Formalizing reachability, viability and avoidability in the context of sequential decision problems

Nicola Botta

Outline

- Why formalizing what?
- Minimal goals
- Sequential decision problems
- Reachability, viability and avoidability
- Decision procedures
- Wrap-up

- ▶ International emissions trading: Good or bad?, Holtsmark & Sommervoll, 2012: "[...] we find that an agreement with international emissions trading leads to increased emissions and reduced efficiency."
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- Confronting Climate Change: Avoiding the Unmanageable and Managing the Unavoidable, P. Raven, R. Bierbaum, J. Holdren, UN-Sigma Xi Climate Change Report, 2007.

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- ► mitigation: "A human intervention to reduce the sources or enhance the sinks of greenhouse gases" ⇒ avoid high atmospheric GHG concentrations
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But what does it mean (for atmospheric GHG concentrations) to be avoidable?



"Die Rolle der Klimaforschung bleibt weiterhin, die Problemfakten auf den Tisch zu knallen und Optionen für geeignete Lösungswege zu identifizieren."

H.-J. Schellnhuber in Frankfurter Allgemeine from 2012-06-19

But how can we produce "hard facts" if the notions used to phrase specific, concrete problems are ambiguous, devoid of precise, well established, meanings?

► Explain what it means for future (possibly harmful) states to be avoidable [reachable, viable, ...]

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Further questions, goals

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Further questions, goals

Can one exploit decidability to derive useful avoidability (levity?) measures?

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Further questions, goals

- Can one exploit decidability to derive useful avoidability (levity?) measures?
- Can one refine decidable notions of viability, avoidability to derive decidable notions (measures?) of sustainability, adaptability, resilience?

Sequential decision problems (intuition)

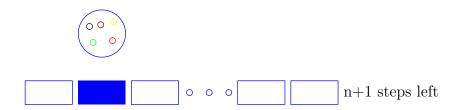
Sequential decision problems (intuition)



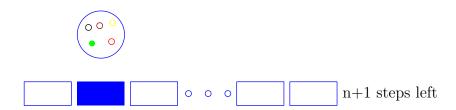
You are here...



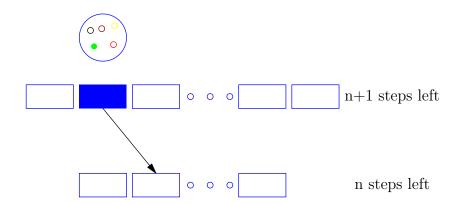
These are your options. . .



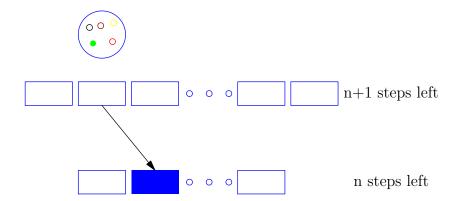
Pick one!



Advance one step. . .



... collect rewards ...



...and go!



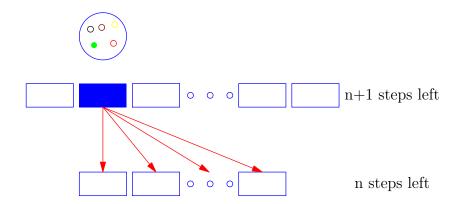
n steps left

General sequential decision problems (intuition)

This intuition is a bit too simplistic . . .

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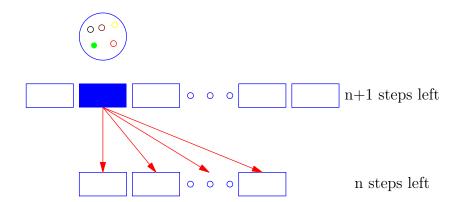
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Notation (language)

Idris	set theory, logic
A : Type	A is a set
a : A	$a \in A$
$f:A\to B$	f:A o B
b = f a	b=f(a)
(a+b)*c	(a+b)*c
P : Type	P is a predicate
p : P	p is a proof of P
$p:P \rightarrow Void$	p is a proof of $\neg P$
$P \rightarrow Q$	P implies Q
$P:A \rightarrow Type$	P is a predicate on A
pa : P a	pa is a proof of $P(a)$
(a : A ** P a)	there exists an $a \in A$ such that $P(a)$ holds
$(a:A) \rightarrow Pa$	forall $a \in A$, $P(a)$ holds

Figure: Curry-Howard correspondence relating Idris and set theory, logic.



At each decision step, a set of possible states:

$$X:(t:\mathbb{N})\to \mathit{Type}$$

At each decision step, a set of possible states:

$$X:(t:\mathbb{N}) o \mathit{Type}$$

At each decision step and for each state, a set of options

$$Y:(t:\mathbb{N})\to(x:X\;t)\to \mathit{Type}$$

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A transition function

$$step: (t : \mathbb{N}) \rightarrow (x : X t) \rightarrow (y : Y t x) \rightarrow M(X(S t))$$

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What are M and S?

Sequential decision problems (uncertainties)

S t is just the successor of *t*:

data \mathbb{N} : Type where

 $Z:\mathbb{N}$

 $S : \mathbb{N} \to \mathbb{N}$

Sequential decision problems (uncertainties)

S t is just the successor of *t*:

```
data \mathbb{N}: Type where \mathbb{Z} : \mathbb{N}
```

 $S: \mathbb{N} \to \mathbb{N}$

 $M: Type \rightarrow Type$ represents the uncertainties of the problem:

- deterministic problems: M = Id
- ▶ non-deterministic problems: M = List
- ▶ stochastic problems: *M* = *Prob*

Sequential decision problems (uncertainties)

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- deterministic problems: M = Id
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```
data Prob : Type \rightarrow Type where mkProb : (as : Vect n a) \rightarrow (ps : Vect n Float) \rightarrow sum\ ps = 1.0 \rightarrow Prob\ a
```

Sequential decision problems (container monad)

 $fmap: (a \rightarrow b) \rightarrow Ma \rightarrow Mb$

ret : $a \rightarrow Ma$

Formally, M is a container monad, that is M is a monad:

```
bind : Ma \rightarrow (a \rightarrow Mb) \rightarrow Mb
join : M(Ma) \rightarrow Ma
  functorSpec1 : fmap \circ id = id
    functorSpec2: fmap (f \circ g) = (fmap \ f) \circ (fmap \ g)
    monadSpec1 : (fmap f) \circ ret = ret \circ f
  monadSpec2: bind (ret a) f = f a
    monadSpec3: bind ma ret = ma
    monadSpec4: \{f: a \rightarrow Mb\} \rightarrow \{g: b \rightarrow Mc\} \rightarrow \{g
                                                                                                                                                                                                                          bind (bind ma f) g = bind ma (\lambda x \Rightarrow bind (f x) g)
    monadSpec5: join mma = bind mma id
```

Sequential decision problems (container monad)

and M is a container:

Elem: $a \rightarrow M a \rightarrow Tvpe$

```
All : (a \rightarrow Type) \rightarrow M a \rightarrow Type
```

```
containerSpec1: a 'Elem' (ret a) containerSpec2: a 'Elem' ma \rightarrow ma 'Elem' mma \rightarrow a 'Elem' (join mma) containerSpec3: All p ma \rightarrow a 'Elem' ma \rightarrow p a
```

Sequential decision problems (basic notions)

Thus, a concrete sequential decision problem is defined (up to the rewards) in terms of 4 entities: X, Y, M and step

$$X:(t:\mathbb{N})\to \mathit{Type}$$

$$Y:(t:\mathbb{N}) \rightarrow (x:X\;t) \rightarrow \mathit{Type}$$

$$M: \mathit{Type} \rightarrow \mathit{Type}$$

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Sequential decision problems (basic notions)

Thus, a concrete sequential decision problem is defined (up to the rewards) in terms of 4 entities: X, Y, M and step

$$Y:(t:\mathbb{N}) o (x:X\;t) o \mathit{Type}$$

$$M: \mathit{Type} \rightarrow \mathit{Type}$$

 $X:(t:\mathbb{N})\to Type$

$$step: (t:\mathbb{N}) \rightarrow (x:X\;t) \rightarrow (y:Y\;t\;x) \rightarrow M(X\;(S\;t))$$

We formalize reachability, viability and avoidability in terms of these notions

Reachability and viability (intuition)

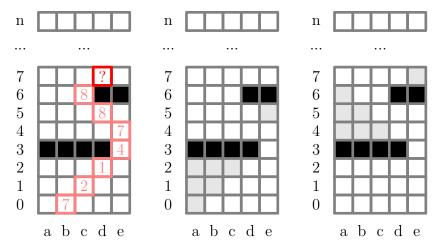


Figure: Possible evolution starting from b (left), states with limited viability (middle) and unreachable states (right).

Predecessor relation, reachability and viability

The (possible) predecessor relation:

```
\begin{array}{ll} \textit{Pred} \; : \; X \; t \; \rightarrow \; X \; (S \; t) \; \rightarrow \; \textit{Type} \\ \textit{Pred} \; \{t\} \; x \; x' = (y \; : \; Y \; t \; x \; ** \; x' \; `\textit{Elem'} \; (\textit{step} \; t \; x \; y)) \end{array}
```

Predecessor relation, reachability and viability

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```

reachability

```
Reachable : X \ t' \rightarrow Type
Reachable \{ t' = Z \} \ x' = Unit
Reachable \{ t' = S \ t \} \ x' = (x : X \ t ** (Reachable x, x 'Pred' x'))
```

Predecessor relation, reachability and viability

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```

and viability

```
Viable : (n : \mathbb{N}) \to X \ t \to Type

Viable \{t\} \ Z \ x = Unit

Viable \{t\} \ (S \ m) \ x = (y : Y \ t \ x ** All \ (Viable \ m) \ (step \ t \ x \ y))
```

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- ▶ The notion of avoidability entails the notion of an alternative.

We are interested in the avoidability of states which are reachable from some given state:

```
ReachableFrom : X \ t'' \rightarrow X \ t \rightarrow Type
ReachableFrom \{t'' = Z\} \{t\} \ x'' \ x = (t = Z, x = x'')
ReachableFrom \{t'' = S \ t'\} \{t\} \ x'' \ x =
Either (t = S \ t', x = x'')
(x' : X \ t' ** (x' `ReachableFrom` x, x' `Pred` x''))
```

where

data Either a
$$b = Left \ a \mid Right \ b$$

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Proof of concept: show that

reachableFromLemma :
$$(x'':X\ t'') \rightarrow (x:X\ t) \rightarrow x''$$
 'ReachableFrom' $x \rightarrow t''$ 'GTE' t

The notion of avoidability entails the notion of an alternative state x''. This has to fulfill three conditions:

```
AvoidableFrom: (x':X\ t') \rightarrow (x:X\ t) \rightarrow x' 'ReachableFrom' x \rightarrow (m:\mathbb{N}) \rightarrow Type

AvoidableFrom \{t'\}\ x' \times r \ m = (x'':X\ t' **(x'' 'ReachableFrom' <math>x , (Viable m\ x'' , Not (x'' = x'))))
```

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```

Back to the minimal goals: under which conditions are reachability, viability and avoidability decidable?

For every type (predicate) P: Type, Not P is just a synonym for $P \rightarrow Void$:

```
Not : Type \rightarrow Type
Not P = P \rightarrow Void
```

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Not : Type
$$\rightarrow$$
 Type
Not $P = P \rightarrow Void$

A predicate P: Type is decidable if one can compute either a value p: P or a value of type Not P:

```
Decidable : Type \rightarrow Type
Decidable P = Either P (Not P)
```

Thus, the question is under which conditions one can implement

```
decReachable: (x:Xt) \rightarrow Decidable (Reachable x) decViable: (n:\mathbb{N}) \rightarrow (x:Xt) \rightarrow Decidable (Viable n x) decAvoidableFrom: \{t':\mathbb{N}\} \rightarrow \{t:\mathbb{N}\} \rightarrow (x':Xt') \rightarrow (x:Xt) \rightarrow (r:x' `ReachableFrom` x) \rightarrow (n:\mathbb{N}) \rightarrow Decidable (AvoidableFrom \{t'\} \{t\} x' x r n)
```

As one would expect, the conditions

$$fX:(t:\mathbb{N}) o Finite(X t)$$
 $fY:(t:\mathbb{N}) o (x:X t) o Finite(Y t x)$
 $decElem:\{t:\mathbb{N}\} o (x:X t) o (mx:M(X t)) o Decidable(x'Elem'mx)$
 $decAll:\{t:\mathbb{N}\} o (P:X t o Type) o ((x:X t) o Decidable(P x)) o (mx:M(X t)) o Decidable(All P mx)$

are sufficient for decidability.

The key lemma for implementing decision procedures for Reachable, Viable and AvoidableFrom is intuitively obvious

```
 \begin{array}{cccc} \textit{finiteDecidableLemma} &: \{A : \textit{Type}\} & \to \\ & \{P : A \rightarrow \textit{Type}\} & \to \\ & \textit{Finite } A \rightarrow \\ & ((a : A) \rightarrow \textit{Decidable } (P \textit{ a})) \rightarrow \\ & \textit{Decidable } (a : A ** P \textit{ a}) \end{array}
```

The key lemma for implementing decision procedures for Reachable, Viable and AvoidableFrom is intuitively obvious

```
finiteDecidableLemma: \{A: Type\} 
ightarrow \{P: A 
ightarrow Type\} 
ightarrow Finite A 
ightarrow ((a: A) 
ightarrow Decidable (Pa)) 
ightarrow Decidable (a: A ** Pa)
```

but implementing finiteDecidableLemma is not trivial!

With *finiteDecidableLemma*, *fY* and decidability of *Elem* one immediately has decidability of *Pred*

```
decPred: \{t: \mathbb{N}\} \rightarrow (x: X t) \rightarrow (x': X (S t)) \rightarrow Decidable (x'Pred'x')

decPred \{t\} \times x' = finiteDecidableLemma (fY t x) prf where

prf: (y: Y t x) \rightarrow Decidable (x''Elem'(step t x y))

prf y = decElem x' (step t x y)
```

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```

Remember

$$Pred \{t\} \times x' = (y : Y t \times ** x' `Elem` (step t \times y))$$

and, with

```
decPair : Decidable p \rightarrow Decidable q \rightarrow Decidable (p, q)
decidability of Reachable:
   decReachable: \{t': \mathbb{N}\} \rightarrow (x': X \ t') \rightarrow Decidable (Reachable x')
   decReachable \{t' = Z\} x' = Left()
   decReachable \{t' = S \ t\} \ x' = s1 where
     s1 : Decidable (x : X t ** (Reachable x, x 'Pred' x'))
     s1 = finiteDecidableI emma
           (fX t)
           (\lambda x \Rightarrow decPair (decReachable x) (decPred x x'))
```

Similarly, one can implement (prove) decidability of Viable:

```
decViable : \{t : \mathbb{N}\} \rightarrow (n : \mathbb{N}) \rightarrow (x : X t) \rightarrow Decidable (Viable n x)
decViable \{t\} \ Z \ x = Left \ ()
decViable \{t\} \ (S \ m) \ x = s3 \ \text{where}
s1 : (y : Y t \ x) \rightarrow Decidable \ (All \ (Viable \ m) \ (step \ t \ x \ y))
s1 \ y = decAll \ (Viable \ m) \ (decViable \ m) \ (step \ t \ x \ y)
s2 : Decidable \ (y : Y t \ x \ ** All \ (Viable \ m) \ (step \ t \ x \ y))
s2 = finiteDecidableLemma \ (fY t \ x) \ s1
s3 : Decidable \ (Viable \ (S \ m) \ x)
s3 = s2
```

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s1 \ y = decAll \ (Viable \ m) \ (decViable \ m) \ (step \ t \ x \ y)
s2 : Decidable \ (y : Y t \ x ** All \ (Viable \ m) \ (step \ t \ x \ y))
s2 = finiteDecidableLemma \ (fY t \ x) \ s1
s3 : Decidable \ (Viable \ (S \ m) \ x)
s3 = s2
```

Implementing a decision procedure for *AvoidableFrom* is a bit more complicated but conceptually equivalent.

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- It is not difficult to formalize viability, reachability and avoidability for a large class of decision problems.
- ► The specific aspects of a concrete decision problem are captured by four abstractions: *X*, *Y*, *M* and *step*.
- In particular, different kinds of uncertainty (for instance, of the models underlying step) are covered by M, a monadic container.
- For finite X and Y decision procedures for viability, reachability and avoidability can be derived rigorously.
- Decidable generic [viability, reachability, avoidability] notions are hopefully a good starting point for deriving decidable domain specific notions: sustainability, adaptability, resilience,

. . .

Acknowledgments

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These slides:

https://github.com/nicolabotta/SeqDecProbs/tree/master/talks/2015.06.rd4_seminar

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The code shown in these slides:

https://github.com/nicolabotta/SeqDecProbs/blob/master/talks/2015.06.rd4_seminar/code/Theory.lidr