

Functional Programming

Patrick Bahr

Monads &
Computation Expressions

Based on original slides by Jesper Bengtson

Last week

Last week

- Mutual Recursion

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- Mutual Recursion
- Sequences
 - ▶ Lazy evaluation
 - ▶ Sequence expressions

This week

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- Monads
 - ▶ How to abstract common programming patterns
 - ▶ Analogy: "Railway-oriented programming"

This week

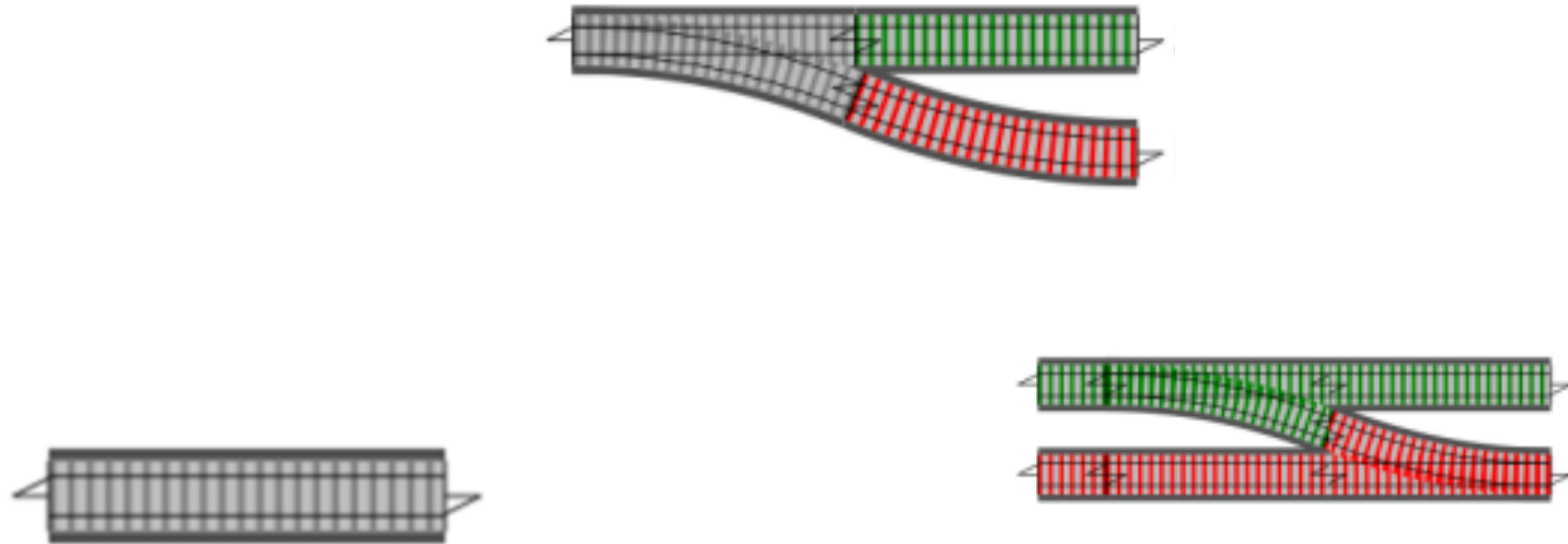
- Monads
 - ▶ How to abstract common programming patterns
 - ▶ Analogy: "Railway-oriented programming"
- Computation expressions
 - ▶ Ergonomic syntax for monads & similar structures

Part I

Railway-Oriented Programming

Credit where credit is due

Thanks to Scott Wlaschin for the use of his railway images
from his site *F# for fun and profit*



What to do when things go wrong

```
type aExp =  
| N of int  
| V of string  
| Add of aExp * aExp  
| Sub of aExp * aExp  
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Recall Exercise 3.2: write a function

`arithEvalState : aExp -> Map<string,int> -> int`

that evaluates arithmetic expressions

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Observation:

- Map.find throws an exception if a key is not found
- Option types are generally better

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type aExp =  
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| V of string  
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We want return type `int option` instead.

```
let rec eval (e : aExp) s : int =  
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Let's refactor this implementation a bit.

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```
let rec eval (e : aExp) s : int =
  match e with
  | N n           -> n
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  | Add (a1, a2)  -> binop ( + ) (eval a1) (eval a2) s
  | Sub (a1, a2)  -> binop ( - ) (eval a1) (eval a2) s
  | Mul (a1, a2)  -> binop ( * ) (eval a1) (eval a2) s
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```
let binop f a b s =
  f (a s) (b s)

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  f (a s) (b s)

let rec eval (e : aExp) (s : Map<string,int>) : int =
  match e with
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  | V x           -> Map.find x s
  | Add (a1, a2)  -> binop (+) (eval a1) (eval a2) s
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What to do when things go wrong

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```
let binop f a b s =
  f (a s) (b s)

let rec eval (e : aExp) : Map<string,int> -> int =
  match e with
  | N n           -> fun _ -> n
  | V x           -> Map.find x
  | Add (a1, a2)  -> binop (+) (eval a1) (eval a2)
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What is the type of binop?

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Now we are ready to change eval so that
it returns `int option` instead of `int`

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What to do when things go wrong

```
let binop f a b s =
  match a s, b s with
  | Some x, Some y -> Some (f x y)
  | _, _               -> None

let rec eval (e : aExp) : Map<string,int> -> int option =
  match e with
  | N n                 -> fun _ -> Some n
  | V x                 -> Map.tryFind x
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binop changed
to accommodate
option type

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```

Some n instead of n
Map.tryFind instead of Map.find

where Map.tryFind : 'a -> Map<'a,'b> -> 'b option

Let's add division

```
let binop f a b s =
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  | Div (a1, a2) ->  
    fun s -> match eval a1 s, eval a2 s with  
    | Some x, Some y when y <> 0 -> Some (x / y)  
    | _, _ -> None
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Almost the same
as **binop**, but
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 $y \neq 0$

Let's add division

```
let binop f a b s =
  match a s, b s with
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```

```
let m
m
|
```

This is getting hairier.

Matches against `Some` and `None` are starting to permeate the program and this will only get worse

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To sum up

- We can account for errors using **option type**
- But: This may require some **refactoring**

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- We can account for errors using **option type**
- But: This may require some **refactoring**
- This is a **common pattern** when implementing
 - ▶ error handling
 - ▶ computations with state (e.g. `Map<string,int>`)
 - ▶ ...
- There is a general technique to **encapsulate** these patterns ...

Part IB

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Monads

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**programmable
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<do this> ;  
<then do this> ;  
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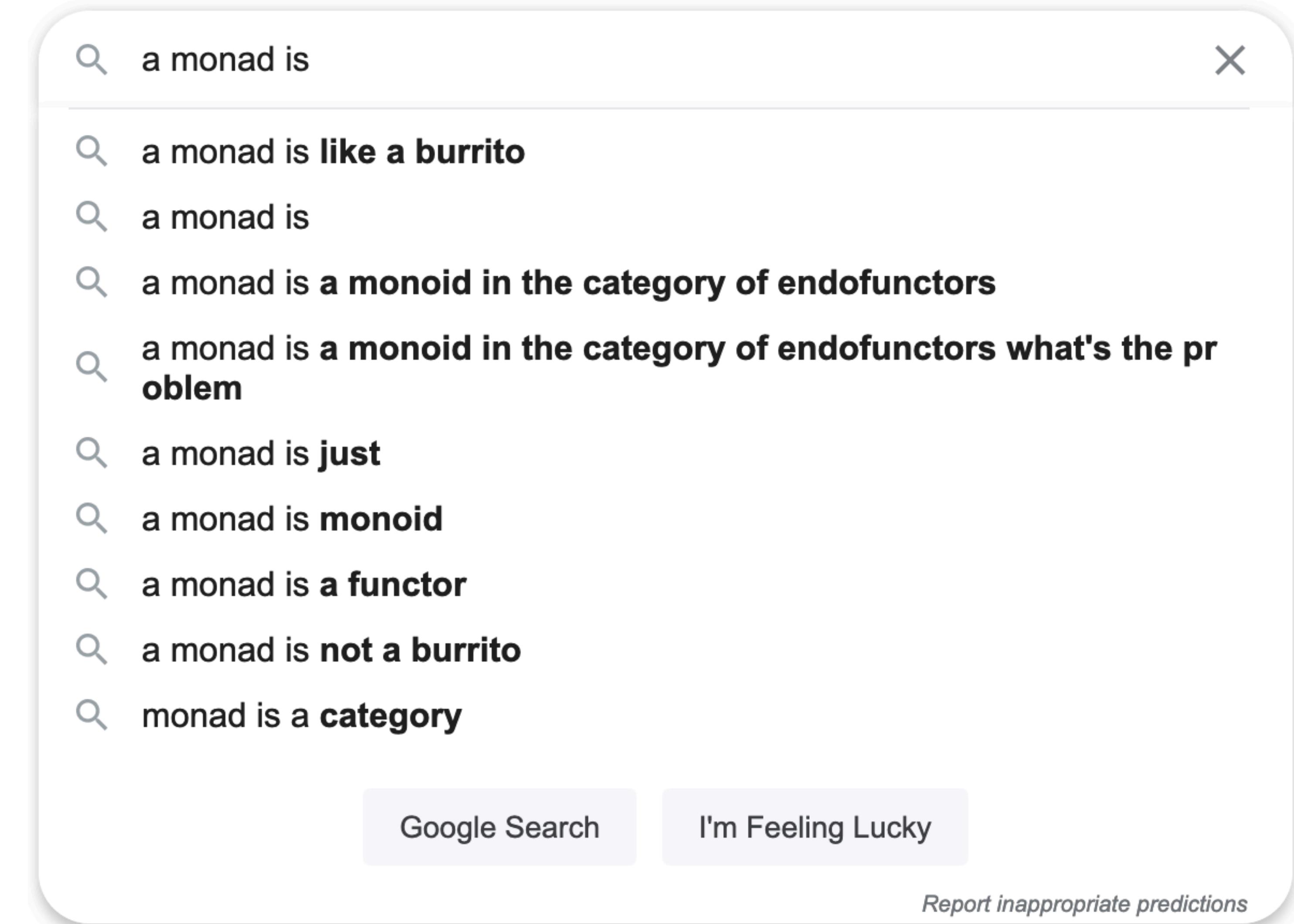
**programmable
semicolons**

<do this> ;

<then do this> ;

...

What should ";" do?



🔍 a monad is

×

🔍 a monad is **like a burrito**

🔍 a monad is

🔍 a monad is **a monoid in the category of endofunctors**

○ a monad is **a monoid in the category of endofunctors what's the pr**

We will use an analogy to help us
work with monads.

Report inappropriate predictions

Railway-oriented programming

- Observation: Many functions have two kinds of outputs (success and error)
- Idea:
 - ▶ *Focus* on the success path.
 - ▶ Propagate errors to the top *automatically*.

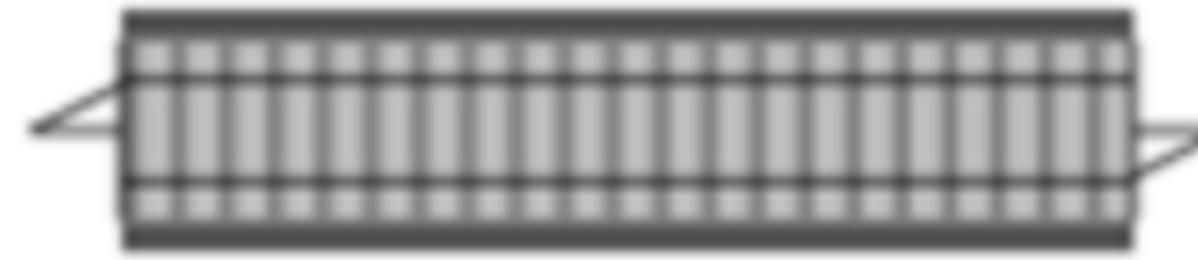


Functions as railways

A “**normal**” function is just a straight railway with one input and one output

$$'a \rightarrow 'b$$

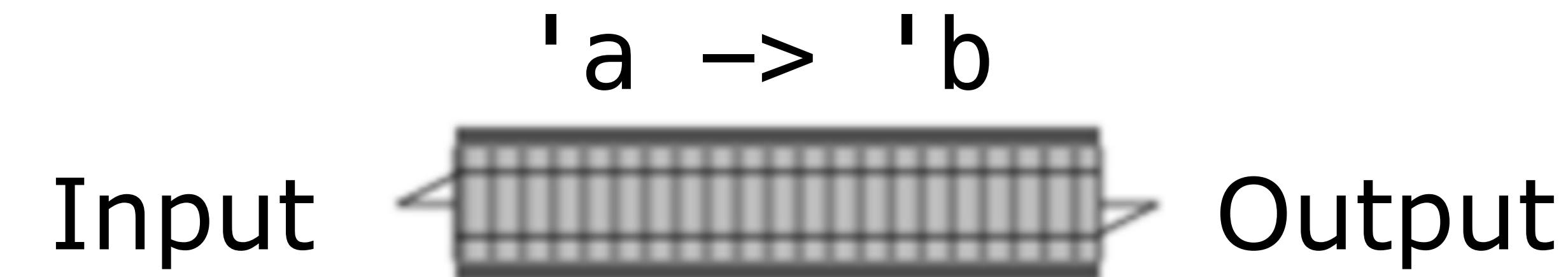
Input



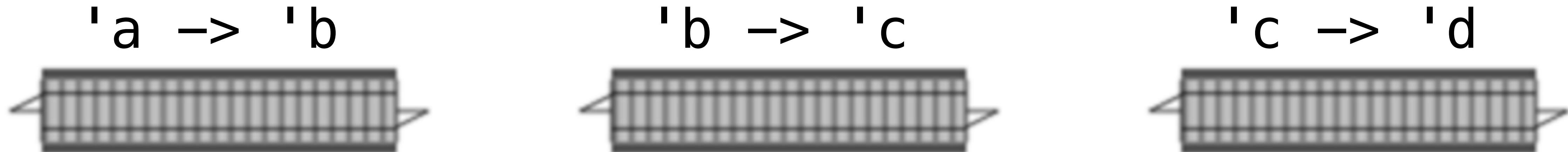
Output

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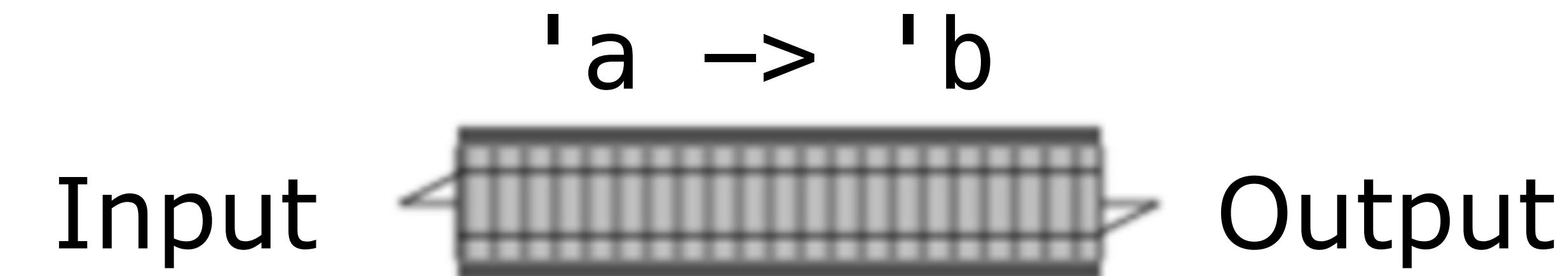


We can lengthen the track using **function composition**:

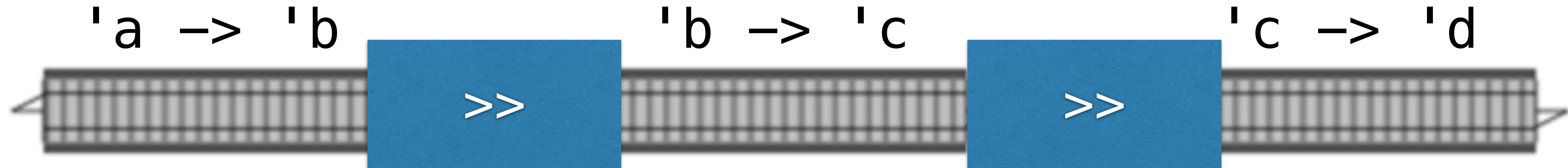


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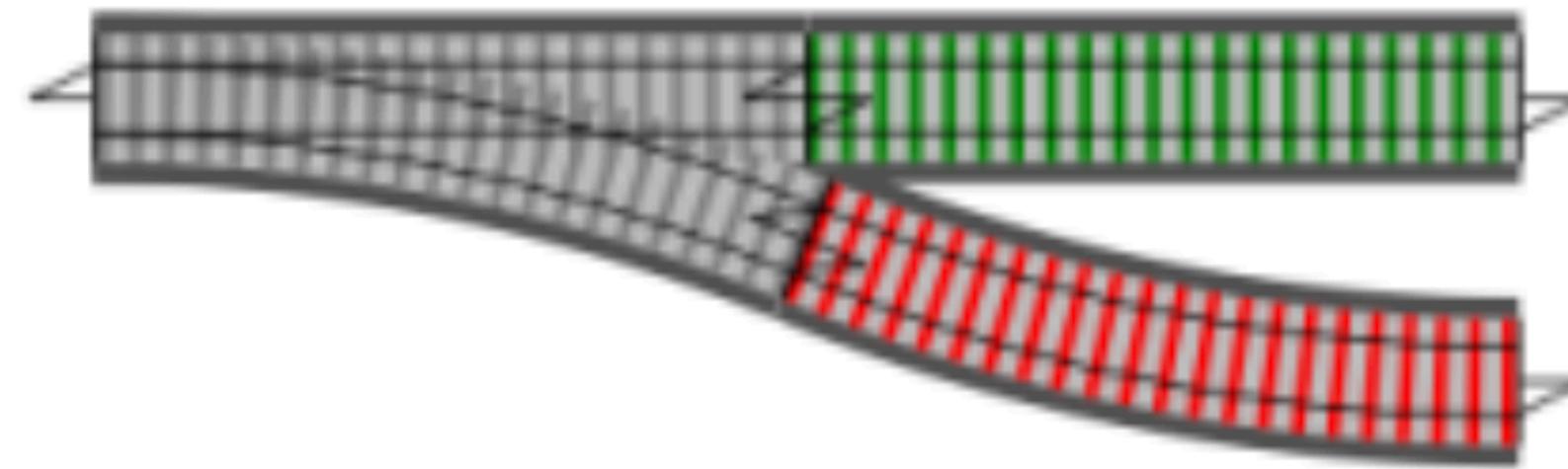


Functions as railways

A function that returns an option type can be seen as a
railway switch

$'a \rightarrow 'b \text{ option}$

Input



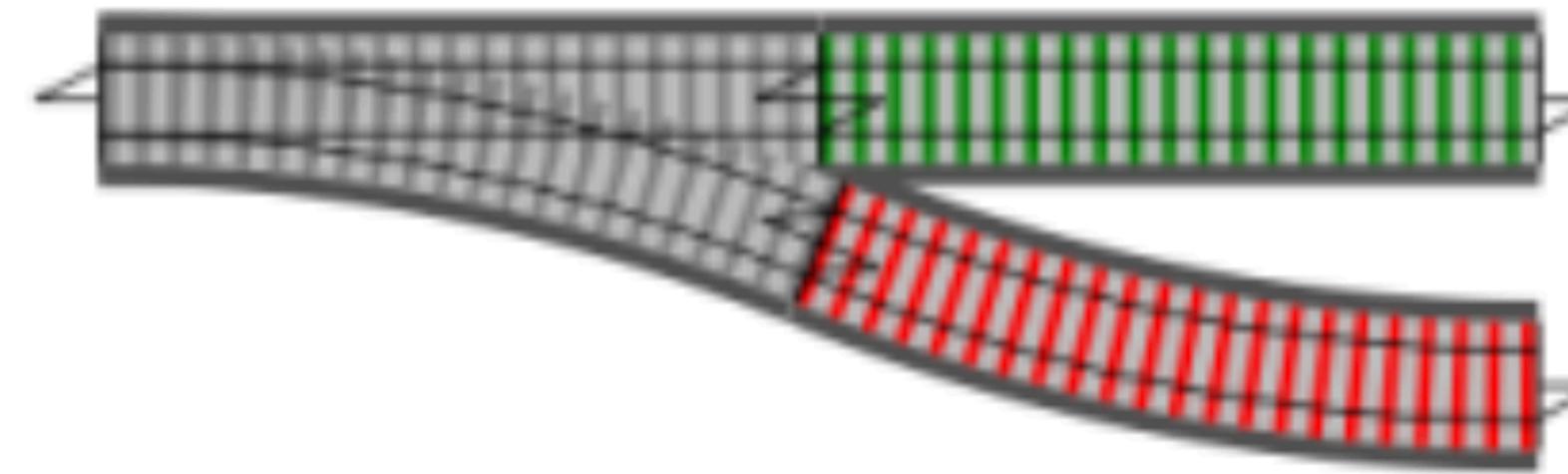
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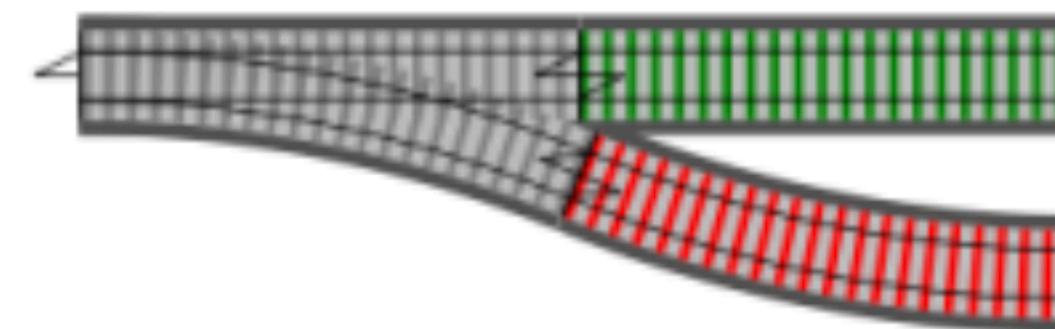
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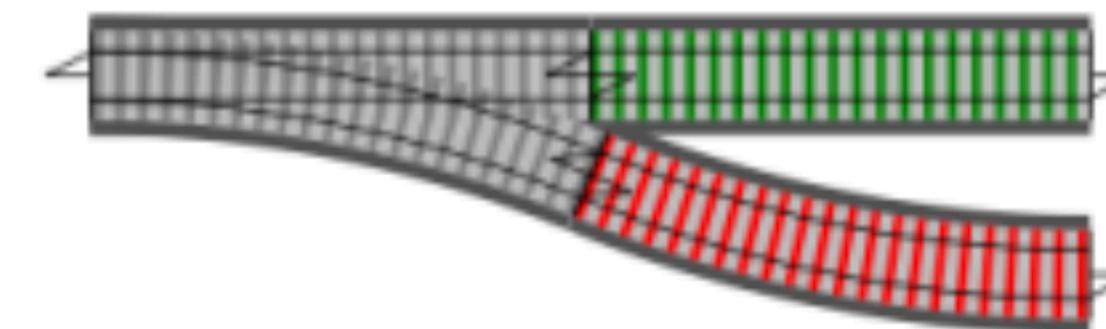
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But: Composing these is problematic.

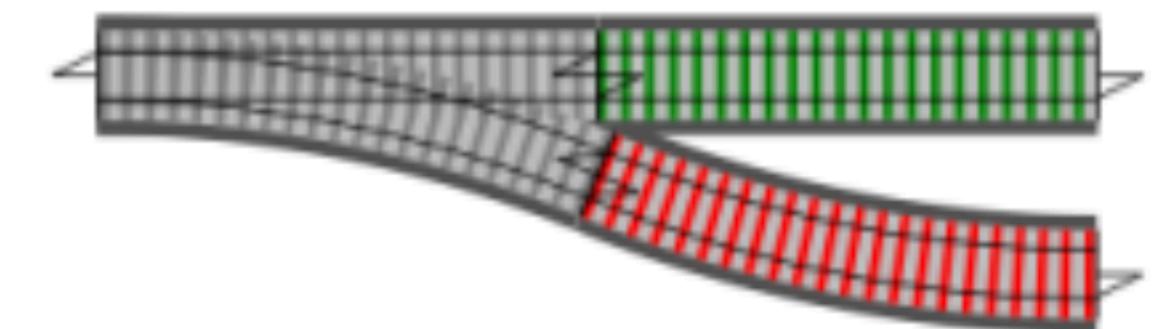
$'a \rightarrow 'b \text{ option}$



$'b \rightarrow 'c \text{ option}$



$'c \rightarrow 'd \text{ option}$

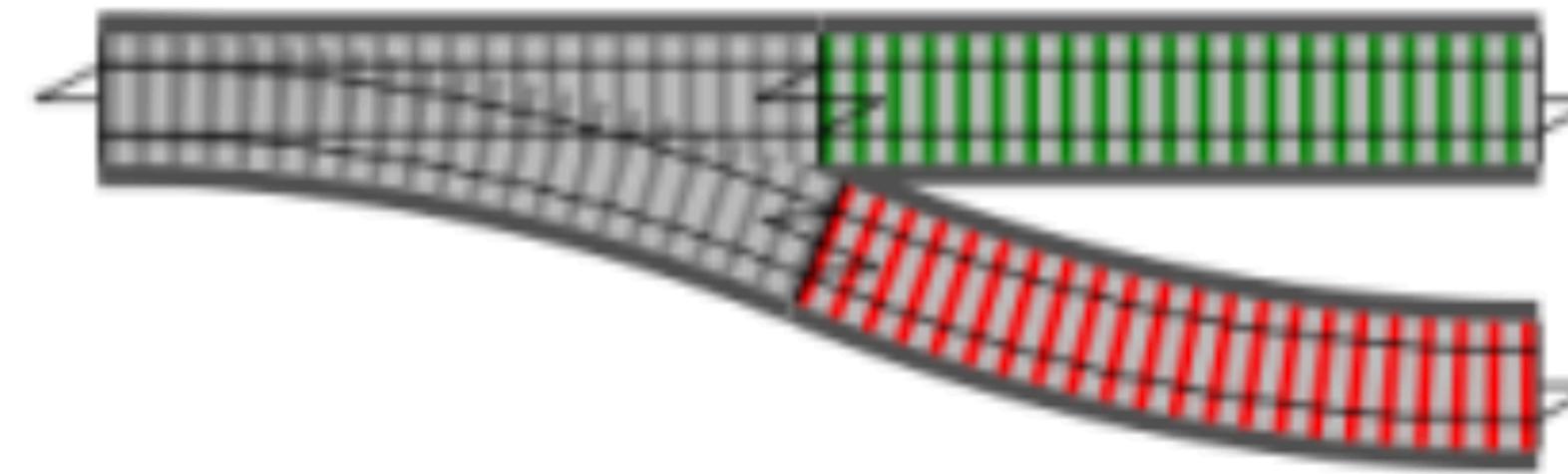


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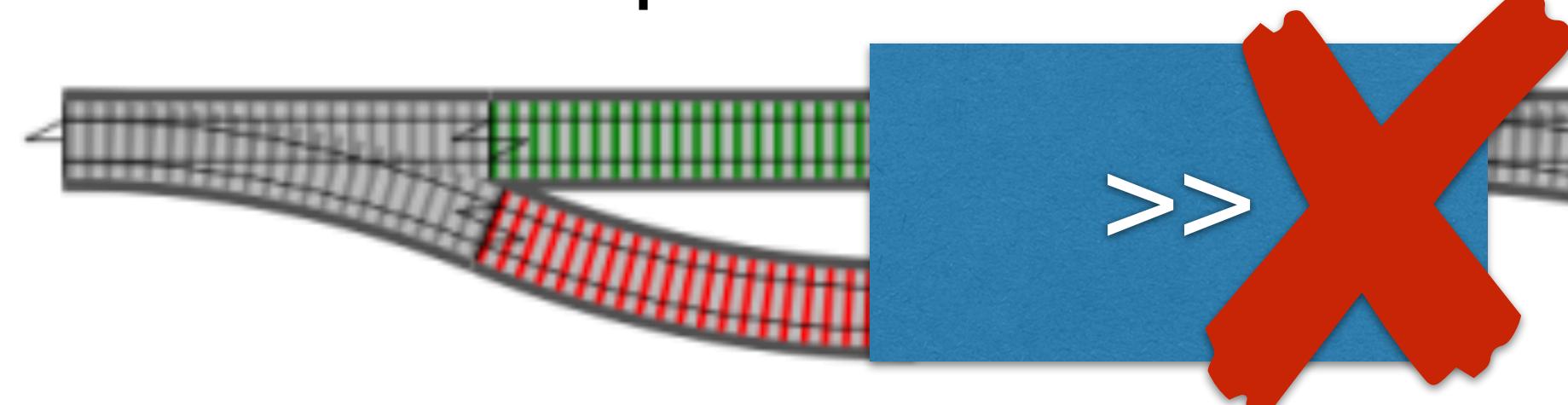
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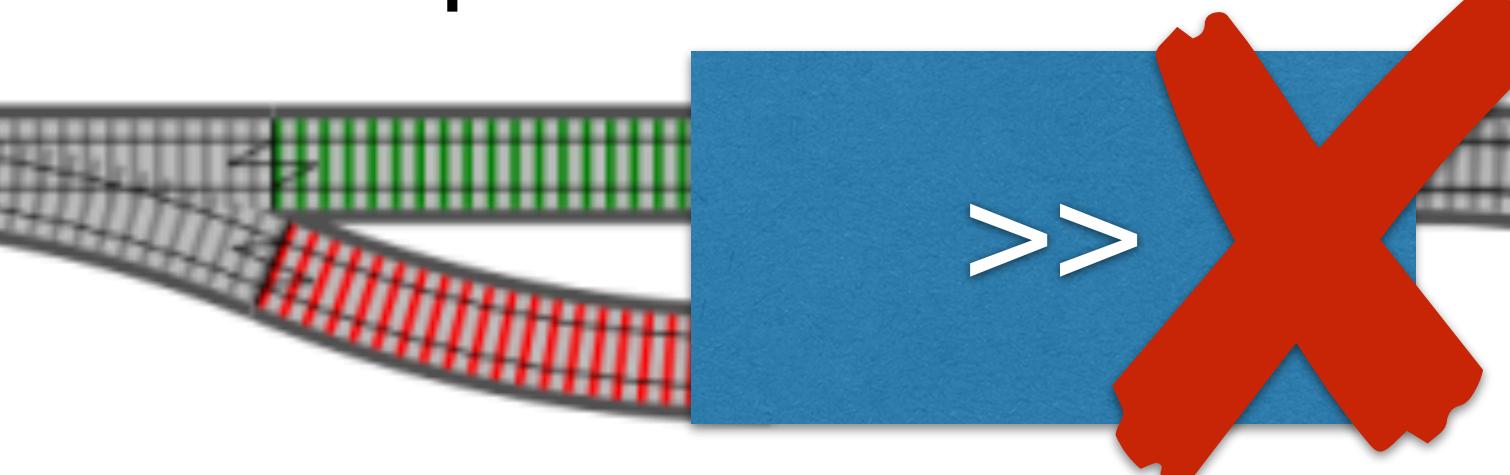
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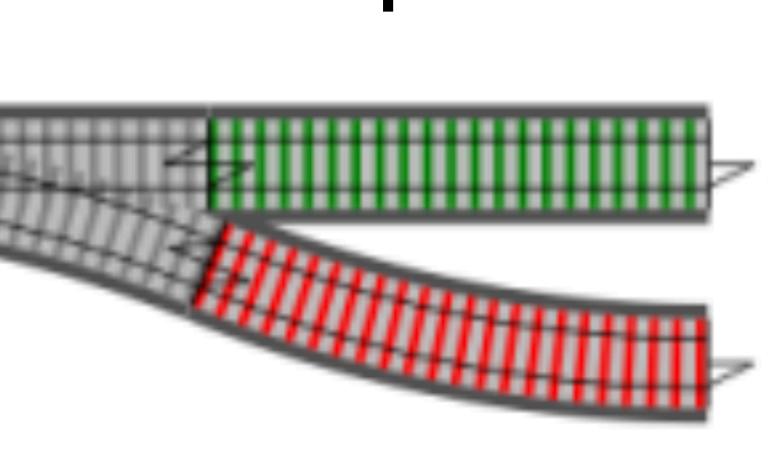
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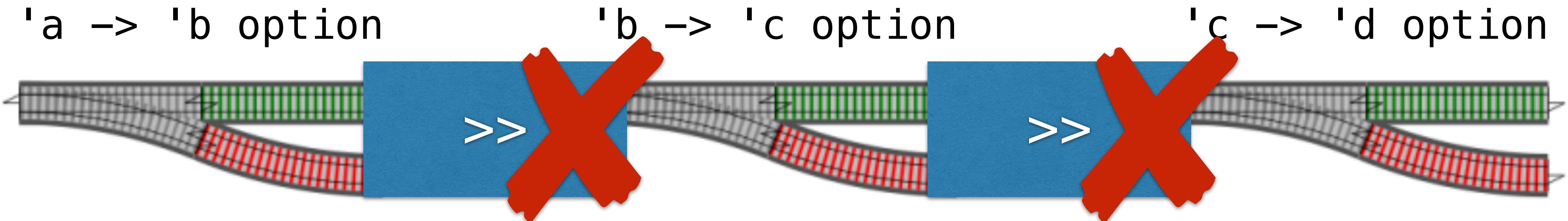
$'b \rightarrow 'c \text{ option}$



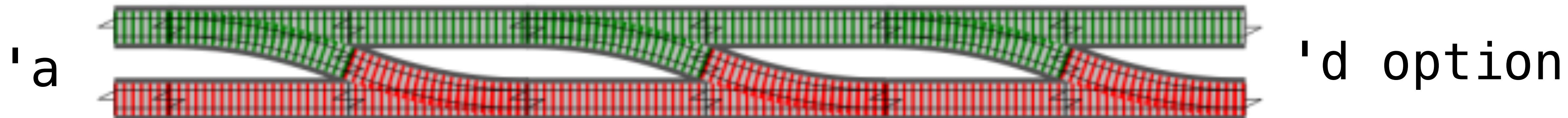
$'c \rightarrow 'd \text{ option}$



Functions as railways



What we want is the following



Once you hit the error track you are stuck there

Our “Railway” Toolbelt

Recall that a “railway switch” has the type

`'a -> 'b option`

We need two helper functions

Our “Railway” Toolbelt

Recall that a “railway switch” has the type

$$'a \rightarrow 'b\ option$$

We need two helper functions

1. A **constant switch** that stays on the green track

$$\text{ret} : 'a \rightarrow 'a\ option$$

Our “Railway” Toolbelt

Recall that a “railway switch” has the type

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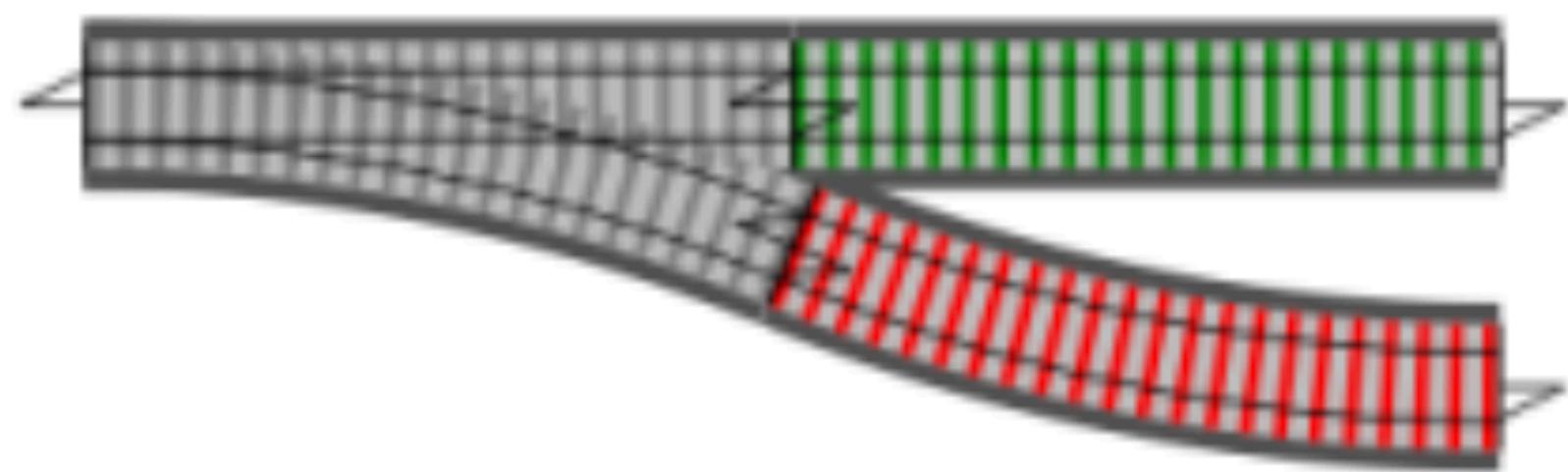
2. Turn **switches into two-track functions** in order to be able to compose them

$$\text{bind} : ('a \rightarrow 'b \text{ option}) \rightarrow ('a \text{ option} \rightarrow 'b \text{ option})$$

Turn constants into switches

We want to construct the
constant switch
(which just passes the
argument through)

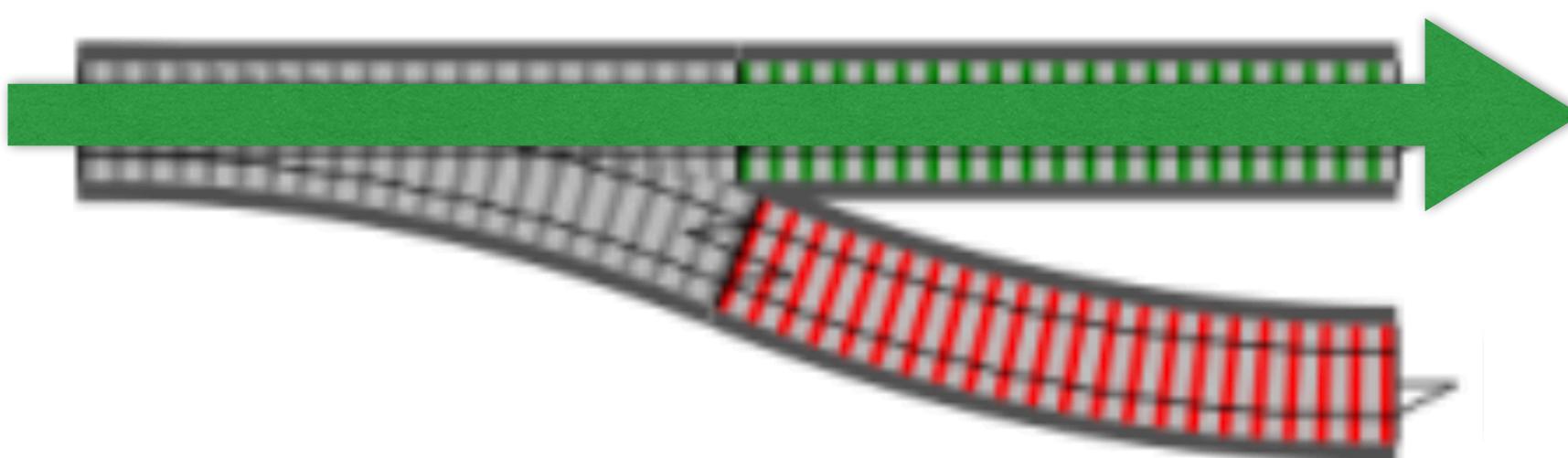
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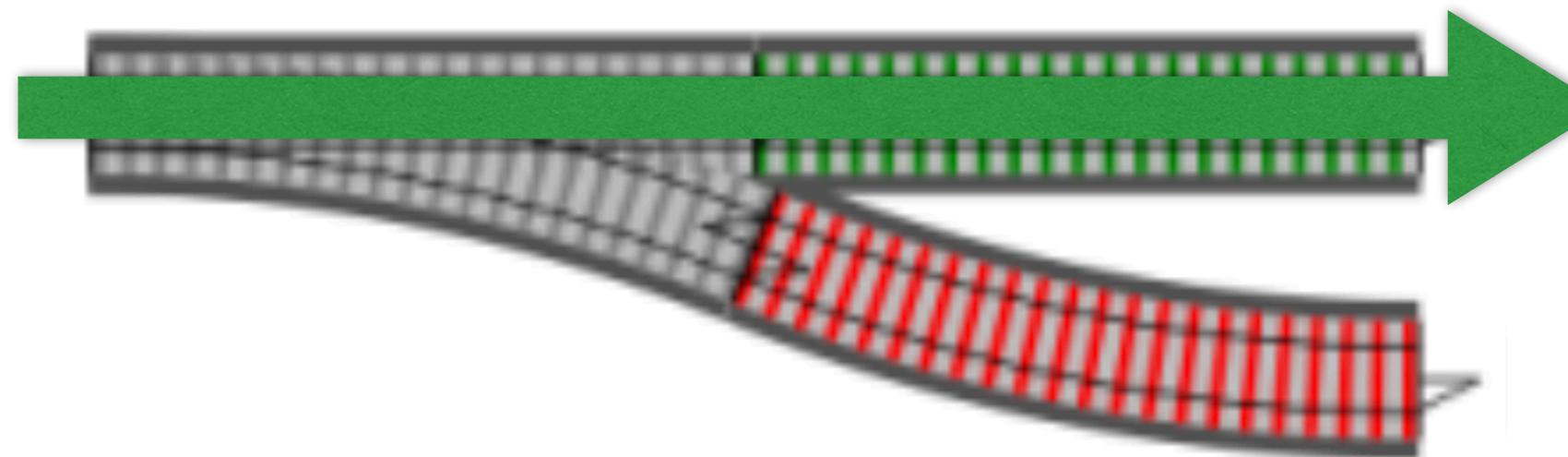
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Turn constants into switches

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This is easy enough:

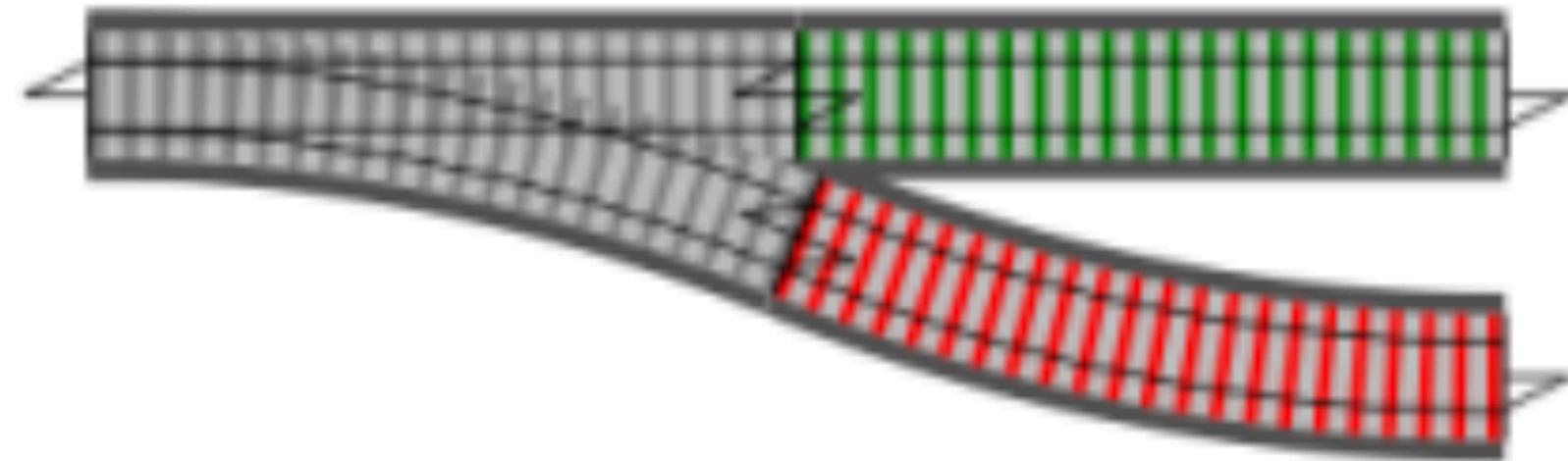
```
let ret x = Some x
```

```
ret : 'a → 'a option
```

Turn switches into two-track functions

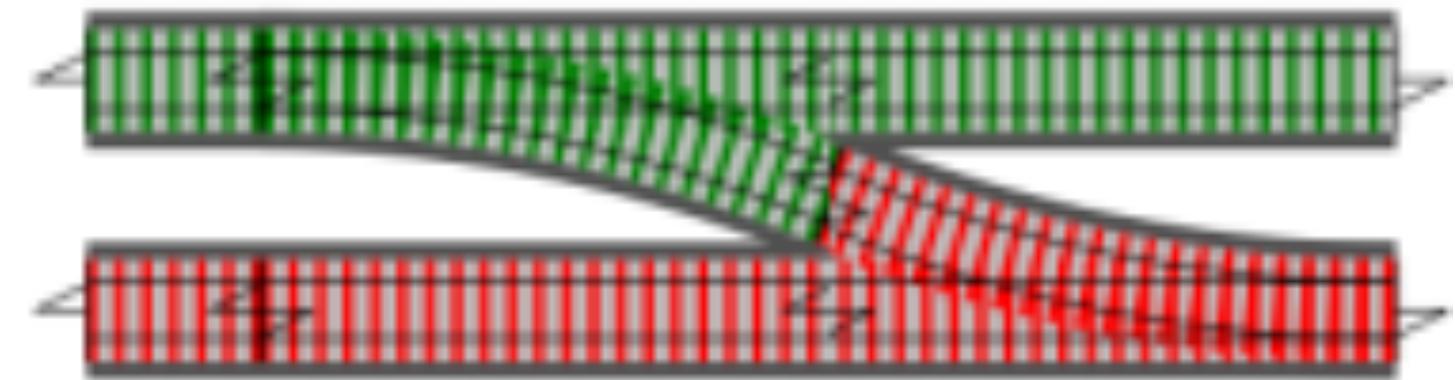
We want to turn

$'a \rightarrow 'b \text{ option}$



into this

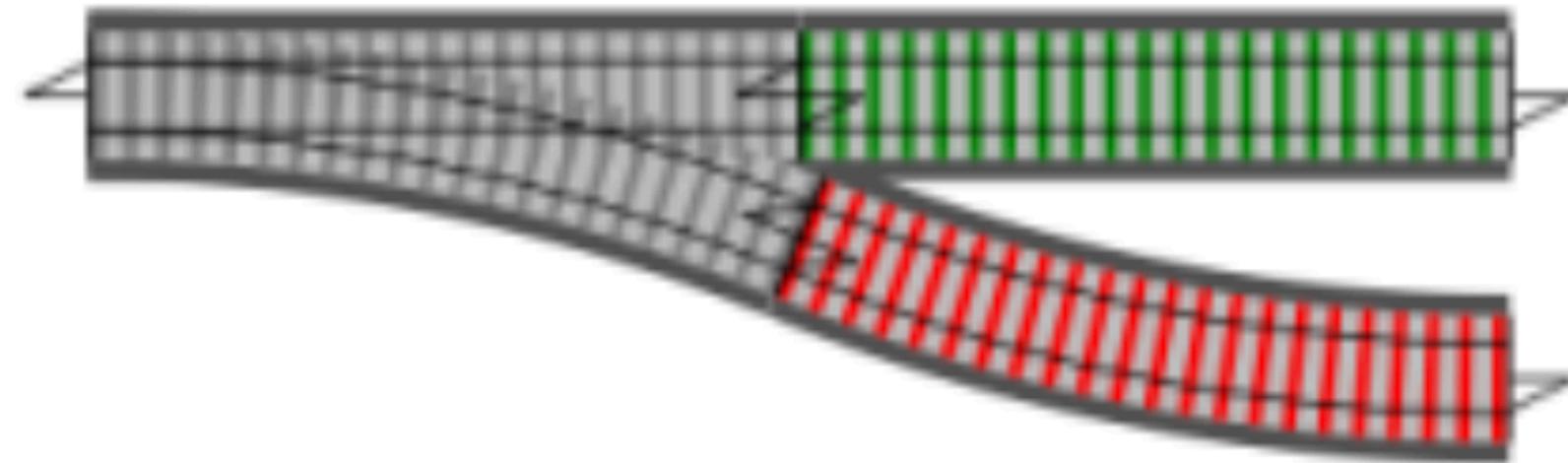
$'a \text{ option} \rightarrow 'b \text{ option}$



Turn switches into two-track functions

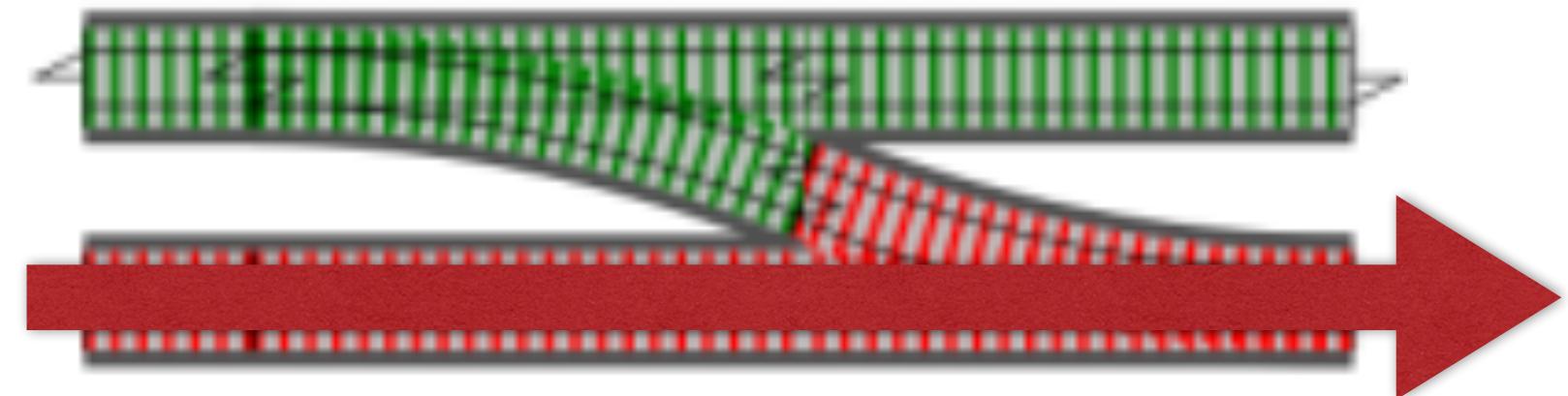
We want to turn

$'a \rightarrow 'b \text{ option}$



into this

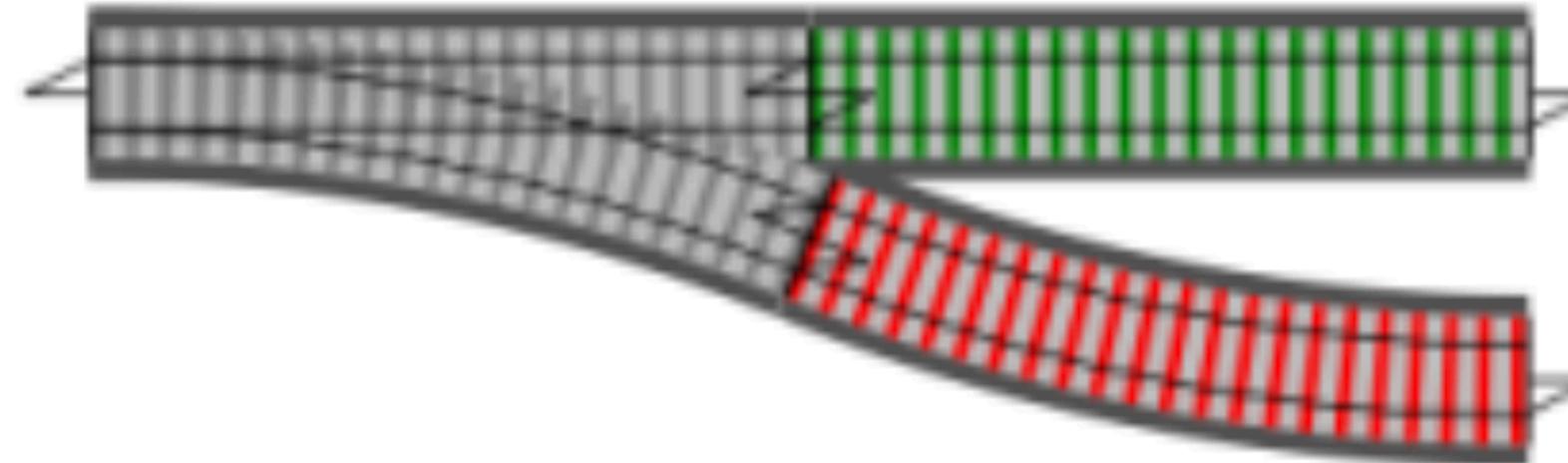
$'a \text{ option} \rightarrow 'b \text{ option}$



Turn switches into two-track functions

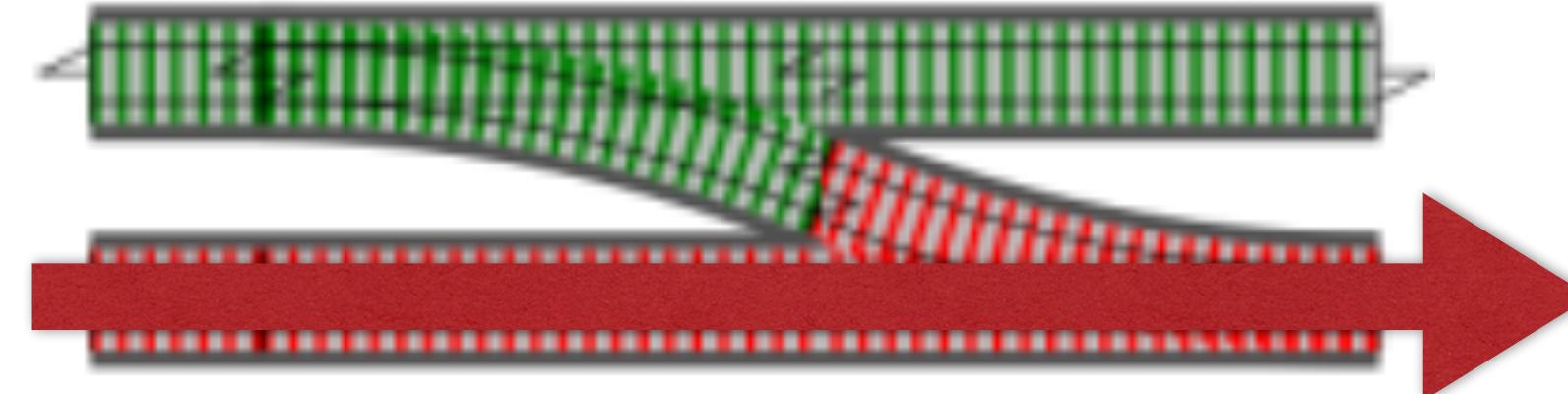
We want to turn

$f : 'a \rightarrow 'b \text{ option}$



into this

$'a \text{ option} \rightarrow 'b \text{ option}$



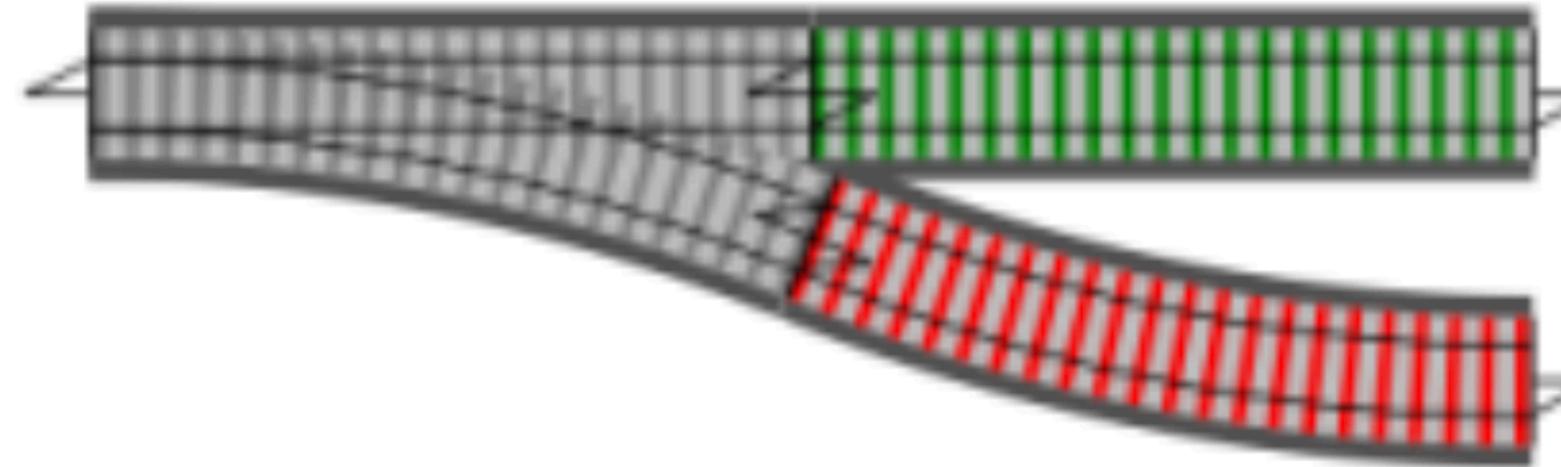
The following function does that

```
let bind f = fun x =>  
  match x with  
  | Some a => f a  
  | None    => None
```

Turn switches into two-track functions

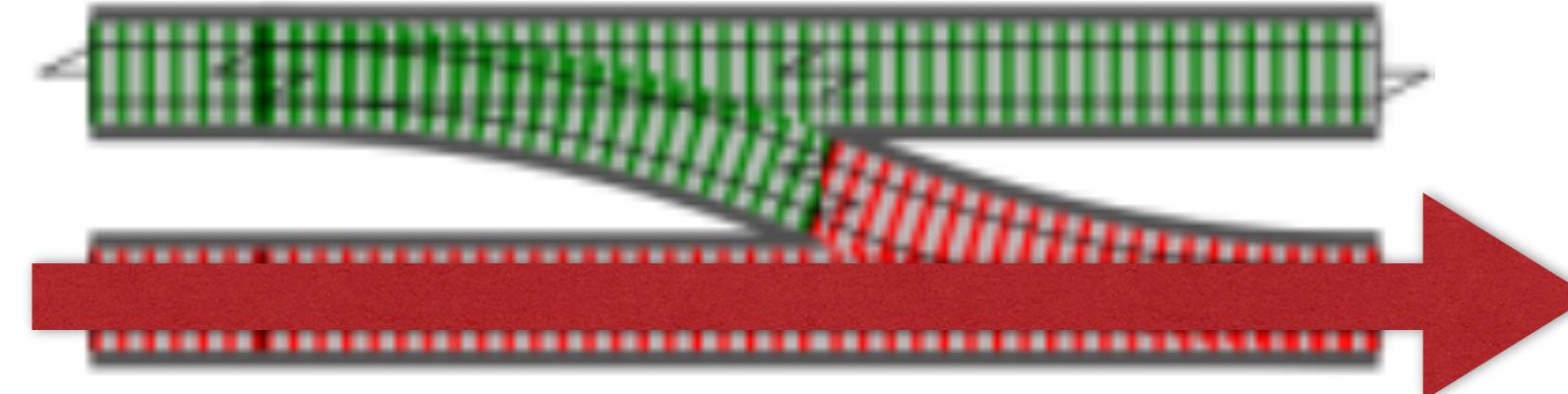
We want to turn

$f : 'a \rightarrow 'b \text{ option}$



into this

$'a \text{ option} \rightarrow 'b \text{ option}$



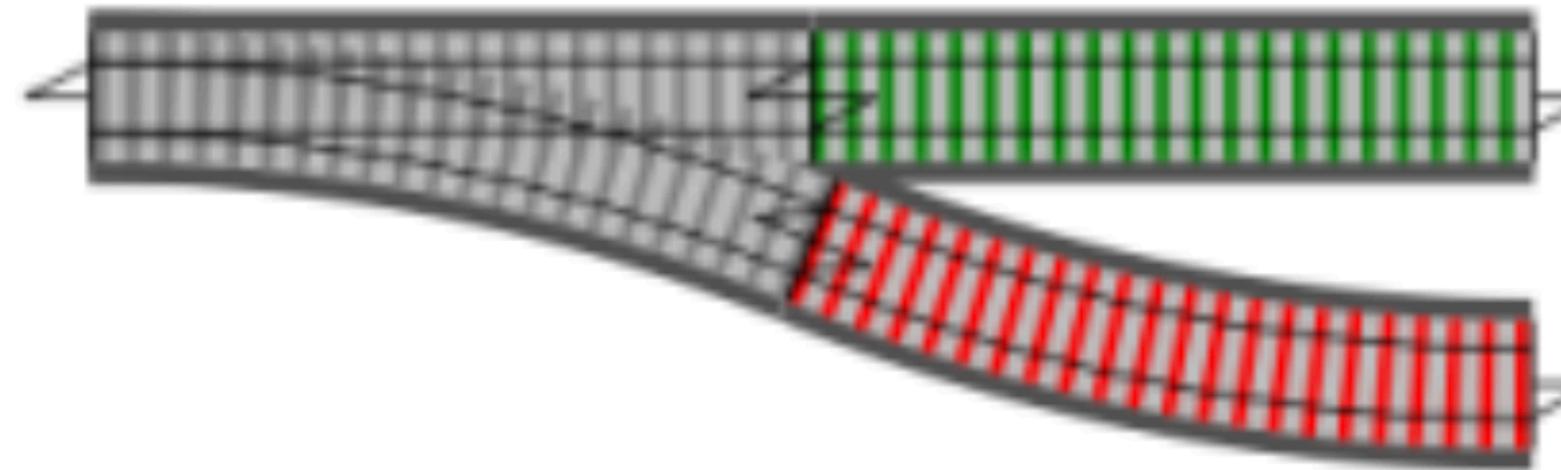
The following function does that

```
let bind f = fun x =>
  match x with
    | Some a => f a
    | None   => None
```

Turn switches into two-track functions

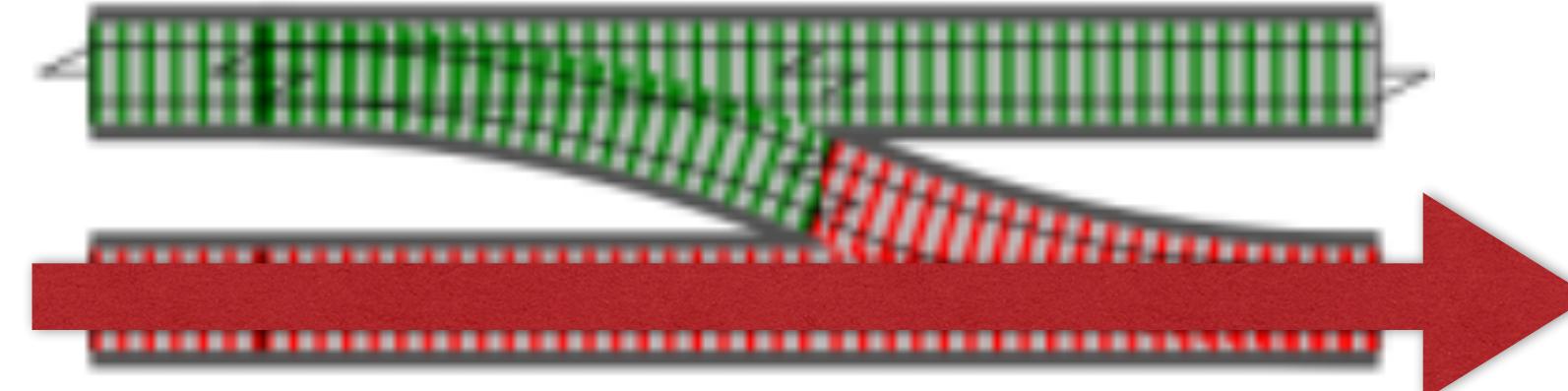
We want to turn

$f : 'a \rightarrow 'b \text{ option}$



into this

$'a \text{ option} \rightarrow 'b \text{ option}$



The following function does that

```
let bind f = fun x =>
  match x with
    green track: | Some a => f a
    red track: | None   => None
```

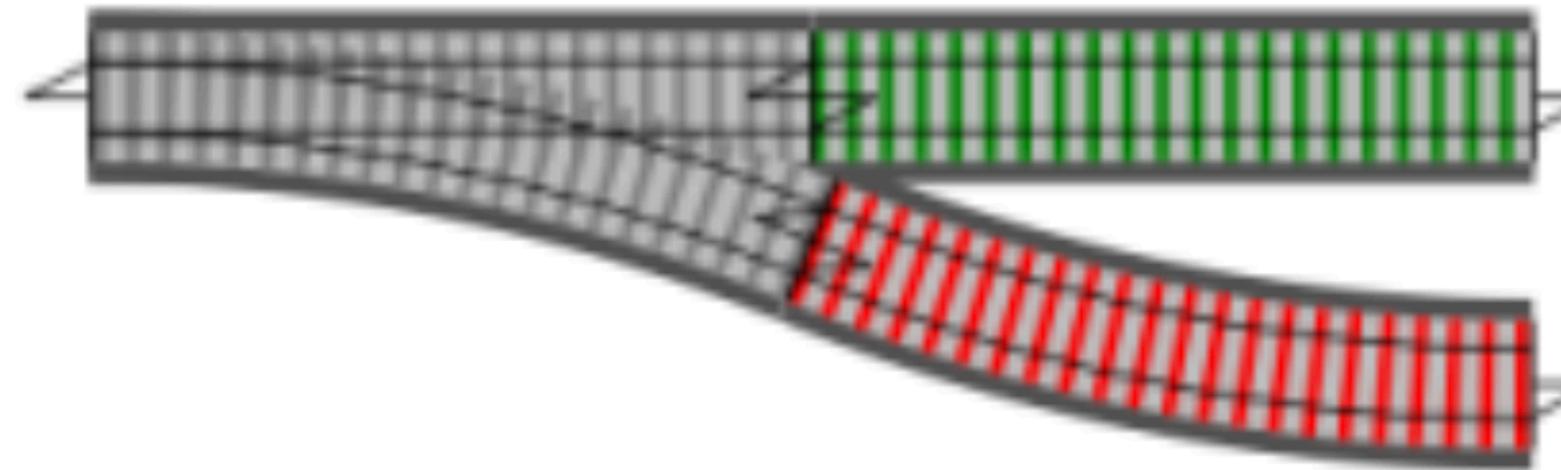
In practice, we use this variant:

```
let (=>) x f = bind f x
(=>) : 'a option -> ('a -> 'b option) -> 'b option
```

Turn switches into two-track functions

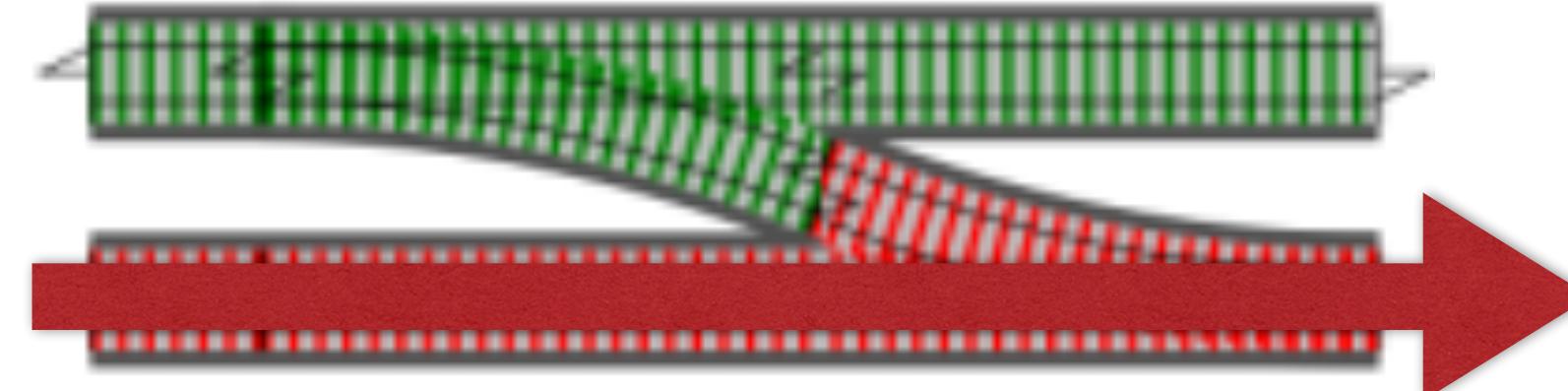
We want to turn

$f : 'a \rightarrow 'b \text{ option}$



into this

$'a \text{ option} \rightarrow 'b \text{ option}$



The following function does that

```
let bind f = fun x =>
  match x with
    | Some a -> f a
    | None -> None
```

green track: | Some a -> f a
red track: | None -> None

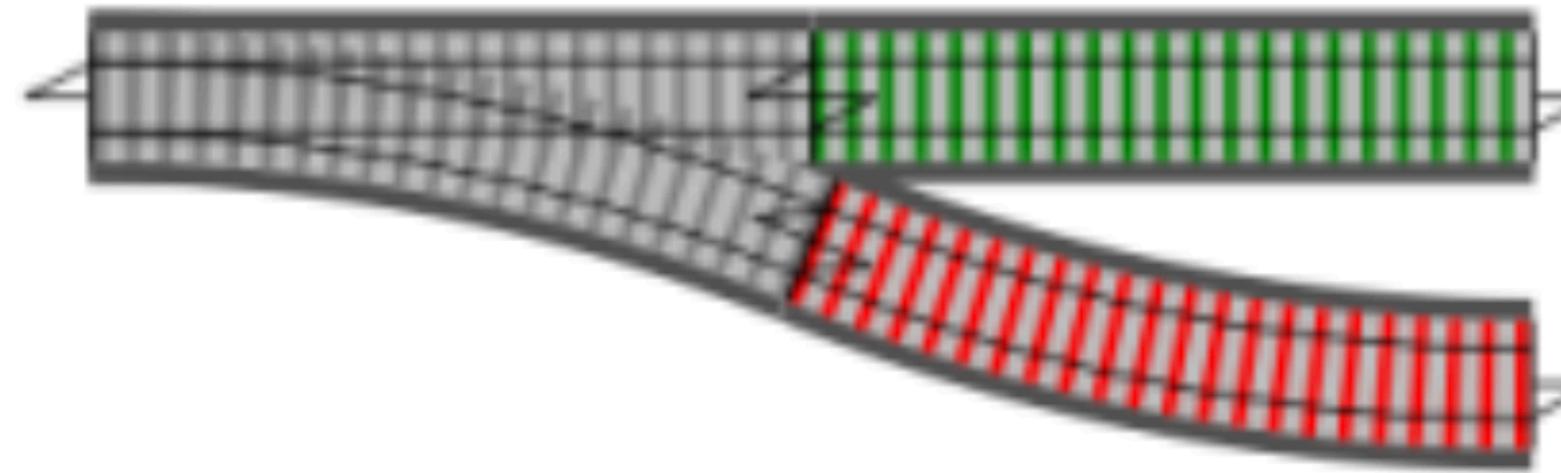
In practice, we use this variant:

```
let (=>) x f = bind f x
(=>) : 'a option ->
  ('a -> 'b option) ->
    'b option
```

Turn switches into two-track functions

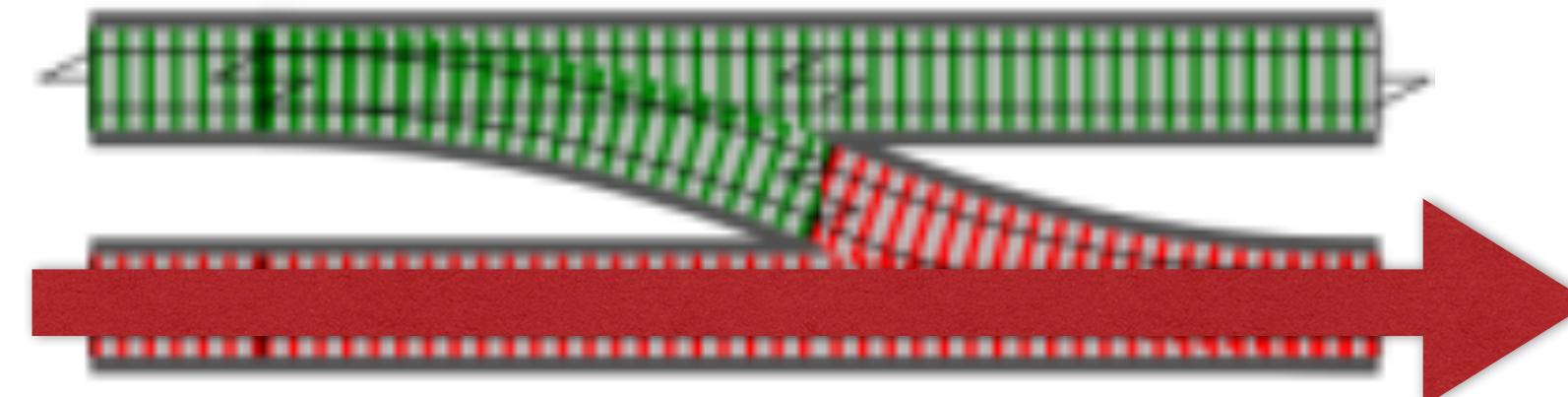
We want to turn

$f : 'a \rightarrow 'b \text{ option}$



into this

$'a \text{ option} \rightarrow 'b \text{ option}$



Direct definition of ($>>=$) :

```
let (>>=) x f =  
  match x with  
    | Some a → f a  
    | None → None
```

In practice, we use this variant:

```
let (>>=) x f = bind f x  
(>>=) : 'a option →  
  ('a → 'b option) →  
  'b option
```

Example

Let's go back to our binop function

```
let binop f a b s =
  match a s, b s with
  | Some x,
    Some y -> Some (f x y)
  | _, _      -> None
```

```
ret : 'a -> 'a option
```

```
let ret x = Some x
```

Example

Let's go back to our binop function

```
let binop f a b s =
  match a s, b s with
  | Some x,
    Some y -> Some (f x y)
  | _, _      -> None
```



```
let binop f a b s =
  match a s, b s with
  | Some x,
    Some y -> ret (f x y)
  | _, _      -> None
```

```
ret : 'a -> 'a option
```

```
let ret x = Some x
```

Example

Let's go back to our binop function

```
let binop f a b s =
  match a s, b s with
  | Some x,
    Some y -> ret (f x y)
  | _, _      -> None
```

```
ret : 'a -> 'a option
```

```
let ret x = Some x
```

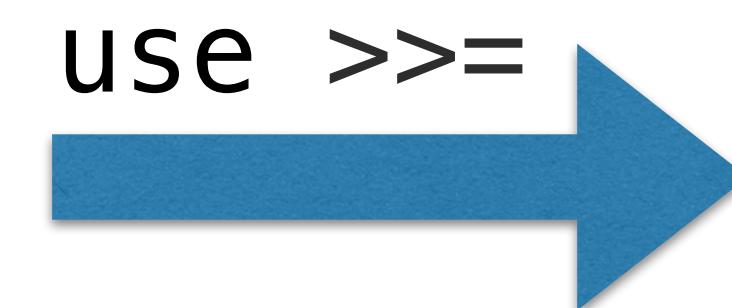
```
(>>=) : 'a option ->
          ('a -> 'b option) ->
          'b option
```

```
let (>>=) x f = match x with
  | Some a -> f a
  | None     -> None
```

Example

Let's go back to our binop function

```
let binop f a b s =
  match a s, b s with
  | Some x,
    Some y -> ret (f x y)
  | _, _ -> None
```



```
let binop f a b s =
  a s >>= fun x ->
  b s >>= fun y ->
  ret (f x y)
```

```
ret : 'a -> 'a option
```

```
let ret x = Some x
```

```
(>>=) : 'a option ->
          ('a -> 'b option) ->
          'b option
```

```
let (>>=) x f = match x with
  | Some a -> f a
  | None -> None
```

Example

```
let binop f a b s =  
  a s >>= fun x ->  
  b s >>= fun y ->  
  ret (f x y)
```

Example

```
let binop f a b s =
  a s >>= fun x ->
  b s >>= fun y ->
  ret (f x y)

let rec eval e =
  match e with
  | N n           -> fun _ -> Some n
  | V x           -> Map.tryFind x
  | Add (a1, a2)  -> binop (+) (eval a1) (eval a2)
  | Sub (a1, a2)  -> binop (-) (eval a1) (eval a2)
  | Mul (a1, a2)  -> binop (*) (eval a1) (eval a2)
  | Div (a1, a2)  ->
    fun s -> match eval a1 s, eval a2 s with
    | Some x, Some y when y <> 0 -> Some (x / y)
    | _, _                         -> None
```

Example

```
let binop f a b s =
  a s >>= fun x ->
  b s >>= fun y ->
  ret (f x y)

let rec eval e =
  match e with
  | N n           -> fun _ -> ret n
  | V x           -> Map.tryFind x
  | Add (a1, a2)  -> binop (+) (eval a1) (eval a2)
  | Sub (a1, a2)  -> binop (-) (eval a1) (eval a2)
  | Mul (a1, a2)  -> binop (*) (eval a1) (eval a2)
  | Div (a1, a2)  -> fun s ->
    eval a1 s >>= fun x ->
    eval a2 s >>= fun y ->
      if y > 0 then ret (x / y) else None
```

Example

```
let binop f a b s =
  a s >>= fun x ->
  b s >>= fun y ->
  ret (f x y)

let rec eval e =
  match e with
  | N n           -> fun _ -> ret n
  | V x           -> Map.tryFind x
  | Add (a1, a2)  -> binop (+) (eval a1) (eval a2)
  | Sub (a1, a2)  -> binop (-) (eval a1) (eval a2)
  | Mul (a1, a2)  -> binop (*) (eval a1) (eval a2)
  | Div (a1, a2)  -> fun s ->
    eval a1 s >>= fun x ->
    eval a2 s >>= fun y ->
      if y >> 0 then ret (x / y) else None
```

Note
">>>= is our
'programmable
semicolon'

What did we gain here?!

- Abstracting away from failure case is useful
- We only have to write the code for error handling once
- In the code for eval we can focus on the “happy path”
- Much easier to add more features later

The big picture

- Next: We extend our “railway” with (1) error messages and (2) state.
- We only need to change its type ($a \rightarrow 'b$ option), and the two operations `ret` & `>>=`
- Our code in the `eval` function needs little or no change!
- At the very end: We improve the syntax using computation expressions

Questions?

Part II

Error Messages

Adding error messages

Let's modify our evaluator to return an error message on failure rather than just None

```
type Error =  
| VarNotFound of string  
| DivisionByZero
```

```
type Result<'a> =  
| Success of 'a  
| Failure of Error
```

Adding error messages

Let's modify our evaluator to return an error message on failure rather than just None

```
type Error =  
| VarNotFound of string  
| DivisionByZero
```

```
type Result<'a> =  
| Success of 'a  
| Failure of Error
```

```
type 'a option =  
| Some of 'a  
| None
```

Result is similar to option

Adding error messages

Let's modify our evaluator to return an error message on failure rather than just None

```
type Error =  
| VarNotFound of string  
| DivisionByZero
```

```
type Result<'a> =  
| Success of 'a  
| Failure of Error
```

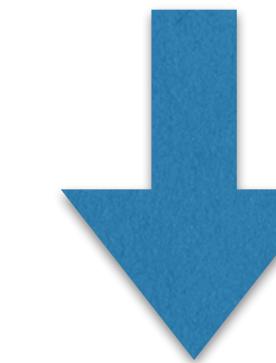
```
type 'a option =  
| Some of 'a  
| None
```

Result is similar to option

Adding error messages

Let's start with the binop helper function
(without >>= and ret)

```
let binop f a b s =
  match a s, b s with
  | Some x, Some y -> Some (f x y)
  | _, _ -> None
```



```
let binop f a b s =
  match a s, b s with
  | Success x, Success y -> Success (f x y)
  | Failure e, _ -> Failure e
  | _, Failure e -> Failure e
```

"Standard" implementation

```
let rec eval e =
  match e with
  | N n -> fun _ -> Success n
  | V x ->
    fun s ->
      match Map.tryFind x s with
      | Some v -> Success v
      | None -> Failure (VarNotFound x)
  | Add (a1, a2) -> binop ( + ) (eval a1) (eval a2)
  | Sub (a1, a2) -> binop ( - ) (eval a1) (eval a2)
  | Mul (a1, a2) -> binop ( * ) (eval a1) (eval a2)
  | Div (a1, a2) ->
    fun s -> match eval a1 s, eval a2 s with
    | Success x, Success y when y <> 0 -> Success (x / y)
    | Success x, Success y -> Failure DivisionByZero
    | Failure e, _
    | _, Failure e -> Failure e
```

"Standard" implementation

```
let rec eval e =
  match e with
  | N n -> fun _ -> Success n
  | V x ->
    fun s ->
      match Map.find x s with
      | Some v -> v
      | None ->
        match e with
        | Add (a1, a2) -> eval a1 s + eval a2 s
        | Sub (a1, a2) -> eval a1 s - eval a2 s
        | Mul (a1, a2) -> eval a1 s * eval a2 s
        | Div (a1, a2) ->
          fun s -> match eval a1 s, eval a2 s with
            | Success x, Success y when y <> 0 -> Success (x / y)
            | Success x, Success y -> Failure DivisionByZero
            | Failure e, _ -> Failure e
            | _, Failure e -> Failure e
```

This feels like several steps backwards

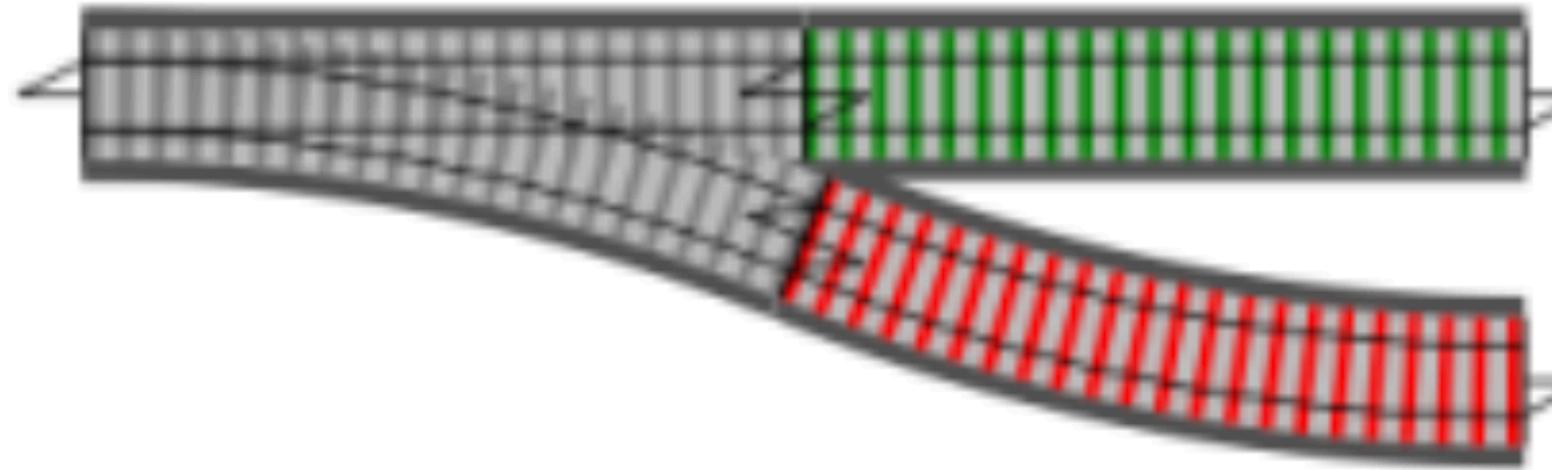
Instead, we will modify $\gg=$ and `ret` to work with `Result` rather than option

Constant switches

The functions turn out to be almost identical

Options

$'a \rightarrow 'a \text{ option}$

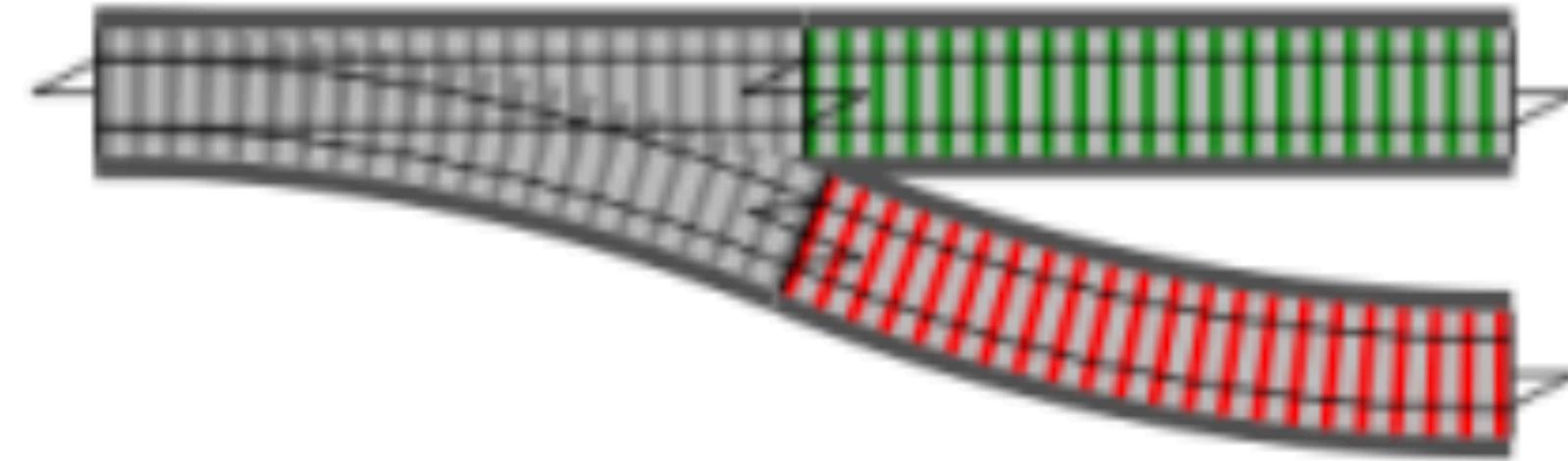


```
let ret x = Some x
```

ret : $'a \rightarrow 'a \text{ option}$

Results

$'a \rightarrow \text{Result}'a\text{>}$



```
let ret x = Success x
```

ret : $'a \rightarrow \text{Result}'a\text{>}$

Turn switches into two-track functions

Options

```
let (>>=) x f =  
  match x with  
  | Some a -> f a  
  | None   -> None
```

```
(>>=) : 'a option ->  
        ('a -> 'b option) ->  
        'b option
```

Results

```
let (>>=) x f =  
  match x with  
  | Success a -> f a  
  | Failure e -> Failure e
```

```
(>>=) : Result<'a> ->  
        ('a -> Result<'b>) ->  
        Result<'b>
```

Comparing the binary operators

The code for the binary operators is identical
Options Results

```
let binop f a b s =  
  a s >>= fun x =>  
  b s >>= fun y =>  
  ret (f x y)
```

```
let binop f a b s =  
  a s >>= fun x =>  
  b s >>= fun y =>  
  ret (f x y)
```

Comparing the binary operators

The code for the binary operators is identical
Options Results

```
let binop f a b s =  
  a s >>= fun x =>  
  b s >>= fun y =>  
  ret (f x y)
```

```
let binop f a b s =  
  a s >>= fun x =>  
  b s >>= fun y =>  
  ret (f x y)
```

But their types differ

```
binop : ('a -> 'b -> 'c) ->  
       (state -> 'a option) ->  
       (state -> 'b option) ->  
       state -> 'c option
```

```
binop : ('a -> 'b -> 'c) ->  
       (state -> Result<'a>) ->  
       (state -> Result<'b>) ->  
       state -> Result<'c>
```

Comparing the binary operators

The code for the binary operators is identical
Options Results

```
let binop f a b s =
  a s >>= fun x =>
  b s >>= fun y =>
  ret (f x y)
```

```
let binop f a b s =
  a s >>= fun x =>
  b s >>= fun y =>
  ret (f x y)
```

type state =
Map<string, int>

But their types differ

```
binop : ('a -> 'b -> 'c) ->
        (state -> 'a option) ->
        (state -> 'b option) ->
        state -> 'c option
```

```
binop : ('a -> 'b -> 'c) ->
        (state -> Result<'a>) ->
        (state -> Result<'b>) ->
        state -> Result<'c>
```

Evaluator with error handling

```
let rec eval e =
  match e with
  | N n -> fun _ -> ret n
  | V x -> fun s ->
    match Map.tryFind x s with
    | Some v -> ret v
    | None -> Failure (VarNotFound x)
  | Add (a1, a2) -> binop ( + ) (eval a1) (eval a2)
  | Sub (a1, a2) -> binop ( - ) (eval a1) (eval a2)
  | Mul (a1, a2) -> binop ( * ) (eval a1) (eval a2)
  | Div (a1, a2) -> fun s ->
    eval a1 s >>= fun x ->
    eval a2 s >>= fun y ->
    if y <> 0 then ret (x / y) else Failure DivisionByZero
```

Evaluator with error handling

```
let rec eval e =
  match e with
  | N n -> fun _ -> ret n
  | V x -> fun s ->
    match Map.tryFind x s with
    | Some v -> ret v
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  | Add (a1, a2) -> binop ( + ) (eval a1) (eval a2)
  | Sub (a1, a2) -> binop ( - ) (eval a1) (eval a2)
  | Mul (a1, a2) -> binop ( * ) (eval a1) (eval a2)
  | Div (a1, a2) -> fun s ->
    eval a1 s >>= fun x ->
    eval a2 s >>= fun y ->
    if y <> 0 then ret (x / y) else Failure DivisionByZero
```

The only place
where we needed to
change our code

Are we there yet?

```
let rec eval e =
  match e with
  | N n -> fun _ -> ret n
  | V x -> fun s ->
    match Map.tryFind x s with
    | Some v -> ret v
    | None -> Failure (VarNotFound x)
  | Add (a1, a2) -> binop ( + ) (eval a1) (eval a2)
  | Sub (a1, a2) -> binop ( - ) (eval a1) (eval a2)
  | Mul (a1, a2) -> binop ( * ) (eval a1) (eval a2)
  | Div (a1, a2) -> fun s ->
    eval a1 s >>= fun x ->
    eval a2 s >>= fun y ->
    if y <> 0 then ret (x / y) else Failure DivisionByZero
```

Are we there yet?

```
let rec eval e =
  match e with
  | N n -> fun _ -> ret n
  | V x -> fun s ->
    match Map.tryFind x s with
    | Some v -> ret v
    | None -> Failure (VarNotFound x)
  | Add (a1, a2) -> binop ( + ) (eval a1) (eval a2)
  | Sub (a1, a2) -> binop ( - ) (eval a1) (eval a2)
  | Mul (a1, a2) -> binop ( * ) (eval a1) (eval a2)
  | Div (a1, a2) -> fun s ->
    eval a1 s >>= fun x ->
    eval a2 s >>= fun y ->
    if y <> 0 then ret (x / y) else Failure DivisionByZero
```

If we look at our code now it still has a few flaws.

- The state is passed through the program
- Lookups are a bit clunky
- What about modifying the state?

Are we there yet?

```
let rec eval e =
  match e with
  | N n -> fun _ -> ret n
  | V x -> fun s ->
    match Map.tryFind x s with
    | Some v -> ret v
    | None -> Failure (VarNotFound x)
  | Add (a1, a2) -> binop ( + ) (eval a1) (eval a2)
  | Sub (a1, a2) -> binop ( - ) (eval a1) (eval a2)
  | Mul (a1, a2) -> binop ( * ) (eval a1) (eval a2)
  | Div (a1, a2) -> fun s ->
    eval a1 s >>= fun x ->
    eval a2 s >>= fun y ->
    if y <> 0 then ret (x / y) else Failure DivisionByZero
```

If we look at our code now it still has a few flaws.

- The state is passed through the program
- Lookups are a bit clunky
- What about modifying the state?

We will address this in the next step.

Questions?

Part III

Maintaining State

Adding state

Initially we worked on option types

`'a option`

We then switched to Result types
to distinguish different errors

`Result<'a>`

We now want a function that takes
a state and also returns a Result
with the updated state

`state -> Result<'a * state>`

Adding state

Initially we worked on option types

`'a option`

We then switched to Result types
to distinguish different errors

`Result<'a>`

We now want a function that takes
a state and also returns a Result
with the updated state

`state -> Result<'a * state>`

Intuition

Now, all switches must also
pass along additional data
(namely the state).

Adding state

Initially we worked on option types

`'a option`

We then switched to Result types
to distinguish different errors

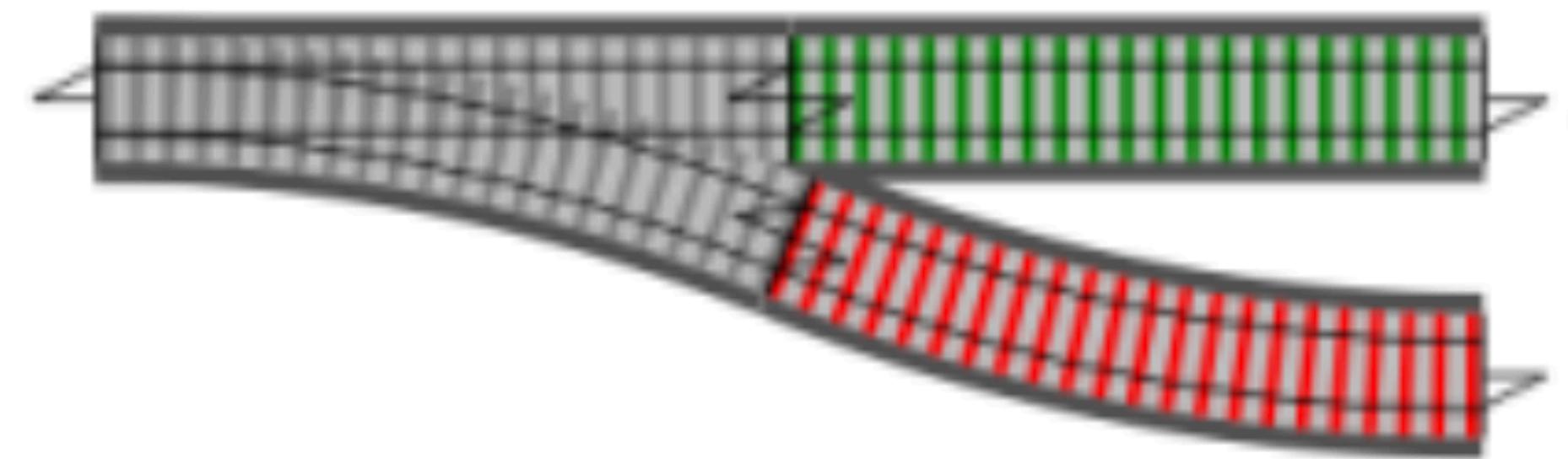
`Result<'a>`

We now want a function that takes
a state and also returns a Result
with the updated state

`state -> Result<'a * state>`

Intuition

Now, all switches must also
pass along additional data
(namely the state).

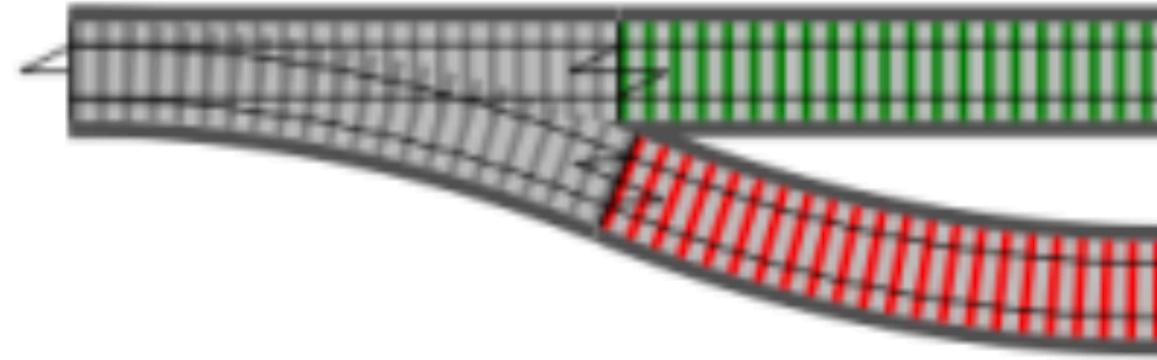


Constant switches

ret now also passes the state data through

Options

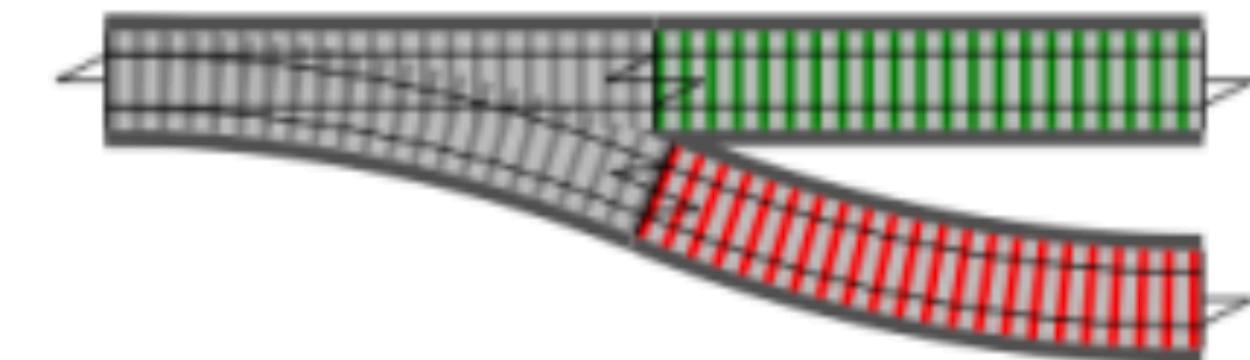
$'a \rightarrow 'a \text{ option}$



```
let ret x = Some x  
ret : 'a ->  
      'a option
```

Results

$'a \rightarrow \text{Result}'a$



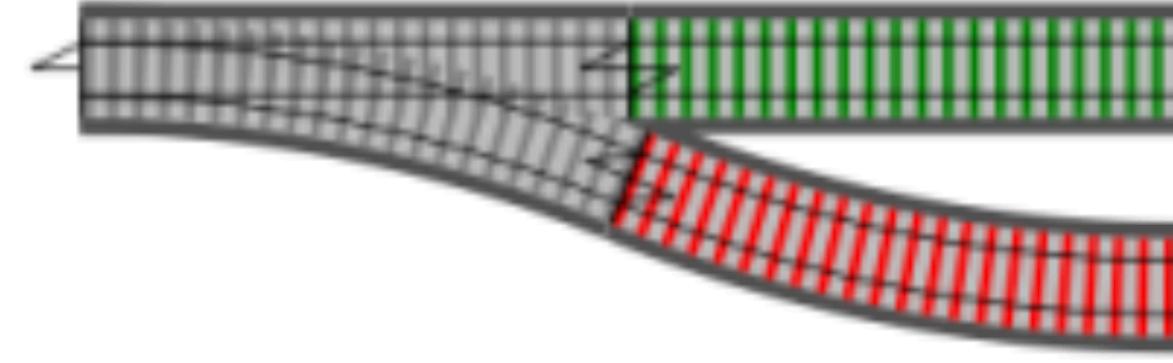
```
let ret x = Success x  
ret : 'a -> Result'a
```

Constant switches

ret now also passes the state data through

Options

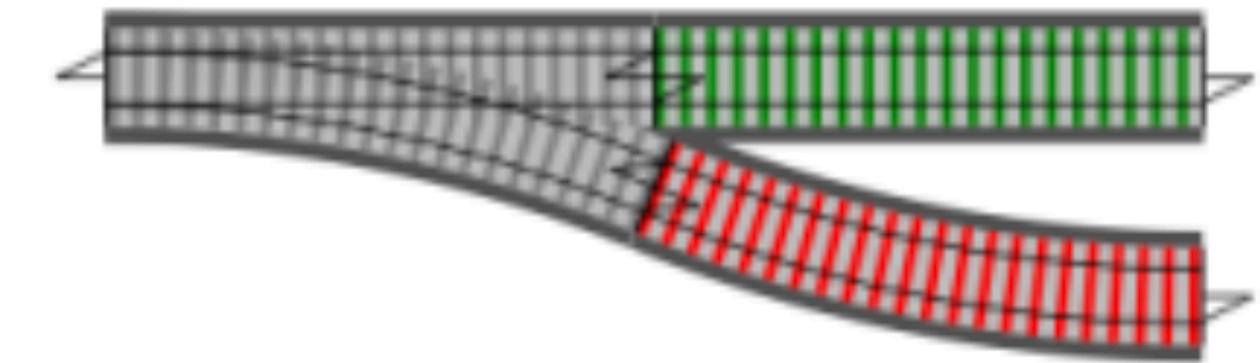
$'a \rightarrow 'a \text{ option}$



```
let ret x = Some x  
ret : 'a →  
     'a option
```

Results

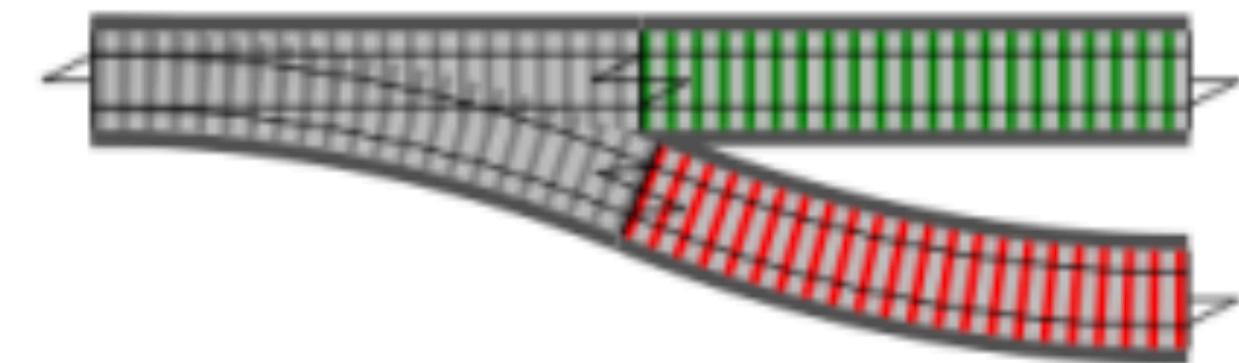
$'a \rightarrow \text{Result}'a$



```
let ret x = Success x  
ret : 'a → Result'a
```

Results + State

$'a \rightarrow (\text{state} \rightarrow \text{Result}'a * \text{state})$



```
let ret x =  
  fun s → Success (x, s)  
  
ret : 'a → state →  
     Result'a * state
```

Turn switches into two-track functions

Options

```
let (>>=) a f =  
  match a with  
  | Some x -> f x  
  | None    -> None
```

```
(>>=) :  
  'a option ->  
  ('a ->  
   'b option) ->  
   'b option
```

Results

```
let (>>=) a f =  
  match a with  
  | Success x -> f x  
  | Failure e ->  
    Failure e
```

```
(>>=) :  
  Result<'a> ->  
  ('a ->  
   Result<'b>) ->  
   Result<'b>
```

Results + State

```
let (>>=) a f = fun s ->  
  match a s with  
  | Success (x, s1) -> f x s1  
  | Failure e -> Failure e
```

```
(>>=) :  
  (state ->  
   Result<'a * state>) ->  
  ('a -> state ->  
   Result<'b * state>) ->  
   state -> Result<'b * state>
```

Comparing the binary operators

The code for the binary operators is now **much** cleaner

Results

```
let binop f a b s =
  a s >>= fun x ->
  b s >>= fun y ->
  ret (f x y)
```

```
binop : ('a -> 'b -> 'c) ->
        (state -> Result<'a>)
        (state -> Result<'b>)
        state -> Result<'c>
```

Results + State

```
let binop f a b =
  a >>= fun x ->
  b >>= fun y ->
  ret (f x y)
```

```
binop : ('a -> 'b -> 'c) ->
        (state -> Result<'a * state>)
        (state -> Result<'b * state>)
        state -> Result<'c * state>
```

Comparing the binary operators

The code for the binary operators is now **much** cleaner

Results

```
let binop f a b s =
  a s >>= fun x ->
  b s >>= fun y ->
  ret (f x y)
```

```
binop : ('a -> state -> state) * state -> state -> result< c >
```

Results + State

```
let binop f a b =
  a >>= fun x ->
  b >>= fun y ->
  ret (f x y)
```

```
state -> result< c * state>
```

Not having to thread around the state, and supporting updated states is a big deal, so the term “**much** cleaner” is warranted

Updating the state

We create the following switches to update the state

```
let find x = fun s =>  
  match Map.tryFind x s with  
  | Some v -> Success (v, s)  
  | None -> Failure (VarNotFound x)
```

```
find : string ->  
      (state -> Result<int * state>)
```

```
let set x v = fun s =>  
  Success ((), (Map.add x v s))  
  
set : string -> int ->  
      (state -> Result<unit * state>)
```

Updating the state

We create the following switches to update the state

```
let find x = fun s ->  
  match Map.tryFind x s with  
  | Some v -> Success (v, s)  
  | None -> Failure (VarNotFound x)
```

```
find : string ->  
      (state -> Result<int * state>)
```

```
let set x v = fun s ->  
  Success ((), (Map.add x v s))
```

set returns a unit; updating the state can be seen as a side effect. It is, however, perfectly functional

```
set : string -> int ->  
      (state -> Result<unit * state>)
```

Updating the state

We create the following switches to update the state

```
let find x = fun s ->  
  match Map.tryFind x s with  
  | Some v -> Success (v, s)  
  | None -> Failure (VarNotFound x)
```

Note how both functions return results + state and the these can be used in binds

```
find : string ->  
      (state -> Result<int * state>)
```

```
let set x v = fun s ->  
  Success ((), (Map.add x v s))
```

set returns a unit; updating the state can be seen as a side effect. It is, however, perfectly functional

```
set : string -> int ->  
      (state -> Result<unit * state>)
```

Error signalling

Let's also write a function for signalling errors

```
let fail e = fun s -> Failure e  
fail : Error ->  
      state -> Result<'a * state>
```

Now we can just write `fail e` to signal errors,
without bothering passing along the state.

Evaluator with stateful railways

```
let rec eval e =
  match e with
  | N n -> ret n
  | V x -> find x
  | Add (a1, a2) -> binop ( + ) (eval a1) (eval a2)
  | Sub (a1, a2) -> binop ( - ) (eval a1) (eval a2)
  | Mul (a1, a2) -> binop ( * ) (eval a1) (eval a2)
  | Div (a1, a2) ->
    eval a1 >>= fun x ->
    eval a2 >>= fun y ->
      if y <> 0 then ret (x / y) else fail DivisionByZero
```

Evaluator with stateful railways

```
let rec eval e =
  match e with
  | N n -> ret n
  | V x -> find x
  | Add (a1, a2) -> binop ( + ) (eval a1) (eval a2)
  | Sub (a1, a2) -> binop ( - ) (eval a1) (eval a2)
  | Mul (a1, a2) -> binop ( * ) (eval a1) (eval a2)
  | Div (a1, a2) ->
    eval a1 >>= fun x ->
    eval a2 >>= fun y ->
      if y <> 0 then ret (x / y) else fail DivisionByZero
```

Let's extend the expression language with
an increment operator (like `++` in Java, C#)

```
type aExp =
  ...
  | Inc of string
```

Evaluator with stateful railways

```
let rec eval e =
  match e with
  | N n -> ret n
  | V x -> find x
  | Add (a1, a2) -> binop ( + ) (eval a1) (eval a2)
  | Sub (a1, a2) -> binop ( - ) (eval a1) (eval a2)
  | Mul (a1, a2) -> binop ( * ) (eval a1) (eval a2)
  | Div (a1, a2) ->
    eval a1 >>= fun x ->
    eval a2 >>= fun y ->
      if y <> 0 then ret (x / y) else fail DivisionByZero
  | Inc x ->
    find x >>= fun v ->
    set x (v + 1) >>= fun () ->
    ret (v + 1)
```

Evaluator with stateful railways

```
let rec eval e =
  match e with
  | N n -> ret n
  | V x -> find x
  | Add (a1, a2) -> binop ( + ) (eval a1) (eval a2)
  | Sub (a1, a2) -> binop ( - ) (eval a1) (eval a2)
  | Mul (a1, a2) -> binop ( * ) (eval a1) (eval a2)
  | Div (a1, a2) ->
    eval a1 >>= fun x ->
    eval a2 >>= fun y ->
      if y <> 0 then ret (x / y) else fail DivisionByZero
  | Inc x ->
    find x >>= fun v ->
    set x (v + 1) >>= fun () ->
    ret (v + 1)
```

The state (`Map<string, int>`) is still not mentioned, even though we read and write it

Evaluator with stateful railways

```
| Inc x ->
  find x >>= fun v ->
    set x (v + 1) >>= fun () ->
      ret (v + 1)
```

Evaluator with stateful railways

```
| Inc x ->
|   find x >>= fun v ->
|     set x (v + 1) >>= fun () ->
|       ret (v + 1)
```

Evaluator with stateful railways

This is a common pattern, so we define a specialised variant of `>>=` for it:

```
let (>>>=) a b = a >>= (fun () -> b)
```

```
| Inc x ->
  find x >>= fun v ->
    set x (v + 1) >>= fun () ->
      ret (v + 1)
```

Evaluator with stateful railways

This is a common pattern, so we define a specialised variant of `>>=` for it:

```
let (>>>=) a b = a >>= (fun () -> b)
```

```
| Inc x ->
  find x >>= fun v ->
    set x (v + 1) >>>=
    ret (v + 1)
```

Evaluator with stateful railways

```
let rec eval e =
  match e with
  | N n -> ret n
  | V x -> find x
  | Add (a1, a2) -> binop ( + ) (eval a1) (eval a2)
  | Sub (a1, a2) -> binop ( - ) (eval a1) (eval a2)
  | Mul (a1, a2) -> binop ( * ) (eval a1) (eval a2)
  | Div (a1, a2) ->
    eval a1 >>= fun x ->
    eval a2 >>= fun y ->
      if y <> 0 then ret (x / y) else fail DivisionByZero
  | Inc x ->
    find x >>= fun v ->
    set x (v + 1) >>>=
    ret (v + 1)
```

Compare the type of $\gg=$ & ret

Option

```
ret :  
'a -> 'a option  
  
(>>=) :  
'a option ->  
( 'a ->  
'b option) ->  
'b option
```

Result

```
ret :  
'a -> Result<'a>  
  
Result<'a> ->  
Result<'b>) ->  
Result<'b>
```

Result + State

```
ret :  
'a ->  
state -> Result<'a * state>  
  
state -> Result<'a * state> ->  
state -> Result<'b * state>) ->  
state -> Result<'b * state>
```

Compare the type of $\gg=$ & ret

Option

```
ret :  
'a -> 'a option  
  
(>>=) :  
'a option ->  
( 'a ->  
'b option ) ->  
'b option
```

Result

```
ret :  
'a -> Result<'a>  
  
Result<'a> ->  
( 'a ->  
Result<'b>) ->  
Result<'b>
```

Result + State

```
ret :  
'a ->  
state -> Result<'a * state>  
  
state -> Result<'a * state> ->  
( 'a ->  
state -> Result<'b * state>) ->  
state -> Result<'b * state>
```

Compare the type of $\gg=$ & ret

Option

```
ret :  
'a -> 'a option  
  
(>>=) :  
'a option ->  
( 'a ->  
'b option ) ->  
'b option
```

Result

```
ret :  
'a -> Result<'a>  
  
Result<'a> ->  
( 'a ->  
Result<'b> ) ->  
Result<'b>
```

Result + State

```
ret :  
'a ->  
state -> Result<'a * state>  
  
state -> Result<'a * state> ->  
( 'a ->  
state -> Result<'b * state> ) ->  
state -> Result<'b * state>
```

Compare the type of $\gg=$ & ret

Option

```
ret :  
'a -> 'a option  
  
(>>=) :  
'a option ->  
( 'a ->  
'b option ->  
'b option ) ->
```

Result

```
ret :  
'a -> Result<'a>  
  
Result<'a> ->  
( 'a ->  
Result<'b> ->  
Result<'b> ) ->
```

Result + State

```
ret :  
'a ->  
state -> Result<'a * state>  
  
state -> Result<'a * state> ->  
( 'a ->  
state -> Result<'b * state> ) ->  
state -> Result<'b * state>
```

Compare the type of $\gg=$ & ret

<u>Option</u>	<u>Result</u>	<u>Result + State</u>
<pre>ret : 'a -> M<'a></pre>	<pre>ret : 'a -> M<'a></pre>	<pre>ret : 'a -> M<'a></pre>
<pre>(>>=) : M<'a> -> ('a -> M<'b>) -> M<'b></pre>	<pre>(>>=) : M<'a> -> ('a -> M<'b>) -> M<'b></pre>	<pre>(>>=) : M<'a> -> ('a -> M<'b>) -> M<'b></pre>

Compare the type of $>>=$ & ret

Option

Result

Result + State

$M<'a> = 'a \text{ option}$

ret :
 $'a \rightarrow M<'a>$

($>>=$) :
 $M<'a> \rightarrow$
($'a \rightarrow$
 $M<'b>$) \rightarrow
 $M<'b>$

$M<'a> = Result<'a>$

ret :
 $'a \rightarrow M<'a>$

($>>=$) :
 $M<'a> \rightarrow$
($'a \rightarrow$
 $M<'b>$) \rightarrow
 $M<'b>$

$M<'a> = state \rightarrow Result<'a * state>$

ret :
 $'a \rightarrow M<'a>$

($>>=$) :
 $M<'a> \rightarrow$
($'a \rightarrow$
 $M<'b>$) \rightarrow
 $M<'b>$

Compare the type of $>>=$ & `ret`

They are **exactly** the same

```
ret :  
  'a -> M<'a>
```

```
(>>=) :  
  M<'a> ->  
  ('a ->  
   M<'b>) ->  
  M<'b>
```

Compare the type of $>>=$ & `ret`

They are **exactly** the same

```
ret :  
  'a -> M<'a>  
  
(>>=) :  
  M<'a> ->  
  ('a ->  
   M<'b>) ->  
  M<'b>
```

A type $M<'a>$
with these
functions is
called a monad*

Compare the type of $>>=$ & `ret`

They are **exactly** the same

```
ret :  
  'a -> M<'a>  
  
(>>=) :  
  M<'a> ->  
  ('a ->  
   M<'b>) ->  
  M<'b>
```

A type $M<'a>$
with these
functions is
called a monad*

* Conditions apply; see next slides

Getting to monads

- Railway-oriented programming offers a **versatile abstraction**
- We only need 2 ingredients:
 - ▶ $\gg= : M<'a> \rightarrow (a \rightarrow M<'b>) \rightarrow M<'b>$
 - ▶ $\text{ret} : 'a \rightarrow M<'a>$

Getting to monads

- Railway-oriented programming offers a **versatile abstraction**
- We only need 2 ingredients:
 - ▶ $\gg= : M<'a> \rightarrow (a \rightarrow M<'b>) \rightarrow M<'b>$
 - ▶ $\text{ret} : 'a \rightarrow M<'a>$
- Technically, $\gg=$ and ret need to satisfy the **monad laws**

Monad Laws

$$\text{ret } a \gg= f = f a \quad (1)$$

$$m \gg= \text{ret} = m \quad (2)$$

$$(m \gg= f) \gg= g = m \gg= (\text{fun } x \rightarrow f x \gg= g) \quad (3)$$

If these equations are satisfied,
then $\gg=$ and ret form a monad.

Monad Laws

$$\text{ret } a \gg= f = f a \quad (1)$$

$$m \gg= \text{ret} = m \quad (2)$$

$$(m \gg= f) \gg= g = m \gg= (\text{fun } x \rightarrow f x \gg= g) \quad (3)$$

I only mention them for the sake of completion.

You don't need to know them.

Function composition

$$\text{id} \gg f = f \tag{1}$$

$$f \gg \text{id} = f \tag{2}$$

$$(h \gg f) \gg g = h \gg (f \gg g) \tag{3}$$

Monad laws correspond to these laws of function composition (\gg) and the identity function (id).

Questions?

Part IV

Computation Expressions

Computation expressions

- **Ergonomic syntax** to work with monads (and similar structures) more easily.
- **Extensible** by the user.

So we can write this:

```
let binop f a b =  
  ev { let! x = a  
        let! y = b  
        return f x y }
```

Instead of this:

```
let binop f a b =  
  a >>= fun x =>  
  b >>= fun y =>  
  ret (f x y)
```

Computation expressions

- **Ergonomic syntax** to work with monads (and similar structures) more easily.
- **Extensible** by the user.

So we can write this:

```
let binop f a b =  
  ev { let! x = a  
        let! y = b  
        return f x y }
```

Instead of this:

```
let binop f a b =  
  a >>= fun x ->  
  b >>= fun y ->  
  ret (f x y)
```

These are F# keywords (but you define what they mean).

The binop-operator revisited

Without computation expr.

```
let binop f a b =  
    a >>= fun x ->  
    b >>= fun y ->  
    ret (f x y)
```

Computation expressions

```
let binop f a b =  
    ev { let! x = a  
         let! y = b  
         return f x y }
```

```
type MyResultBuilder() =  
    member bld.Bind (a, f) =  
        a >>= f  
    member bld.Return e =  
        ret e  
    member bld.ReturnFrom e =  
        e  
let ev = MyResultBuilder()
```

The binop-operator revisited

Without computation expr.

```
let binop f a b =  
    a >>= fun x ->  
    b >>= fun y ->  
    ret (f x y)
```

Computation expressions

```
let binop f a b =  
    ev { let! x = a  
         let! y = b  
         return f x y }
```

```
type MyResultBuilder() =  
    member bld.Bind (a, f) =  
        a >>= f  
    member bld.Return e =  
        ret e  
    member bld.ReturnFrom e =  
        e  
let ev = MyResultBuilder()
```

These names must match

The binop-operator revisited

Our last binop operation

```
let binop f a b =  
    a >>= fun x ->  
    b >>= fun y ->  
    ret (f x y)
```

```
type MyResultBuilder() =  
    member bld.Bind (a, f) =  
        a >>= f  
    member bld.Return e =  
        ret e  
    member bld.ReturnFrom e =  
        e  
let ev = MyResultBuilder()
```

Computation expressions

```
let binop f a b =  
    ev { let! x = a  
         let! y = b  
         return f x y }
```

Monadic bind

The binop-operator revisited

Our last binop operation

```
let binop f a b =  
    a >>= fun x ->  
    b >>= fun y ->  
    ret (f x y)
```

Computation expressions

```
let binop f a b =  
    ev { let! x = a  
         let! y = b  
         return f x y }
```

```
type MyResultBuilder() =  
    member bld.Bind (a, f) =  
        a >>= f  
    member bld.Return e =  
        ret e  
    member bld.ReturnFrom e =  
        e  
let ev = MyResultBuilder()
```

Monadic return

The binop-operator revisited

Our last binop operation

```
let binop f a b =  
    a >>= fun x ->  
    b >>= fun y ->  
    ret (f x y)
```

Computation expressions

```
let binop f a b =  
    ev { let! x = a  
         let! y = b  
         return f x y }
```

```
type MyResultBuilder() =  
    member bld.Bind (a, f) =  
        a >>= f  
    member bld.Return e =  
        ret e  
    member bld.ReturnFrom e =  
        e  
let ev = MyResultBuilder()
```

Useful for returning failure values (keyword return!)

The binop-operator revisited

Our last binop operation

```
let binop f a b =  
    a >>= fun x ->  
    b >>= fun y ->  
    ret (f x y)
```

Computation expressions

```
let binop f a b =  
    ev { let! x = a  
         let! y = b  
         return f x y }
```

```
type MyResultBuilder() =  
    member bld.Bind (a, f) =  
        a >>= f  
    member bld.Return e =  
        ret e  
    member bld.ReturnFrom e =  
        e  
let ev = MyResultBuilder()
```

```
let binop f a b =  
    ev.Bind (a, fun x ->  
             ev.Bind (b, fun y ->  
                     ev.Return(f x y)))
```

The binop-operator revisited

Our last binop operation

```
let binop f a b =  
    a >>= fun x ->  
    b >>= fun y ->  
    ret (f x y)
```

```
type MyResultBuilder() =  
    member bld.Bind (a, f) =  
        a >>= f  
    member bld.Return e =  
        ret e  
    member bld.ReturnFrom e =  
        e  
let ev = MyResultBuilder()
```

Computation expressions

```
let binop f a b =  
    ev { let! x = a  
         let! y = b  
         return f x y }
```

Syntactic sugar
for this

```
let binop f a b =  
    ev.Bind (a, fun x ->  
             ev.Bind (b, fun y ->  
                     ev.Return(f x y)))
```

Translations into standard syntax

Translation function $\textcolor{brown}{T}$ translates computational expressions to standard syntax

$$\textcolor{brown}{T}(\text{return } v) = \text{Return } v$$

$$\textcolor{brown}{T}(\text{return! } e) = \text{ReturnFrom } e$$

$$\begin{aligned} \textcolor{brown}{T}(\text{let! } x = e \\ ce) &= \text{Bind}(e, \text{ fun } x \rightarrow \textcolor{brown}{T}(ce)) \end{aligned}$$

$$\begin{aligned} \textcolor{brown}{T}(\text{do! } e \\ ce) &= \text{Bind}(e, \text{ fun } () \rightarrow \textcolor{brown}{T}(ce)) \end{aligned}$$

Example

$\text{T}(\text{return } v) = \text{Return } v$
 $\text{T}(\text{let! } x = e \\ ce) = \text{Bind}(e, \text{ fun } x \rightarrow \text{T}(ce))$

```
let binop f a b =
  ev { let! x = a
       let! y = b
       return f x y }
```

Example

$\text{T}(\text{return } v) = \text{Return } v$
 $\text{T}(\text{let! } x = e \\ ce) = \text{Bind}(e, \text{ fun } x \rightarrow \text{T}(ce))$

```
let binop f a b =
  T ( let! x = a
      let! y = b
      return f x y )
```

Example

$\text{T}(\text{return } v) = \text{Return } v$
 $\text{T}(\text{let! } x = e \\ ce) = \text{Bind}(e, \text{ fun } x \rightarrow \text{T}(ce))$

```
let binop f a b =  
  Bind(a, fun x =>  
    T (let! y = b  
        return f x y))
```

Example

$\text{T}(\text{return } v) = \text{Return } v$
 $\text{T}(\text{let! } x = e \\ ce) = \text{Bind}(e, \text{ fun } x \rightarrow \text{T}(ce))$

```
let binop f a b =  
    Bind(a, fun x =>  
        Bind(b, fun y =>  
            T (return f x y)))
```

Example

$\text{T}(\text{return } v) = \text{Return } v$

$\text{T}(\text{let! } x = e \\ ce) = \text{Bind}(e, \text{ fun } x \rightarrow \text{T}(ce))$

```
let binop f a b =
  Bind(a, fun x =>
    Bind(b, fun y =>
      Return (f x y))))
```

Example

$\text{T}(\text{return } v) = \text{Return } v$
 $\text{T}(\text{let! } x = e \\ ce) = \text{Bind}(e, \text{ fun } x \rightarrow \text{T}(ce))$

```
let binop f a b =
    a >>= fun x =>
    b >>= fun y =>
    ret (f x y)
```

Evaluator w/ computation expressions

```
let binop f a b =
  ev { let! x = a
        let! y = b
        return f x y }

let div a b = ev {
  let! x = a
  let! y = b
  if y <> 0 then
    return (x / y)
  else
    return! fail DivisionByZero }
```

```
let rec eval e =
  match e with
  | N n -> ev {return n}
  | V x -> find x
  | Add (a1, a2) ->
    binop ( + ) (eval a1) (eval a2)
  | Sub (a1, a2) ->
    binop ( - ) (eval a1) (eval a2)
  | Mul (a1, a2) ->
    binop ( * ) (eval a1) (eval a2)
  | Div (a1, a2) ->
    div (eval a1) (eval a2)
  | Inc x ->
    ev { let! v = find x
          do! set x (v + 1)
          return v + 1 }
```

Evaluator as one big ev{...}

```
let rec eval (a : aExp) : state -> Result<int * state> = ev {  
  match a with  
  | N n -> return n  
  | V x -> return! find x  
  | Add (a1, a2) -> return! binop ( + ) (eval a1) (eval a2)  
  | Sub (a1, a2) -> return! binop ( - ) (eval a1) (eval a2)  
  | Mul (a1, a2) -> return! binop ( * ) (eval a1) (eval a2)  
  | Div (a1, a2) ->  
    let! x = eval a1  
    let! y = eval a2  
    if y <> 0 then return (x / y)  
    else return! fail DivisionByZero  
  | Inc x ->  
    let! v = find x  
    do! set x (v + 1)  
    return v + 1 }
```

Sequence expressions

```
> seq {for x in 1..10 do yield x * x}
```

```
val it : seq<int> = seq [1; 4; 9; 16; ...]
```

- Sequence expressions are a special case of **computation expressions**.
- Uses For & Yield Instead of Bind & Return

The computation expression for sequences is defined like this:

```
type MySeqBuilder() =
    member this.Yield x = ...
    ...
let seq = MySeqBuilder()
```

Sequence expressions

```
> seq {for x in 1..10 do yield x * x}
```

The above syntax is translated as follows:

$T(\text{yield } v)$ = Yield v

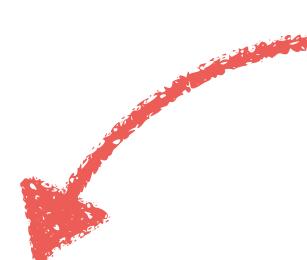
$T(\text{yield! } e)$ = YieldFrom e

$T(\text{for } x \text{ in } e \text{ do } ce)$ = For(e, fun x -> T(ce))

Sequence expressions

```
> seq {for x in 1..10 do yield x * x}
```

The above syntax is translated as follows:

 **T** is the function that does the translation.

$$\mathbf{T}(\mathbf{yield}\ v) = \mathbf{Yield}\ v$$

$$\mathbf{T}(\mathbf{yield!}\ e) = \mathbf{YieldFrom}\ e$$

$$\mathbf{T}(\mathbf{for}\ x\ \mathbf{in}\ e\ \mathbf{do}\ ce) = \mathbf{For}(e, \mathbf{fun}\ x\ \rightarrow \mathbf{T}(ce))$$

Sequence expressions

```
> seq {for x in 1..10 do yield x * x}
```

In addition, computation expressions
for sequences use the function Delay

$$T(\text{seq } \{\text{ce}\}) = \text{Delay } (\text{fun } () \rightarrow T(\text{ce}))$$

Sequence expressions

```
> seq {for x in 1..10 do yield x * x}
```

In addition, computation expressions for sequences use the function Delay

$$\text{T}(\text{seq } \{\text{ce}\}) = \text{Delay } (\text{fun } () \rightarrow \text{T } (\text{ce}))$$

This makes sure that sequences defined by `seq {...}` are delayed by default (\Rightarrow can be used in recursive functions)

Summary

- The **railway** approach (a.k.a. **monads**) allows you to encapsulate behind-the-scenes boilerplate code (handling errors, reading/updating state)
- Then you can **focus on the main logic** in your code (e.g. evaluating an expression)
- **Computation expressions** provide a nicer syntax to do all of this.
- Computation expressions are also used for **sequences** and for **asynchronous** programming (see later lecture)