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```
typedef enum {Nil_t,Cons_t} List* Nil () {
                                  List* 1 = (List*) malloc(sizeof(List));
                  Tagtype;
typedef struct L
                                  1->tag = Nil_t;
                                  return(1);}
 Tagtype tag;
   struct {
                              List* Cons (int hd, List* tl) {
                                  List* 1 = (List*) malloc(sizeof(List));
     int head;
     struct L* tail;
                                  1->tag = Cons_t;
   1:
                                  1->head = hd;
} List;
                                  1->tail = tl;
                                  return(1):}
int main ()
   int i; List* l = Nil();
   i = 10;
   while (i > 0) 1 = Cons (i--, 1);}
```

Lists in C

```
typedef enum {Nil_t,Cons_t}
                  Tagtype;
typedef struct L
  Tagtype tag;
  struct {
    int head;
    struct L* tail;};
} List:
List* Cons (int hd, List* tl)
List* 1 = (List*) malloc(sizeof(1)):
1->tag = Cons_t;
1->head = hd:
```

Lists in Haskell

```
data List a = Nil | Cons a (List a)
```

- Defines a polymorphic type List a.
- List is a type constructor.
- Nil and Cons are data constructors.
 They also serve the role of tags.
- | is disjoint union.

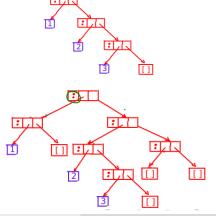
```
data [a] = [] | a : [a]

(Cons cell | Nil memory cell | Nil memory
```

1->tail = tl;

return(1);}

- [] is a shorthand for Nil.
- [1,2,3] is a shorthand for 1:(2:(3:[])).
- 1:(2:(3:[])) is Haskell notation for Cons 1 (Cons (2 (Cons 3 [])).



length

```
length [] = 0
length (x:xs) = 1 + length xs
sum
```

```
length [] = 0
length (x:xs) = 1 + length xs

sum [] = 0
sum(x:xs) = x + sum xs

product
```

```
length [] = 0
length (x:xs) = 1 + length xs

sum [] = 0
sum(x:xs) = x + sum xs

product [] = 1
product(x:xs) = x * product xs

[] ++ ys
```

```
length [] = 0
length (x:xs) = 1 + length xs
sum | \Pi = 0
sum(x:xs) = x + sum xs
product [] = 1
product(x:xs) = x * product xs
[] ++ ys = ys
(x:xs)++ys = x:(xs ++ ys)
```

reverse

```
length [] = 0
                               map
length (x:xs) = 1 + length xs
sum | \Pi = 0
sum(x:xs) = x + sum xs
product [] = 1
product(x:xs) = x * product xs
[] ++ ys = ys
(x:xs)++ys = x:(xs ++ ys)
reverse [] = []
reverse(x:xs) = reverse xs ++ x
```

```
length [] = 0
                     map f [] = []
length (x:xs) = 1 + length xs map f (x : xs) = f x : map f xs
sum [] = 0
                             filter
sum(x:xs) = x + sum xs
product [] = 1
product(x:xs) = x * product xs
[] ++ ys = ys
(x:xs)++ys = x:(xs ++ ys)
reverse [] = []
reverse(x:xs) = reverse xs ++ x
```

```
length [] = 0
                      map f [] = []
length (x:xs) = 1 + length xs map f (x : xs) = f x : map f xs
sum [] = 0
                            filter p [] = []
sum(x:xs) = x + sum xs
                             filter p (x:xs)
                                 | p x = x:(filter p xs)
product [] = 1
                                 | otherwise = (filter p xs)
product(x:xs) = x * product xs
[] ++ ys = ys
(x:xs)++ys = x:(xs ++ ys)
reverse [] = []
reverse(x:xs) = reverse xs ++ x
```

The foldr function

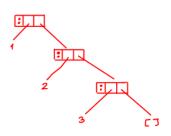
foldr - the natural abstraction of list processing functions:

```
foldr f id [] = id
foldr f id (x:xs) = f x (foldr f id xs)
```

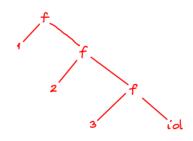
```
length 1 = foldr (\x y -> 1 + y) 0 1
l1 ++ 12 = foldr ...
reverse 1 = foldr ...
map f 1 = foldr ...
filter p 1 = foldr ...
```

What does foldr do?

[1,2,3]



foldr f id [1,2,3]



Other List Processing Functions

```
xs !! n | n < 0 = error "negative index"
[] !! n = error "index too large"
(x:xs) !! 0 = x
(x:xs) !! n = xs !! (n-1)
take 0 _ = []
take _ [] = []
take (n + 1) (x:xs) = x : take n xs
zip [] 12 = []
zip 11 [] = []
zip (x:xs) (y:ys) = (x,y) : zip xs ys
takeWhile p [] = []
takeWhile p (x:xs) = if (p x) then x : takewhile p xs else []
```

dropWhile p [] = []

List Comprehensions

```
We wanted a function dropWhile' which satisfied
dropWhile' p l = (dropWhile p l, l)
Now we wanted to express dropWhile' as a foldr, i.e.
dropWhile' p l = foldr g id l
Let us calculate g and id.
id = dropWhile' p [] = (dropWhile p [], [])
Now dropWhile' p (x:xs)
 = (dropWhile p (x:xs), (x:xs))
 = (if (p x) then dropWhile p xs else x:xs, x:xs)
 = if (p x) then (dropWhile p xs, x:xs) else (x:xs, x:xs)
 = if (p x) then (dropWhile p xs), x:xs) else (x:xs, x:xs)
 = if (p x) then (d, x:1) else (x:xs, x:xs)
         where (d, 1) = dropWhile' p xs -- and 1 = xs
Extract the g
```

g x (d,1) = if (p x) then (d, x:1) else (x:1, x:1) \bigcirc

List Comprehensions

```
[x * x | x < -[1.2.3.4.5]] = [1.4.9.16.25]
[x * x | x < [1,2,3,4,5], even x] => [4,16]
[x + y \mid x \leftarrow [1,2,3], y \leftarrow [6,7]] \Rightarrow [7,8,8,9,9,10]
gsort [] = []
qsort (x:xs) = qsort lows ++ [x] ++ qsort highs
      where lows = [y \mid y \leftarrow xs, y \leftarrow x]
             highs = [y \mid y \leftarrow xs, y > x]
fib = 0:1:[x + y \mid (x,y) \leftarrow zip fib (tail fib)]
fib = 0:1:[x + y | x \leftarrow fib, y \leftarrow (tail fib)]
```

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List Comprehension

The eight queens problem

Reasoning about Functional Programs

Universal property of foldr:

```
e [] = id \Leftrightarrow e = foldr f id
e (x:xs) = f x (e xs)
```

```
<= foldr f id is a solution of the equations on the left
```

>= foldr f id is the only solution of the equations on the left

Reasoning about Functional Programs

Universal property of foldr:

```
e [] = id \Leftrightarrow e = foldr f id e (x:xs) = f x (e xs)
```

- <= foldr f id is a solution of the equations on the left
- >= foldr f id is the only solution of the equations on the left

One can prove many interesting results using this property

- 1 (+ 1).sum = foldr (+) 1
- if h w = v and h (g x y) = f x (h y), then
 h.(foldr g w) = foldr f v.
- 3 map s.map t = map (s.t)
- map s.concat = concat.map (map s)



Reasoning about Lists

```
inits: Finds all initial segments of a list.

inits [] = [[]]
inits (x:xs) = [] : (map (x:) inits xs)

tails: Finds all tail segments of a list

tails [] = [[]]
tails (x:xs) = (x:head 1):1
   where 1 = tails xs
```

Can you express heads and tails using foldr?

Reasoning about Functional Programs

scanl/scanr: Accumulating foldl/foldr. *n* times the time taken to apply f on a list element.

```
scanl f id l = map (foldl f id ) (inits l)
scanr f id l = map (foldr f id ) (tails l)
```

foldr1: Fold without identity element

```
foldr1 f (x:xs) = if null xs then x else f x (foldr1 f xs)
```

Reasoning about Functional Programs

Bookkeeping law: If **f** is associative with identity **a**. Then:

```
foldr f a . concat = foldr f a . map (foldr f a)
```

Generalized Horner's rule:

```
1 + x_0 + x_0 * x_1 + x_0 * x_1 * x_2 + x_0 * x_1 * x_2 * x_3 - foldr 1 + . scanl * 1
= 1 + x_0 * (1 + x_1 * (1 + x_2 * (1 + x_3))) - foldr f 1 where f x y = 1 + x * y
```

Under what conditions is:

```
foldr1 \oplus .scanl \otimes id the same as foldr \odot id
   where x \odot y = id \oplus (x \otimes y)?
```

Answer:

- **1** id should be the identity element of \otimes .
- \bigcirc should distribute over \oplus .

The maximum segment sum problem

Given a sequence of integers, find the maximum of the sum of all (contiguous) segments.

Example:

```
mss [-1, 2, -3, 5, -2, 1, 3, -2, -2, -3, 6] = 7
```

An obviously correct but inefficient definition of mss:

```
mss = maximum . map sum . segs
segs = concat . map inits . tails
```

- tails -O(n)
- 2 map inits $O(n^3)$, assuming O(n) sublists, each of length O(n)
- **3** concat $O(n^2)$, assuming O(n) sublists, each of length O(n).
- **1** map sum $O(n^3)$, assuming $O(n^2)$ sublists, each of length O(n).

Reasoning about Functional Programs

```
mss = maximum . map sum . concat . map inits . tails
       {map f . concat = concat . map (map f)}
    = maximum . concat . map (map sum) . map inits . tails
       \{map f . map g = map (f . g)\}
    = maximum . concat . map (map sum . inits) . tails
       {maximum = foldr max -infinity}
    = maximum . map maximum . map (map sum . inits) . tails
       \{map f . map g = map (f . g)\}
    = maximum . map (maximum . map sum . inits) . tails
       \{map sum . inits = scanl (+) 0\}
    = maximum . map (maximum . scanl (+) 0) . tails
       {maximum = foldr1 max}
       \{ 0 \text{ is id for } + \}
       { + is associative}
       { + distributes over max}
    = maximum . map (foldr f 0) . tails
        where f x y = 0 'max' (x+y)
    = maximum . scanr f 0
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                         Functional Programming With Lists
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```

A Sudoku solver

As an example of

- List processing
- Backtracking in lazy languages

Reference: FUNCTIONAL PEARL - A program to solve Sudoku, RICHARD BIRD

www.cs.tufts.edu/~nr/comp150fp/archive/richard-bird/sudoku.pdf

The Board

```
column
board1 = [['2', '.',
    box-
            ['3', '1', '.'<mark>,</mark> '.',|'.',| '.', '8', '.', '.'],
            ['.', '5', '.', '.', '6', '9', '7', '8', '4'],
```

type Matrix a = [[a]]
type Board = Matrix Char

Characterizing a correct solution

Some constants

```
boxsize = 3:: Int
allvals = "123456789"
blank c = c == '.'
```

A Board is correct, if each row, each column and each box is free of duplicates.

Characterizing a correct solution

```
rows = id
cols makes rows of columns:
cols [] = replicate 9 []
cols (r:rs) = zipWith (:) r (cols rs)
boxes makes rows of boxes:
      board1 = [['2', '.', '.', '.', '.', '1', '1', '3', '8'],
                 ['.', '7', '.', '.', '.', '6', '.', '.', '.'],
['.', '.', '.', '.', '.', '.', '.', '1', '3'],
                 ['.', '9', '8', |1', '.', '.', '2', '5', '7'],
                 ['3', '1', '.', '.', '.', '.', '8', '.', '.'],
['9', '.', '.', '8', '.', '.', '.', '2', '.'],
                 ['.', '5', '.', '.', '6', '9', '7', '8', '4'],
                 ['4', '.', '.', '2', '5', '.', '.', '.', '.', '.']]
```

Characterizing a correct solution

```
boxes = map unchop . unchop . map cols . chop . map chop
chop :: [a] -> [[a]]
chop = chopBy boxsize
  where chopBy bsize [] = []
        chopBy bsize 1 = (take bsize 1) :
                          (chopBy bsize (drop bsize 1))
unchop = concat
Notice that rows, cols or boxes done twice gives identity.
rows . rows = id
cols . cols = id
boxes = id
```

Choices

A Choice is a list of characters, that represent the choices for a cell

 Intially, the choices for a blank cell are all possible characters, and the choices for a non-blank cell is the only character in the cell.

From a Matrix of Choices, we want to generate all possible boards.

How does one do that?

type Choices = [Char]

Easier problem: From a list of choices, how does one generate all possible list?

Choices

```
cp :: [[a]] -> [[a]] -- cp for cartesian product
cp[] = [[]]
cp (x:xs) = [h:t | h <- x, t <- (cp xs)]
How can one use cp, to calculate the matrix cartesian product, mcp?
mcp :: Matrix [a] -> [Matrix a]
Surprisingly, mcp is easy to define using cp?
mcp = cp (map cp)
map cp converts a Matrix of choices into
 [ list of possible first rows
  list of possible second rows
  list of possible ninth rows]
```

cp converts it into possible matrix of Boards

Choices

A Sudoku solver takes a board and returns all possible completions of the board. Returns [] if there are none.

```
sudokusolver1 :: Board -> [Board]
--sudokusolver - first attempt
sudokusolver1 = filter correct . mcp . initialChoices
```

Pruning

We would like to do pruning of the following form:

24	2	34	12
34	234	134	13
124	23	13	4
14	123	123	3

4	2	34	1
34	34	134	1
12	3	13	4
14	1	12	3

This is one time pruning.

Given a row, column or a box, we collect all the fixed choices and remove these from the non-fixed choices.

```
fixed :: [Choices] -> Choices -- fixed identifies fixed choices
fixed = concat . filter single
    where single [_] = True
        single _ = False
```

Pruning

pruneList takes a list of choices and prunes it into a list of choices:

Now pruneMatrix prunes each row, each column and each box using pruneList

24	2	34	12
34	234	134	13
124	23	13	4
14	123	123	3

24	2	34	234

4	2	34	12
34	34	134	13
124	23	13	4
14	123	123	3

Pruning

The rows pruning can be done by

```
rows . map pruneList . rows
```

Similarly for pruning by columns and boxes. We therefore abstract:

```
pruneBy f = f . map pruneList . f
pruneMatrix = pruneBy boxes. pruneBy cols . pruneBy rows

sudokusolver2 :: Board -> [Board]
sudokusolver2 = filter correct.mcp .pruneMatrix.initialChoices
```

plug in your own pruning strategy here

$\textbf{Expand} \rightarrow \textbf{Prune} \rightarrow \textbf{Expand} \rightarrow \textbf{Prune}$



Expand



Expand ---







Prune

4	2	3	1
34	34	14	1
12	3	1	4
14	1	12	3

Blocked

Blocked

Expand \rightarrow **Prune** \rightarrow **Expand** \rightarrow **Prune**

Take a Choice Matrix that has a cell with at least two (say x) choices, and generate x Choice Matrices with fixed choice for this cell.

expand :: Matrix Choices -> [Matrix Choices]

Sometimes a Choice Matrix can be blocked. Conditions are

- 1. No choices for a cell,
- 2. Same fixed choices in more than one cells in row, col or box.

We shall discard blocked matrices during expansion and pruning.

$\textbf{Expand} \rightarrow \textbf{Prune} \rightarrow \textbf{Expand} \rightarrow \textbf{Prune}$

$Expand \rightarrow Prune \rightarrow Expand \rightarrow Prune$

To expand, we select the first cell that has the minimum number of choices amongst all cell which have more than one choices.

```
minchoice = minimum . filter ( > 1) . concat . map (map length)
```

A choice list is a candidate for expansion if its length is the same as the minimum. We pick the first candidate for-- expansion. This goes as follows:

The Final Solution

```
board1
              initialChoices
                   search
                   expand
       cm1
   pruneMatrix
                            This part of the
                            tree is not expanded
      search
                                  search cm | blocked cm = []
      expand
                                              | all (all single) cm = [cm]
                                              | otherwise = (concat .
 cm3
              cm4
                                                              map (search . pruneMatrix) .
                                                              expand) cm
          pruneMatrix
uneMatrix
             search
 search
                                  sudokusolver3 = map (map head) .
   11
              [cm4]
                                                     head . search .
                                                     initialChoices
```