Chalmers | GÖTEBORGS UNIVERSITET Andreas Abel, Computer Science and Engineering

Advanced Functional Programming TDA342/DIT260

Wednesday, June 11, 2025, 8:30 - 12:30, Lindholmen

(including example solutions to programming problems)

- Examiner: Andreas Abel (+46-31-772-1731)
- Teacher Evan Cavallo visits 9:30 and 11:30.
- The maximum amount of points you can score on the exam: 60 points. The grade for the exam is as follows:

Chalmers: 3: ≥ 24 points, 4: ≥ 36 points, 5: ≥ 48 points.

GU: Godkänd ≥ 24 points, väl godkänd ≥ 48 points.

PhD student: ≥ 36 points to pass.

- Results: within 21 days.
- Permitted materials (Hjälpmedel): Dictionary (Ordlista/ordbok).

You may bring up to two pages (on one A4 sheet of paper) of pre-written notes – a "summary sheet". These notes may be typed or handwritten. They may be from any source. If this summary sheet is brought to the exam it must also be handed in with the exam (so make a copy if you want to keep it).

• Notes:

- Read through the exam sheet first and plan your time.
- Answers preferably in English, some assistants might not read Swedish.
- If a question does not give you all the details you need, you may make reasonable assumptions. Your assumptions must be clearly stated. If your solution only works under certain conditions, state them.
- Start each of the questions on a new page.
- The exact syntax of Haskell is not so important as long as the graders can understand the intended meaning. If you are unsure just put in an explanation of your notation.
- Hand in the summary sheet (if you brought one) with the exam solutions.
- Exam review: please contact the examiner.

Background: Probability Distributions

A probability distribution for a sample space Ω assigns a probability $p \in [0;1]$ to each event from the sample space. In general, an event is a subset of the sample space, but we will confine ourselves to elementary events $\omega \in \Omega$. Further, the probability may be different from 0 only for a finite number such events. Finally, we consider only rational probabilities $p \in \mathbb{Q}$. These restrictions allows us to represent distributions simply as weighted lists:

```
type P = Rational

type D \ a = [Weighted \ a]

data Weighted \ a = W \ \{weight :: P, event :: a\}

deriving (Eq)
```

Such a weighted list is a proper probability distribution if the weights sum to 1. For instance, the probability distribution of a fair (aka Laplace) coin is given by:

```
data Coin = Heads \mid Tails

deriving (Eq, Bounded, Enum)

coinFlip :: D \ Coin

coinFlip = [W \ (1 \ / \ 2) \ Heads, W \ (1 \ / \ 2) \ Tails]
```

More generally, for a finite type (like *Coin*) we can define the *uniform* distribution that assigns each event the same probability.

```
uniformD :: (Enum\ a, Bounded\ a) \Rightarrow D\ a
uniformD = map\ (W\ p)\ events
\mathbf{where}
events = [minBound ... maxBound]
p = 1\ /\ fromIntegral\ (length\ events)
```

Thus, coinFlip = uniformD :: D Coin.

The *Bernoulli distribution* assigns an event a given probability p and its opposite the counterprobability 1 - p.

```
bernoulliD :: P \rightarrow D \ Bool

bernoulliD \ p = [W \ p \ True, W \ (1-p) \ False]
```

Given two independent events, their joint probability can be computed as the product of the individual events:

```
\begin{array}{l} crossD::D\ a\rightarrow D\ b\rightarrow D\ (a,b)\\ crossD\ da\ db=\left[\ W\ (pa*pb)\ (a,b)\ |\ W\ pa\ a\leftarrow da,\ W\ pb\ b\leftarrow db\ ] \end{array}
```

For example, rolling two 6s with a standard die gives the following distribution, interpreting *True* as one 6:

```
double6 :: D (Bool, Bool)

double6 = crossD sixD sixD

sixD :: D Bool

sixD = bernoulliD (1 / 6)
```

double6 evaluates to the following distribution:

```
[ W (1 % 36) (True, True)
, W (5 % 36) (True, False)
, W (5 % 36) (False, True)
, W (25 % 36) (False, False)]
```

If we have a valuation $f: \Omega \to \mathbb{Q}$ of events and a probability distribution $d: \Omega \to [0; 1]$ we can compute the *expected value* as the sum:

$$\sum_{\omega \in \Omega} d(\omega) \cdot f(\omega)$$

Generalizing the valuation to $f: \Omega \to M$ where M is any module, meaning it is an additive monoid with scaling scale $p = p \cdot _$, we obtain the function

```
runD :: Module \ m \Rightarrow (a \rightarrow m) \rightarrow D \ a \rightarrow m

runD \ f = foldMap\lambda(W \ p \ x) \rightarrow scale \ p \ (f \ x)
```

(foldMap:: Monoid $m \Rightarrow (a \rightarrow m) \rightarrow [a] \rightarrow m$ does the summation using the monoidal <>.) The definition of modules shall be given by the Module class:

```
class (Monoid m, Scale m) \Rightarrow Module m where class Scale m where scale :: P \rightarrow m \rightarrow m
```

The simplest module are the rationals themselves:

```
instance Semigroup \ Rational \ where (<>)=(+) instance Monoid \ Rational \ where mempty=0 instance Scale \ Rational \ where scale=(*) instance Module \ Rational
```

As an example of an expected value, let us consider a game with 2 dice with an initial payment 1 EUR where you get your 1 EUR back if you roll one 6 but get 10 EUR if you roll two 6s:

(Aside question: Is this game fair?)

Problem 1 (20p): (Probability Monad)

Probability distributions can be seen as monad similar to the non-determinism monad. A monadic value like coinFlip::D Coin can be seen as choosing Heads or Tails non-deterministically with their associated probabilities (which are both $\frac{1}{2}$ in this case). Using the Monad D instance, example double6 can be written as:

```
double6 :: D (Bool, Bool)

double6 = \mathbf{do}

x \leftarrow sixD

y \leftarrow sixD

return (x, y)
```

ightharpoonup Task: Define Functor, Applicative and Monad instances for D.

(Note: GHC would require a **newtype** definition like **newtype** D a = D [Weighted a] but you are welcome to use the plain type synonym **type** D a = [Weighted a] to save you some writing.)

SOLUTION:

```
mapEvent :: (a \rightarrow b) \rightarrow Weighted \ a \rightarrow Weighted \ b
mapEvent f (W p a) = W p (f a)
mapD :: (a \rightarrow b) \rightarrow D \ a \rightarrow D \ b
mapD f = map (mapEvent f)
returnD :: a \rightarrow D \ a
returnD \ a = [W \ 1 \ a]
zip With D :: (a \rightarrow b \rightarrow c) \rightarrow D \ a \rightarrow D \ b \rightarrow D \ c
zipWithD\ f\ da\ db = [\ W\ (pa*pb)\ (f\ a\ b)\ |\ W\ pa\ a \leftarrow da,\ W\ pb\ b \leftarrow db]
apD :: D (a \rightarrow b) \rightarrow D \ a \rightarrow D \ b
apD = zip WithD (\$)
bindD :: D \ a \rightarrow (a \rightarrow D \ b) \rightarrow D \ b
bindD \ da \ k = [W \ (pa * pb) \ b \ | \ W \ pa \ a \leftarrow da, W \ pb \ b \leftarrow k \ a]
instance Functor D where
   fmap = mapD
instance Applicative D where
   pure = returnD
   (\langle * \rangle) = apD
instance Monad D where
   (\gg) = bindD
```

Problem 2 (15p): (Application: Risk)

In the popular boardgame Risk battles are fought between the armies of the attacker and the armies of the defender by rolling standard dice.

```
data Die = D6 \mid D5 \mid D4 \mid D3 \mid D2 \mid D1
deriving (Eq, Ord, Show, Bounded, Enum)
```

In reach round, attacker and defender both role a number of dice limited by the number of their armies. (In the game, the maximum number of dice is capped to 3 for the attacker, and for the defender to 2.) The dice of attacker and defender are sorted descendingly and then compared positionwise. A lower number causes an army loss, in case of a draw the attacker loses.

For instance, if the attacker rolls 641 and the defender 54, each loses one army. If the attacker rolls 66 and the defender 6, just the attacker loses an army. If the attacker rolls 331 and the defender 21, the defender loses two armies.

To implement a Risk simulation, we represent the outcome of one round by the following record:

```
\begin{aligned} \textbf{data} \ \textit{Outcome} &= \textit{Outcome} \\ \{ \textit{defenderLosses} :: Rational} \\ , \ \textit{attackerLosses} \ :: Rational \} \end{aligned}
```

► Task: Write functions

```
riskD :: Int \rightarrow Int \rightarrow D \ Outcome
riskE :: Int \rightarrow Int \rightarrow Outcome
```

that given the number of attacker and defender dice return a probability distribution riskD and expected value riskE for the outcome of a round.

You may use standard Haskell functions freely (from packages like base shipped with GHC).

```
SOLUTION:
  dieD :: D Die
  dieD = uniformD
  instance Semigroup Outcome where
    Outcome d1 a1 <> Outcome d2 a2 = Outcome (d1 + d2) (a1 + a2)
  instance Monoid Outcome where
    mempty = Outcome \ 0 \ 0
  instance Scale Outcome where
    scale\ s\ (Outcome\ x\ y) = Outcome\ (s*x)\ (s*y)
  instance Module Outcome
    -- Outcome for one army if 'True' is interpreted as attacker winning.
  outcome :: Bool \rightarrow Outcome
  outcome\ True = Outcome\ 1\ 0
  outcome\ False = Outcome\ 0\ 1
  riskD nA nD = do
    as \leftarrow sort \langle \$ \rangle replicateM \ nA \ dieD
```

```
ds \leftarrow sort \, \langle \$ \rangle \ replicateM \ nD \ dieD
\mathbf{let} \ attackerWins = zipWith \ (>) \ as \ ds
return \, \$ \ foldMap \ outcome \ attackerWins
riskE \ nA \ nD = runD \ id \, \$ \ riskD \ nA \ nD
```

Problem 3 (20p): (Monad laws)

ightharpoonup Task: Prove the 3 monad laws for D using step-by-step equational reasoning. Each step must be explicitly justified, either by "definition" or "computation", by appeal to some theorem or already proven property, or by some (induction) hypothesis.

```
SOLUTION:
   prop\_return\_bind :: Eq \ b \Rightarrow a \rightarrow (a \rightarrow D \ b) \rightarrow Proof \ (D \ b)
   prop\_return\_bind\ a\ k = proof
       (bindD (returnD \ a) \ k)
                                                                                            \equiv \langle Def bindD \rangle
        W (pa * pb) b \mid W pa \ a \leftarrow returnD \ a, W \ pb \ b \leftarrow k \ a ] \equiv \langle Def \ returnD \rangle \equiv
        W(pa*pb) b \mid Wpa a \leftarrow [W1a], Wpb b \leftarrow ka] \equiv \langle Conv
                                                                                                                      \geq
        W(1*pb) b \mid W pb b \leftarrow k a
                                                                                            \equiv \langle Conv \rangle
                                                                                                                      \geq
        [W \ pb \ b \mid W \ pb \ b \leftarrow k \ a]
                                                                                            \equiv \langle Conv \rangle
                                                                                                                      \geq
       (k \ a)
   prop\_bind\_return :: Eq \ a \Rightarrow D \ a \rightarrow Proof \ (D \ a)
   prop\_bind\_return\ d = proof
       (bindD \ d \ returnD)
                                                                                         \equiv \langle Def bindD \rangle
                                                                                                                      \geq
        \geq \equiv
        W(pa*pb) b \mid W pa a \leftarrow d, W pb b \leftarrow [W 1 a]
                                                                                        \equiv \langle Conv \rangle
                                                                                                                      \geq \equiv
        W(pa*1) \ a \mid W \ pa \ a \leftarrow d
                                                                                         \equiv \langle Conv \rangle
                                                                                                                      \geq \equiv
       [W pa a \mid W pa a \leftarrow d]
                                                                                         \equiv \langle Conv \rangle
                                                                                                                      \geq
       d
   prop\_bind\_assoc :: Eq \ c \Rightarrow D \ a \rightarrow (a \rightarrow D \ b) \rightarrow (b \rightarrow D \ c) \rightarrow Proof \ (D \ c)
   prop\_bind\_assoc\ d\ f\ q = proof
       (bindD \ (bindD \ d \ f) \ q)
                                                                                                               \equiv \langle Def bindD \rangle
       [W (p * pc) c \mid W p b \leftarrow bindD d f, W pc c \leftarrow g b]
                                                                                                               \equiv \langle Def bindD \rangle
                                                                                                                                             ⟩≣
       [W(p*pc)c]
           \mid W \mid p \mid b \leftarrow [W \mid (pa * pb) \mid b \mid W \mid pa \mid a \leftarrow d, W \mid pb \mid b \leftarrow f \mid a]
           , W \ pc \ c \leftarrow g \ b
                                                                                                               \equiv \langle Conv \rangle
                                                                                                                                             \rangle \equiv
       [W((pa*pb)*pc)c \mid Wpa a \leftarrow d, Wpb b \leftarrow fa, Wpc c \leftarrow gb] \equiv \langle Thm "assoc*"
                                                                                                                                             ⟩≣
        W(pa*(pb*pc)) c \mid W pa a \leftarrow d, W pb b \leftarrow f a, W pc c \leftarrow g b \equiv \langle Conv \rangle
                                                                                                                                             ⟩≣
       [W(pa*p)c]
           \mid W \mid pa \mid a \leftarrow d
           , W p c \leftarrow [W (pb * pb) c \mid W pb b \leftarrow f a, W pc c \leftarrow g b]]
                                                                                                               \equiv \langle Def bindD \rangle
                                                                                                                                            ⟩≡
       [W(pa*p) c \mid W pa a \leftarrow d, W p c \leftarrow bindD(f a) g]
                                                                                                               \equiv \langle Def bindD \rangle
                                                                                                                                            ⟩≡
       (bindD \ d \ (\lambda a \rightarrow bindD \ (f \ a) \ g))
```

Problem 4 (5p): (More efficient representation of distributions)

Suppose we define **type** D a = Map a P to use $tree\ maps$ instead of lists for the representation of the distribution.

- ► Task: Answer the following questions:
 - 1. Which constraints are placed on a to enable such a representation?
 - 2. What formal problem would we run into when trying to define the Monad instance for this D?
 - 3. How can we (at least partially) address this problem?

SOLUTION:

- 1. Type a needs to be a decidable linear order, i.e., it needs to implement $Ord\ a$.
- 2. The type of bind is D $a \to (a \to D$ $b) \to D$ b, but to construct a distribution D b over b we would need b to be ordered. Yet the type does not accommodate an Ord b constraint. Worse, the type of idiomatic application is D $(a \to b) \to D$ $a \to D$ b and generally there is no decidable order on functions.
- 3. We could add the constraint to the type of bind in our own definition of "monads of ordered types". However, the **do** notation would likely not be available.

```
class OMonad\ m\ where
returnO:: a \to m\ a
bindO:: Ord\ b \Rightarrow m\ a \to (a \to m\ b) \to m\ b
```

Idiomatic application cannot be salvaged, but we can implement applicative functors using lift A2.

```
class OFunctor m where mapO :: Ord \ b \Rightarrow (a \rightarrow b) \rightarrow m \ a \rightarrow m \ b class OApplicative m where pureO :: a \rightarrow m \ a liftA2O :: Ord \ c \Rightarrow (a \rightarrow b \rightarrow c) \rightarrow m \ a \rightarrow m \ b \rightarrow m \ c
```