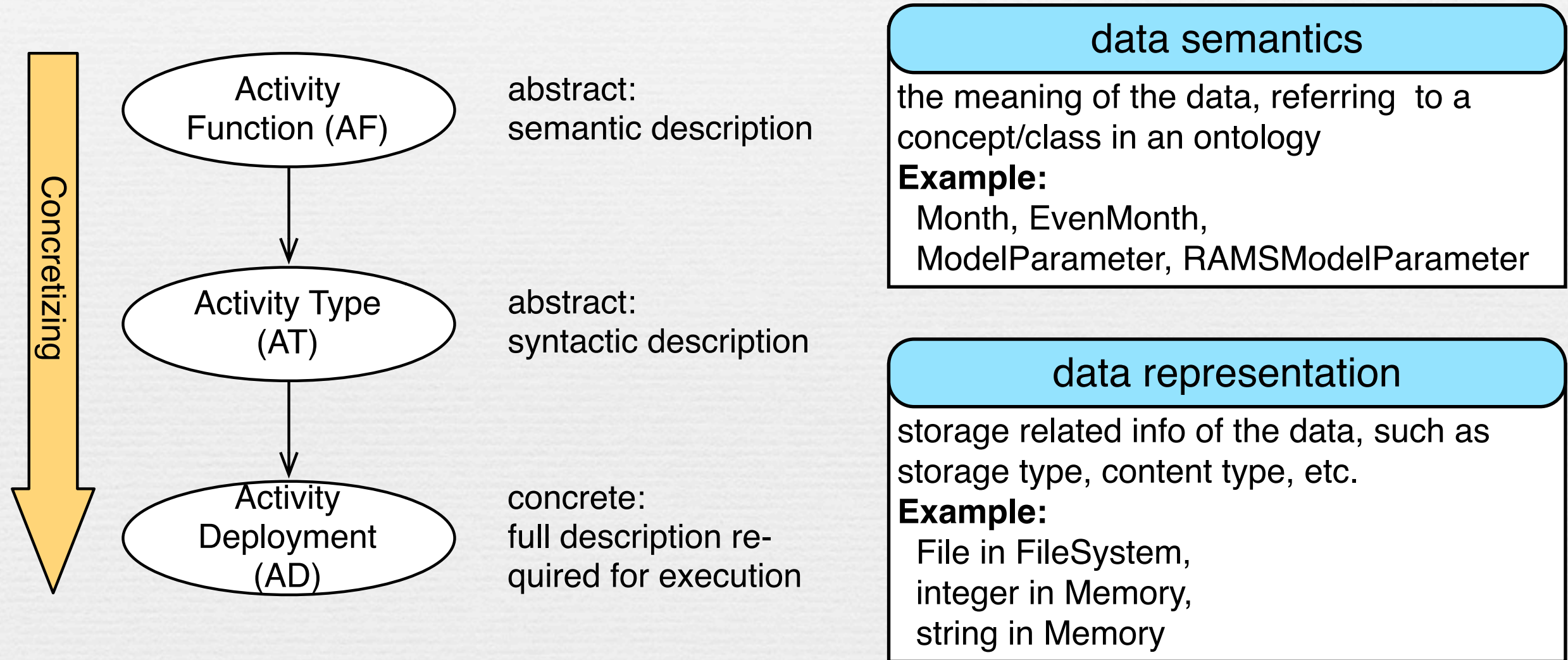


# Abstract Grid Workflow Language (AGWL)

- ❧ XML-based language for describing scientific Grid workflows at a high level of abstraction
- ❧ A rich set of control flow constructs
  - ❧ *sequence, parallel, if, switch, while, doWhile, for, forEach, parallelFor, parallelForEach, dag, alternative*
- ❧ data flow links: source data port → sink data port
  - ❧ in case of multiple sink data ports, each receives a data copy
  - ❧ data collection
- ❧ properties and constraints
- ❧ the main interface to ASKALON



# Abstraction in AGWL





# Definition of the Grid workflow composition problem

- ❧ STRIPS (STanford Research Institute Problem Solver)
  - ❧ initial state, goal state, actions
- ❧ Apply STRIPS into Grid workflow composition
  - ❧ state: a set of Data Classes, indicating the availability of data
  - ❧ initial state: user provided data which can be consumed by activities
  - ❧ goal state: user required data which must be produced by the composed workflow
  - ❧ action: Activity Function

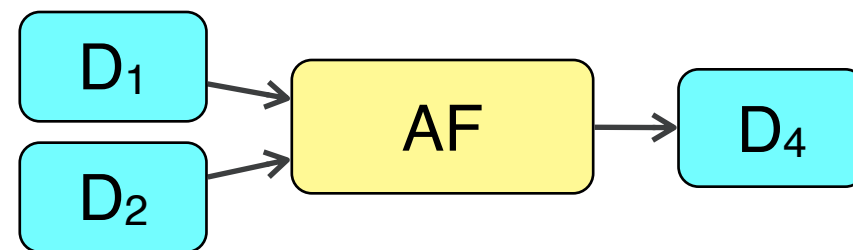


# Definition of the Grid workflow composition problem

state<sub>1</sub>: D<sub>1</sub>, D<sub>2.1</sub>, D<sub>3</sub>, *D<sub>2.1</sub> is subclass of D<sub>2</sub> according to ontology*



state<sub>1</sub> ⊨ AF.I  
(entails)

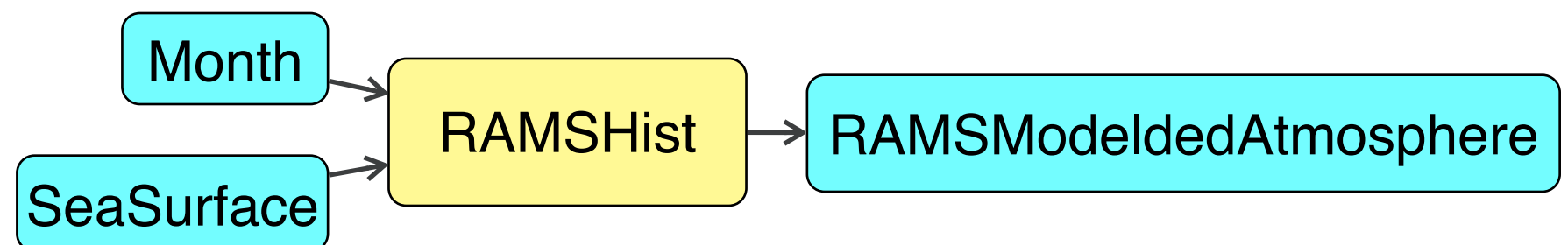


state<sub>2</sub>: D<sub>1</sub>, D<sub>2.1</sub>, D<sub>3</sub>, D<sub>4</sub>

state<sub>1</sub>: Month, SeaSurface



state<sub>1</sub> ⊨ AF.I



state<sub>2</sub>: Month, SeaSurface, RAMSModeldedAtmosphere



# Definition of the Grid workflow composition problem

- The Grid workflow composition problem can be defined by the function:

$$f : (s_{init}, s_{goal}, \mathcal{AF}) \rightarrow w$$

- $s_{init}$ : the initial state
- $s_{goal}$ : the goal state
- $\mathcal{AF}$ : the set of AFs among which some AFs will be selected for the composition of the Grid workflow  $w$
- $w$  is a DAG of AFs connected by control flow edges
  - 1)  $s_{init} \models AF.I$  for any AF which has no incoming control flow edges
  - 2)  $s_{init} \cup (\bigcup_{AF' \in \mathcal{AF}'} AF'.O) \models AF.I$  for any AF which has predecessors
  - 3)  $s_{init} \cup (\bigcup AF.O) \models s_{goal}$

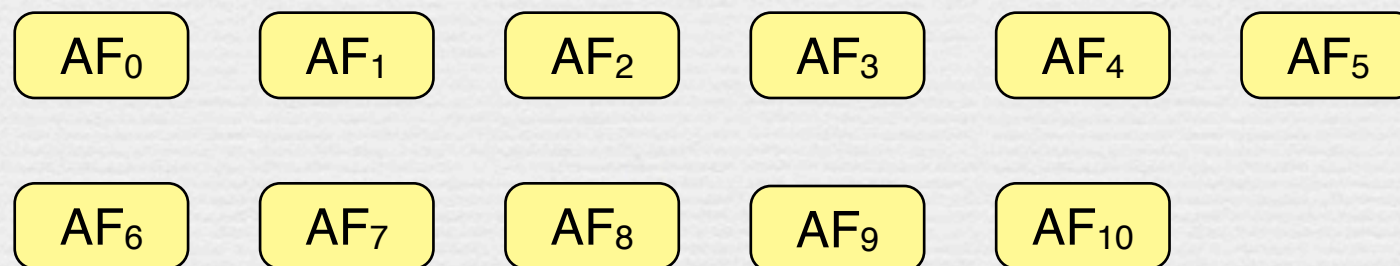


# A Simulated Domain

## ☛ Data Classes (DC)

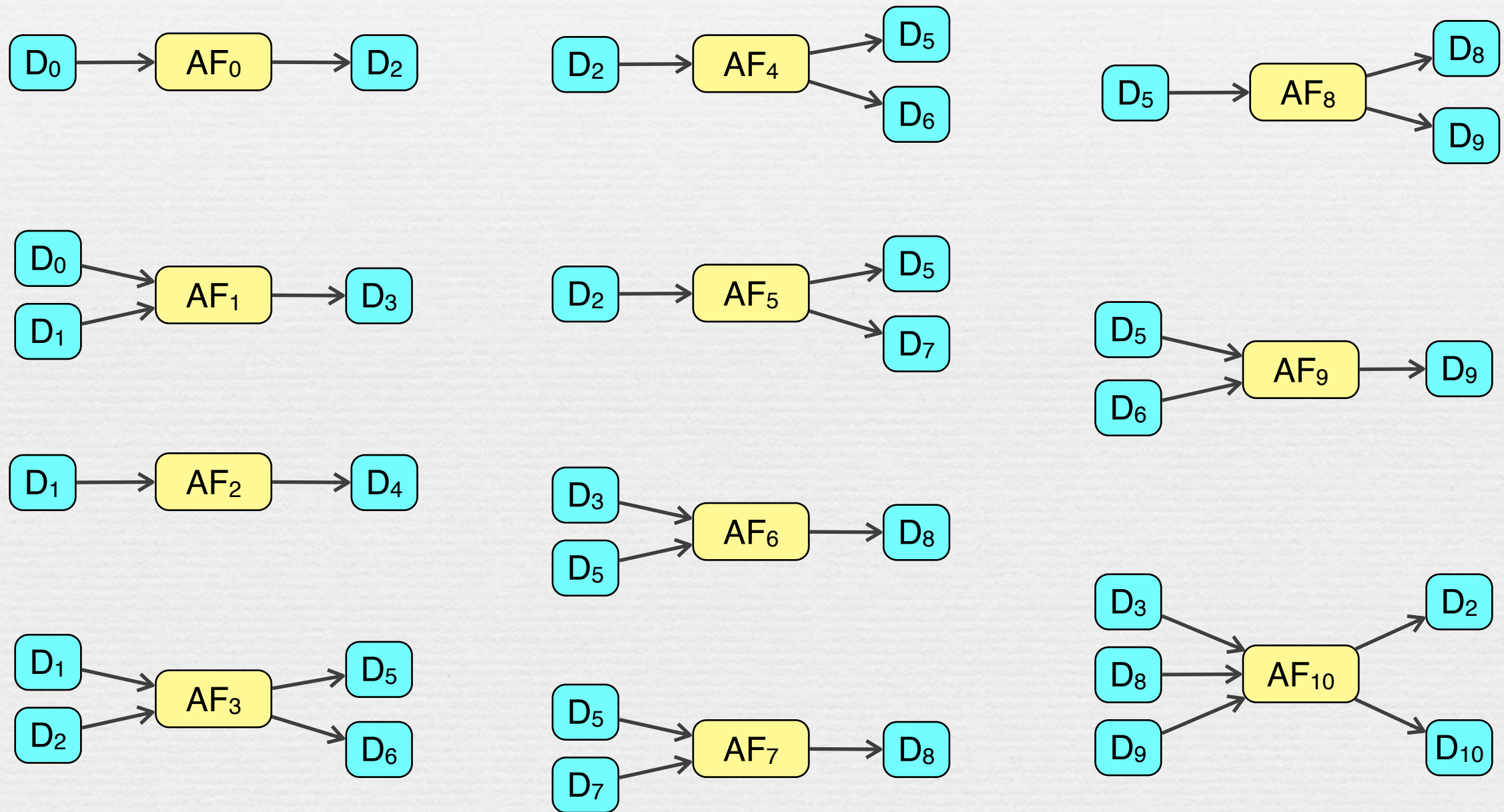


## ☛ Activity Functions (AF)





# A Simulated Domain



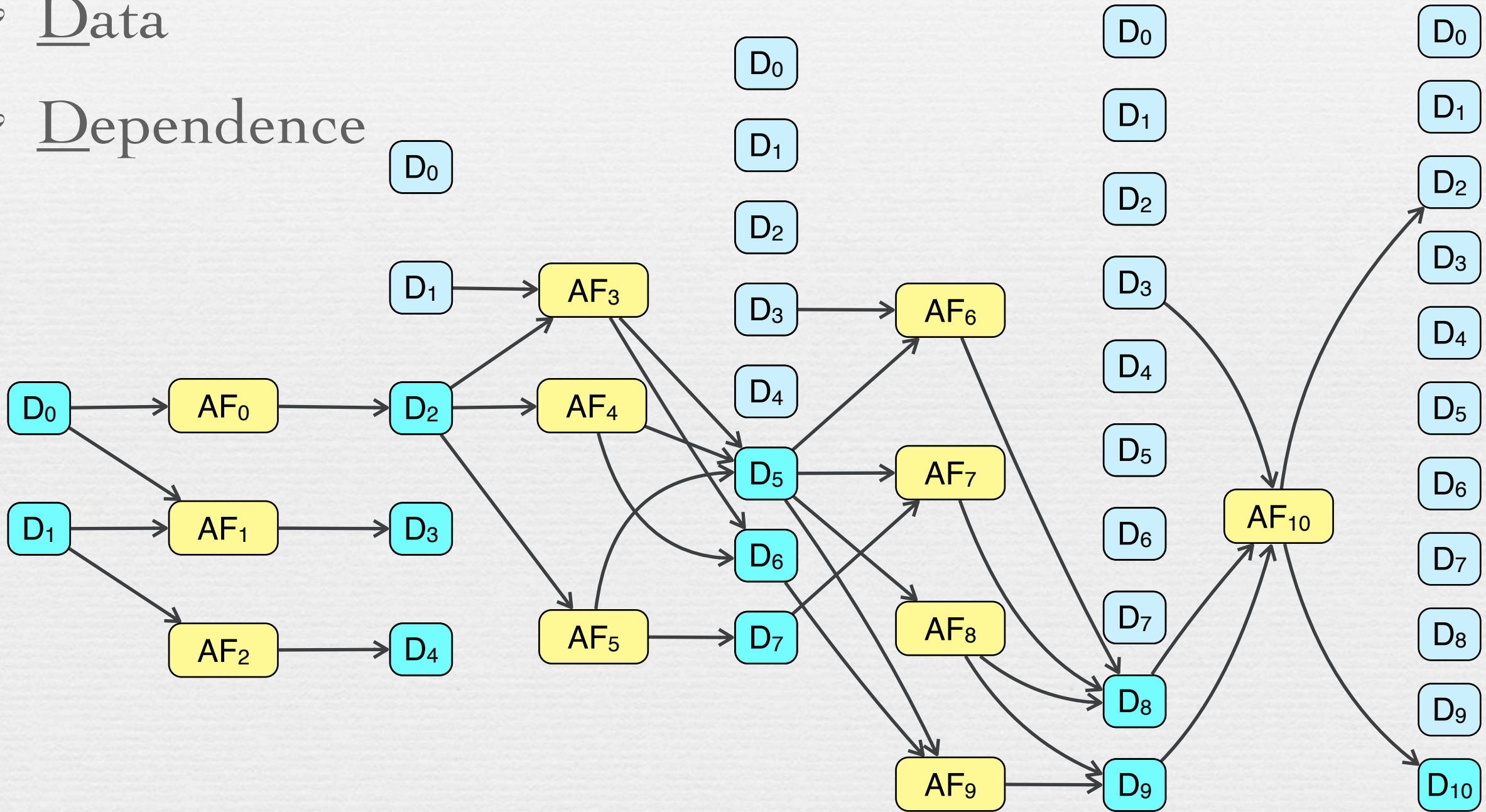


# ADD Graph

Activity Function

Data

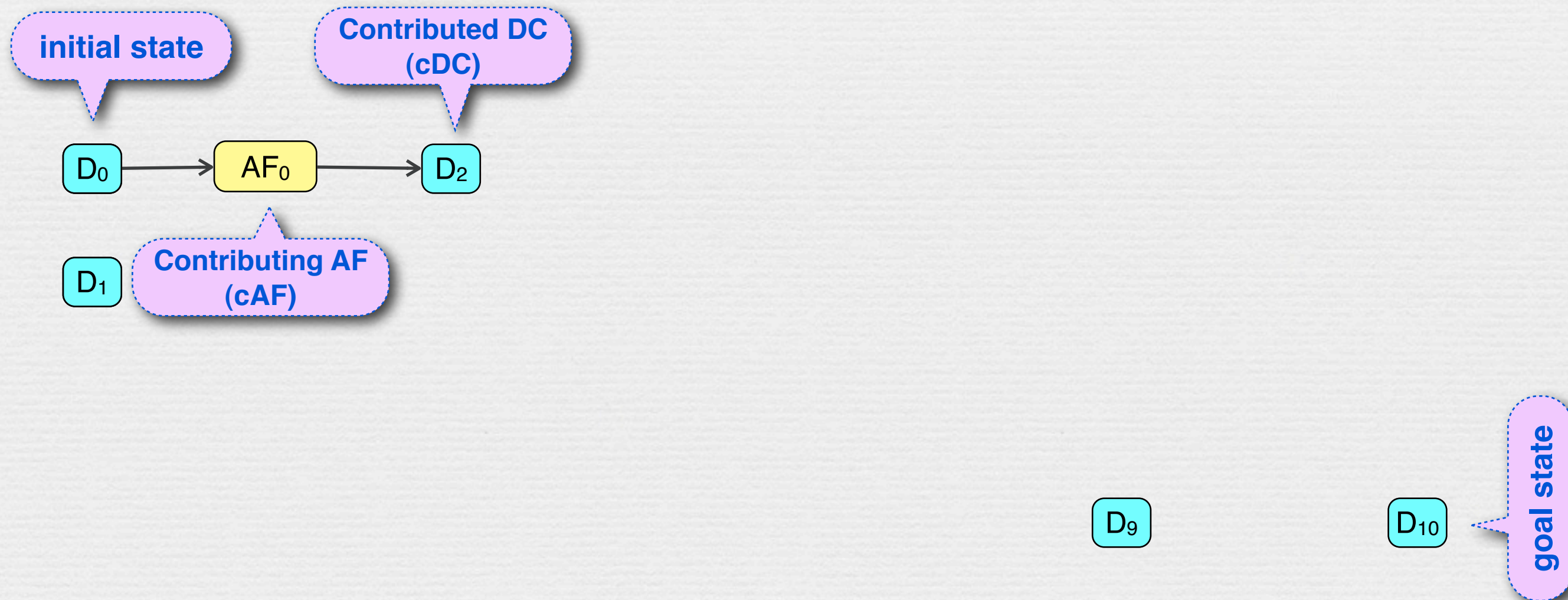
Dependence



# ADD Graph Creation

$S_{init} = \{D_0, D_1\}$

$S_{goal} = \{D_9, D_{10}\}$

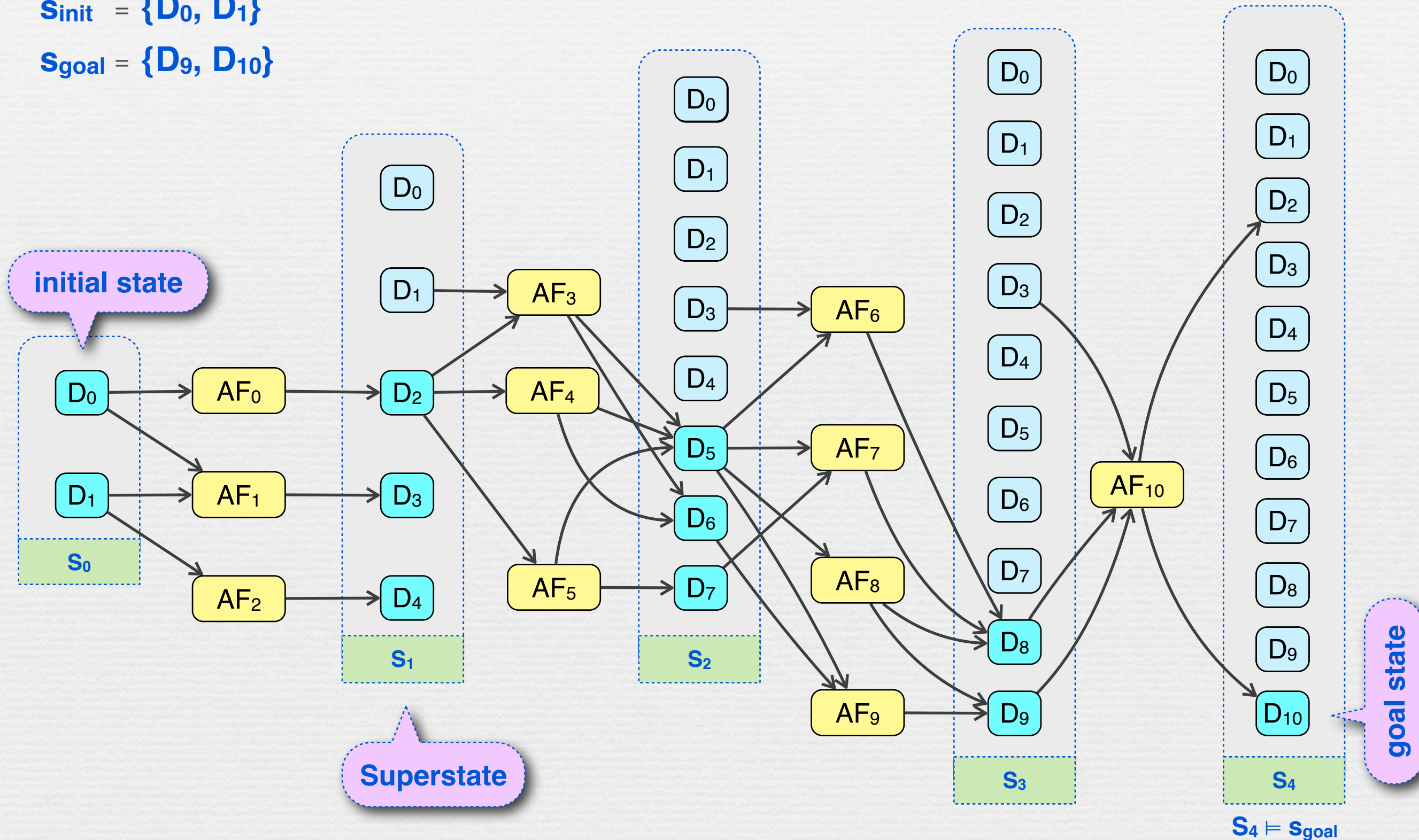




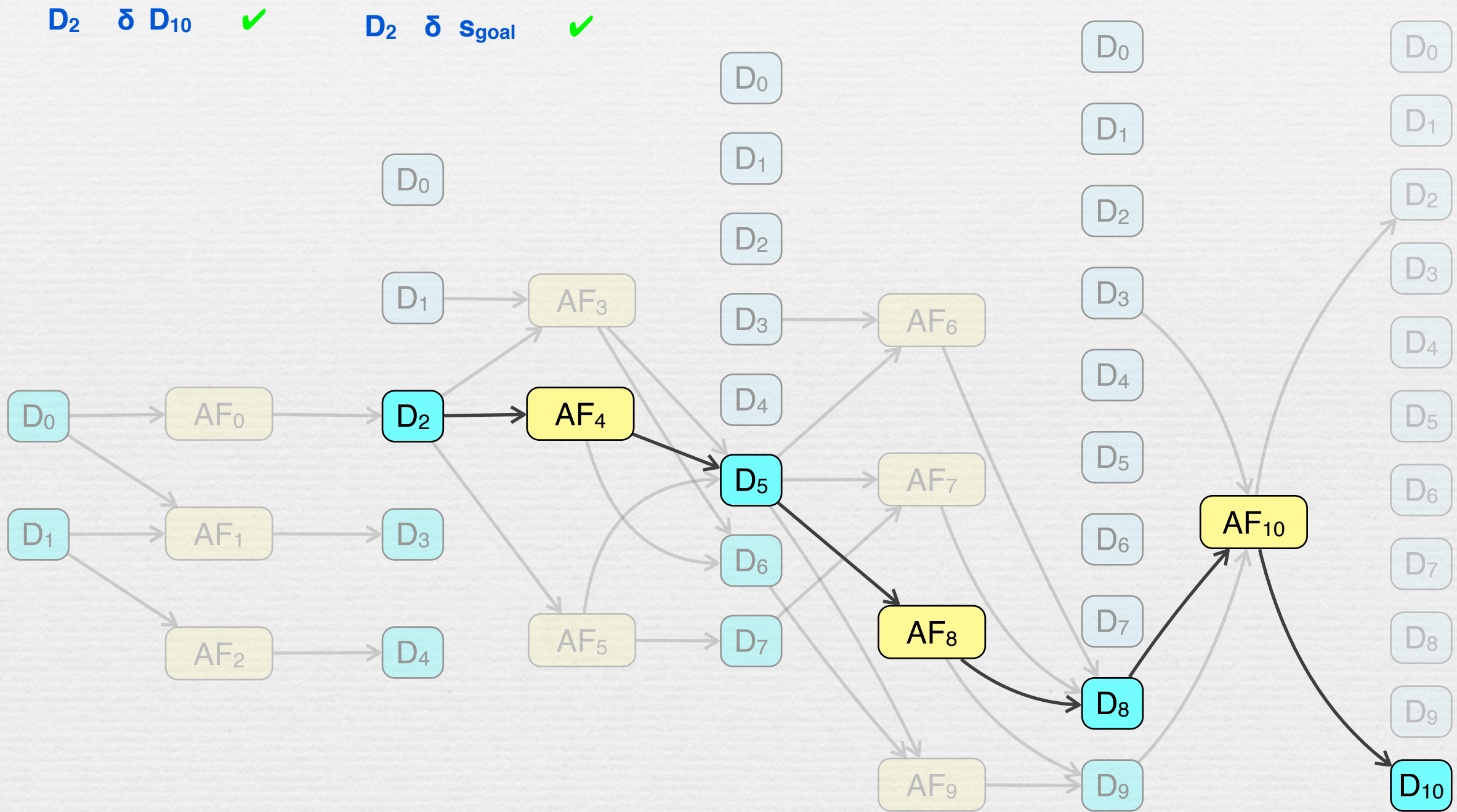
# ADD Graph Creation

$S_{init} = \{D_0, D_1\}$

$S_{goal} = \{D_9, D_{10}\}$



# Notation: dependence



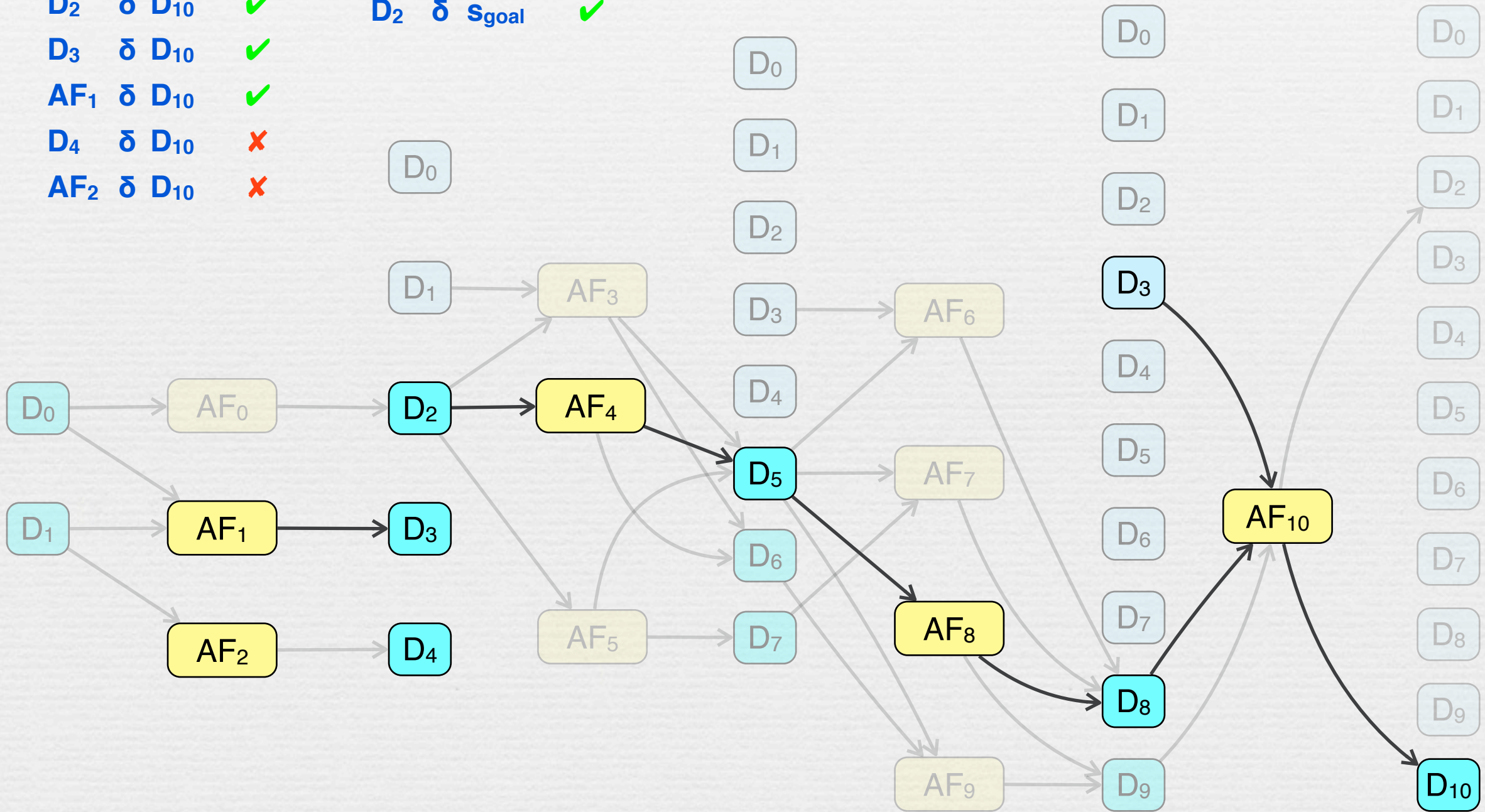
Dependence:  $N_i \delta N_j$



# Notation: dependence

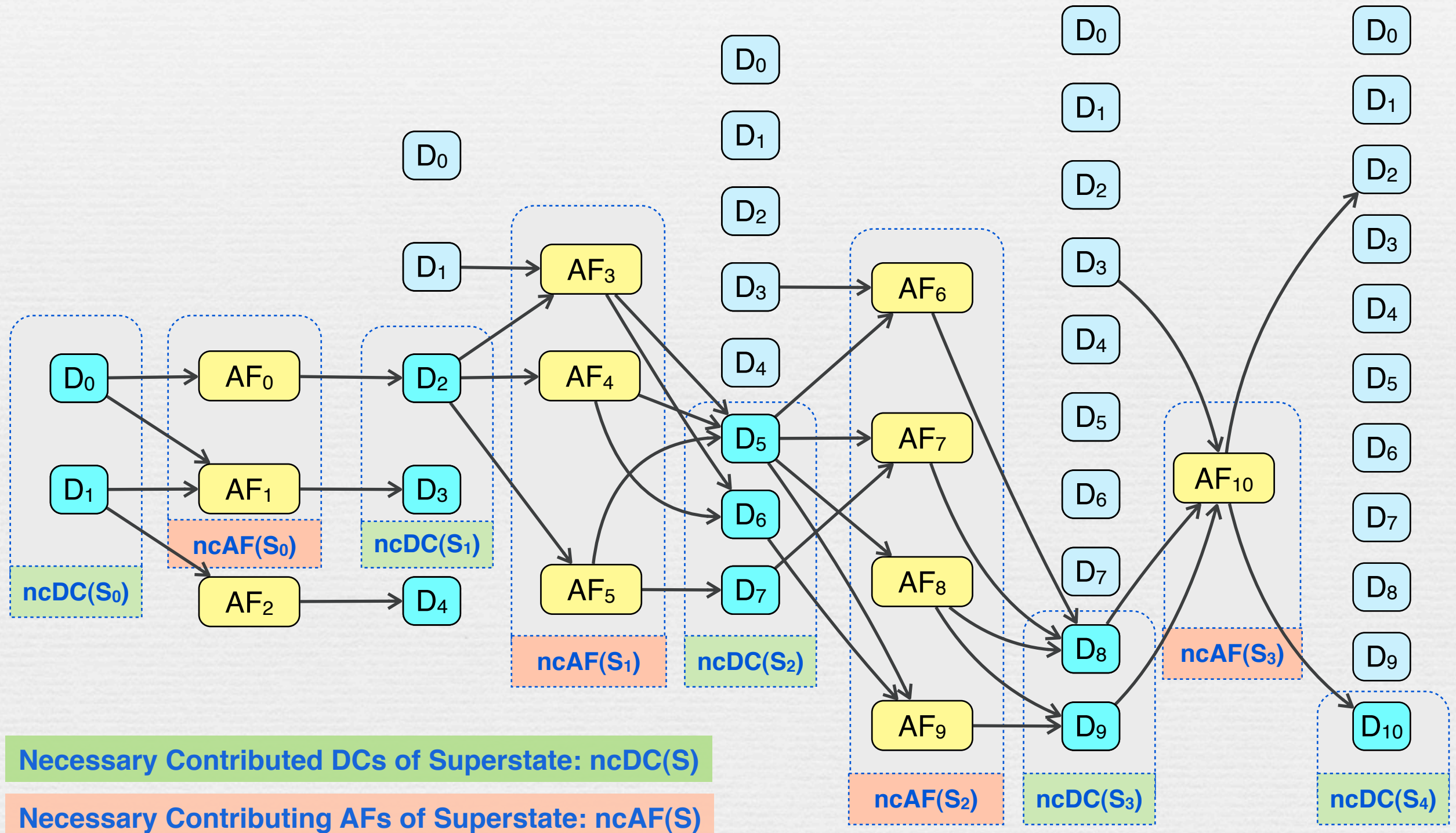
$D_2 \delta D_{10}$  ✓  
 $D_3 \delta D_{10}$  ✓  
 $AF_1 \delta D_{10}$  ✓  
 $D_4 \delta D_{10}$  ✗  
 $AF_2 \delta D_{10}$  ✗

$D_2 \delta S_{goal}$  ✓



Dependence:  $N_i \delta N_j$

# Notation: $ncDC(S)$ , $ncAF(S)$





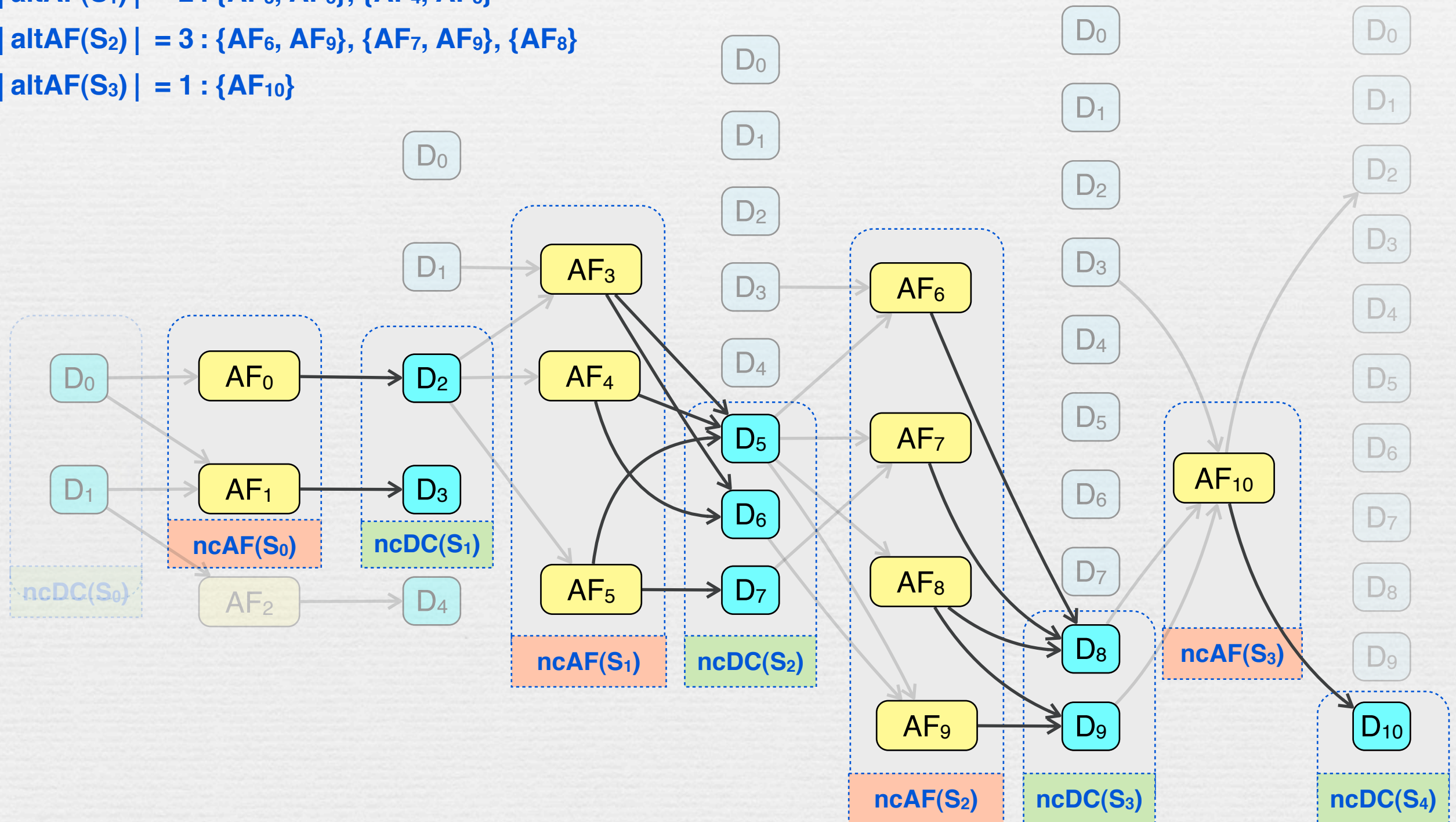
# Notation: $\text{altAF}(S)$

$|\text{altAF}(S_0)| = 1 : \{AF_0, AF_1\}$

$|\text{altAF}(S_1)| = 2 : \{AF_3, AF_5\}, \{AF_4, AF_5\}$

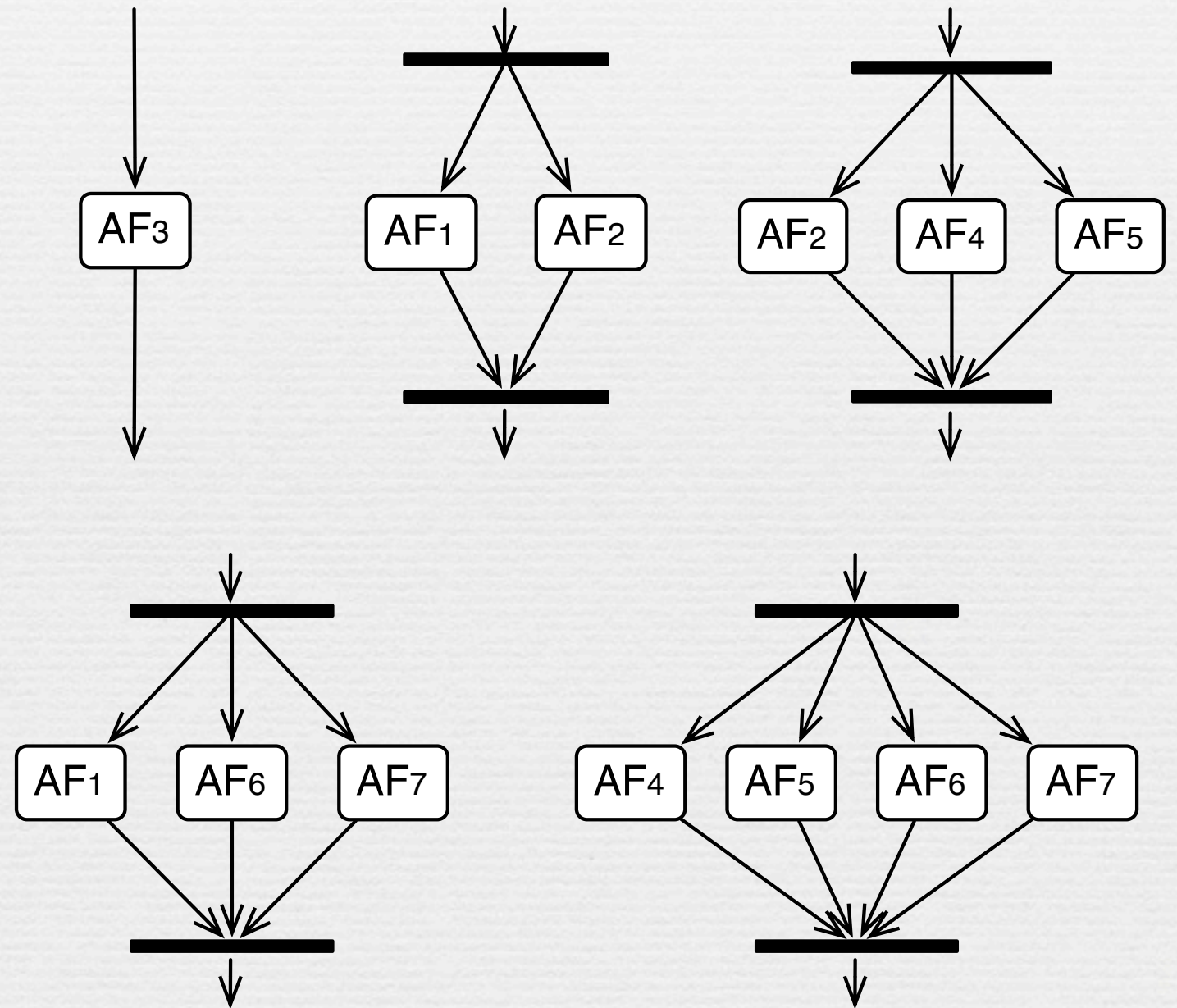
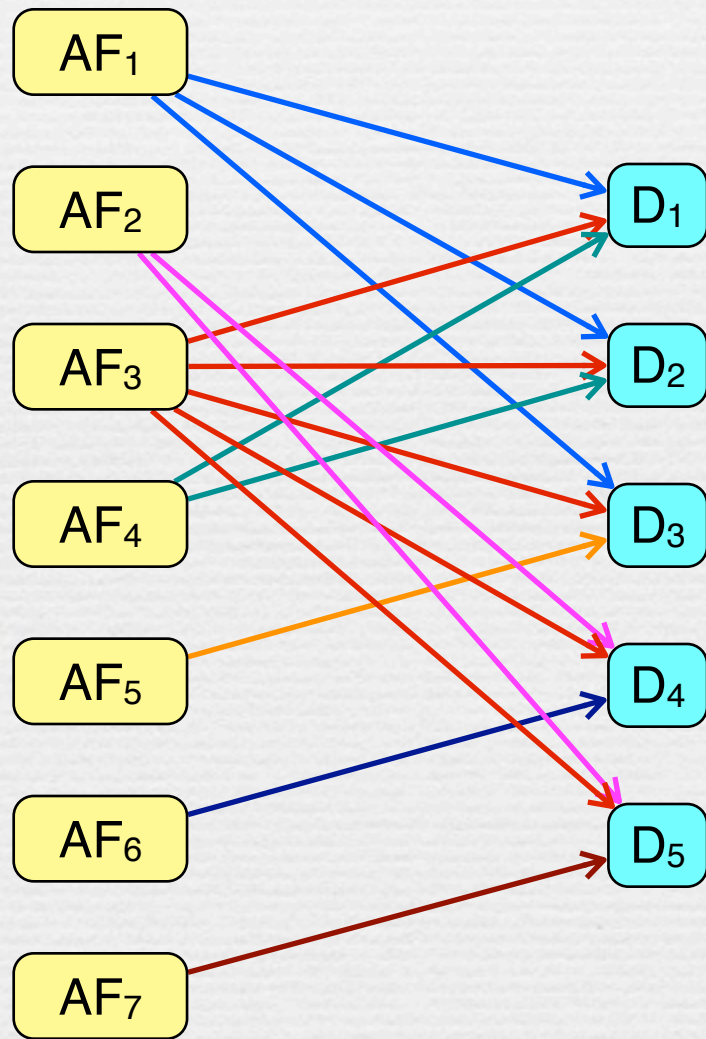
$|\text{altAF}(S_2)| = 3 : \{AF_6, AF_9\}, \{AF_7, AF_9\}, \{AF_8\}$

$|\text{altAF}(S_3)| = 1 : \{AF_{10}\}$



Alternative AF Combination of Superstate:  $\text{altAF}(S)$

# Calculation of altAF(S)



$|\text{altAF}(S)| = 5 : \{AF_3\}, \{AF_1, AF_2\}, \{AF_2, AF_4, AF_5\}, \{AF_1, AF_6, AF_7\}, \{AF_4, AF_5, AF_6, AF_7\}$



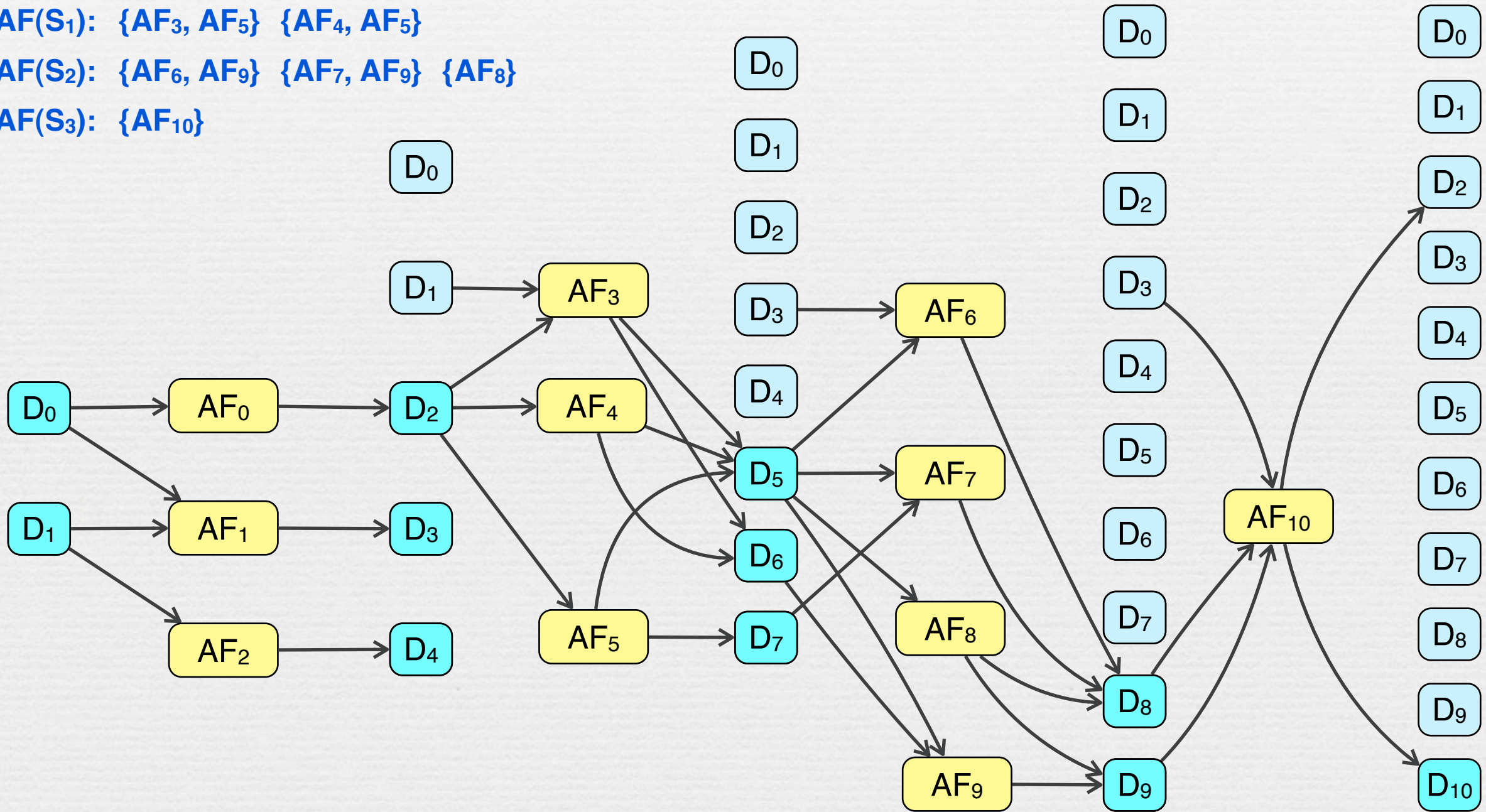
# Workflow Extraction

altAF(S<sub>0</sub>): {AF<sub>0</sub>, AF<sub>1</sub>}

altAF(S<sub>1</sub>): {AF<sub>3</sub>, AF<sub>5</sub>} {AF<sub>4</sub>, AF<sub>5</sub>}

altAF(S<sub>2</sub>): {AF<sub>6</sub>, AF<sub>9</sub>} {AF<sub>7</sub>, AF<sub>9</sub>} {AF<sub>8</sub>}

altAF(S<sub>3</sub>): {AF<sub>10</sub>}



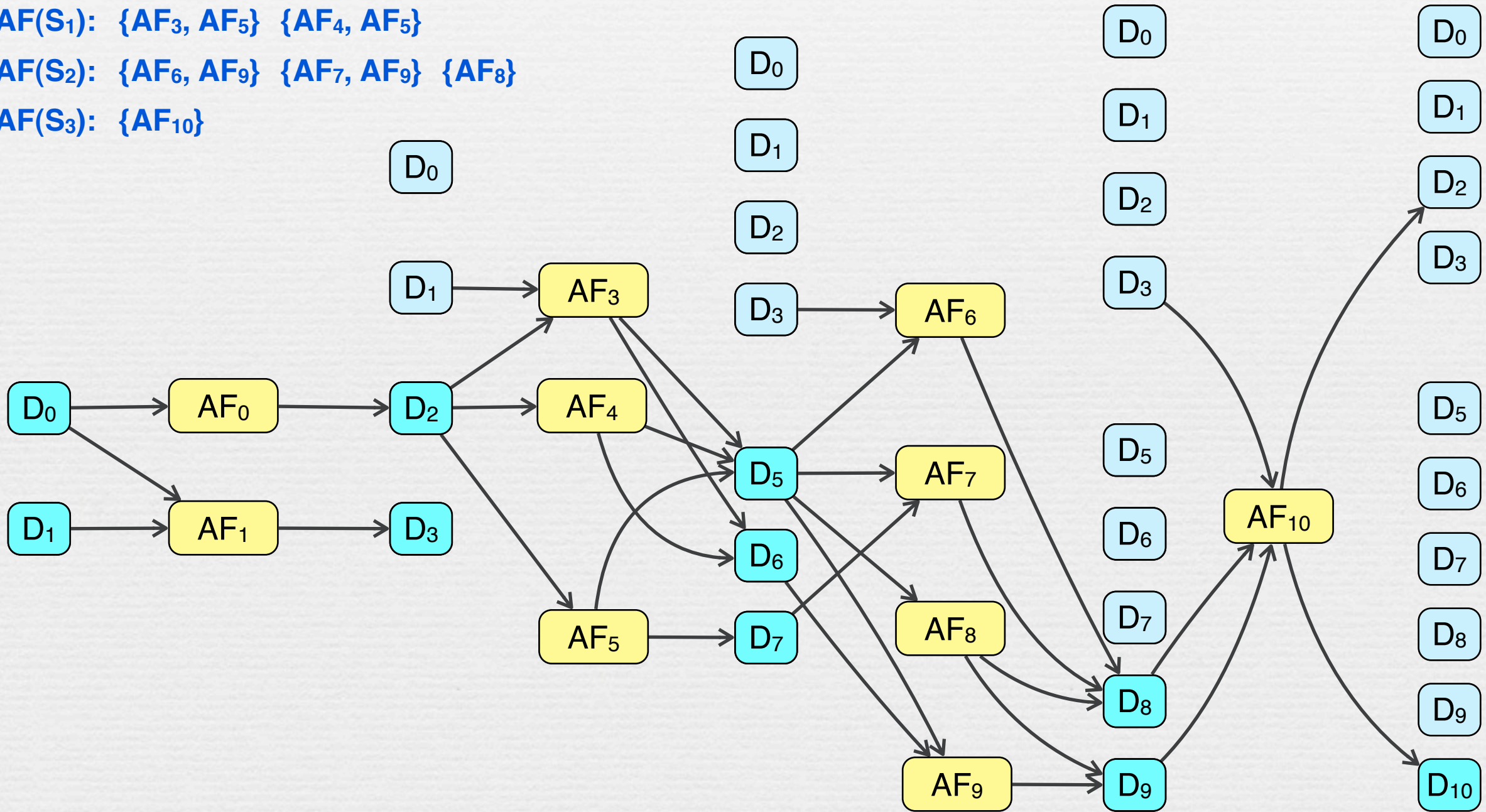
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altAF(S<sub>3</sub>): {AF<sub>10</sub>}





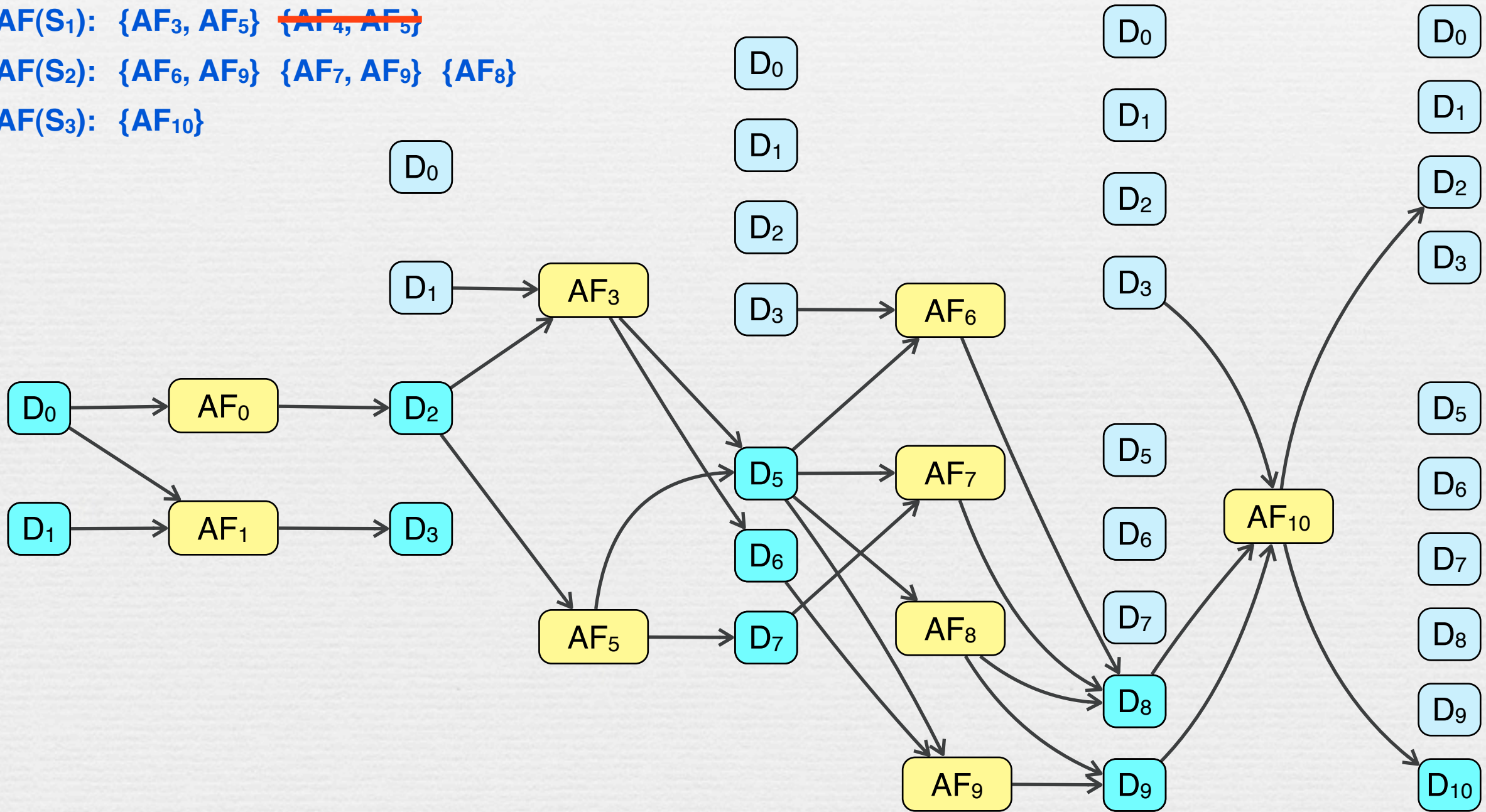
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altAF(S<sub>2</sub>): {AF<sub>6</sub>, AF<sub>9</sub>} {AF<sub>7</sub>, AF<sub>9</sub>} {AF<sub>8</sub>}

altAF(S<sub>3</sub>): {AF<sub>10</sub>}



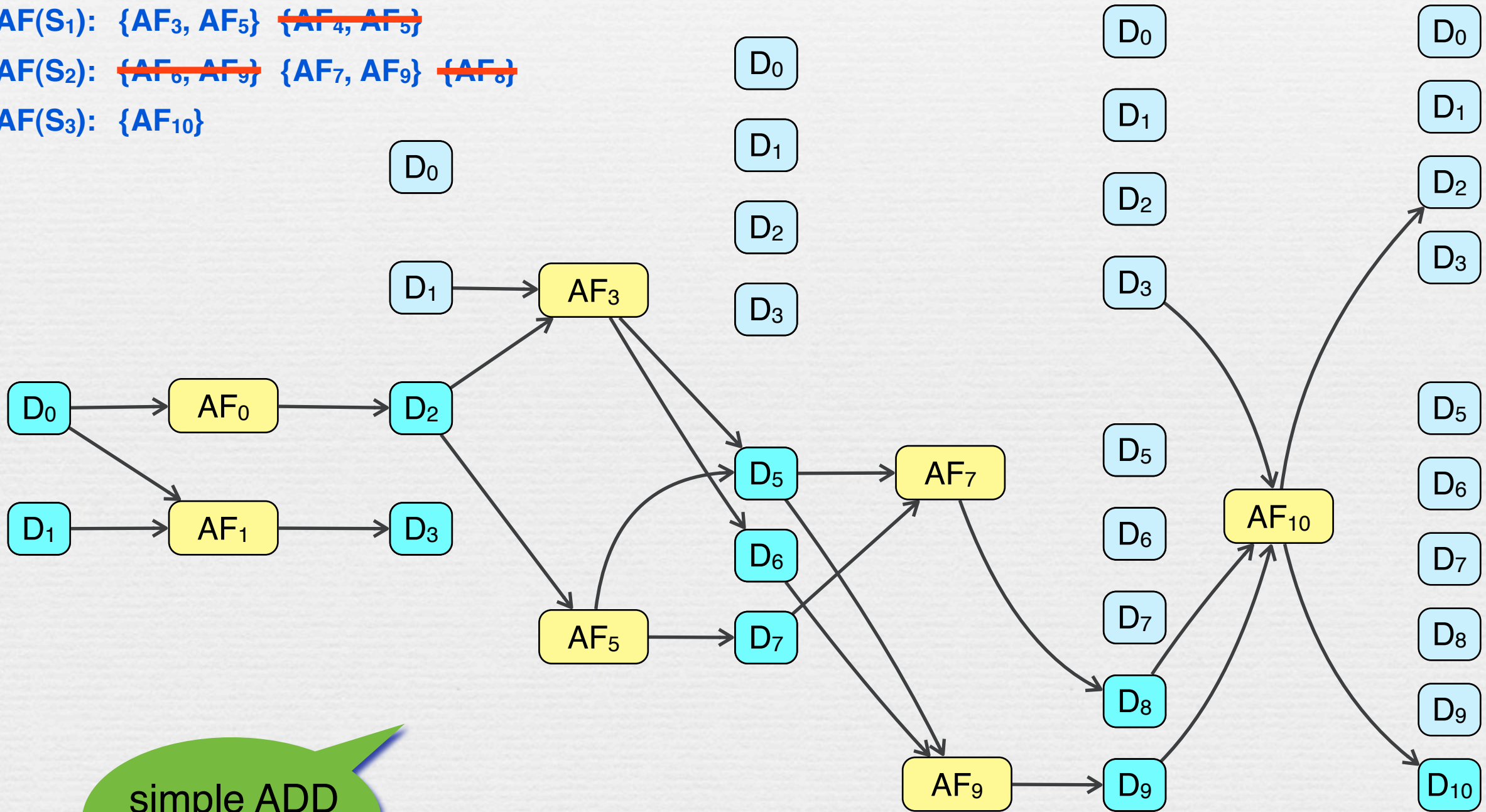
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altAF(S<sub>2</sub>): ~~{AF<sub>6</sub>, AF<sub>9</sub>}~~ {AF<sub>7</sub>, AF<sub>9</sub>} ~~{AF<sub>8</sub>}~~

altAF(S<sub>3</sub>): {AF<sub>10</sub>}



simple ADD  
Graph

- (1) for all  $i \in [0, n)$ :  $|\text{altAF}(S_i)| = 1$
- (2) all AFs/DCs are necessary



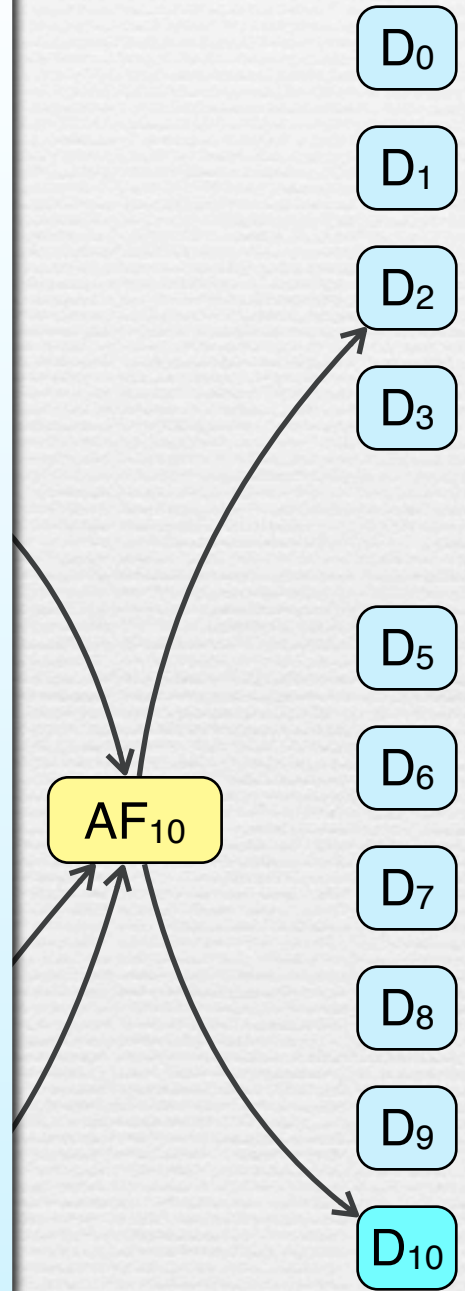
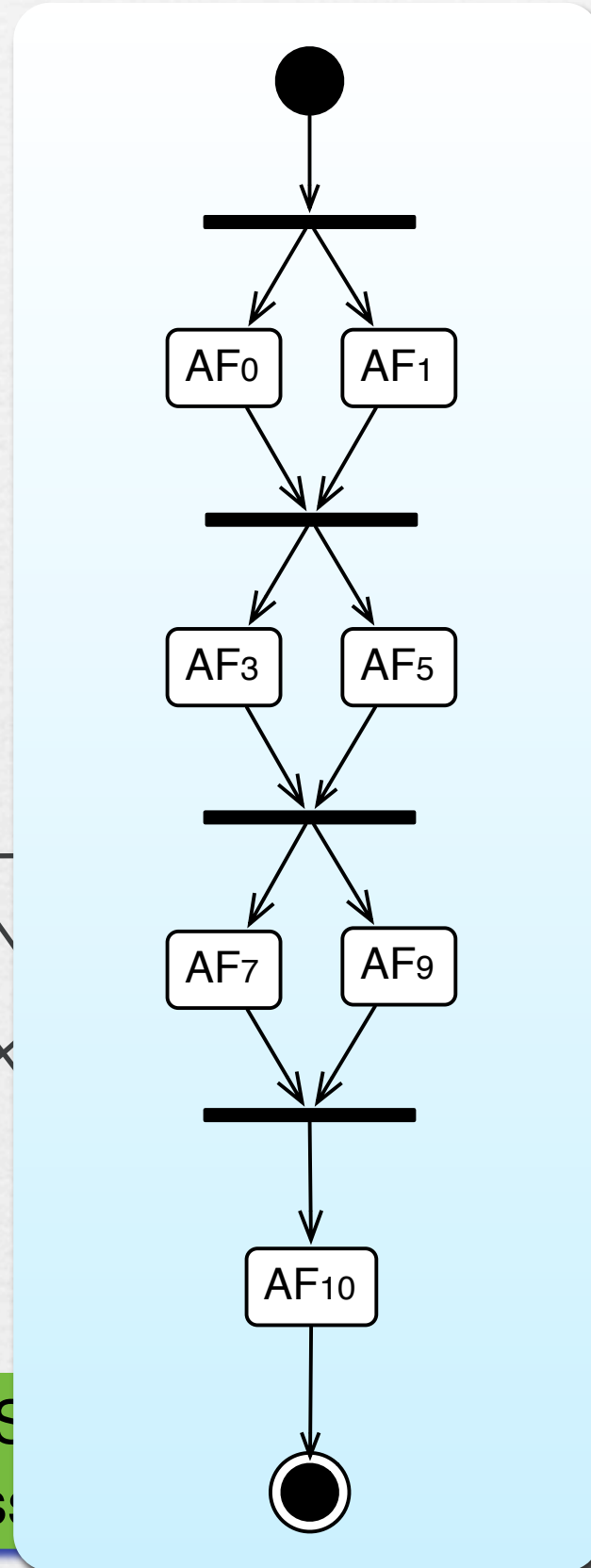
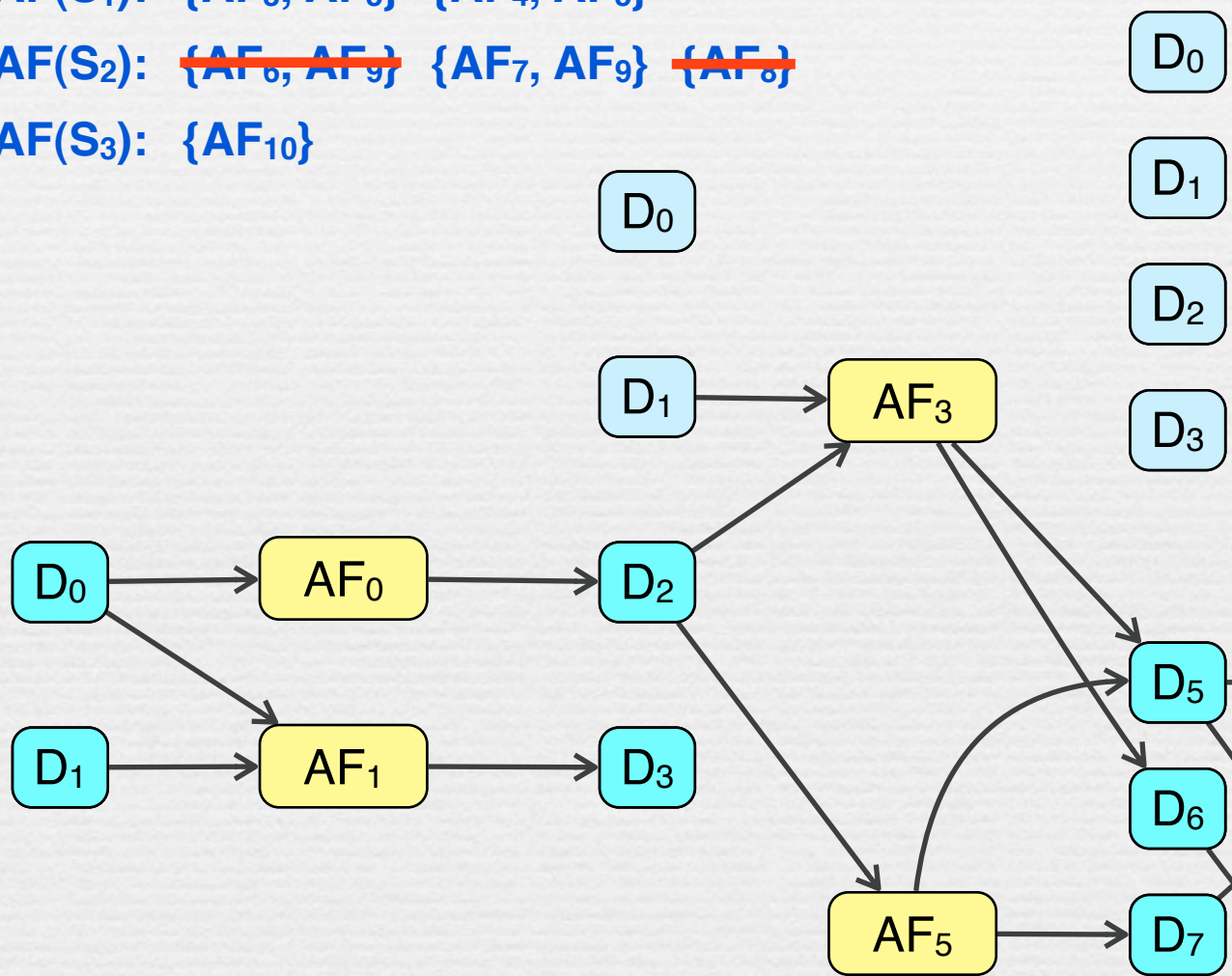
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altAF(S<sub>0</sub>): {AF<sub>0</sub>, AF<sub>1</sub>}

altAF(S<sub>1</sub>): {AF<sub>3</sub>, AF<sub>5</sub>} ~~{AF<sub>4</sub>, AF<sub>5</sub>}~~

altAF(S<sub>2</sub>): ~~{AF<sub>6</sub>, AF<sub>9</sub>}~~ {AF<sub>7</sub>, AF<sub>9</sub>} ~~{AF<sub>8</sub>}~~

altAF(S<sub>3</sub>): {AF<sub>10</sub>}



simple ADD Graph

- (1) for all  $i \in [0, n)$ : | altAF(S<sub>i</sub>)
- (2) all AFs/DCs are neces

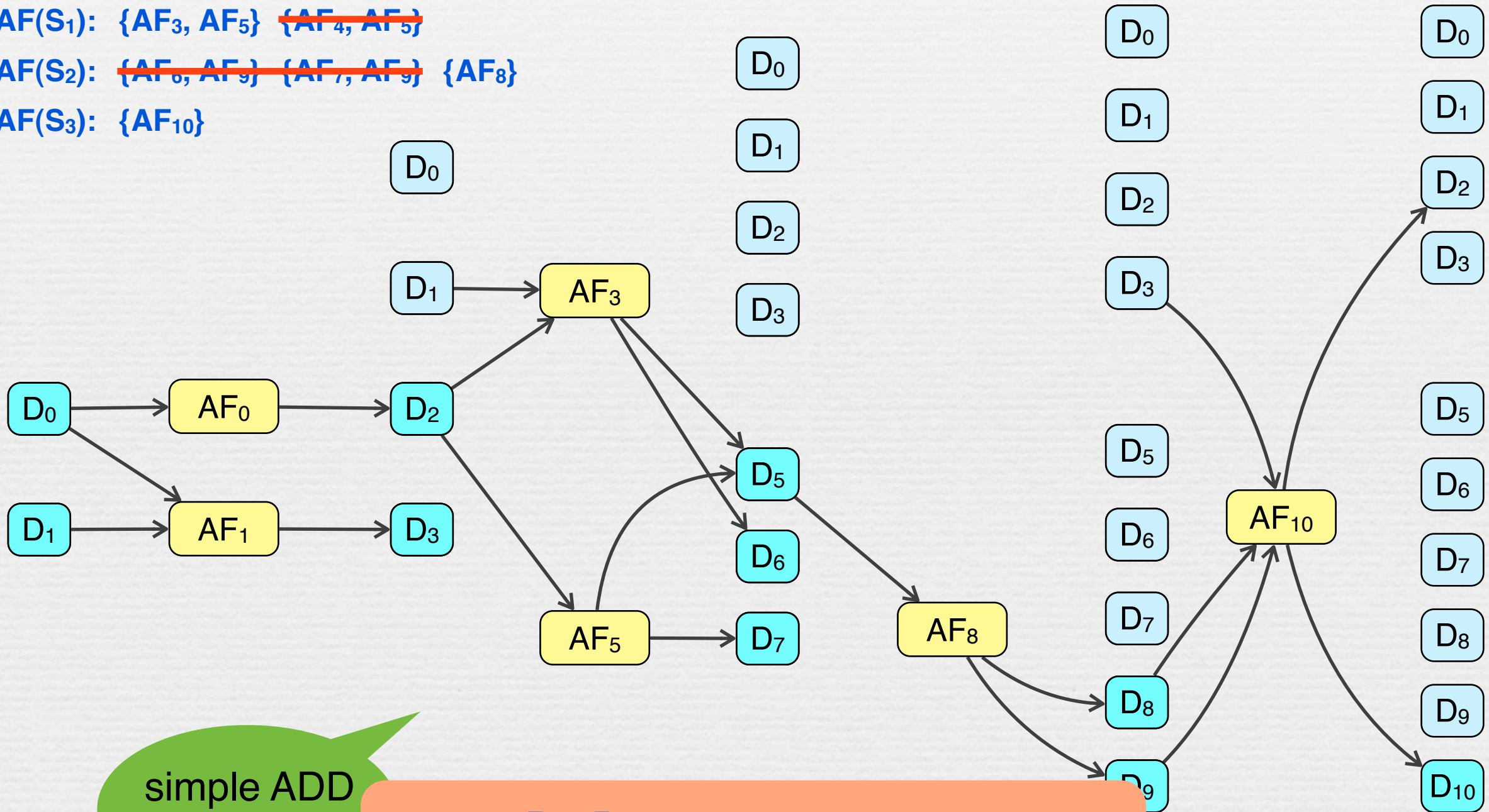
# Workflow Extraction

altAF(S<sub>0</sub>): {AF<sub>0</sub>, AF<sub>1</sub>}

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altAF(S<sub>3</sub>): {AF<sub>10</sub>}



simple ADD  
Graph??

not yet: D<sub>6</sub>, D<sub>7</sub> are not necessary



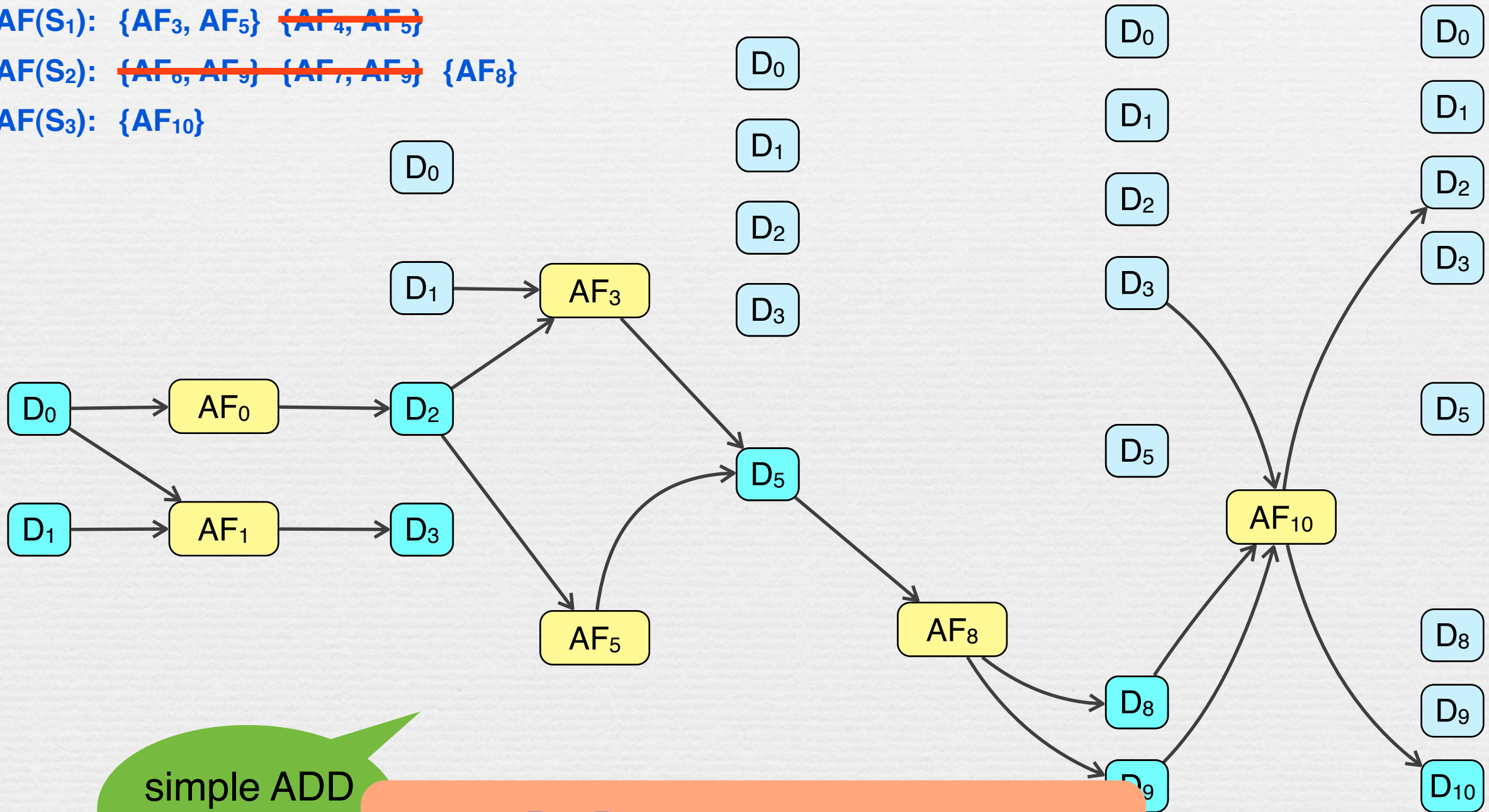
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altAF(S<sub>3</sub>): {AF<sub>10</sub>}



simple ADD  
Graph??

not yet: D<sub>6</sub>, D<sub>7</sub> are not necessary

not yet: |altAF(S<sub>1</sub>)| = 2: {AF<sub>3</sub>}, {AF<sub>5</sub>}

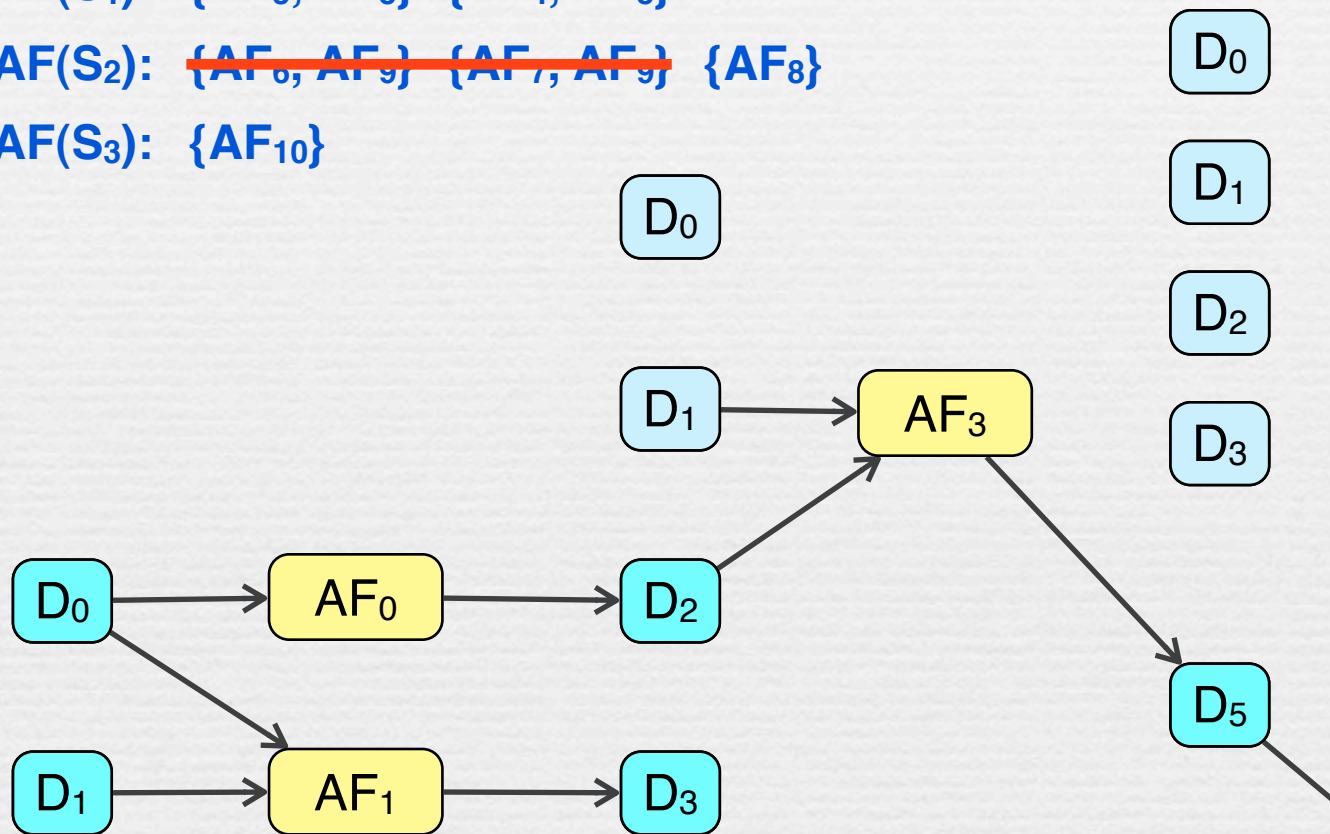
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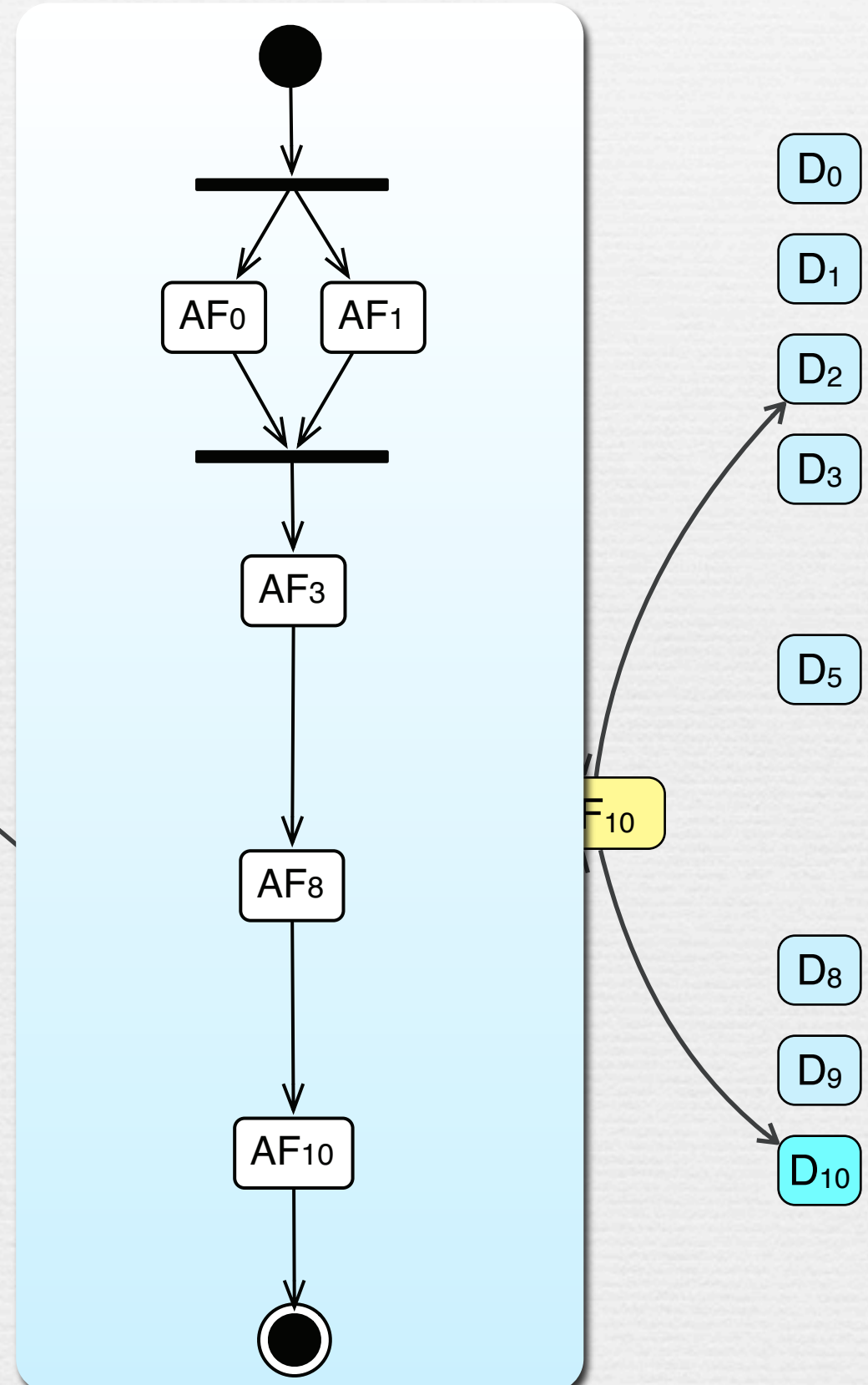
altAF(S<sub>2</sub>): ~~{AF<sub>6</sub>, AF<sub>9</sub>}~~ ~~{AF<sub>7</sub>, AF<sub>9</sub>}~~ {AF<sub>8</sub>}

altAF(S<sub>3</sub>): {AF<sub>10</sub>}



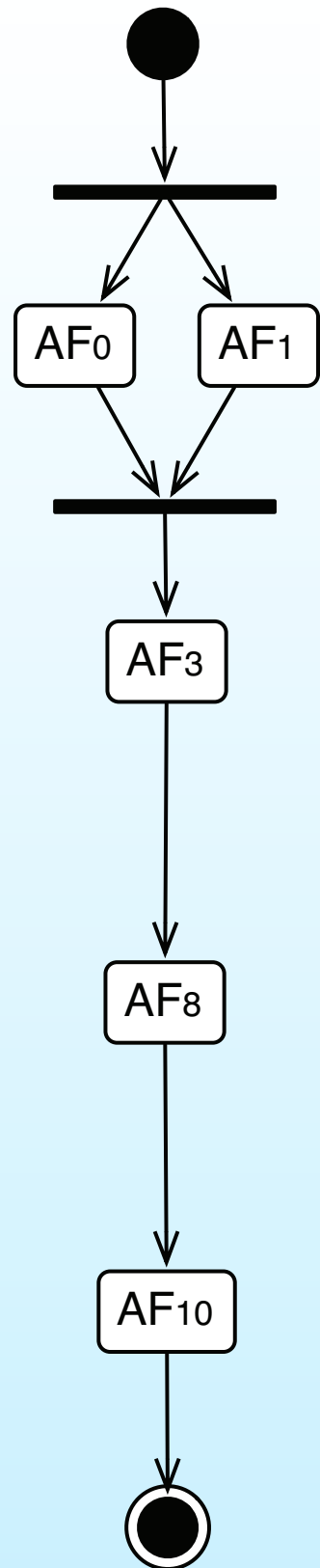
simple ADD  
Graph

**now yes.**





# Workflow Extraction



~~AF5~~  
~~AF9~~ {AF8}

D0

D1

D2

D3

ow yes.

D0

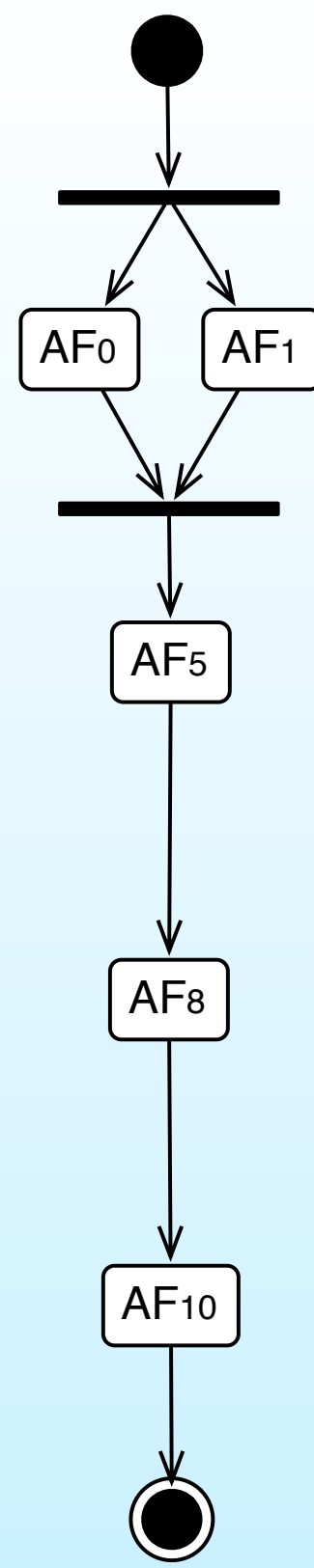
D1

D2

D3

D5

AF5



D0

D1

D2

D3

D5

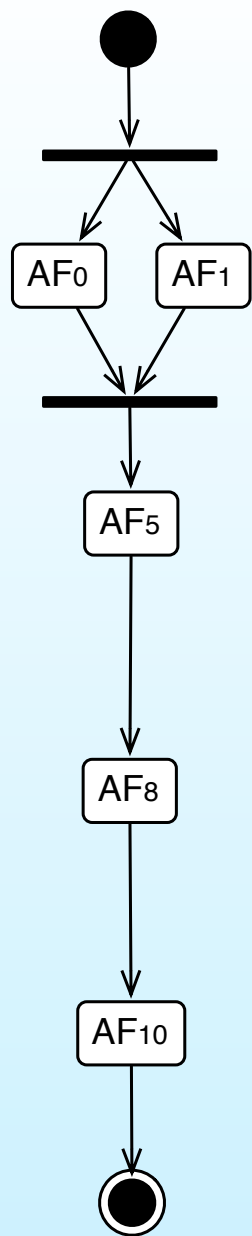
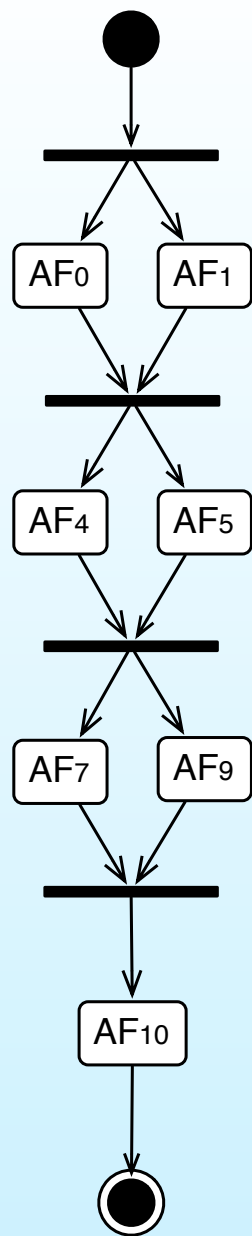
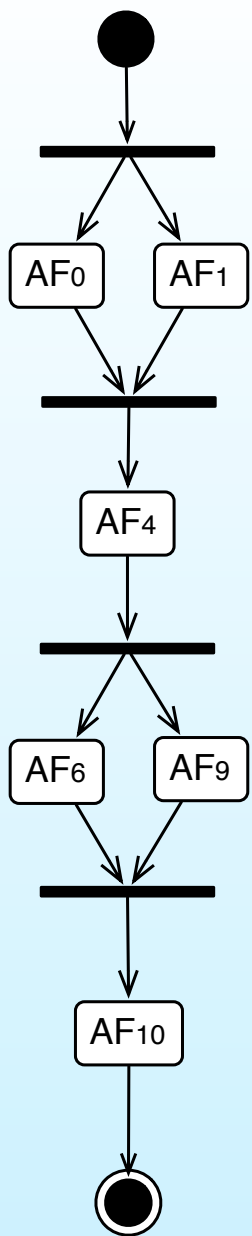
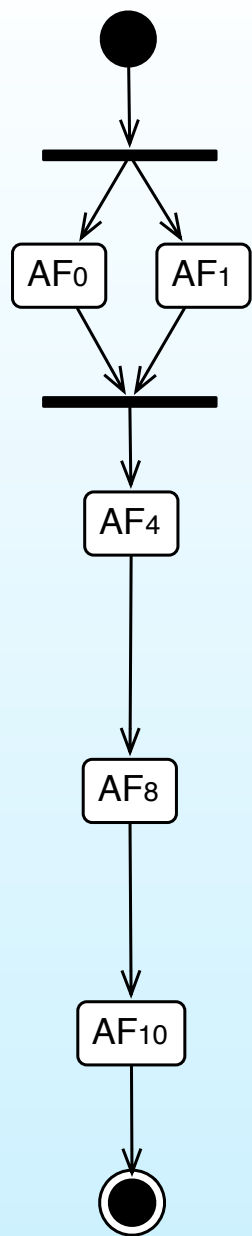
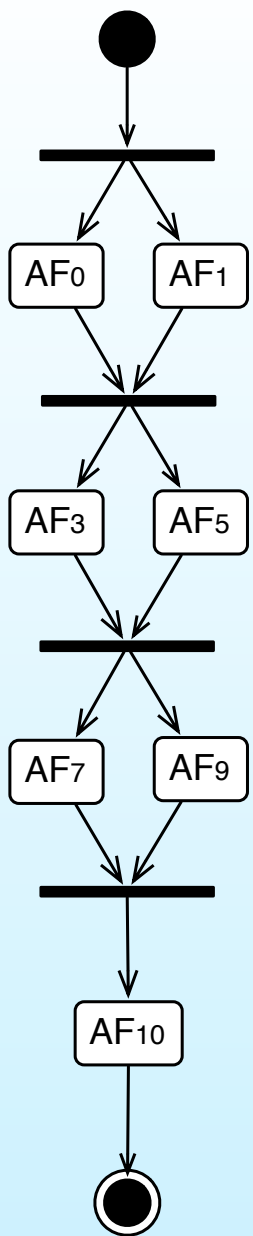
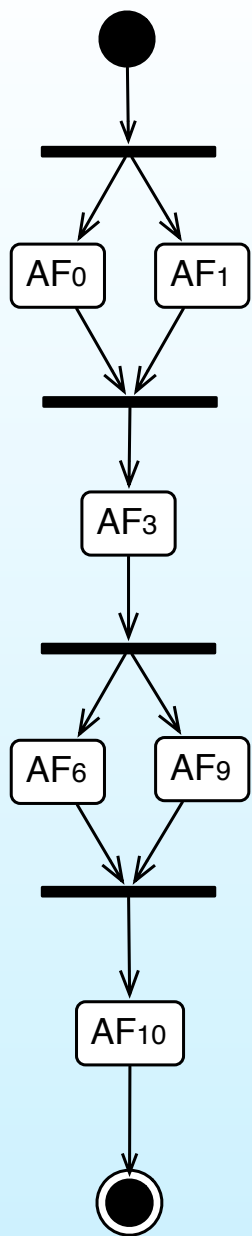
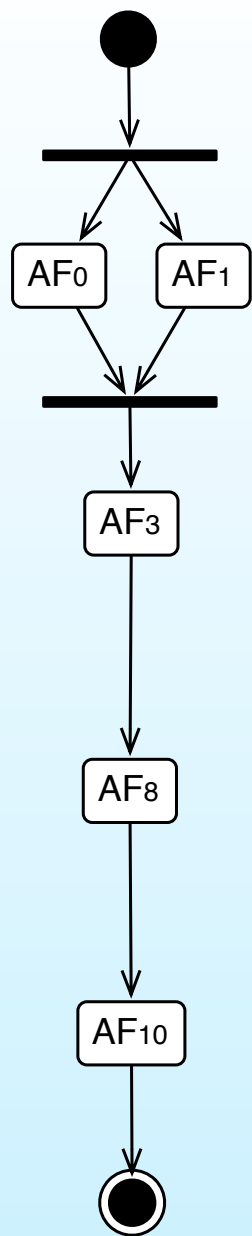
D8

D9

D10

AF10

# Workflow Extraction

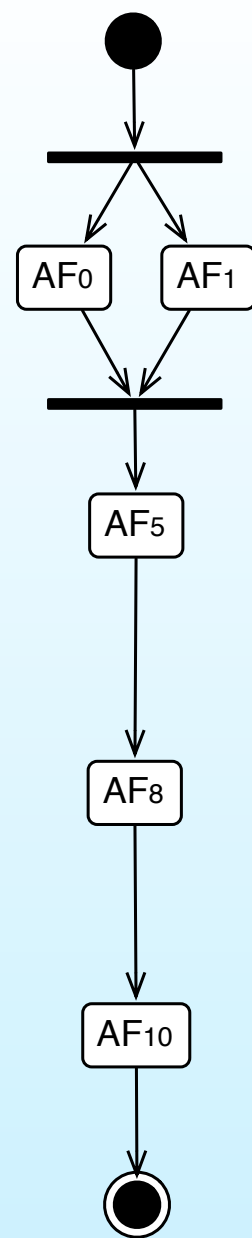
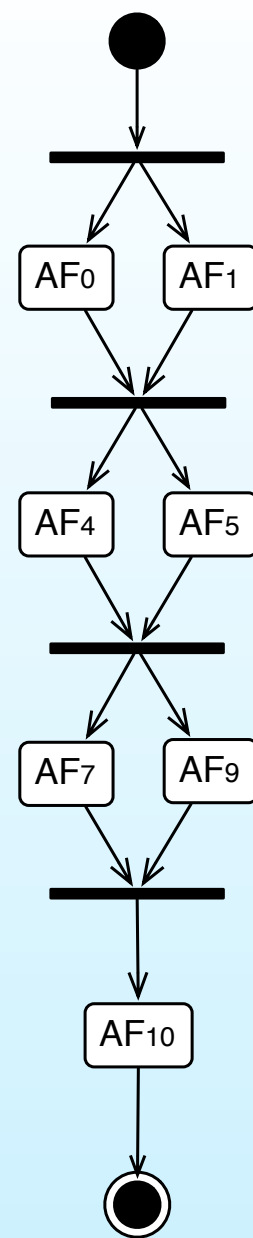
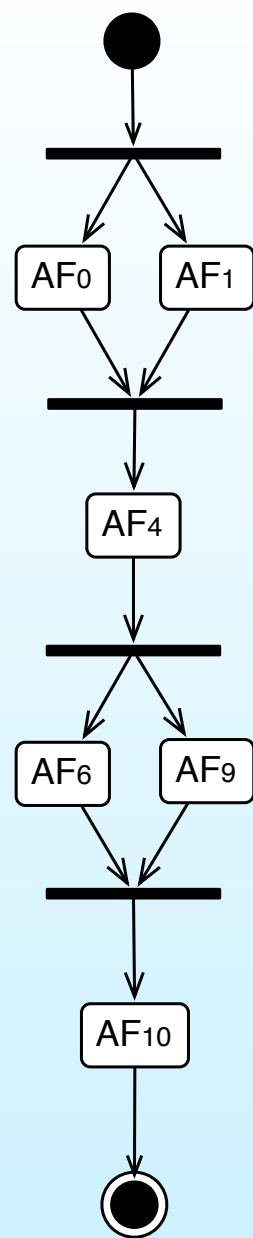
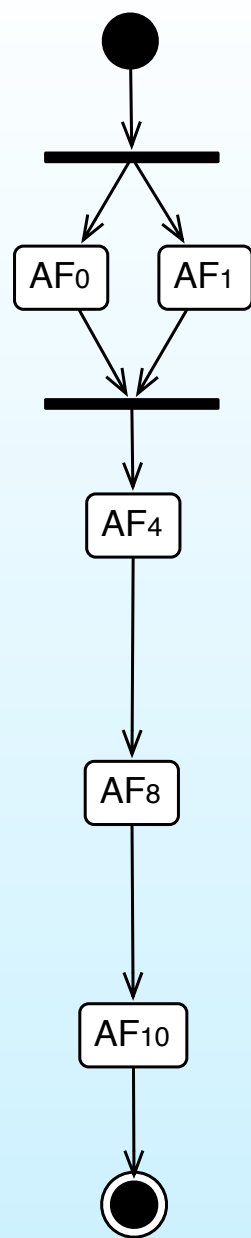
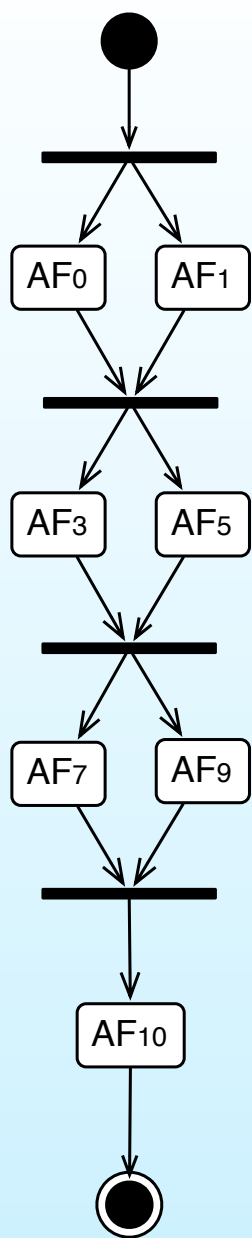
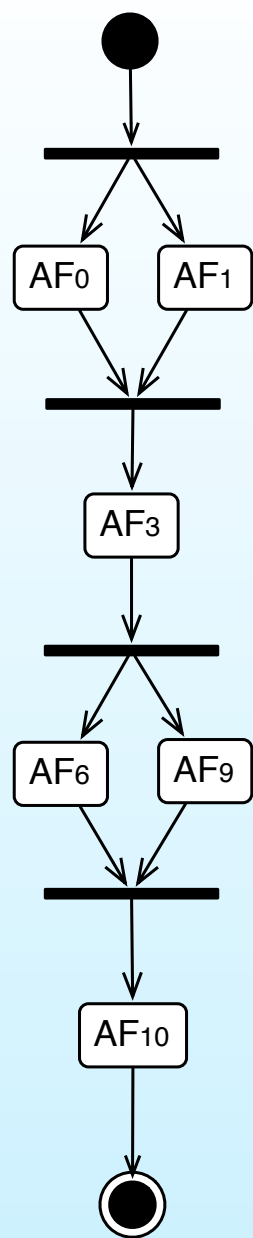
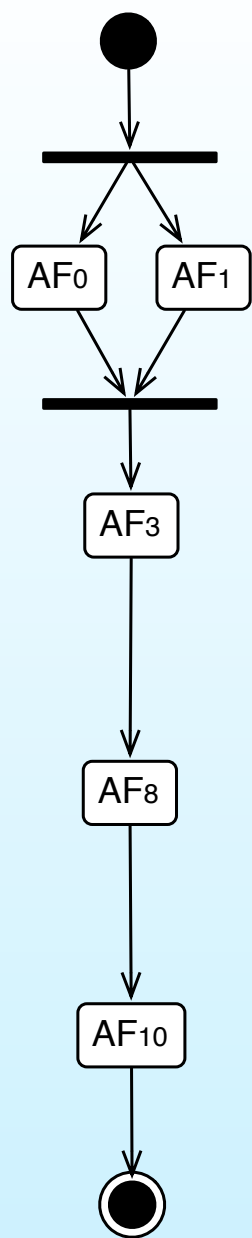




# Why Alternative Workflows

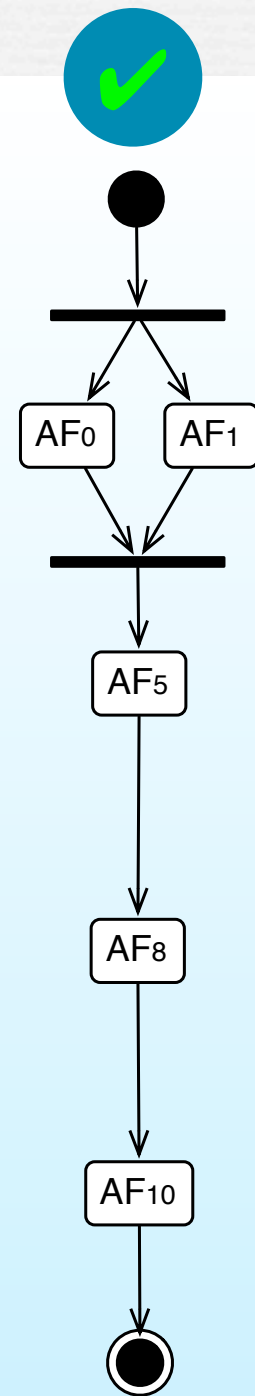
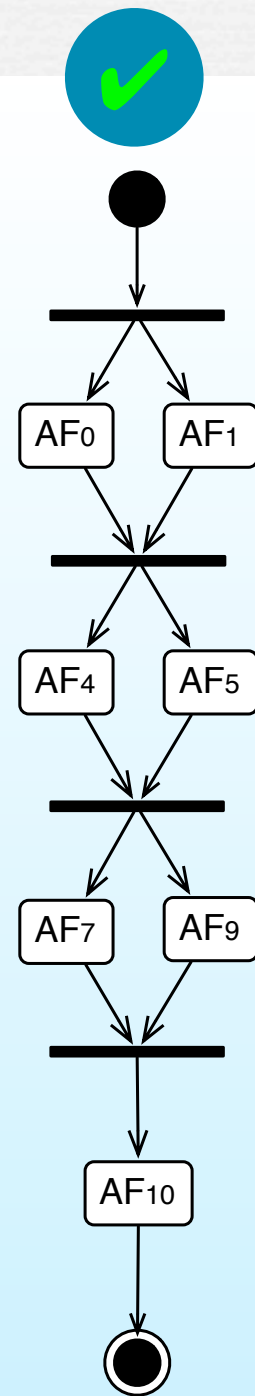
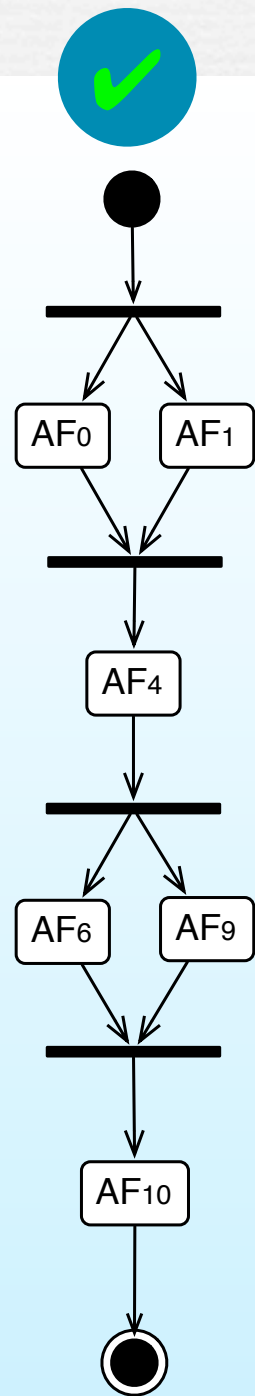
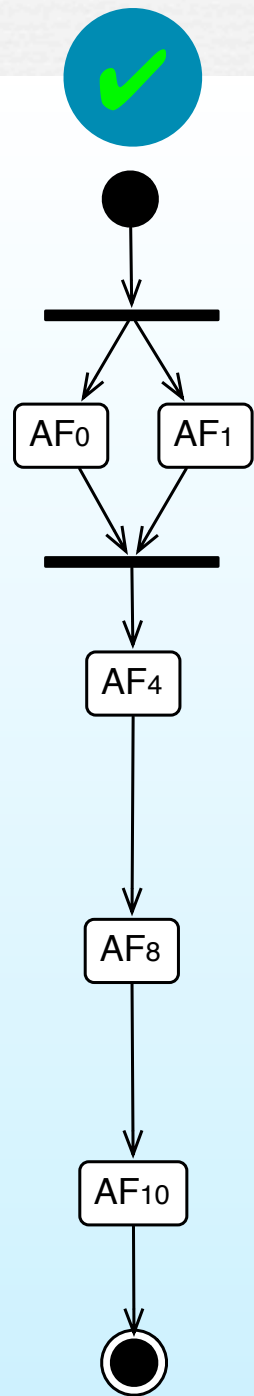
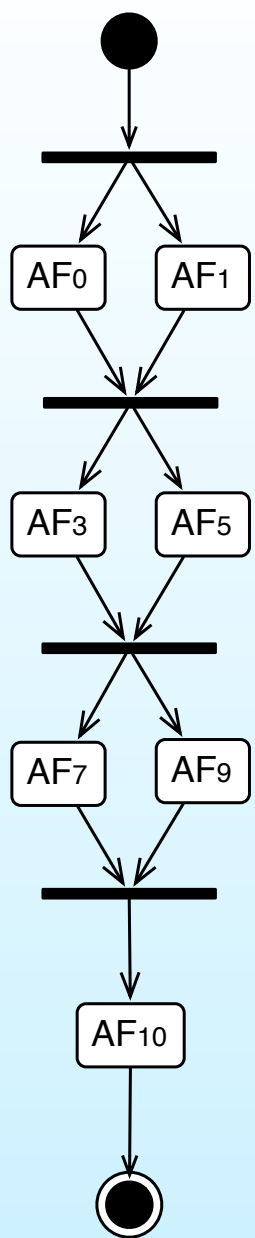
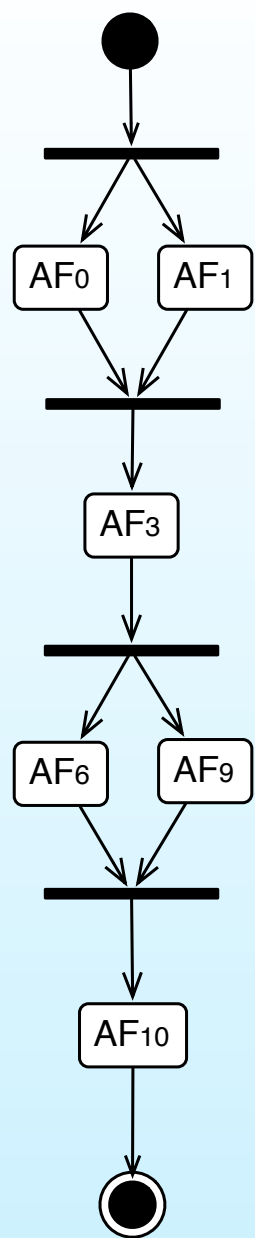
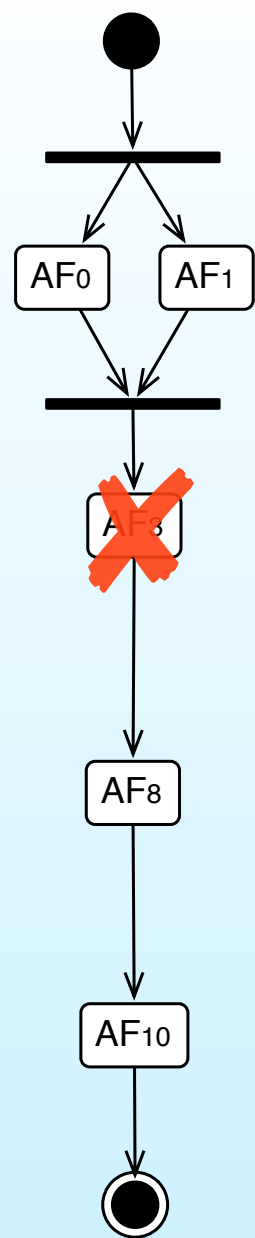
- To support fault tolerance
- Why fault tolerance?
  - services and computers of distributed systems may fail unexpectedly
  - services may be registered or unregistered at any time without intimation, may happen even during workflow execution
  - Especially important for the Grid due to its dynamic nature.
- Alternative workflows is helpful
  - service associated with alternative activities may still available
  - alternative activities may run on different computers
- Automatic generation of alternative workflows makes ASKALON very different from other systems.

# Fault Tolerance Support

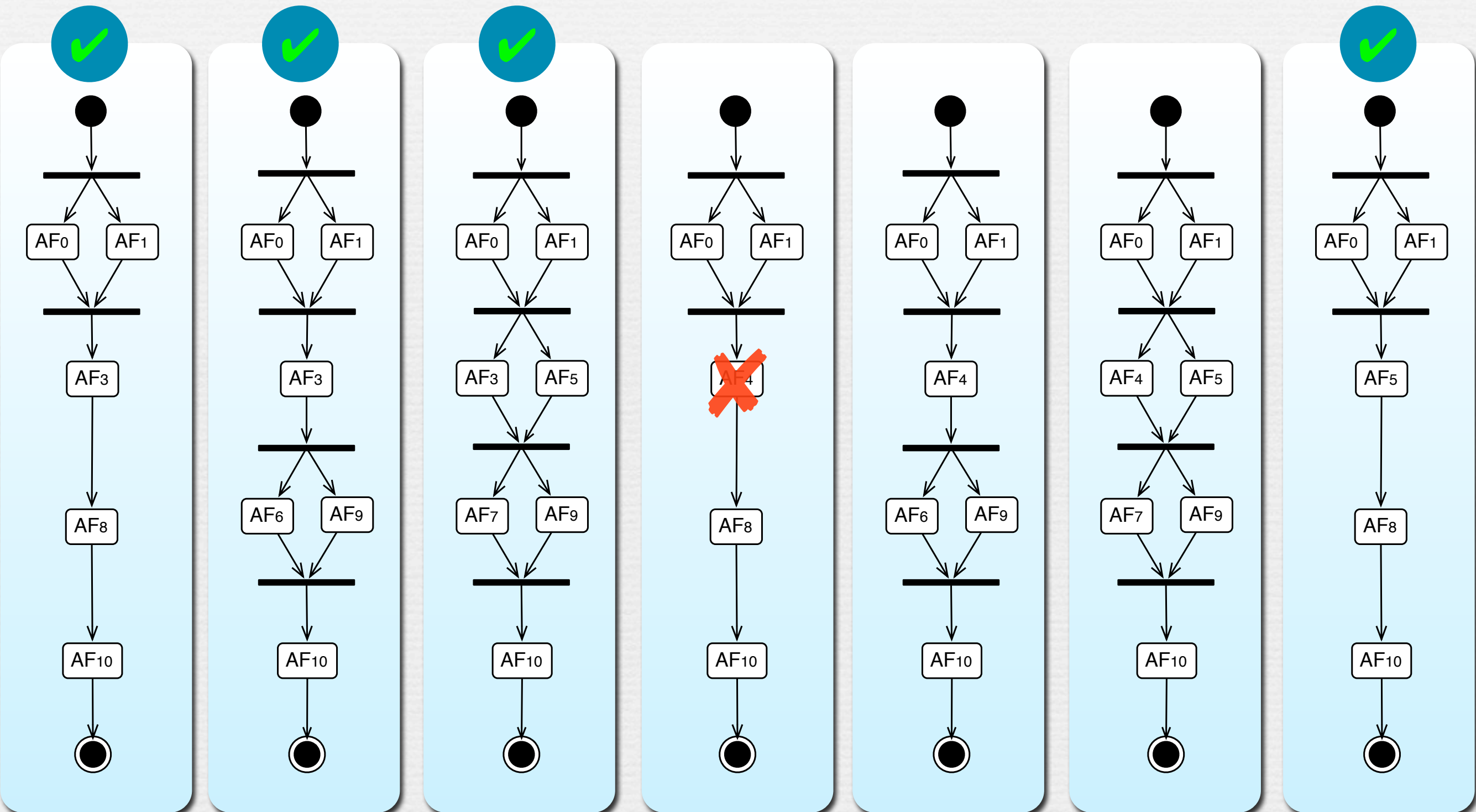




# Fault Tolerance Support

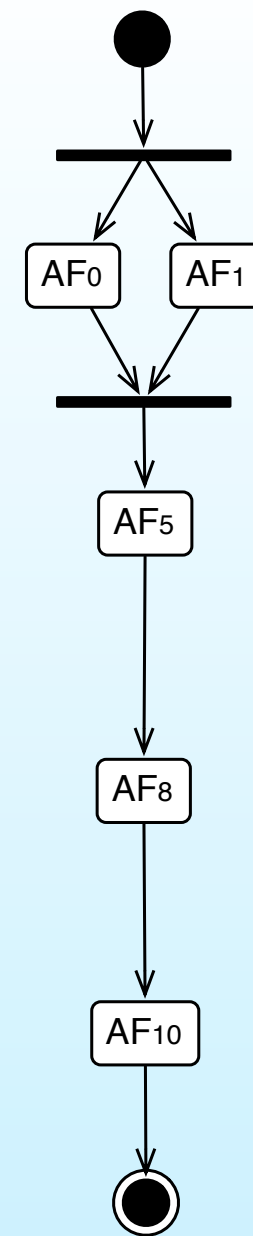
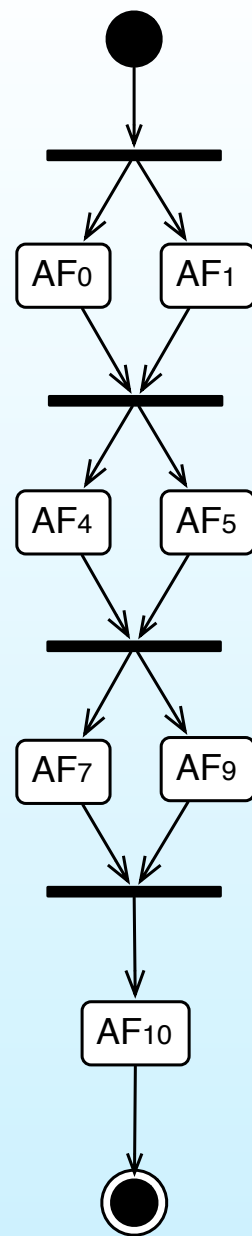
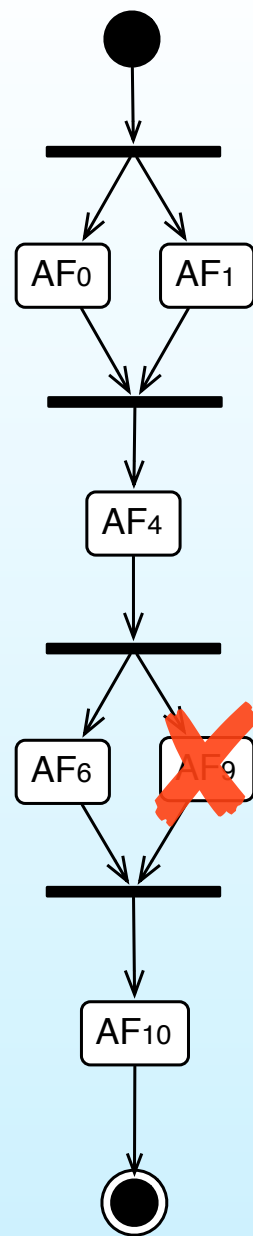
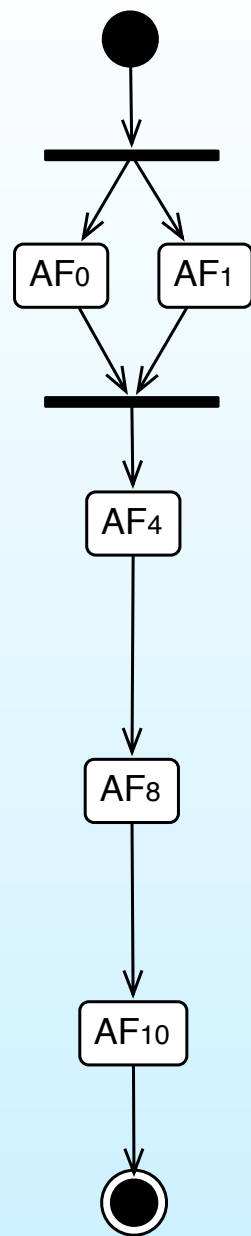
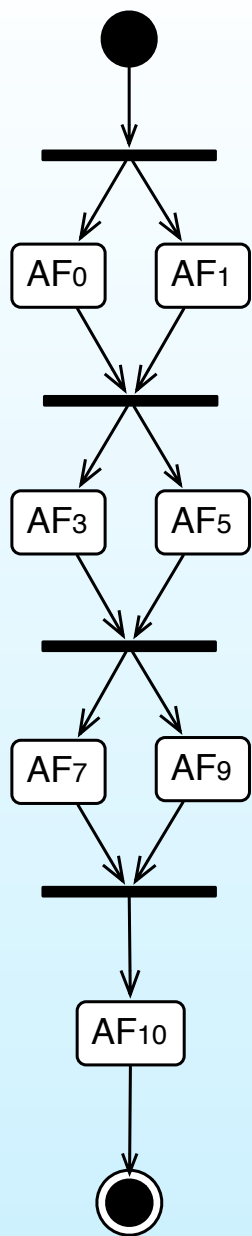
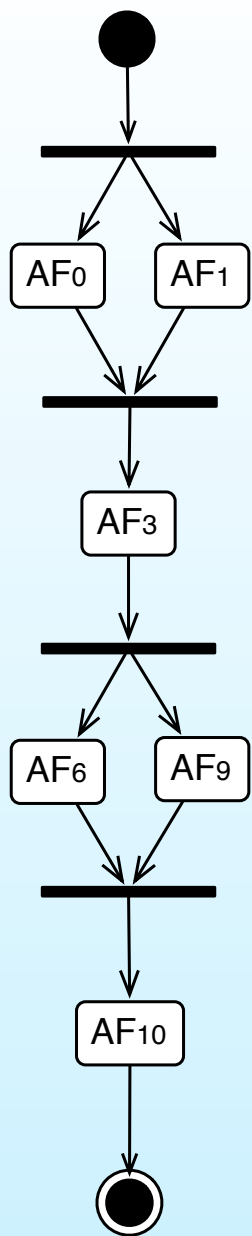
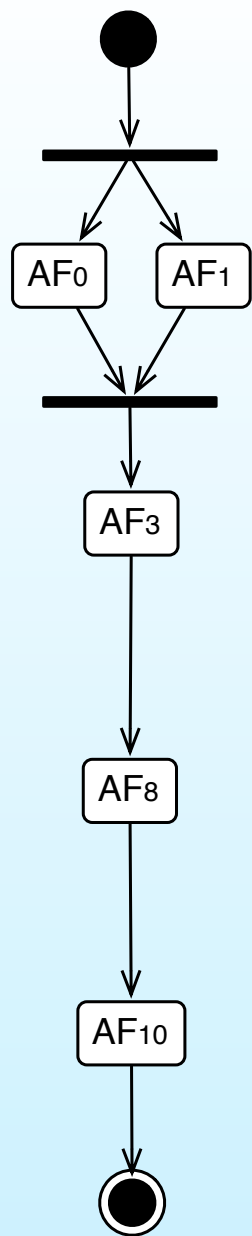


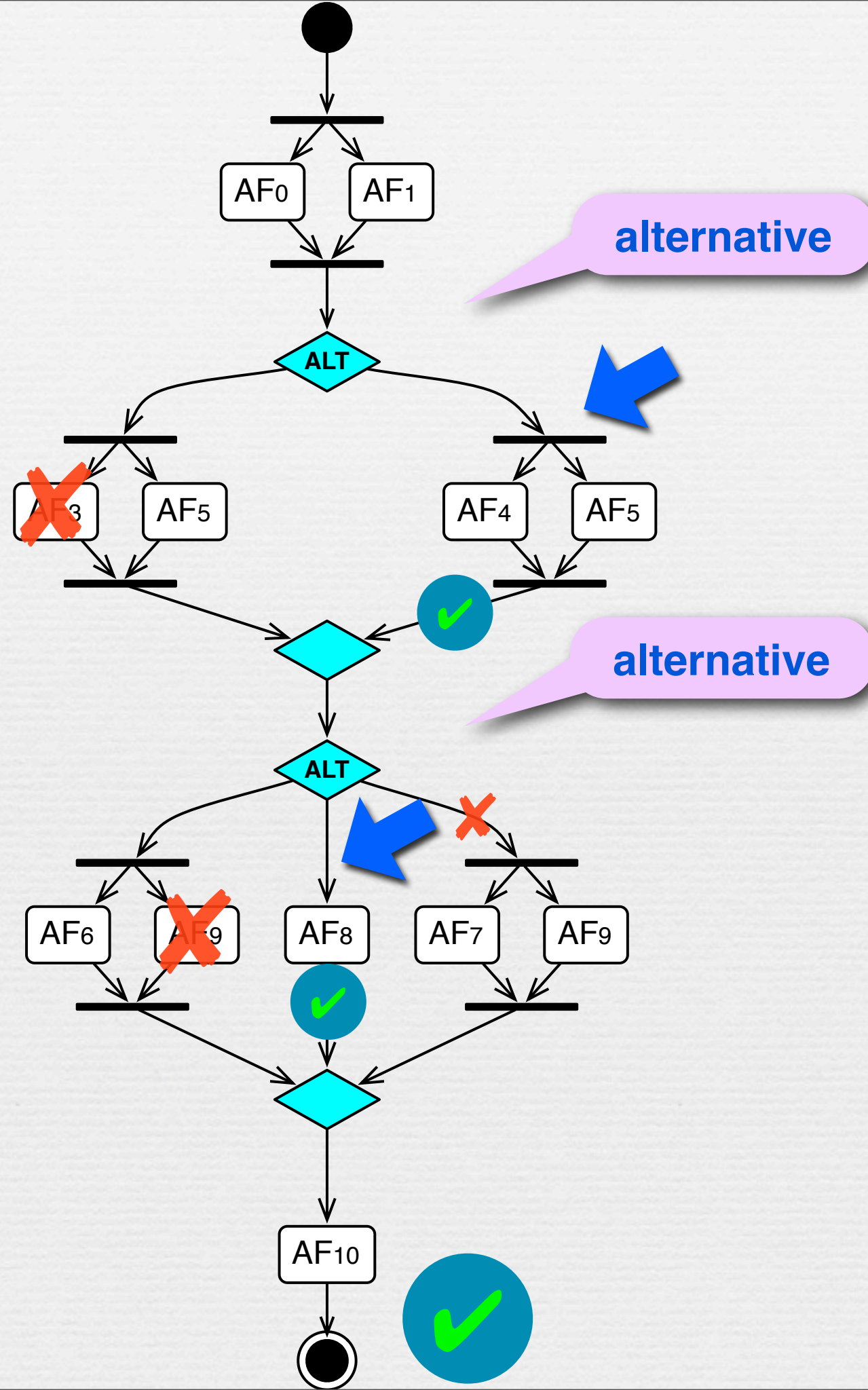
# Fault Tolerance Support





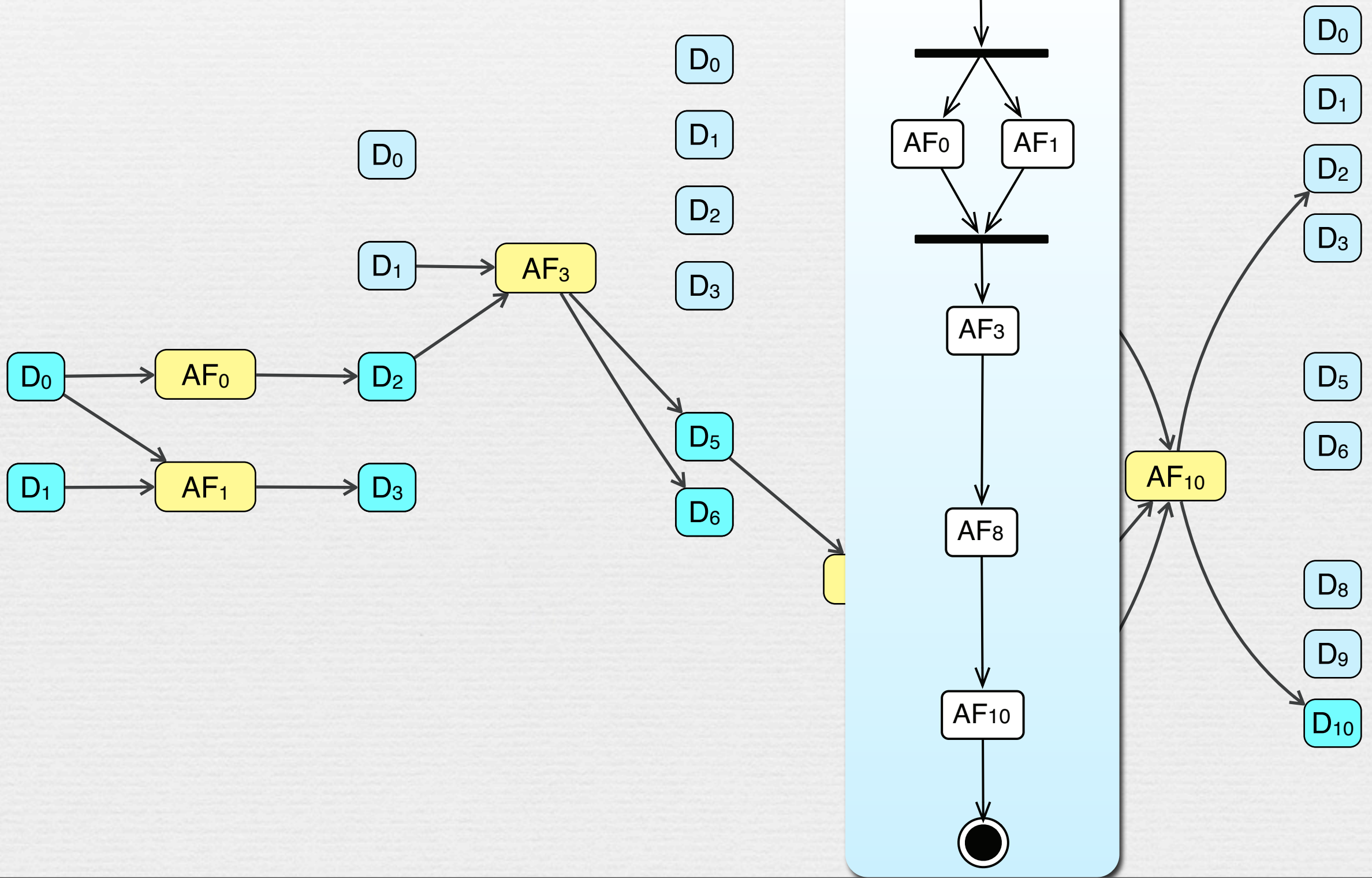
# Fault Tolerance Support



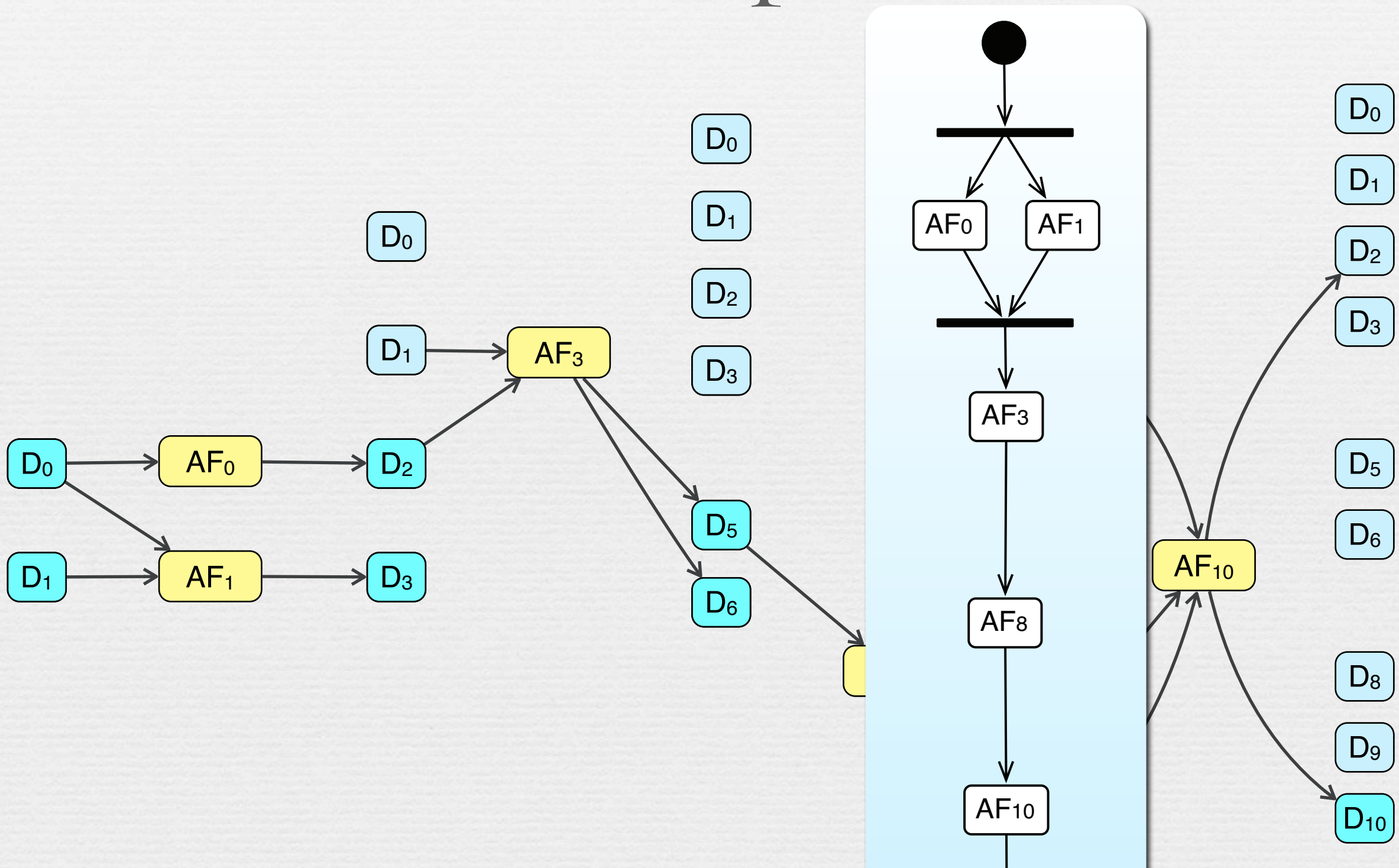




# Workflow Optimization



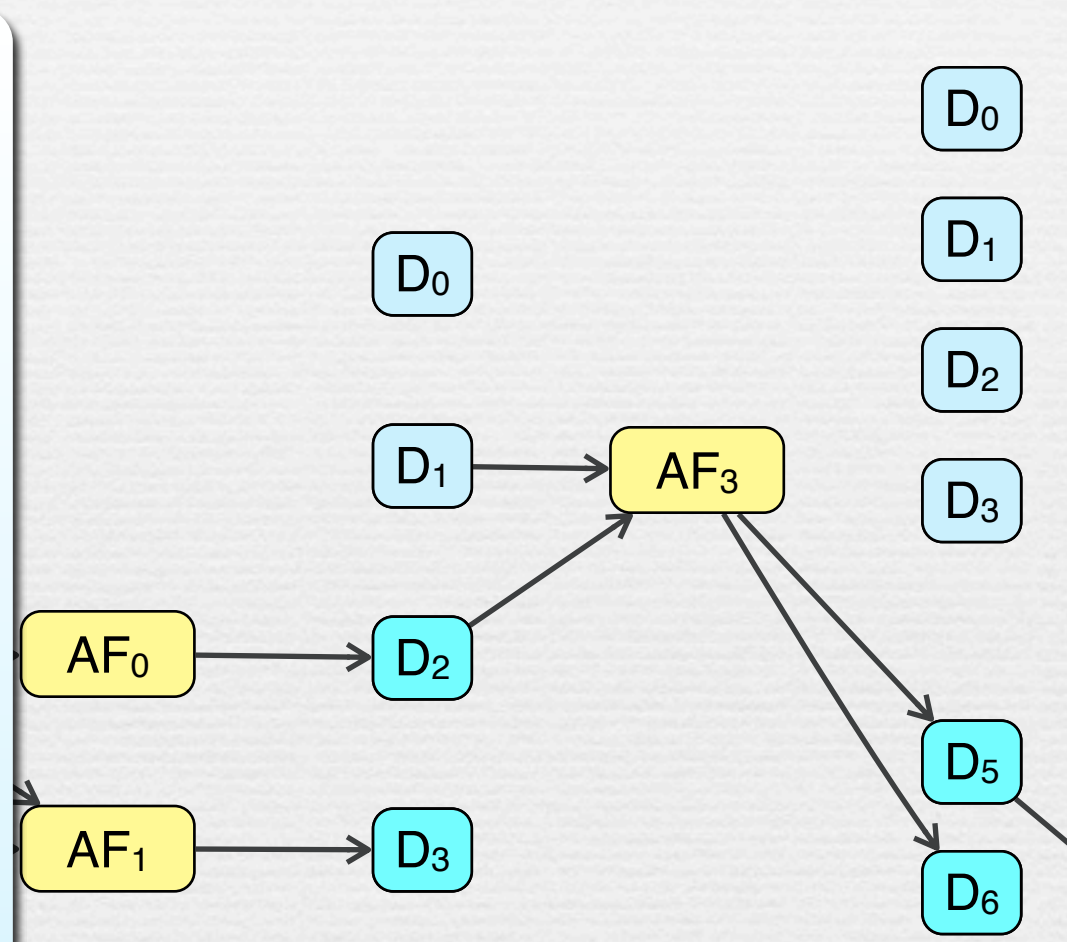
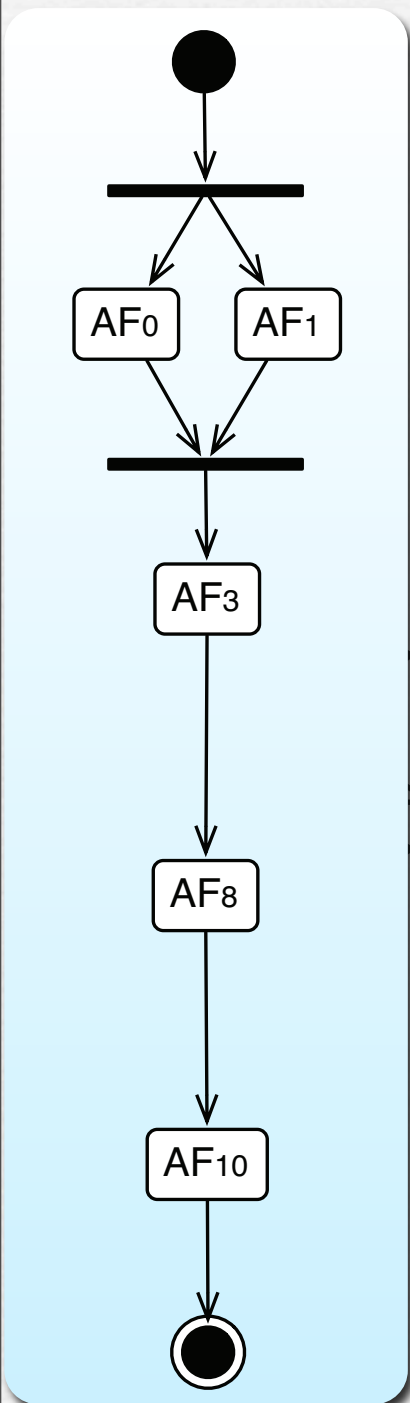
# Workflow Optimization



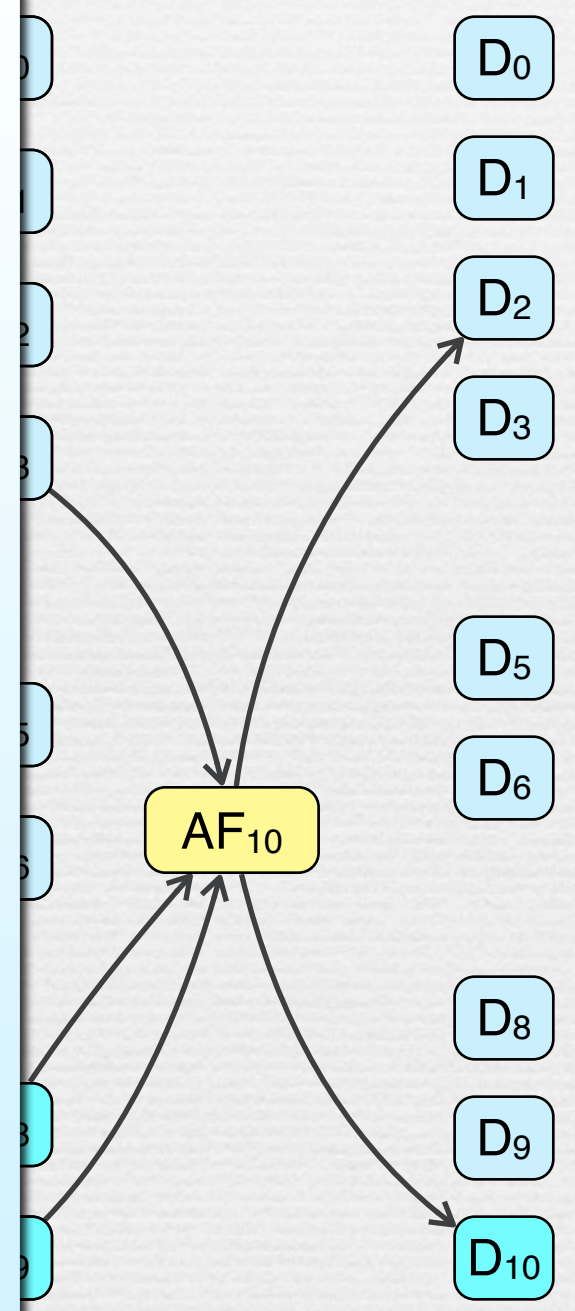
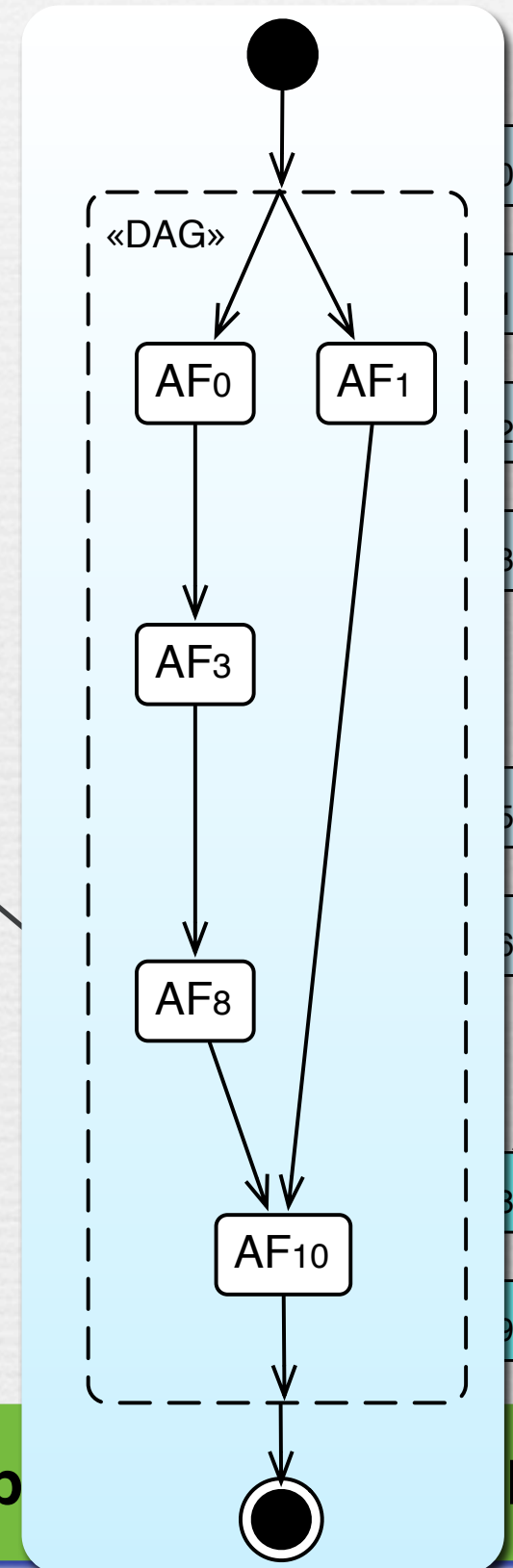
**AF<sub>3</sub>, AF<sub>8</sub> can be executed before AF<sub>1</sub> is finished**



# Workflow Optimization



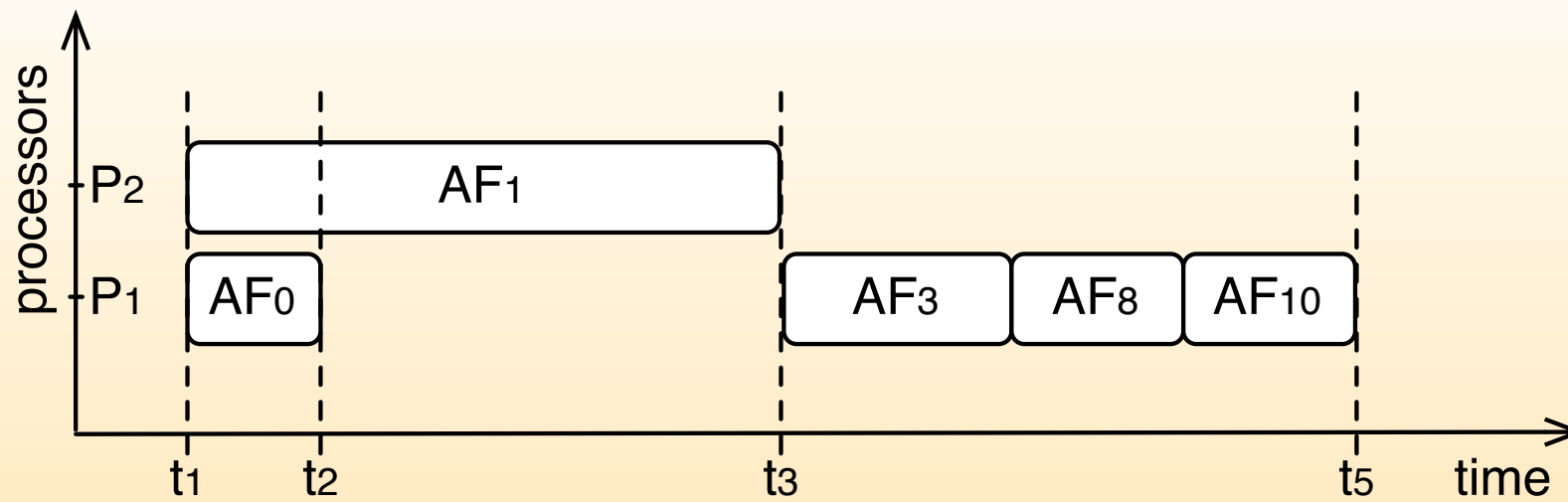
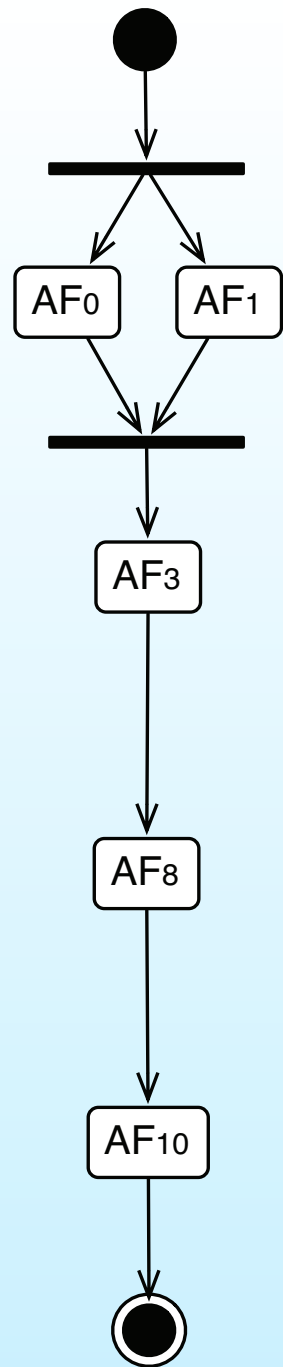
- D<sub>0</sub>
- D<sub>1</sub>
- D<sub>2</sub>
- D<sub>3</sub>
- D<sub>5</sub>
- D<sub>6</sub>



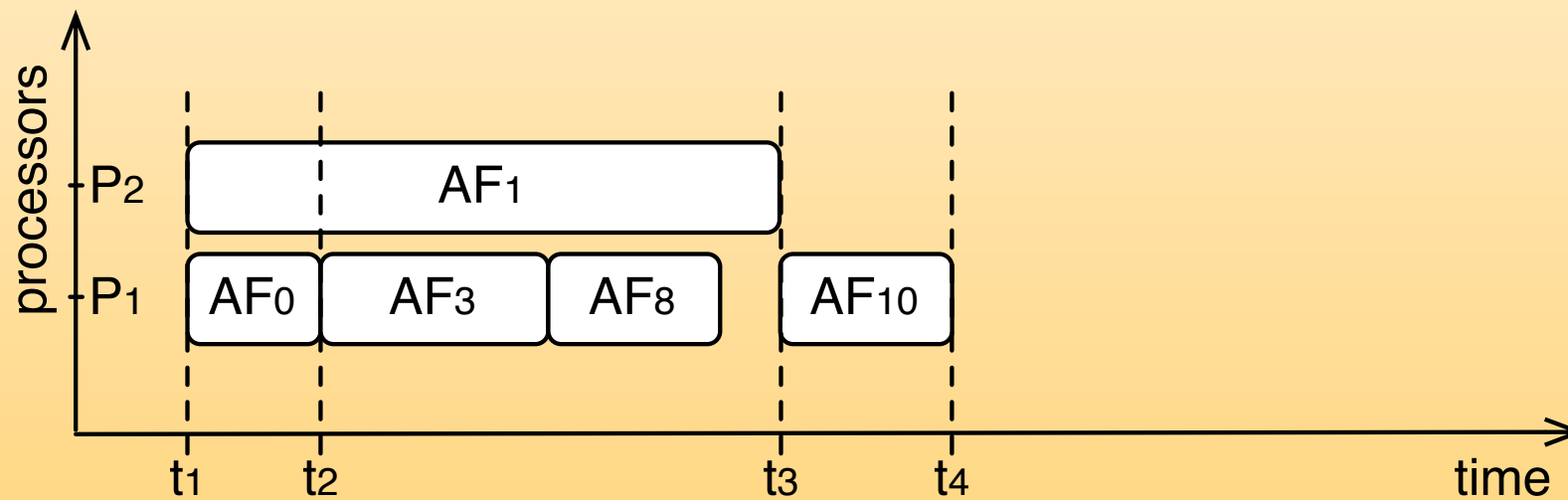
AF<sub>3</sub>, AF<sub>8</sub> can be executed b hed

# Workflow Optimization

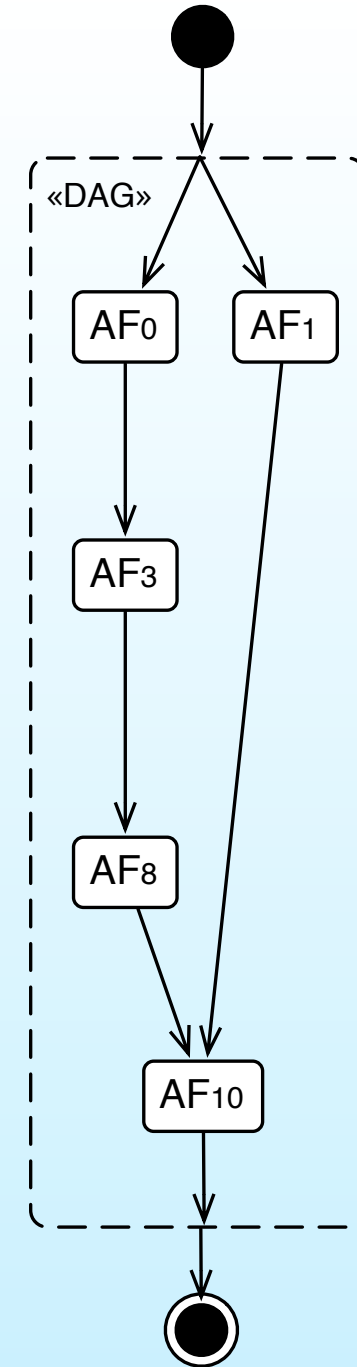
## Execution Time Comparison



(a)



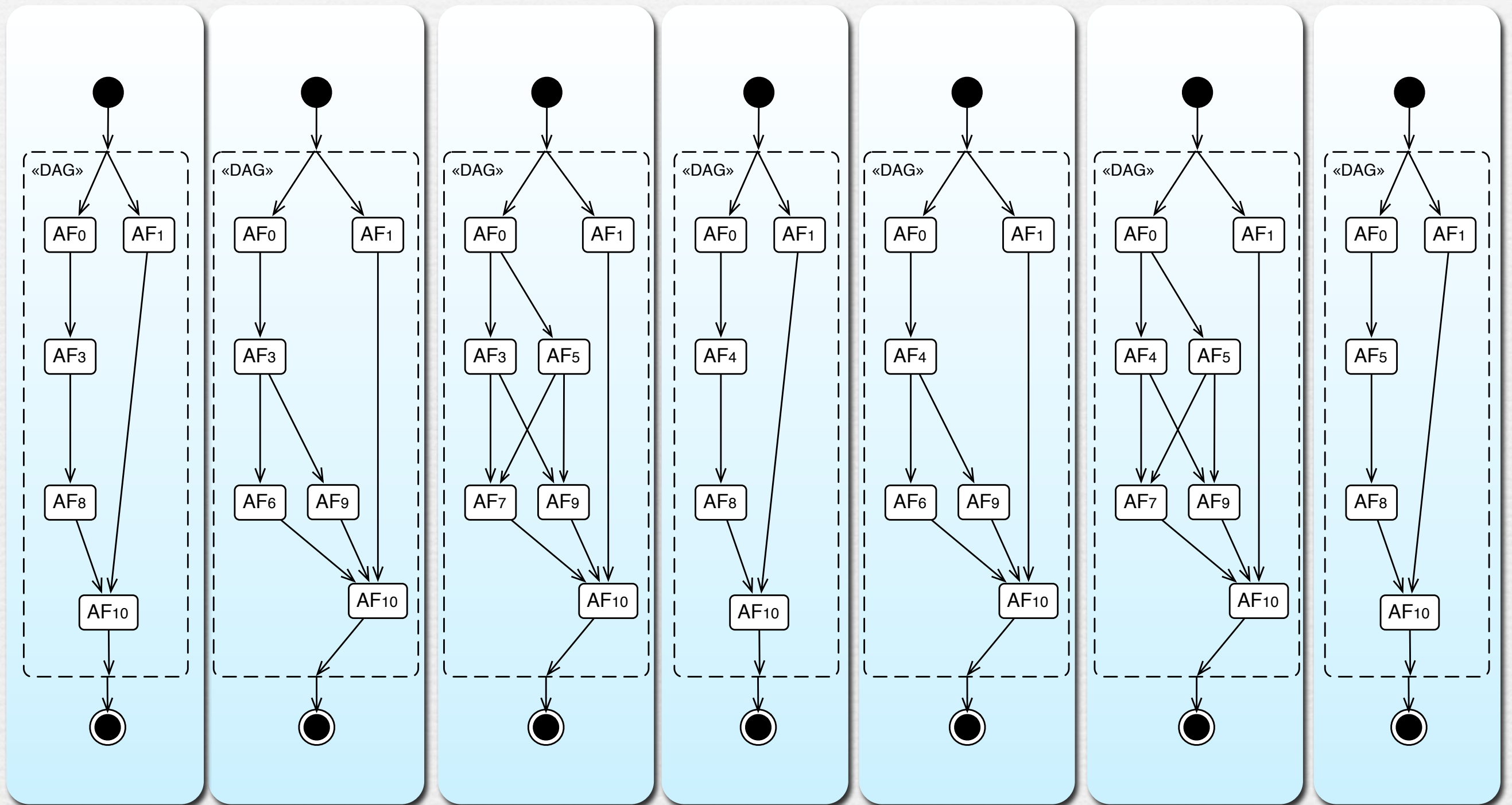
(b)



**AF<sub>3</sub>, AF<sub>8</sub> can be executed before AF<sub>1</sub> is finished**



# Workflow Optimization



# Algorithm Analysis

*W* is the set of all possible workflows, given a set of  $x$  AFs, an initial state  $S_{init}$  and a goal state  $S_{goal}$

**Proposition 1.** The **worst case execution time** taken by our algorithm to find an element of  $W$  is **a quadratic in  $x$**  if  $W \neq \emptyset$ . If such an element is not found by our algorithm, then necessarily  $W = \emptyset$ .

$$x + (x - 1) + (x - 2) + \dots + 1 = \frac{x^2 + x}{2}$$

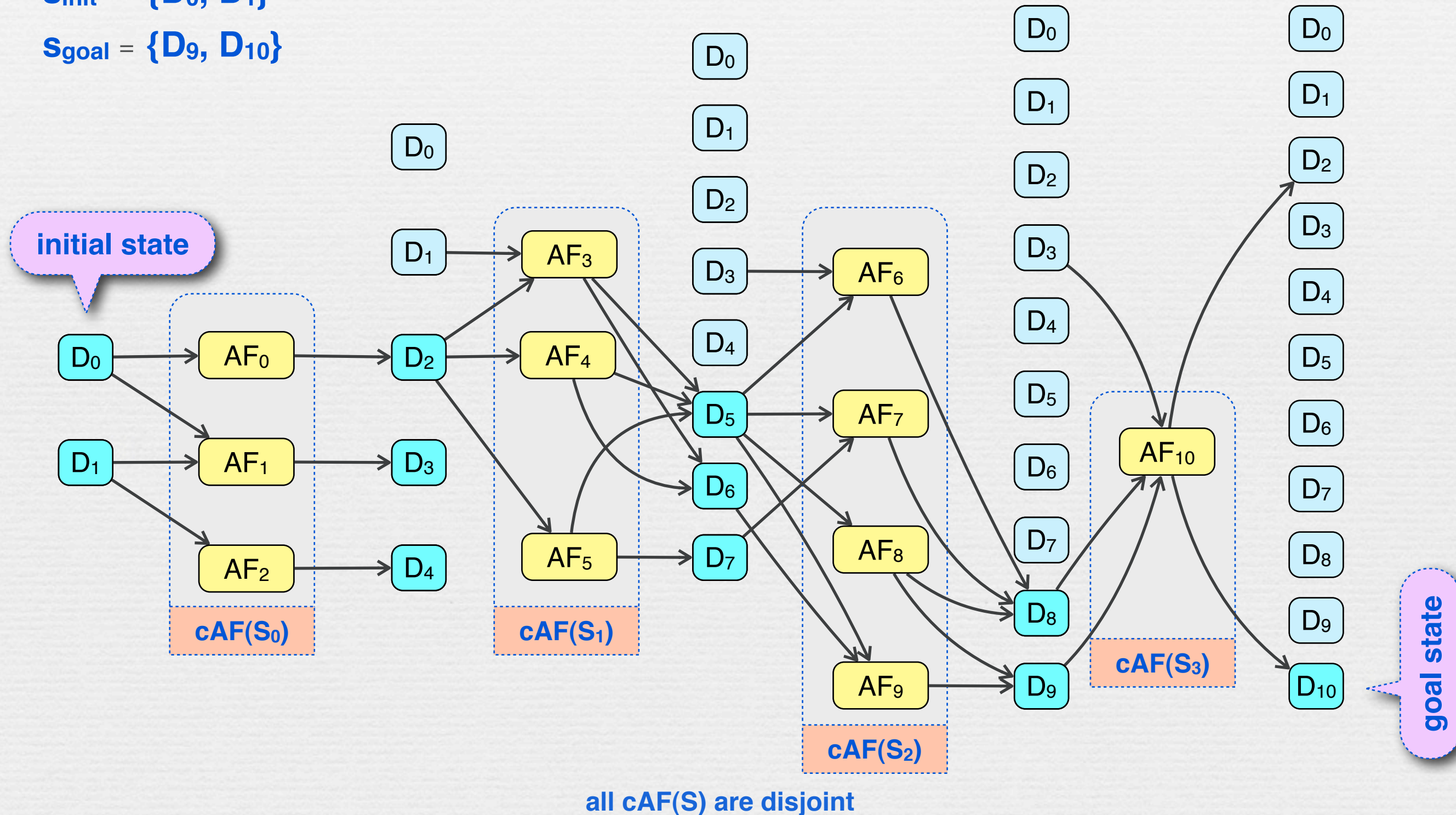
**Proposition 2.** If an element of  $W$  is found by our algorithm, the number of the superstates of the ADD graph is minimum, which also means that **the length of the DAG workflow is minimum.**



# ADD Graph Creation

$S_{init} = \{D_0, D_1\}$

$S_{goal} = \{D_9, D_{10}\}$



# Branches & Loops

## Branches

•  $S_{goal} = \{D_9, D_{10}(agwl:precondition="D_6=true")\}$

• STEP 1:  $S_{init1} = S_{init}, S_{goal1} = \{D_9, D_6\}$ , to obtain ADD graph with  $S_n \models S_{goal1}$ , thereby get workflow  $W_1$

• STEP 2:  $S_{init2} = S_n, S_{goal2} = \{D_{10}\}$ , get workflow  $W_2$

• STEP 3: the workflow is  $W_1$ , followed by an *if* construct where  $W_2$  is the then branch, else branch is empty

## Parallel Loops

•  $S_{init} = \{D_1(agwl:cardinality="multiple", agwl:access-order="parallel"), D_2\}$

• STEP 1:  $S_{init} = \{D_1, D_2\}$ , get workflow  $W$

• STEP 2: put  $W$  in a `parallelForEach` construct, which iterates over data collection  $D_1$



# Sequential Loops

- Sequential Loops

- $s_{goal} = \{D_9, D_{10}(agwl:postcondition = "D_{10} < 0.1")\}$

- STEP 1:  $s_{goal} = \{D_9, D_{10}\}$

- STEP 2: find the start/stop point of the sequential loop

- STEP 3: insert `doWhile` loop

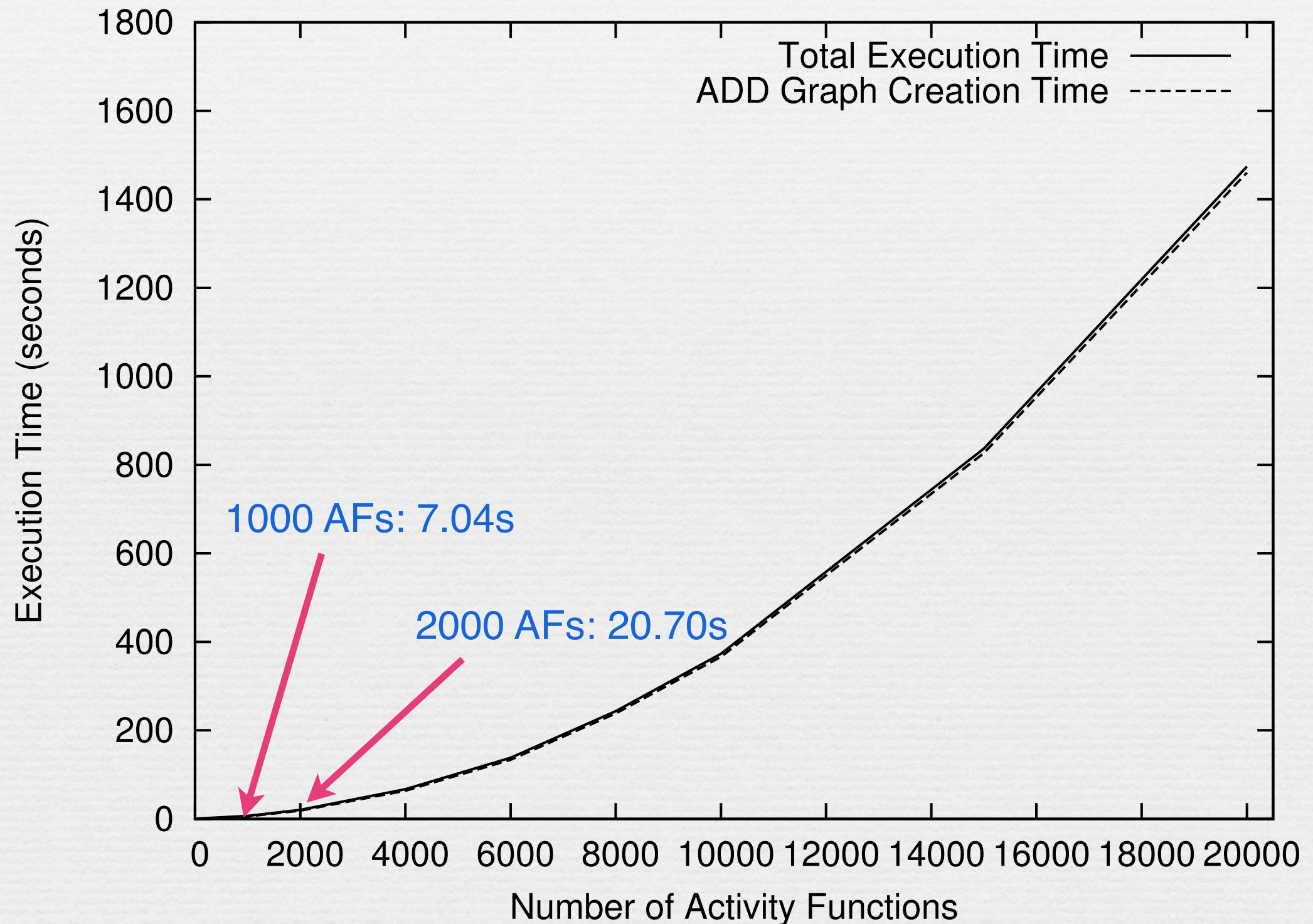




# Experimental Results

- Experiment 1
  - the composition of a Grid workflow in a simulated domain,
- Hardware and software environment
  - 2GB Memory, 2.4 GHz Intel Core 2 Duo CPU, JRE 1.5.0\_16
- Ontology Setup
  - thousands of AFs and DCs:  $AF_0, AF_1, \dots$
  - thousands of DCs:  $D_0, D_1, \dots$
  - each AF has random number (between 1 and 10) of input and output DCs
    - $AF_0: (D_0) \rightarrow (D_{1.1})$
    - $AF_1: (D_0, D_1) \rightarrow (D_2)$
    - $AF_2: (D_2) \rightarrow (D_1, D_{3.2})$
    - $AF_3: (D_0, D_1, D_3) \rightarrow (D_{4.1})$
    - ...
    - $AF_{100}: (D_3, D_{12}, D_{35}, D_{82}, D_{90}, D_{93}, D_{100}) \rightarrow (D_5, D_{23}, D_{52}, D_{73}, D_{101.8})$
    - ...
    - $AF_{20000}: \dots$

# Algorithm Execution Time

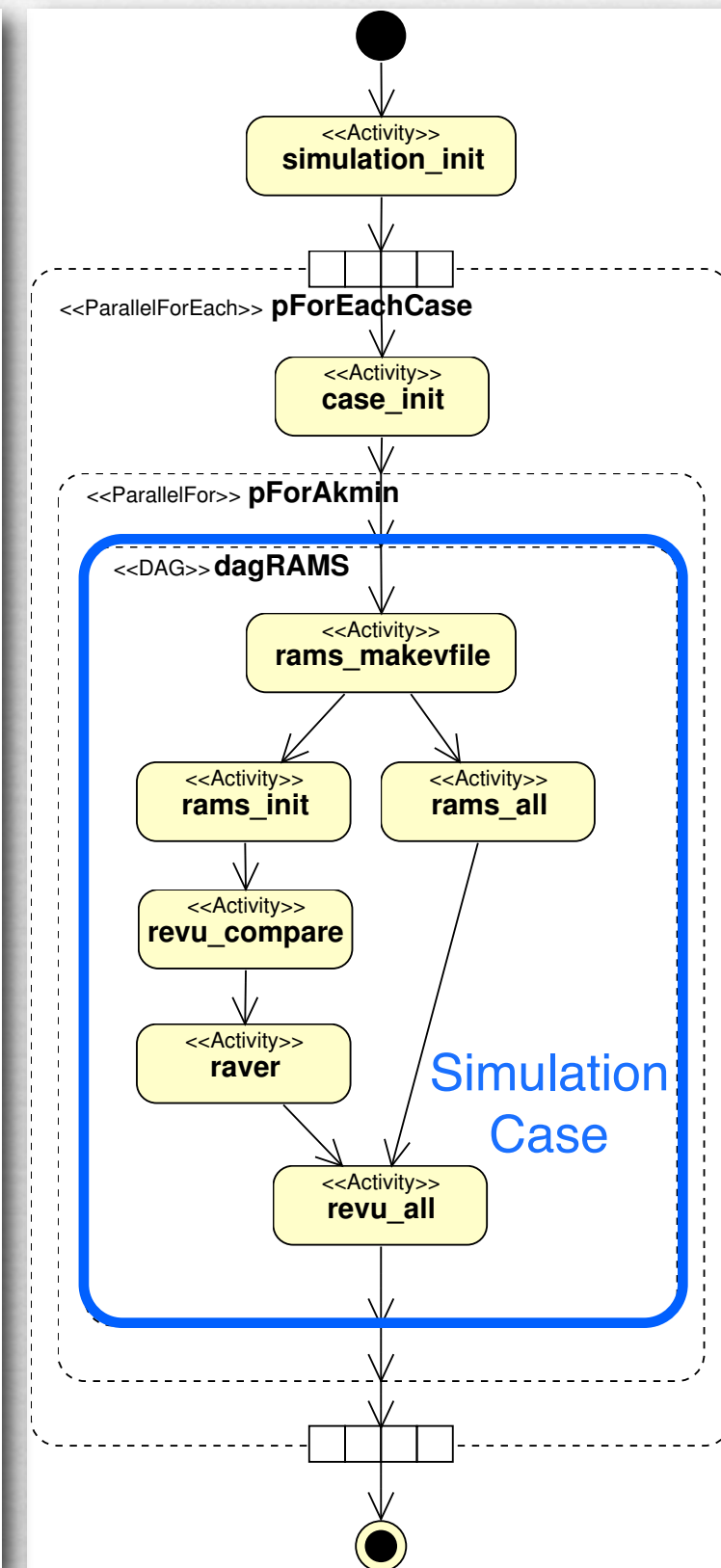
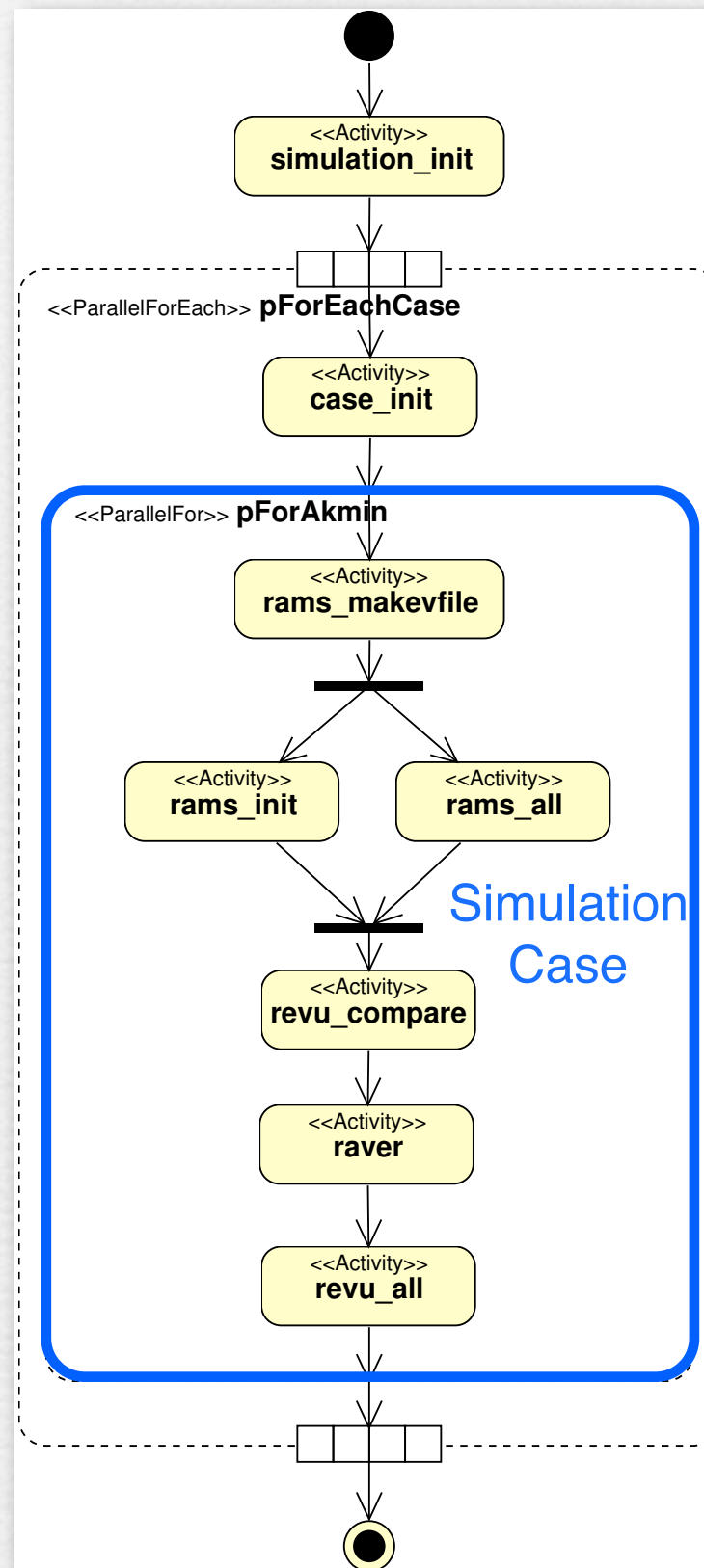




# Experimental Results

## Experiment 2

- the composition of a real world Grid workflow MeteoAG in the meteorology domain
- 19 AFs in the ontology
- algorithm execution time:
  - 0.54 seconds for non-optimized version
  - 0.64 seconds for optimized version



# Experimental Results

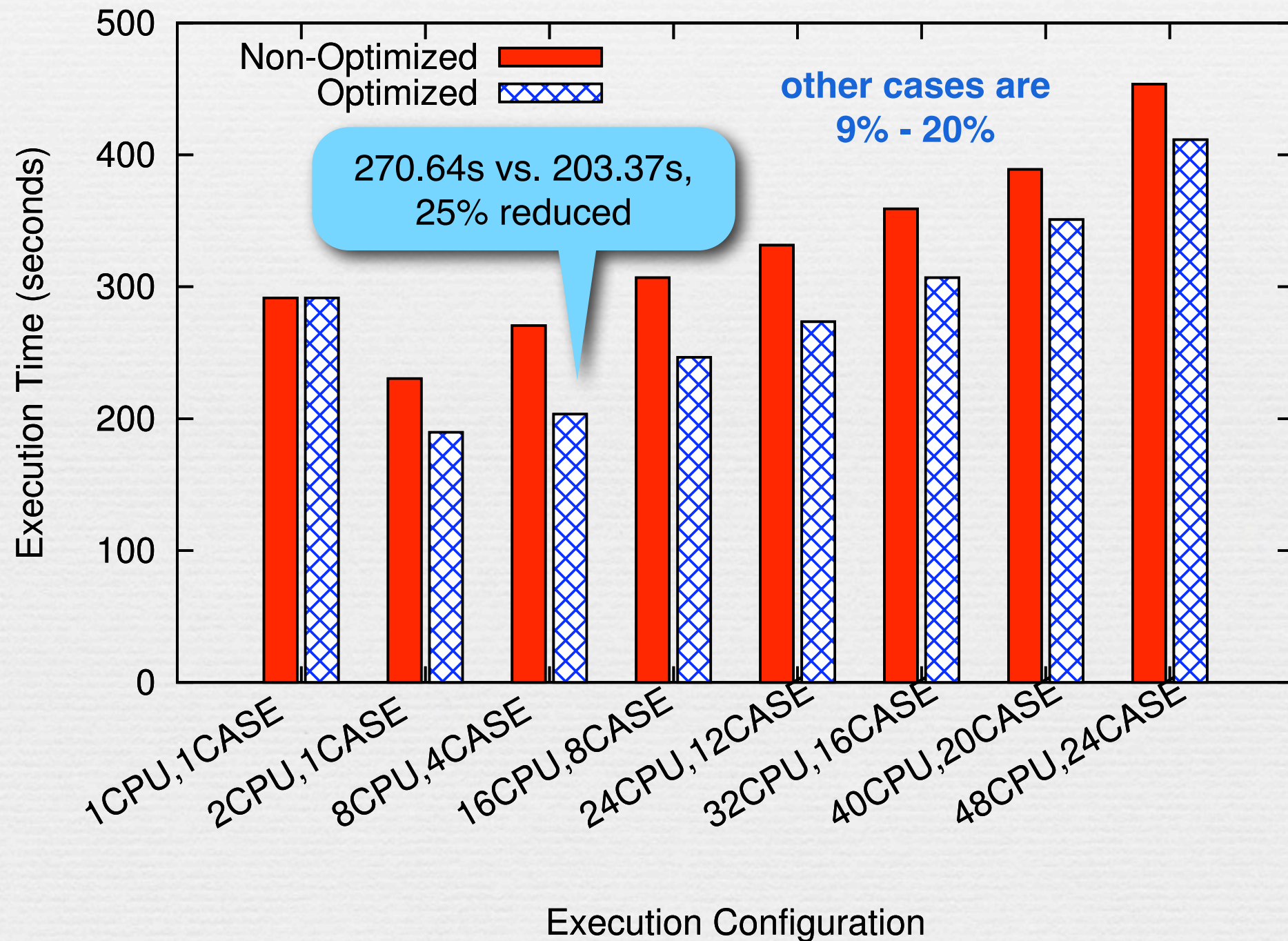
## ☛ Experiment 3

- ☛ the comparison of the execution time of the optimized and non-optimized MeteoAG
- ☛ Austrian Grid testbed

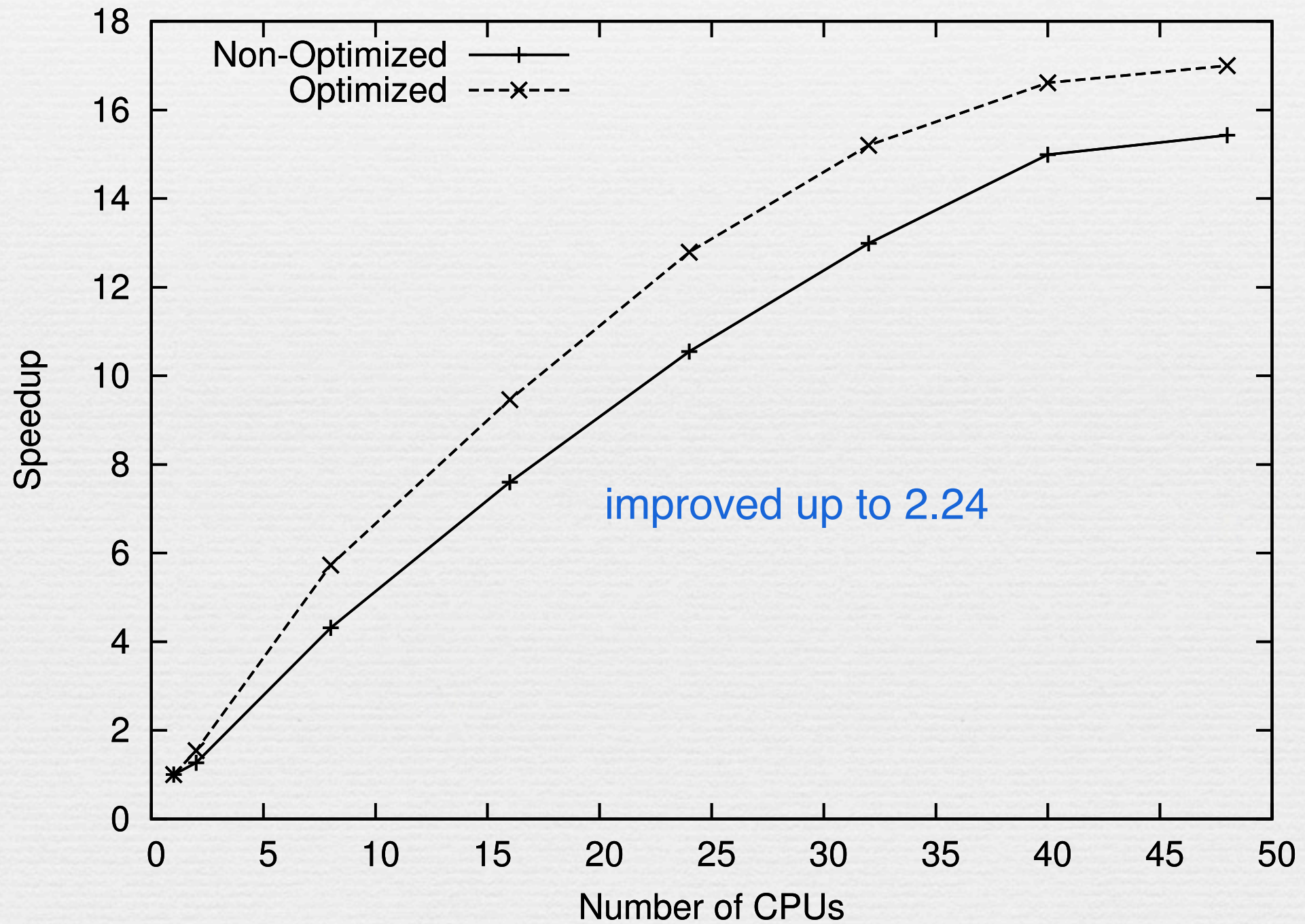
<i>Grid Site</i>	<i>CPU</i>	<i>#</i>	<i>GHz</i>	<i>LRM</i>	<i>Location</i>
karwendel	Dual Core AMD Opteron	8	2.4	SGE	Innsbruck
altix1	Itanium 2	8	1.4	PBS	Innsbruck
schafberg	Itanium 2	8	1.4	PBS	Salzburg
altix1jku	Itanium 2	8	1.4	PBS	Linz
c703-pc1801	Pentium 4	8	2.8	Torque	Innsbruck
c703-pc2601	Pentium 4	8	2.8	Torque	Innsbruck



# Workflow Execution Time



# Speedup





# Summary

- ❧ We formalized the Grid workflow composition problem based on the STRIPS language
- ❧ We presented a novel ADD graph based algorithm for automatic composition of high quality Grid workflows: portable, fault tolerant support, optimized.
- ❧ Our approach
  - ❧ provides a general solution for automatic Grid workflow composition
  - ❧ can generate alternative workflows automatically
  - ❧ considers workflow optimization
  - ❧ can compose workflows with branches and loops
- ❧ To the best of our knowledge, ASKALON provides the only widely used workflow systems with a general solution for automatic workflow composition
  - ❧ others are built for demonstration of concepts
- ❧ Future work
  - ❧ partially known initial state



# Thank you

- For more information:
  - ASKALON: [www.askalon.org](http://www.askalon.org)
  - AGWL: [www.askalon.org/agwl](http://www.askalon.org/agwl)

