

* DMN: how to satisfy multiple objectives?

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* Who?

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Research and teaching:

- Business rules, processes and information systems
- Information & Knowledge Management
- Decision models & tables
- Business intelligence & Analytics

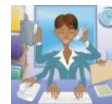
IBM Faculty Award

Belgian Francqui Chair 2009 at FUNDP

RuleML best paper award 2007

- Bpost bank Research Chair Actionable Analytics
- Colruyt-Symeta Research Chair Smart Data and Decisions in Marketing
- IBM Fund Intelligent Business Decision Making
- Microsoft Research Chair on Intelligent Environments
- PricewaterhouseCoopers Chair on E-Business

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* Abstract

- * Decision modeling with DMN allows to model decisions and offers a standard notation and expression for decision requirements and decision logic.
- * Is there only one best model for a (set of) decision(s) or can you have multiple models?
- * Based on a recent Decision Management Community challenge, this presentation investigates various objectives of decision modeling:
 - providing an overview for business,
 - verification of business logic,
 - traceability to knowledge sources,
 - maintainability,
 - model-driven execution.

* Problem statement

The number of vacation days depends on age and years of service.

Every employee receives at least 22 days.

Additional days are provided according to the following criteria:

- 1) Only employees younger than 18 or at least 60 years, or employees with at least 30 years of service will receive 5 extra days.
- 2) Employees with at least 30 years of service and also employees of age 60 or more, receive 3 extra days, on top of possible additional days already given.
- 3) If an employee has at least 15 but less than 30 years of service, 2 extra days are given. These 2 days are also provided for employees of age 45 or more. These 2 extra days can not be combined with the 5 extra days.



Challenge Jan-2016

Notes

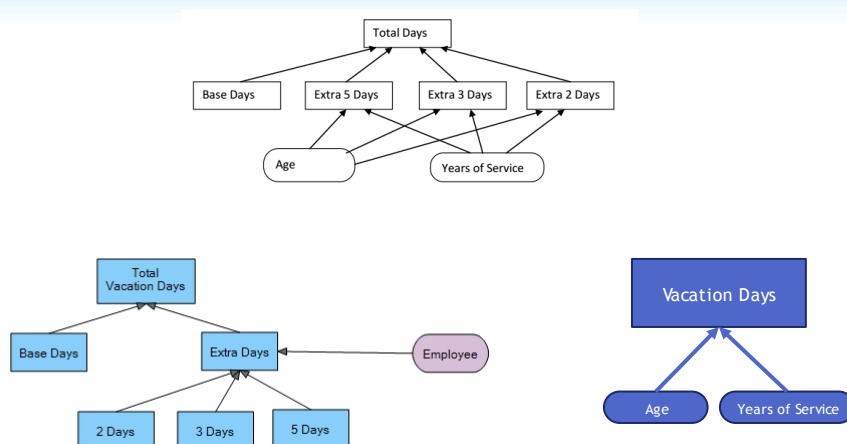
- Additional days (5, 3, 2) are only added once (that is an assumption indeed), but some of them can be combined.
- The 2 extra days cannot be combined with the 5 extra days.
- You can not have more years of service than your age - the legal minimum age (child labour is illegal).

*Standardization concerns

* There was a large variety of tools and formats. It would be good for exchange and readability if the common notation is used:

- * [45..60) or [45..60[are well-defined notations (*at least one of them*) and much more compact than "(Age >= 45) and (Age < 60)"
- * Decision tables can return the outcome of one rule (the first, the only one, whatever) or the outcomes of all matching rules. It was not always clear from the submissions what was meant. That is exactly the purpose of the hit indicator: tell us how to read the table. If the hit indicator is not used, only the outcome(s) of one rule will be returned.
- * An irrelevant input entry is indicated with "-", not "*" or blank.

*Solutions: DRD



*Typical solution 1 (Multiple Hit)

DecisionTableMultiHit DefineVacationDays					
Condition		Condition		Conclusion	
Age in Years		Years of Service		Vacation Days	
				=	22
<	18			+=	5
>=	18	>=	30	+=	5
>=	60	<	30	+=	5
		>=	30	+=	3
>=	60	<	30	+=	3
Within	[45..60)	<	30	+=	2
<	45	Within	[15..30)	+=	2

What?

- * Collect/add all rules that apply

the age of the employee	the rrb of year of service	the regular holiday amount is	the holidays bonus is
≥ 15	> 0	22	
< 18			5
< 45	[15 30[2
≥ 45	[15 30[4
< 60	≥ 30		5
≥ 60	≥ 30		8

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*Typical solution 1 (Multiple Hit)

Conditions	0	1	2	3	4	5	6	7
Age		< 18	>= 60	18..59	>= 60	18..59	45..59	18..44
Service		-	-	>= 30	>= 30	15..29	< 30	< 15
Actions								
Post Message(s)	✉	✉	✉	✉	✉	✉		
Base Days	22							
Extra Days		5	5	5	3	2	2	0

What?

- * Collect/add all rules that apply

Pro

- * Traceability +/-

Con

- * Avoiding 5+2 is work
- * V&V: Who gets 5+3?
- * Where is 'my case'?

Ref	Text
0	Base: Every employee receives at least 22 days Extra days:
1	1A. Only employees younger than 18 receive 5 extra days
2	1B. Only employees at least 60 receive 5 extra days
3	1C. Only employees with at least 30 years of service receive 5 extra days (if they didn't already get 5 days because of their age)
4	2. Employees with at least 30 years of service and [also employees of] age 60 or more receive 3 extra days on top of other days
5	3A. If an employee has at least 15 but less than 30 years of service 2 extra days are given. They cannot be combined with the 5 extra days.
6	3B. These 2 days are also provided for employees age 45 or more. They cannot be combined with the 5 extra days.
7	Employees do not get extra days when years of service is less than 15 and age is 18 - 44

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*Typical solution 2 (Any)

Relations and information

Rule Family Table				
Operand FactTypes Used in Exports Snapshots Audit				
Add Rule Add Condition				
Conditions				Conclusion
				Employee Contract Number Of Vacation Days
<	Employee Age	<	Employee Years of Service	Is 22 Days + 5
Is between [Right Excluded]	18 Years and 45 Years	<	15 Years	Is 22 Days
Is between [Right Excluded]	18 Years and 45 Years	Is between [Right Excluded]	15 Years and 30 Years	Is 22 Days + 2
Is between [Right Excluded]	45 Years and 60 Years	<	30 Years	Is 22 Days + 5
>=	60 Years	>=	30 Years	Is 22 Days + 5

What?

* Take any rule that applies (result =)

Pro

* Traceability +/-

Con

* Avoiding 5+2 is work
* Completeness?
* Overlap/Redundancy

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*Typical solution 3 (First)

	inputs		outputs	Description
	Age	Years of Service	Vacation Days	
F	Number [14,]	Number [6,]	Number [22,]	
1	<18	-	22+5	Basic days + rule #1 People younger than 18 cannot have 30 years of experience and this is the only case that would have changed their holidays count so this information is irrelevant
2	>=60	-	22+8	Basic days + rule #1 + rule #2
3	-	>=30	22+2	Basic days + rule #3
4	>=45	-	22	Basic days only
5	-	>=15		
6	-	-		

What?

* Hit & run

Pro

* Traceability +/-

Con

* Who gets 22+2?
* Hard to maintain
* Completeness?

Initial Action

Days_leave <= 22

Condition

AGE < 18

AGE >= 60

SERVICE >= 30

SERVICE >= 15

AGE >= 45

Action

Days_leave + 5

Days_leave + 2

Days_leave + 3

RULES					
1	2	3	4	5	ELSE
Y	N	N	N	N	ELSE
N	Y	-	N	N	-
N	-	Y	N	N	-
N	-	-	Y	N	-
N	-	-	-	Y	-
X	X	X	-	-	-
-	-	-	X	X	-
-	X	X	-	-	-

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*Typical solution 4 (Unique)

What?

* Take the one rule that applies

Employee.Age	<18	>=18 AND <45	>=45 AND <60	>=60			
Employee.YearsOfService	*	<15	>=15 AND <30	>=30	<30	>=30	*
Employee.VacationDays	27	22	24	30	24	30	30

DecisionTable DefineVacationDays		
If	If	Then
Age in Years	Years of Service	Vacation Days
<18		::= (22 + 5)
[18..45]	<15	::= 22
[18..45]	[15..30]	::= (22 + 2)
[18..45]	>=30	::= (22 + 5 + 3)
[45..60]	<15	::= (22 + 2)
[45..60]	[15..30]	::= (22 + 2)
[45..60]	>=30	::= (22 + 5 + 3)
60+		::= (22 + 5 + 3)

Initial Action

Days_leave MV 22

Condition

AGE >= ?

AGE < ?

SERVICE >= 15

SERVICE >= 30

Action

Days_leave + 5

Days_leave + 2

Days_leave + 3

RULES

	1	2	3	4	5	6	7	8	ELSE
AGE >= ?	-	18	18	18	45	45	45	60	ELSE
AGE < ?	18	45	45	45	60	60	60	-	-
SERVICE >= 15	-	N	Y	-	N	Y	-	-	-
SERVICE >= 30	-	N	N	Y	N	N	Y	-	-
Days_leave + 5	X	-	-	X	-	-	X	X	-
Days_leave + 2	-	-	X	-	X	X	-	-	-
Days_leave + 3	-	-	-	X	-	-	X	X	-

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*Typical solution 4 (Unique)

What?

* Take the one rule that applies

Pro

* V&V
* Completeness

Con

* Traceability +/-

U	Inputs		outputs	Description
	Age	Years of Service	Vacation Days	
	Number (I4,)	Number (I1,)	Number (I2,)	
1	<18	-	22+5	Basic days + rule #1 People younger than 18 cannot have 30 years of experience and this is the only case that would have changed their holidays count so this information is irrelevant
2		<15	22	Basic days
3	[18..45]	[15..30]	22+2	Basic days + rule #3
4		>=30	22+5+3	Basic days + rule #1 + rule #2
5		<30	22+2	Basic days + rule #3
6	[45..60]	>=30	22+5+3	Basic days + rule #1 + rule #2
7	>=60	-	22+5+3	Basic days + rule #1

Conditions	1	2	3	4	5	6	7
Age	< 18	[18..45]	[18..45]	[18..45]	[45..60]	[45..60]	>= 60
Service	-	< 15	[15..30]	>= 30	< 30	>= 30	-
Actions							
Post Message(s)							
Allocate 22 days	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
Add 5 days	<input checked="" type="checkbox"/>			<input checked="" type="checkbox"/>		<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
Add 3 days				<input checked="" type="checkbox"/>			<input checked="" type="checkbox"/>
Add 2 days			<input checked="" type="checkbox"/>		<input checked="" type="checkbox"/>		<input checked="" type="checkbox"/>

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*Solutions with Decomposition

```

graph TD
    TotalVacationDays[Total Vacation Days] --> BaseDays[Base Days]
    TotalVacationDays --> ExtraDays[Extra Days]
    ExtraDays --> TwoDays[2 Days]
    ExtraDays --> ThreeDays[3 Days]
    ExtraDays --> FiveDays[5 Days]
    Employee((Employee)) --> ExtraDays
        
```

Base Days Decision

BaseDays.xml

1	2	A	B	C
	1	Age	Years of Service	Is Eligible
+	4			true

Extra 2 Days Decision

2Days.xml

1	2	A	B	C
	1	Age	Years of Service	Is Eligible
+	4		>=45	true
	5		[15;30]	true
	6			false

Total Vacation Days

TotalVacationDays.xml

1	2	A	B	C	D	E
	1	Base Days	Eligible for Extra 5 Days	Eligible for Extra 3 Days	Eligible for Extra 2 Days	Vacation Days
+	4	true				22
	5		true			5
	6			true		3
	7		false		true	2

What?

- * Model decision dependencies (how detailed?)
- * Tables still have hit policy

if	if	if	Conclusion
Eligible to Extra 5 Days	Eligible to Extra 3 Days	Eligible to Extra 2 Days	Vacation Days
=			22
TRUE			5
FALSE	TRUE		3
	TRUE	TRUE	2

if	Then
Age in Years	Eligible to Extra 5 Days
< 18	TRUE
>= 60	TRUE
>= 30	TRUE
	FALSE

if	if	Then
Age in Years	Years of Service	Eligible to Extra 3 Days
	>= 30	TRUE
>= 60		TRUE

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*Solutions with Decomposition

Total Days			
Base Days + (if Extra 5 Days then 5 else 0) + (if Extra 3 Days then 3 else 0) + (if Extra 2 Days and not(Extra 5 Days) then 2 else 0)			
Base Days			
22			
Extra 5 Days			
A	Age	Years of Service	
			false, true
1	<18, >=60	-	true
2	-	>= 30	true
Extra 3 Days			
A	Age	Years of Service	
			false, true
1	>=60	-	true
2	-	>= 30	true
Extra 2 Days			
A	Age	Years of Service	
			false, true
1	>=45	-	true
2	-	[15..30]	true

- What?
- * Model decision dependencies (how detailed?)
 - * Tables still have hit policy
- Pro
- * Traceability
 - * Simple
- Con
- * Overview

*Some DMN features

Have a look at some DMN conventions:

- * A boxed expression to set the base days.
- * The A (Any) hit-indicator to list rules connected by “or”, with the same outcome. This allows to stay close to the original text (and automatically avoids giving the 5 days more than once).
- * The underlined value false to state the default outcome.
- * The use of “,” in ‘<18, >=60’ to indicate ‘or’.
- * The expression to calculate the total days (it could also be a table, for people who do not understand ‘if then else’).

*Separating eligibility - exclusion

Conditions	1	2	3	4	5
Age	< 18	>= 60	-	-	>= 45
Years of Service	-	-	>= 30	15..29	-
Actions					
Post Message(s)					
Eligible for A	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>		
Eligible for B		<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>		
Eligible for C				<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>

Conditions	0	1	2	3	4
Eligible for plan A?	T	-	F	F	
Eligible for plan B?	-	T	-	F	
Eligible for plan C?	-	-	T	F	
Actions					
Post Message(s)					
Base	22				
Extra	5	3	2	0	

Ref	Text
0	22 base days for everyone
1	5 extra days for the A entitlement
2	3 extra days for the B entitlement
3	2 extra days for the C entitlement but only if they are not entitled to A
4	0 extra days

*Solution with unknown

Employee.Age	<18		>=18 AND <45			>=45 AND <60			>=60		?	
Employee.YearsOfService	7	11	<15	>=15 AND <30		>=30	?	<30	>=30	?	?	*
Employee.VacationDays	0	27	22	24	30	0	24	30	0	0	30	0

Model or execution?

*Incomplete Solution with default

Employee.Age	<18	>=18 AND <45		>=45 AND <60	
Employee.YearsOfService	*	<15	>=15 AND <30		<30
Employee.VacationDays	27	22	24	24	

Default is 30

* Compact (!) solution (?)

Employee.Age >= 60 OR Employee.YearsOfService >= 30	TRUE	FALSE		
Employee.Age < 18	*	TRUE	FALSE	
(Employee.YearsOfService >= 15 AND Employee.YearsOfService < 30) OR Employee.Age >= 45	*	*	TRUE	FALSE
Employee.VacationDays	30	27	24	22

* Business questions and criteria

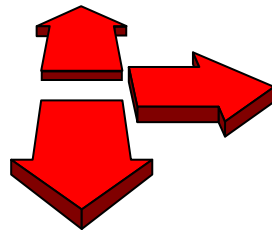
- * Decision making: John Doe is 50 and has 30 years of service, how much does he get (30 days)?
- * Overview: Who finally gets the 2 extra days? Where is my case?
- * Analysis: Are there some strange assignments in giving additional days? Yes, if you turn 18, e.g., you lose 5 bonus days.
- * Maintenance: What if the combination policy for 2 and 5 bonus days changes?
- * Traceability: How easy is it to trace back to the original text (rules)?

*Solution Types

- * **Building a model which clearly captures the original specification and can easily be traced back to it.** This is flexible and easy to maintain. If the bonus rules or the combination rules change, the model easily follows.
- * **Building a model which easily shows the overview, allowing to analyze and validate the business concerns.** These models allow to compare the bonus days over age categories, spot strange outcomes and show the result in a blink of the eye.
- * **Building a model (and tables) that tries to combine both views: show the final outcomes and ensure traceability to some extent.** That is often a compromise and challenging.

*Modeling objectives

Specification
(description, modelling)



Verification
& Validation

Execution
(implementation)

*Solutions

Table type?	DRD?	Traceable	Maintainable	Overview	DMN conformant	Score
Unique		medium	medium	high	high	very good
Multiple		medium	medium	medium	high	good
First	Decomposed	high	high	medium	medium	excellent
Any	Decomposed	high	high	medium	high	excellent
Multiple		medium	low	medium	medium	good
Multiple	Separating Exclusion	high	high	medium	high	excellent
Unique		medium	medium	high	high	very good
Unique		high	medium	high	high	excellent
First		high	medium	medium	high	very good
Any		high	medium	medium	medium	good
Unique		medium	medium	high	medium	good
Unique with default		medium	medium	high	medium	good
Incomplete with default		medium	medium	medium	medium	good
Compact		medium	low	medium	low	low
More Compact		medium	low	low	low	low
First		high	medium	medium	medium	good
Unique		medium	medium	high	medium	very good
Multiple		medium	medium	medium	medium	good
First	Decomposed	high	high	medium	low	good

*Note 1: DMN Power

- * All this is possible in DMN, in a standardized way, and immediately executable from the model.
- * With all these possibilities, it is important to understand and exchange each other's models. So, follow the DMN conventions.
- * Methodology should not be blind for objectives.

* Model transformations and optimizations

Lots of conversions/transformations/optimizations already exist:

- * From tables to optimal code (Codasyl 1982)
- * Decision table mining (1998, 2003)
- * Lifecycle of hit policies (1988)
- * Normalization of decision tables (1993)
- * Decision models and business processes (2007)
- * Factoring/Defactoring of decision models (1996)
- * Decision model mining (2015)
- * Mixed-paradigm process modeling (2016)
- * Verification of tables (1998)
- * Verification between tables (1998)
- * From rules to tables (1982, 1993)
- * From tables to minimal rules (1986)
- * From logs to decision requirements (2010)
- * Mixed-paradigm mining (2015)
- * Construction methodologies (1986)
- * Decision model dependencies (2012)
- * Rule set consistency (2007)
- * From Knowledge discovery to decision tables (2001, 2005)

* Note 2: Full DMN usage

There is more than the basic big decision : *John Doe is 50 and has 30 years of service, how much does he get?*

The model should also allow to answer:

- * What if I turn 45?
- * Why do I get 27 days?
- * What do I have to change to obtain x days?
- * How do I get the maximum? (optimization)
- * I have incomplete data, what can I already decide/exclude
- * ...

***Thank you**

**and thanks to all who submitted
their model**