

Making the right exceptions

Frank Veltman & Harald Bastiaanse



Institute for Logic, Language and Computation.

University of Amsterdam

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Abstract

In non-monotonic reasoning conflicts between default rules abound. I will present a principled account to deal with them. I will do so in two ways:

- *semantically*, within a circumscriptive theory
- *syntactically*, by supplying an algorithm for inheritance networks

The latter is sound and complete with respect to the first.



Default Reasoning 1

This talk is about sentences of the form

P's are normally Q

Such sentences express **default rules**. Roughly, what they mean is this. Whenever you are confronted with an object with the property P , you may assume it has the property Q as well, provided you have no evidence to the contrary.



Default Reasoning 2

premise 1 P 's are normally R

premise 2 x is P

by default x is R



Default Reasoning 3

premise 1 Master students normally are full time students
premise 2 John is a master student

by default John is a full time student



Default Reasoning 4

premise 1 P 's are normally R

premise 2 x is P and x is Q

by default x is R



Default Reasoning 5

premise 1 P 's are normally R
premise 2 x is P and x is not R

by default



Default Reasoning 6

premise 1 *Q's are normally not R*

premise 2 *P's are normally R*

premise 3 *x is P and x is Q*

by default *???*



Nixon Diamond

<i>premise 1</i>	Republicans are normally not pacifists
<i>premise 2</i>	Quakers are normally pacifists
<i>premise 3</i>	Nixon is a republican and a quaker
<hr/>	
<i>by default</i>	???



Default Reasoning 7

premise 1 *Q's are normally P*
premise 2 *Q's are normally not R*
premise 3 *P's are normally R*
premise 4 *x is P and x is Q*

by default *x is not R*



Default Reasoning 8

premise 1 *Q's are normally P*
premise 2 *Q's are normally not R*
premise 3 *P's are normally R*
premise 4 *x is P*

by default *x is Q, but x is not R*



Weak Tweety Triangle

<i>premise 1</i>	Master students are normally adults
<i>premise 2</i>	Master students are normally not employed
<i>premise 3</i>	Adults are normally employed
<i>premise 4</i>	John is a master student
<hr/>	
<i>by default</i>	John is an adult, but not employed



Strong Tweety Triangle

premise 1 Penguins are birds

premise 2 Penguins cannot fly

premise 3 Birds normally fly

premise 4 Tweety is a penguin

by default Tweety is a bird, but Tweety cannot fly



Circumscription 1

A sentence of the form

P's are normally Q

will be represented by a formula of the form

$$\forall x((Px \wedge \neg Ab_{Px, Qx} x) \rightarrow Qx)$$

If an object satisfies the formula $Ab_{Px, Qx} x$ this means that it behaves *abnormally* with respect to this rule.



More precisely

Let \mathcal{L}_0 be a language of monadic first order logic with finitely many one-place predicates.

We extend the language \mathcal{L}_0 with exception predicates $Ab_{\varphi(x),\psi(x)}$. Here $\varphi(x)$ and $\psi(x)$ are both formulas of \mathcal{L}_0 with one and the same free variable x .

(I omit some technical proviso's here)



Default Rules

A *default rule* is a formula of the form

$$\forall x((\varphi(x) \wedge \neg Ab_{\varphi(x),\psi(x)}x) \rightarrow \psi(x))$$

- $\varphi(x)$ and $\psi(x)$ are formulas of \mathcal{L}_0 in which x is the only free variable.
- $\varphi(x)$ is the **antecedent** and $\psi(x)$ is the **consequent** of the rule.
- $Ab_{\varphi(x),\psi(x)}x$ is the **abnormality clause** of of the rule.



Circumscription 2

Let the models $\mathfrak{A} = \langle \mathcal{D}, \mathcal{I} \rangle$ and $\mathfrak{A}' = \langle \mathcal{D}, \mathcal{I}' \rangle$ be based on the same domain \mathcal{D} . Then \mathfrak{A} *is at least as normal as* \mathfrak{A}' iff for all predicates $Ab_{\varphi(x), \psi(x)}$, $\mathcal{I}(Ab_{\varphi(x), \psi(x)}) \subseteq \mathcal{I}'(Ab_{\varphi(x), \psi(x)})$.

Let \mathcal{S} be a set of models. Then \mathfrak{A} *is optimal in* \mathcal{S} iff there is no $\mathfrak{A}' \in \mathcal{S}$ such that \mathfrak{A}' is more normal than \mathfrak{A} .



Naive Circumscription

$\Delta \models_d \varphi$ iff for all nonempty domains \mathcal{D} , and all models \mathfrak{A} based on \mathcal{D} it holds that if \mathfrak{A} is an *optimal* model of Δ , then \mathfrak{A} is a model of φ .



Normal in some respects, but not in other

<i>premise 1</i>	Adults normally have a bank account
<i>premise 2</i>	Adults normally have a driver's licence
<i>premise 3</i>	John is an adult without a driver's licence
<hr/>	
<i>by default</i>	John is an adult with a bank account



Normal in some respects, but not in other

premise 1 $\forall x((Ax \wedge \neg Ab_{Ax, Bx} x) \rightarrow Bx)$

premise 2 $\forall x((Ax \wedge \neg Ab_{Ax, Dx} x) \rightarrow Dx)$

premise 3 $Aj \wedge \neg Dj$

by default Bj

The example illustrates why the abnormality predicates have two indices, and not just one.



Naive Approach (continued)

This way

$$\begin{aligned} & \forall x((Sx \wedge \neg Ab_{Sx, Ax} x) \rightarrow Ax) \\ & \forall x((Ax \wedge \neg Ab_{Ax, Ex} x) \rightarrow Ex) \\ & \forall x((Sx \wedge \neg Ab_{Sx, \neg Ex} x)) \rightarrow \neg Ex) \\ & Sa \end{aligned}$$

by default $\neg Ea$

is invalid.



What we would like

$$\begin{array}{l} \forall x((Sx \wedge \neg Ab_{Sx, Ax} x) \rightarrow Ax) \\ \forall x((Ax \wedge \neg Ab_{Ax, Ex} x) \rightarrow Ex) \\ \forall x((Sx \wedge \neg Ab_{Sx, \neg Ex} x)) \rightarrow \neg Ex \\ \hline \therefore \forall x(Sx \rightarrow Ab_{Ax, Ex} x) \end{array}$$



Exemption

We will only admit models in which the formula $\forall x(Sx \rightarrow Ab_{Ax,Ex} x)$ is true. This way we enforce the idea that objects with property S , are *exempted* from the default rule that A 's are normally E .

(Think of default rules as normative rules. Students *have to* be adults, adults *have to* be employed, but here an exception is made for students, they *don't have to* be employed, they are not subjected to this rule.)



Strict Rules

Henceforth, I will often write $\forall x(\varphi(x) \rightsquigarrow \psi(x))$ to abbreviate $\forall x((\varphi(x) \wedge \neg Ab_{\varphi(x), \psi(x)} x) \rightarrow \psi(x))$. (Since the abnormality clause is determined by the antecedent and the consequent, we can do so)

Some sentences of the form $\forall x(\varphi(x) \rightarrow \psi(x))$ will get a special status as *strict rules*, rules that don't allow for exceptions.

They are to be distinguished from universal sentences that are accidentally true, and will be treated different from these.



Set up

Let Σ be a set of rules, and Δ be a set of sentences. Think of $I = \langle \Sigma, \Delta \rangle$ as the *information* of some agent at some time, where Σ is the set of rules the agent is acquainted with, and Δ his/her factual information.

We will correlate with I a pair $\langle \mathcal{U}_I, \mathcal{F}_I \rangle$, and call this the (information) *state* generated by I .

\mathcal{U}_I is called the *universe* of the state. The elements of \mathcal{U}_I are models of Σ , but not all models of Σ are allowed. \mathcal{U}_I has to satisfy some additional *constraints*.

\mathcal{F}_I consists of all models in \mathcal{U}_I that are models of Δ .



Set up (continued)

Given this set up we can define validity as follows :

$\Sigma, \Delta \models_d \varphi$ iff for all *optimal* models $\mathfrak{A} \in \mathcal{F}_I$, $\mathfrak{A} \models \varphi$.



Some (technical) notions

- Suppose $\mathfrak{A} \models \forall x(\varphi(x) \rightsquigarrow \psi(x))$, and let d be an element of the domain of \mathfrak{A} . Then d *complies with* $\forall x(\varphi(x) \rightsquigarrow \psi(x))$ (in \mathfrak{A}) iff d does not satisfy $Ab_{\varphi(x),\psi(x)}x$.

Let Δ be a set of default rules, and d an element of the domain of some model \mathfrak{A} for Δ . Then d *complies with* Δ (in \mathfrak{A}) iff d complies with all $\delta \in \Delta$.



Some (technical) notions 2

- Let Σ be a set of rules and $\varphi(x)$ be some formula with one free variable x . $\Sigma\varphi(x)$ is the set of all defaults $\delta \in \Sigma$ with antecedent $\varphi(x)$.

$\Sigma\varphi(x)$ is called the *default theory of $\varphi(x)$ in Σ* .



What we *want*

Minimal Requirement

Suppose it is logically possible for there to exist objects with property P that comply with all rules for objects with property P .

Then if the only factual information about some object is that it has property P , it must at least be valid to infer (by default) that it does comply with all rules for objects with property P .



Exemption Constraint 1

One of the constraints that we have to impose for the Minimal Requirement to be satisfied is this.

Let $\varphi(x)$ a formula with one free variable x and let $\Sigma' \subseteq \Sigma$.

Suppose for all $\mathfrak{A} \in \mathcal{U}_I$ it holds that no object in the domain of \mathfrak{A} satisfies $\varphi(x)$ and complies with $\Sigma' \cup \Sigma\varphi(x)$.

Then for all $\mathfrak{A} \in \mathcal{U}_I$ it holds that no object in the domain of \mathfrak{A} satisfies $\varphi(x)$ and complies with Σ' .



Exemption Constraint 2

Example

Consider $\Sigma = \{\forall x(Sx \rightsquigarrow Ax), \forall x(Sx \rightsquigarrow \neg Ex), \forall x(Ax \rightsquigarrow Ex)\}$

Then $\Sigma^{Sx} = \{\forall x(Sx \rightsquigarrow Ax), \forall x(Sx \rightsquigarrow \neg Ex)\}$

Let $\Sigma' = \{\forall x(Ax \rightsquigarrow Ex)\}$

Clearly, there is no \mathfrak{A} such that some object in the domain of \mathfrak{A} satisfies Sx and complies with $\Sigma' \cup \Sigma^{Sx}$.

This means that all $\mathfrak{A} \in \mathcal{U}_{\mathcal{I}}$ have the property that all objects in the domain of \mathfrak{A} that satisfy Sx , satisfy $Ab_{Ax, Ex}x$.



Exemption Constraint 3

Consider $I = \langle \Sigma, \Delta \rangle$ and let $\Sigma' \subseteq \Sigma$.

Suppose

$$\mathcal{U}_I \models \forall x(\varphi(x) \rightarrow \bigvee_{\delta \in \Sigma' \cup \Sigma\varphi(x)} Ab_\delta x),$$

then

$$\mathcal{U}_I \models \forall x(\varphi(x) \rightarrow \bigvee_{\delta \in \Sigma'} Ab_\delta x)$$



Inheritance constraint (simple form)

The next constraint goes beyond the Minimal Requirement.

Suppose

$$\mathcal{U}_I \models \forall x(\varphi \rightsquigarrow \psi) \text{ and } \mathcal{U}_I \models \forall x(\psi(x) \rightarrow Ab_{\chi(x),\theta(x)} x),$$

then

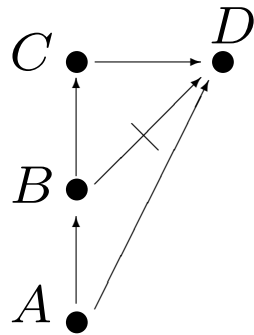
$$\mathcal{U}_I \models \forall x(\varphi(x) \rightarrow Ab_{\chi(x),\theta(x)} x)$$

So, if the φ 's are normally ψ then the φ 's are exempted from all the rules the ψ 's are exempted from.



Inheritance constraint (example)

Suppose we have the following five default rules



$$\forall x((Ax \rightsquigarrow Bx))$$

$$\forall x((Bx \rightsquigarrow Cx))$$

$$\forall x((Cx \rightsquigarrow Dx))$$

$$\forall x((Bx \rightsquigarrow \neg Dx))$$

$$\forall x((Ax \rightsquigarrow Dx))$$

The *exemption constraint* enforces $\forall x(Bx \rightarrow Ab_{Cx, Dx}x)$.

By the *exemption constraint* we also have $\forall x(Ax \rightarrow Ab_{Bx, \neg Dx}x)$.

But, exceptions to exceptions do not count as normal: Applying the *inheritance constraint* we get $\forall x(Ax \rightarrow Ab_{Cx, Dx}x)$.



Inheritance constraint 3

Consider $I = \langle \Sigma, \Delta \rangle$ and let $\Sigma' \subseteq \Sigma$.

Suppose

$$\mathcal{U}_I \models \forall x(\varphi \rightsquigarrow \psi) \text{ and } \mathcal{U}_I \models \forall x(\psi(x) \rightarrow \bigvee_{\delta \in \Sigma'} Ab_\delta x),$$

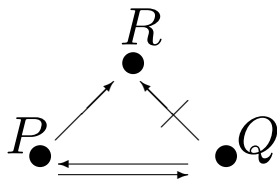
then

$$\mathcal{U}_I \models \forall x(\varphi(x) \rightarrow \bigvee_{\delta \in \Sigma'} Ab_\delta x)$$



Equivalence constraint 1

As things stand now, the Minimal Requirement is not satisfied. Consider the following example



$$\begin{aligned} & \forall x(Px \rightsquigarrow Qx) \\ & \forall x(Qx \rightsquigarrow Px) \\ & \forall x(Px \rightsquigarrow Rx) \\ & \forall x(Qx \rightsquigarrow \neg Rx) \\ & Pa \end{aligned}$$

We would want to conclude Qa and Ra , but we cannot. By the exemption constraint we get $\forall x(Qx \rightarrow Ab_{Px, Rx}x)$. As a consequence there are no models in \mathcal{F}_I in which the object a complies with both the rule $\forall x(Px \rightsquigarrow Qx)$ and the rule $\forall x(Px \rightsquigarrow Rx)$.



Equivalence Constraint (simple form)

We can avoid that such situations can consistently arise by adopting the following constraint.

Suppose both $\forall x(\varphi(x) \rightsquigarrow \psi(x))$ and $\forall x(\psi(x) \rightsquigarrow \varphi(x))$ hold in \mathcal{U}_I .

Then if $\forall x(\varphi(x) \rightsquigarrow \chi(x))$ holds in \mathcal{U} , also $\forall x(\psi(x) \rightsquigarrow \chi(x))$ holds in \mathcal{U}_I .



Equivalence Constraint (general form)

In fact we will adopt something more general.

Let $n > 1$

Suppose for all $1 \leq i < n$

$$\mathcal{U}_{\mathcal{I}} \models \forall x(\varphi_i(x) \rightsquigarrow \varphi_{i+1}(x)), \text{ and } \mathcal{U}_{\mathcal{I}} \models \forall x(\varphi_n(x) \rightsquigarrow \varphi_1(x)),$$

then for all $1 \leq i, j \leq n$

$$\text{if } \mathcal{U}_{\mathcal{I}} \models \forall x(\varphi_i(x) \rightsquigarrow \psi(x)), \mathcal{U}_{\mathcal{I}} \models \forall x(\varphi_j(x) \rightsquigarrow \psi(x))$$



States

Let Σ be a set of rules, and Δ be a set of sentences. The *state* generated by $I = \langle \Sigma, \Delta \rangle$ is the pair $\langle \mathcal{U}_I, \mathcal{F}_I \rangle$ where

- \mathcal{U}_I is the largest class of models of Σ satisfying the three constraints (Exemption, Inheritance, Equivalence) discussed.
- \mathcal{F}_I is the class of all models in \mathcal{U}_I that are models of Δ .



Some examples

Both *Defeasible Modus Ponens* and *Defeasible Modus Tollens* are valid.

$$\frac{\forall x((Px \rightsquigarrow Qx) \quad Pa)}{\therefore Qa}$$

$$\frac{\forall x((Qx \rightsquigarrow \neg Px) \quad Pa)}{\therefore \neg Qa}$$



Some Examples 2

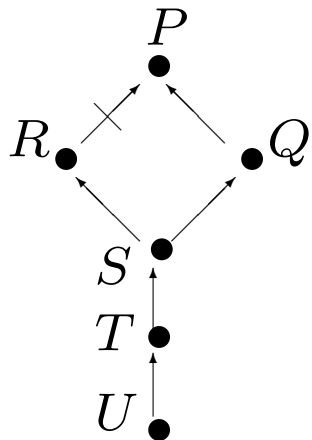
$$\frac{\begin{array}{l} \forall x((Px \rightsquigarrow Qx) \\ \forall x((Qx \rightsquigarrow \neg Px) \\ Pa \end{array}}{\therefore Qa}$$

Defeasible Modus Ponens beats *Defeasible Modus Tollens*! It does not follow from the premises that $\neg Pa$. The exemption constraint enforces that $\mathcal{U}_I \models \forall x(Px \rightarrow Ab_{Qx, \neg Px} x)$.



Some examples 3

This example illustrates the Inheritance Principle



$$\forall x(Rx \rightsquigarrow \neg Px)$$

$$\forall x(Qx \rightsquigarrow Px)$$

$$\forall x(Sx \rightsquigarrow Rx)$$

$$\forall x(Sx \rightsquigarrow Qx)$$

$$\forall x(Tx \rightsquigarrow Sx)$$

$$\forall x(Ux \rightsquigarrow Tx)$$

$$Ua$$

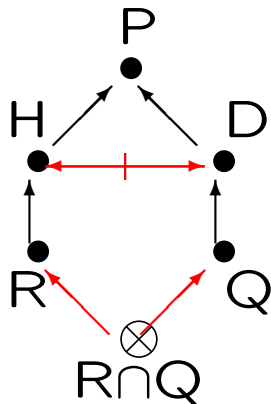
$$\therefore Ra \wedge Qa$$

Exemption enforces $\forall x(Sx \rightarrow (Ab_{Rx, \neg Px}x \vee Ab_{Qx, Px}x))$.

2 x Inheritance gives $\forall x(Ux \rightarrow (Ab_{Rx, \neg Px}x \vee Ab_{Qx, Px}x))$.



A floating conclusion

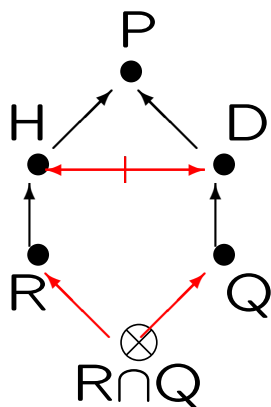


Quakers are normally doves
Republicans are normally hawks
Nobody can be both a hawk and a dove
Hawks are normally politically motivated
Doves are normally politically motivated
Nixon is a republican quaker

Is Nixon politically motivated?



A floating conclusion (continued)



The exemption constraint enforces that in all models Nixon has either the property $Ab_{Rx,Hx}$ or the property $Ab_{Qx,Dx}$.

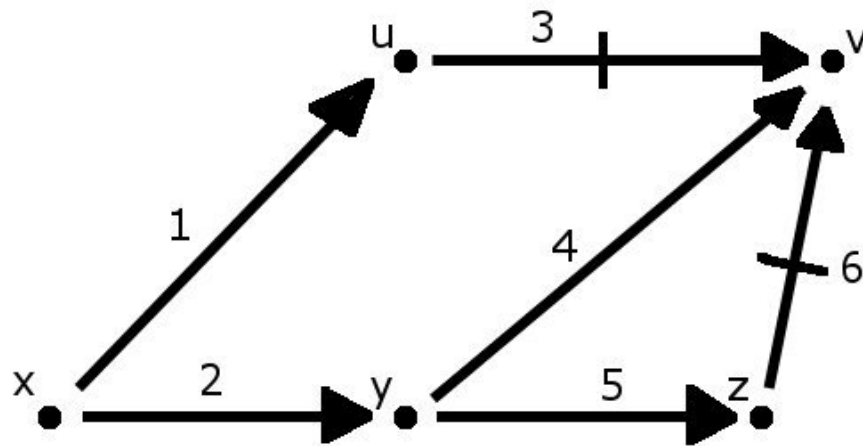
In the optimal models he will be abnormal in only one of these respects and perfectly normal in the other respect.

So, yes, presumably Nixon is politically motivated.



Networks - basics

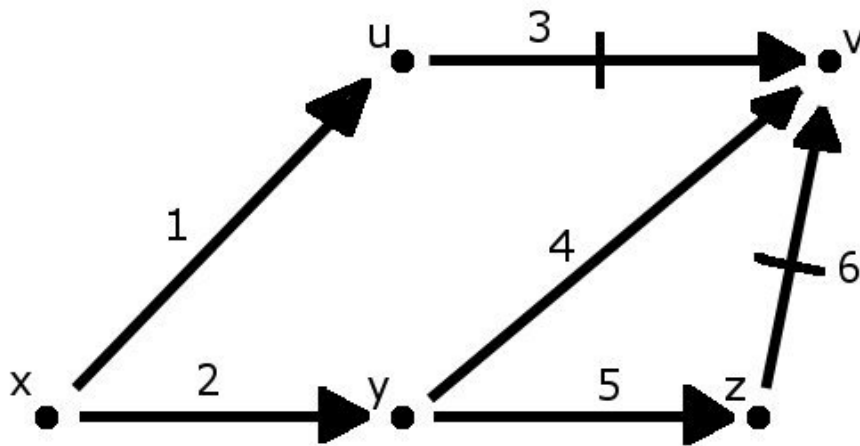
An **inheritance network** is a directed graph where the arrows represent default rules. Nodes may represent individuals or properties. Specifically marked arrows are used for negative rules and for strict rules.





Networks - basics

Paths bring you from a given premise to a 'prima facie' conclusion. There are positive paths and negative paths. Where these contradict, some arrows must be eliminated.





Networks - algorithm

For any node x , $Min(x)$ consists of the strict rules of the network and the arrows starting at x . Where a set of rules allows for contradicting conclusions when starting from x , it is concluded that x is an exception to one of the other rules in that set but not in $Min(x)$.

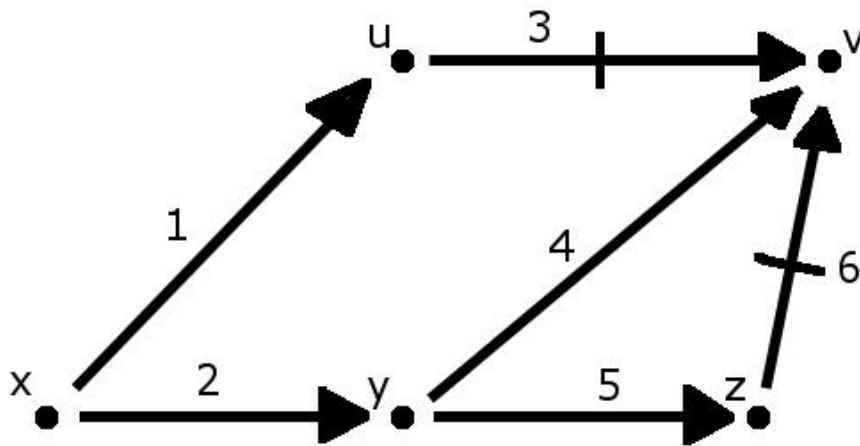
Exceptions are inherited: if Q 's are an exception to a given rule (or to at least one rule in a given set) and P 's are normally Q 's, then P 's are an exception to that rule (to one of those rules).

The inheritance principle makes a Backward Induction approach ideal.



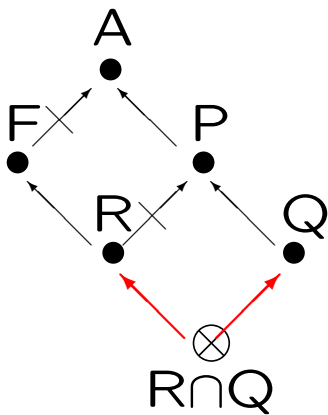
Networks - algorithm

Rather than spelling the algorithm out, I will show you how it works on the blackboard.





An example with a 'zombie path'



Quakers are normally pacifists
Republicans are normally not pacifists
Republicans are normally football fans
Pacifists are normally anti-military
Football fans are normally not anti-military
Nixon is a republican quaker