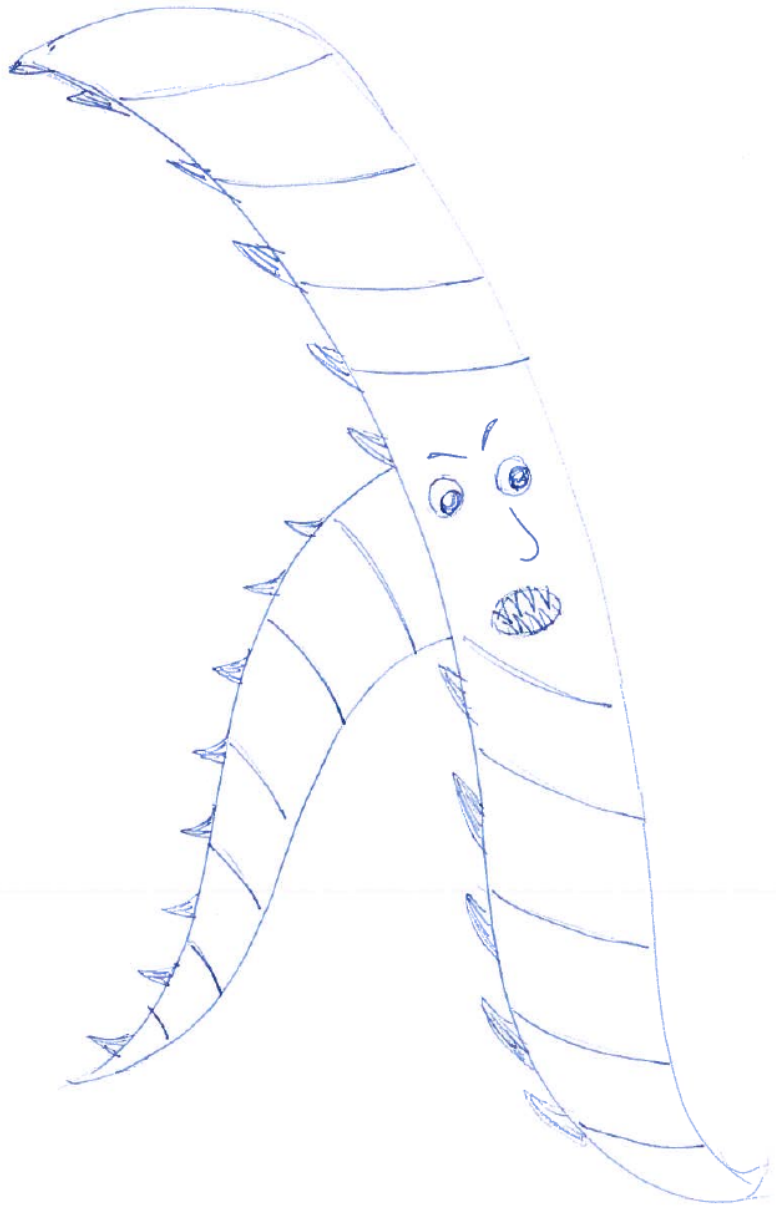


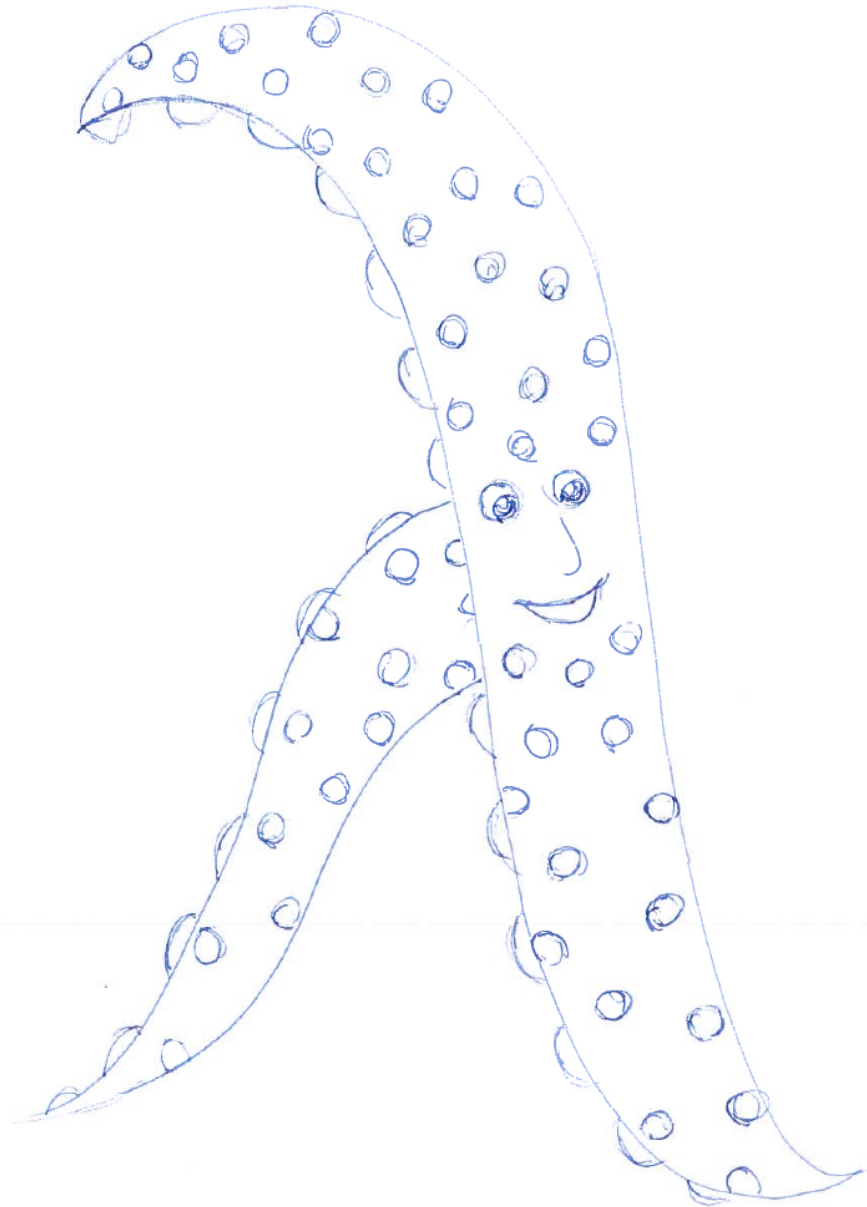
# The Essence of Language Integrated Query

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# Database programming languages

## Kleisli

Buneman, Libkin, Suciu, Tannen, Wong (Penn)

## Ferry

Grust, Mayr, Rittinger, Schreiber (Tübingen)

## Links

Cooper, Lindley, Wadler, Yallop (Edinburgh)

## SML#

Ohori, Ueno (Tohoku)

## Ur/Web

Chlipala (Harvard/MIT)

## LINQ for C#, VB, F#

Helsbjorg, Meijer, Syme (Microsoft Redmond & Cambridge)

## *Our goals:*

Abstraction over values (first-order)

Abstraction over predicates (higher-order)

Composition of queries

Dynamic generation of queries

Type-safety

## *Goldilocks:*

Exactly one query per *run*

Not too few (**failure**)

Not too many (**avalanche**)

## *Our restrictions:*

We consider only *select-from-where* queries,  
with *exists* and *union*.

We equate *bags* and *lists*.

Future work to extend to *group-by* and *sort-by*.

Part I

*A first example*



# A database

people

name	age
"Alex"	60
"Bert"	56
"Cora"	33
"Drew"	31
"Edna"	21
"Fred"	60

couples

her	him
"Alex"	"Bert"
"Cora"	"Drew"
"Edna"	"Fred"

## A query in SQL

```
select w.name as name, w.age – m.age as diff
from couples as c,
      people as w,
      people as m
where c.her = w.name and c.him = m.name and
      w.age > m.age
```

name	diff
“Alex”	4
“Cora”	2

## A database as data

{people =

[ {name = "Alex" ; age = 60};

{name = "Bert" ; age = 56};

{name = "Cora" ; age = 33};

{name = "Drew"; age = 31};

{name = "Edna"; age = 21};

{name = "Fred" ; age = 60} ] ;

couples =

[ {her = "Alex" ; him = "Bert" } ;

{her = "Cora" ; him = "Drew"} ;

{her = "Edna" ; him = "Fred" } ] }

## Importing the database (naive)

```
type DB =  
  {people :  
    {name : string; age : int} list;  
  couples :  
    {her : string; him : string} list}  
let db' : DB = database("People")
```

## A query as a comprehension (naive)

```
let differences' : {name : string; diff : int} list =  
  for c in db'.couples do  
  for w in db'.people do  
  for m in db'.people do  
  if c.her = w.name && c.him = m.name && w.age > m.age then  
  yield {name : w.name; diff : w.age – m.age}
```

differences'

```
[ {name = "Alex"; diff = 4}  
  {name = "Cora"; diff = 2} ]
```

## Importing the database (quoted)

```
type DB =  
  {people :  
    {name : string; age : int} list;  
  couples :  
    {her : string; him : string} list}  
let db : Expr< DB > = <@ database("People") @>
```

## A query as a comprehension (quoted)

```
let differences : Expr< {name : string; diff : int} list > =  
  <@ for c in (%db).couples do  
    for w in (%db).people do  
      for m in (%db).people do  
        if c.her = w.name && c.him = m.name && w.age > m.age then  
          yield {name : w.name; diff : w.age – m.age} @>
```

**run**(differences)

```
[ {name = "Alex"; diff = 4}  
  {name = "Cora"; diff = 2} ]
```

Execute **run** as follows:

1. compute quoted expression
2. simplify quoted expression
3. translate query to SQL
4. execute SQL
5. translate answer to host language

Each **run** generates one query if:

- A. answer type is flat (bag-of-record-of-scalars)
- B. only permitted operations (e.g., no recursion)
- C. consistent use of **database** (all same)



## Part II

Abstraction, composition, dynamic generation

# Abstracting over values

```
type Names = {name : string} list
```

```
let range : Expr< (int, int) → Names > =
```

```
  <@ fun(a, b) → for w in (%db).people do
```

```
    if a ≤ w.age && w.age < b then
```

```
    yield {name : w.name} @>
```

```
run(<@ (%range)(30, 40) @>)
```

```
[{name = "Cora"}; {name = "Drew"}]
```

# Abstracting over a predicate

```
let satisfies : Expr< (int → bool) → Names > =  
  <@ fun(p) → for w in (%db).people do  
    if p(w.age) then  
      yield {name : w.name} @>
```

```
run(<@ (%satisfies)(fun(x) → 30 ≤ x && x < 40) @>)  
  [{name = "Cora"}; {name = "Drew"}]
```

```
run(<@ (%satisfies)(fun(x) → x mod 2 = 0) @>)  
  [{name = "Alex"}; {name = "Bert"}; {name = "Fred"}]
```

# Composing queries

```
let ageFromName : Expr< string → int list > =
```

```
<@ fun(s) → for u in (%db).people do
```

```
    if u.name = s then
```

```
        yield u.age @>
```

```
let rangeFromNames : Expr< (string, string) → Names > =
```

```
<@ fun(s, t) → for a in (%ageFromName)(s) do
```

```
    for b in (%ageFromName)(t) do
```

```
        (%range)(a, b) @>
```

```
run(<@ (%nameRange)("Edna", "Bert") @>)
```

```
[ {name = "Cora"}; {name = "Drew"}; {name = "Edna"} ]
```

# Dynamically generated queries (1)

**type** Predicate =

| Above **of** int

| Below **of** int

| And **of** Predicate × Predicate

| Or **of** Predicate × Predicate

| Not **of** Predicate

**let** t<sub>0</sub> : Predicate = And(Above(30), Below(40))

**let** t<sub>1</sub> : Predicate = Not(Or(Below(30), Above(40)))

## Dynamically generated queries (2)

**let rec** P(*t* : Predicate) : Expr<int → bool> =

**match** *t* **with**

| Above(*a*) → <@ **fun**(*x*) → (%**lift**(*a*)) ≤ *x* @>

| Below(*a*) → <@ **fun**(*x*) → *x* < (%**lift**(*a*)) @>

| And(*t*, *u*) → <@ **fun**(*x*) → (%P(*t*))(*x*) && (%P(*u*))(*x*) @>

| Or(*t*, *u*) → <@ **fun**(*x*) → (%P(*t*))(*x*) || (%P(*u*))(*x*) @>

| Not(*t*) → <@ **fun**(*x*) → **not**((%P(*t*))(*x*)) @>

## Dynamically generated queries (3)

$P(t_0)$

$\langle @ \text{fun}(x) \rightarrow (\text{fun}(x) \rightarrow 30 \leq x)(x) \ \&\& \ (\text{fun}(x) \rightarrow x < 40)(x) \ @ \rangle$

$\langle @ \text{fun}(x) \rightarrow 30 \leq x \ \&\& \ x < 40 \ @ \rangle$

**run**( $\langle @ \text{(\%satisfies)(\%P}(t_0)) \ @ \rangle$ )

[ {name = "Cora"}; {name = "Drew"} ]

**run**( $\langle @ \text{(\%satisfies)(\%P}(t_1)) \ @ \rangle$ )

[ {name = "Cora"}; {name = "Drew"} ]

Part III

Nesting



# Flat data

```
{departments =
```

```
  [ {dpt = "Product"};
```

```
    {dpt = "Quality"};
```

```
    {dpt = "Research"};
```

```
    {dpt = "Sales"} ];
```

```
employees =
```

```
  [ {dpt = "Product"; emp = "Alex"};
```

```
    {dpt = "Product"; emp = "Bert"};
```

```
    {dpt = "Research"; emp = "Cora"};
```

```
    {dpt = "Research"; emp = "Drew"};
```

```
    {dpt = "Research"; emp = "Edna"};
```

```
    {dpt = "Sales"; emp = "Fred"} ];
```

## Flat data (continued)

tasks =

```
[ {emp = "Alex"; tsk = "build"};  
  {emp = "Bert"; tsk = "build"};  
  {emp = "Cora"; tsk = "abstract"};  
  {emp = "Cora"; tsk = "build"};  
  {emp = "Cora"; tsk = "design"};  
  {emp = "Drew"; tsk = "abstract"};  
  {emp = "Drew"; tsk = "design"};  
  {emp = "Edna"; tsk = "abstract"};  
  {emp = "Edna"; tsk = "call"};  
  {emp = "Edna"; tsk = "design"};  
  {emp = "Fred"; tsk = "call"} ] }
```

# Importing the database

```
type Org = {departments : {dpt : string} list;  
            employees : {dpt : string; emp : string} list;  
            tasks : {emp : string; tsk : string} list }  
let org : Expr< Org > = <@ database("Org") @>
```

# Departments where every employee can do a given task

```
let expertise' : Expr< string → {dpt : string} list > =
```

```
<@ fun(u) → for d in (%org).departments do
```

```
  if not(exists(
```

```
    for e in (%org).employees do
```

```
    if d.dpt = e.dpt && not(exists(
```

```
      for t in (%org).tasks do
```

```
        if e.emp = t.emp && t.tsk = u then yield { })
```

```
    )) then yield { })
```

```
  )) then yield {dpt = d.dpt} @>
```

```
run(<@ (%expertise')("abstract") @>)
```

```
[ {dpt = "Quality"}; {dpt = "Research"} ]
```

## Nested data

```
[ {dpt = "Product"; employees =  
  [ {emp = "Alex"; tasks = [ "build" ] }  
    {emp = "Bert"; tasks = [ "build" ] } ] ];  
{dpt = "Quality"; employees = [ ] };  
{dpt = "Research"; employees =  
  [ {emp = "Cora"; tasks = [ "abstract"; "build"; "design" ] } ;  
    {emp = "Drew"; tasks = [ "abstract"; "design" ] } ;  
    {emp = "Edna"; tasks = [ "abstract"; "call"; "design" ] } ] ];  
{dpt = "Sales"; employees =  
  [ {emp = "Fred"; tasks = [ "call" ] } ] ] ]
```

## Nested data from flat data

```
type NestedOrg = [{dpt : string; employees :  
                    [{emp : string; tasks : [string] }]}]
```

```
let nestedOrg : Expr<NestedOrg> =  
  <@ for d in (%org).departments do  
    yield {dpt = d.dpt; employees =  
          for e in (%org).employees do  
            if d.dpt = e.dpt then  
              yield {emp = e.emp; tasks =  
                    for t in (%org).tasks do  
                      if e.emp = t.emp then  
                        yield t.tsk}}}} @>
```

# Higher-order queries

**let any** : Expr< (**A list**,  $A \rightarrow \mathbf{bool}$ )  $\rightarrow \mathbf{bool}$  > =

<@ **fun**(xs, p)  $\rightarrow$

**exists**(for x in xs do

**if** p(x) **then**

**yield** { }) @>

**let all** : Expr< (**A list**,  $A \rightarrow \mathbf{bool}$ )  $\rightarrow \mathbf{bool}$  > =

<@ **fun**(xs, p)  $\rightarrow$

**not**((%any)(xs, **fun**(x)  $\rightarrow$  **not**(p(x)))) @>

**let contains** : Expr< (**A list**,  $A$ )  $\rightarrow \mathbf{bool}$  > =

<@ **fun**(xs, u)  $\rightarrow$

(%any)(xs, **fun**(x)  $\rightarrow$  x = u) @>

# Departments where every employee can do a given task

```
let expertise : Expr< string → {dpt : string} list > =  
  <@ fun(u) → for d in (%nestedOrg)  
    if (%all)(d.employees,  
      fun(e) → (%contains)(e.tasks, u) then  
    yield {dpt = d.dpt} @>
```

```
run(<@ (%expertise)("abstract") @>)
```

```
[{dpt = "Quality"}; {dpt = "Research"}]
```



## Part IV

# Quotations vs. functions

# Abstracting over values

```
let range : Expr< (int, int) → Names > =  
  <@ fun(a, b) → for w in (%db).people do  
    if a ≤ w.age && w.age < b then  
      yield {name : w.name} @>  
run(<@ (%range)(30, 40) @>)
```

vs.

```
let range'(a : Expr< int >, b : Expr< int >) : Names =  
  <@ for w in (%db).people do  
    if (%a) ≤ w.age && w.age < (%b) then  
      yield {name : w.name} @>  
run(range'(<@ 30 @>, <@ 40 @>))
```

# Composing queries

```
let rangeFromNames : Expr< (string, string) → Names > =  
  <@ fun(s, t) → for a in (%ageFromName)(s) do  
    for b in (%ageFromName)(t) do  
      (%range)(a, b) @>
```

vs.

```
let rangeFromNames' : Expr< (string, string) → Names > =  
  <@ fun(s, t) → for a in (%ageFromName)(s) do  
    for b in (%ageFromName)(t) do  
      (%range'(<@ a @>, <@ b @>)) @>
```

Prefer  
*closed quotations*  
to  
*open quotations.*

Prefer  
*quotations of functions*  
to  
*functions of quotations.*

Part V

From XPath to SQL

Part VI

Idealised LINQ

# Terms

VAR

$$\frac{}{\Gamma, x : A \vdash x : A}$$

FUN

$$\frac{\Gamma, x : A \vdash N : B}{\Gamma \vdash \mathbf{fun}(x) \rightarrow N : A \rightarrow B}$$

APP

$$\frac{\Gamma \vdash L : A \rightarrow B \quad \Gamma \vdash M : A}{\Gamma \vdash L M : B}$$

SINGLETON

$$\frac{\Gamma \vdash M : A}{\Gamma \vdash \mathbf{yield} M : A \mathbf{list}}$$

FOR

$$\frac{\Gamma \vdash M : A \mathbf{list} \quad \Gamma, x : A \vdash N : B \mathbf{list}}{\Gamma \vdash \mathbf{for} x \mathbf{in} M \mathbf{do} N : B \mathbf{list}}$$

REC

$$\frac{\Gamma, f : A \rightarrow B, x : A \vdash N : B}{\Gamma \vdash \mathbf{rec} f(x) \rightarrow N : A \rightarrow B}$$

# Quoted terms

VARQ

$$\frac{}{\Gamma; \Delta, x : A \vdash x : A}$$

FUNQ

$$\frac{\Gamma; \Delta, x : A \vdash N : B}{\Gamma; \Delta \vdash \mathbf{fun}(x) \rightarrow N : A \rightarrow B}$$

APPQ

$$\frac{\Gamma; \Delta \vdash L : A \rightarrow B \quad \Gamma; \Delta \vdash M : A}{\Gamma; \Delta \vdash L M : B}$$

SINGLETONQ

$$\frac{\Gamma; \Delta \vdash M : A}{\Gamma; \Delta \vdash \mathbf{yield} M : A \mathbf{list}}$$

FORQ

$$\frac{\Gamma; \Delta \vdash M : A \mathbf{list} \quad \Gamma; \Delta, x : A \vdash N : B \mathbf{list}}{\Gamma; \Delta \vdash \mathbf{for} x \mathbf{in} M \mathbf{do} N : B \mathbf{list}}$$

DATABASE

$$\frac{\Sigma(\mathbf{db}) = \{\overline{\ell : T}\}}{\Gamma; \Delta \vdash \mathbf{database}(\mathbf{db}) : \{\overline{\ell : T}\}}$$



# Quotation and anti-quotation

QUOTE

$$\frac{\Gamma; \cdot \vdash M : A}{\Gamma \vdash \langle @ M @ \rangle : \text{Expr} \langle A \rangle}$$

ANTIQUOTE

$$\frac{\Gamma \vdash M : \text{Expr} \langle A \rangle}{\Gamma; \Delta \vdash (\%M) : A}$$

RUN

$$\frac{\Gamma \vdash M : \text{Expr} \langle T \rangle}{\Gamma \vdash \mathbf{run}(M) : T}$$

LIFT

$$\frac{\Gamma \vdash M : O}{\Gamma \vdash \mathbf{lift}(M) : \text{Expr} \langle O \rangle}$$

# Normalisation: symbolic evaluation

**(fun**( $x$ )  $\rightarrow N$ )  $M \rightsquigarrow N[x := M]$

$\{\overline{\ell = M}\}.l_i \rightsquigarrow M_i$

**for**  $x$  **in** (**yield**  $M$ ) **do**  $N \rightsquigarrow N[x := M]$

**for**  $y$  **in** (**for**  $x$  **in**  $L$  **do**  $M$ ) **do**  $N \rightsquigarrow$  **for**  $x$  **in**  $L$  **do** (**for**  $y$  **in**  $M$  **do**  $N$ )

**for**  $x$  **in** (**if**  $L$  **then**  $M$ ) **do**  $N \rightsquigarrow$  **if**  $L$  **then** (**for**  $x$  **in**  $M$  **do**  $N$ )

**for**  $x$  **in** [ ] **do**  $N \rightsquigarrow$  [ ]

**for**  $x$  **in** ( $L @ M$ ) **do**  $N \rightsquigarrow$  (**for**  $x$  **in**  $L$  **do**  $N$ ) @ (**for**  $x$  **in**  $M$  **do**  $N$ )

**if** **true** **then**  $M \rightsquigarrow M$

**if** **false** **then**  $M \rightsquigarrow$  [ ]

## Normalisation: *ad hoc* rewriting

**for**  $x$  **in**  $L$  **do**  $(M @ N)$   $\hookrightarrow$  (**for**  $x$  **in**  $L$  **do**  $M$ ) @ (**for**  $x$  **in**  $L$  **do**  $N$ )

**for**  $x$  **in**  $L$  **do**  $[\ ]$   $\hookrightarrow$   $[\ ]$

**if**  $L$  **then**  $(M @ N)$   $\hookrightarrow$  (**if**  $L$  **then**  $M$ ) @ (**if**  $L$  **then**  $N$ )

**if**  $L$  **then**  $[\ ]$   $\hookrightarrow$   $[\ ]$

**if**  $L$  **then** (**for**  $x$  **in**  $M$  **do**  $N$ )  $\hookrightarrow$  **for**  $x$  **in**  $M$  **do** (**if**  $L$  **then**  $N$ )

**if**  $L$  **then** (**if**  $M$  **then**  $N$ )  $\hookrightarrow$  **if**  $(L \ \&\& \ M)$  **then**  $N$

**yield**  $x$   $\hookrightarrow$  **yield**  $\{\overline{\ell = x.\ell}\}$

**database**( $db$ ). $\ell$   $\hookrightarrow$  **for**  $x$  **in** **database**( $db$ ). $\ell$  **do** **yield**  $x$

# Properties of reduction

On well-typed terms, the relations  $\rightsquigarrow$  and  $\hookrightarrow$

- *preserve* typing,
- are *strongly normalising*, and
- are *confluent*.

## Example (1): query

```
run(<@ (%nameRange)("Edna", "Bert") @>)
```

## Example (2): after splicing

```
(fun(s, t) →  
  for a in (fun(s) →  
    for u in database("People").people do  
    if u.name = s then yield u.age)(s) do  
  for b in (fun(s) →  
    for u in database("People").people do  
    if u.name = s then yield u.age)(t) do  
  (fun(a, b) →  
    for w in database("People").people do  
    if a ≤ w.age && w.age < b then  
    yield {name : w.name})(a, b))  
("Edna", "Bert")
```

## Example (3): beta reduction $\rightsquigarrow$

```
for a in (for u in database("People").people do  
    if u.name = "Edna" then yield u.age) do  
for b in (for u in database("People").people do  
    if u.name = "Bert" then yield u.age) do  
for w in database("People").people do  
if a ≤ w.age && w.age < b then  
yield {name : w.name}
```

## Example (4): other rewriting $\rightsquigarrow$

```
for u in database("People").people do  
if u.name = "Edna" then  
for v in database("People").people do  
if v.name = "Bert" then  
for w in database("People").people do  
if u.age  $\leq$  w.age && w.age < v.age then  
yield {name : w.name}
```



## Example (5): *ad hoc* reductions $\hookrightarrow$

```
for u in database("People").people do  
for v in database("People").people do  
for w in database("People").people do  
if u.name = "Edna" && v.name = "Bert" &&  
    u.age  $\leq$  w.age && w.age < v.age then  
yield {name : w.name}
```

## Example (6): SQL

```
select w.name as name
from people as u,
      people as v,
      people as w
where u.name = "Edna" and v.name = "Bert" and
      u.age ≤ w.age and w.age < v.age
```

Part VII

Results

Example	F# 2.0	F# 3.0	Our system
differences	✓	✓	✓
range	✗	✓	✓
satisfies	✓	✗	✓
satisfies	✓	✗	✓
rangeFromNames	✗	✗	✓
P(t <sub>0</sub> )	✓	✗	✓
P(t <sub>1</sub> )	✓	✗	✓
expertise'	✓	✓	✓
expertise	✗	avalanche	✓
xp <sub>0</sub>	✗	✓	✓
xp <sub>1</sub>	✗	✓	✓
xp <sub>2</sub>	✗	✗	✓
xp <sub>3</sub>	✗	✗	✓

## *Our goals:*

Abstraction over values (first-order)

Abstraction over predicates (higher-order)

Composition of queries

Dynamic generation of queries

Type-safety

## *Goldilocks:*

Exactly one query per *run*

Not too few (**failure**)

Not too many (**avalanche**)



Daddy  
as a  
lambada  
man

## Appendix A7

# Problems with F#

# Problems with F# PowerPack

(Notes from James Cheney)

## Problems fixed in F# PowerPack code:

- F# 2.0/PowerPack lacked support for singletons in nonstandard places (i.e. other than in a comprehension body).
- F# 2.0/PowerPack also lacked support for Seq.exists in certain places because it was assuming that expressions of base types (eg. booleans) did not need to be further translated.

## F# 3.0:

- Did not exhibit the above problems
- But did exhibit translation bug where something like

```
query if 1 = 2 then yield 3
```

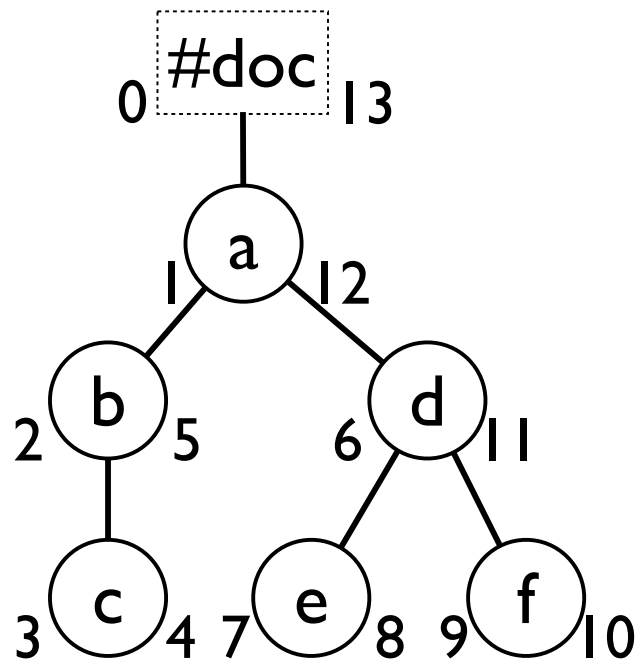
leads to a run-time type error.



## Appendix A7

# From XPath to SQL

# Representing XML



xml

id	parent	name	pre	post
0	-1	#doc	0	13
1	0	a	1	12
2	1	b	2	5
3	2	c	3	4
4	1	d	6	11
5	4	e	7	8
6	4	f	9	10

**type** Node =

{id : **int**, parent : **int**, name : **string**, pre : **int**, post : **int**}

# Abstract syntax of XPath

**type** Axis =

- | Self
- | Child
- | Descendant
- | DescendantOrSelf
- | Following
- | FollowingSibling
- | Rev **of** Axis

**type** Path =

- | Seq **of** Path × Path
- | Axis **of** Axis
- | NameTest **of** string
- | Filter **of** Path

## An evaluator for XPath: axis

**let rec** axis(ax : Axis) : Expr< (Node, Node) → **bool** > =

**match** ax **with**

| Self → <@ **fun**(s, t) → s.id = t.id @>

| Child → <@ **fun**(s, t) → s.id = t.parent @>

| Descendant → <@ **fun**(s, t) →

s.pre < t.pre && t.post < s.post @>

| DescendantOrSelf → <@ **fun**(s, t) →

s.pre ≤ t.pre && t.post ≤ s.post @>

| Following → <@ **fun**(s, t) → s.pre < t.pre @>

| FollowingSibling → <@ **fun**(s, t) →

s.post < t.pre && s.parent = t.parent @>

| Rev(axis) → <@ **fun**(s, t) → (%axis(ax))(t, s) @>

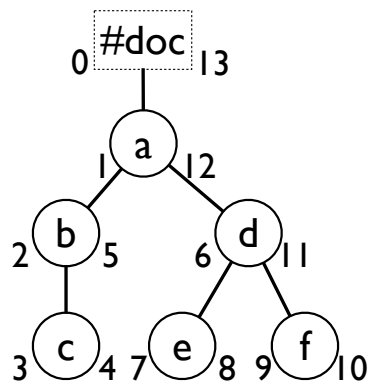
## An evaluator for XPath: path

```
let rec path(p : Path) : Expr< (Node, Node) → bool > =  
match p with  
| Seq(p, q) → <@ fun(s, u) → (%any)((%db).xml,  
    fun(t) → (%path(p))(s, t) && (%path(q))(t, u)) @>  
| Axis(ax) → axis(ax)  
| NameTest(name) → <@ fun(s, t) →  
    s.id = t.id && s.name = name @>  
| Filter(p) → <@ fun(s, t) → s.id = t.id &&  
    (%any)((%db).xml, fun(u) → (%path(p))(s, u)) @>
```

## An evaluator for XPath: xpath

```
let xpath(p : Path) : Expr< Node list > =  
  <@ for root in (%db).xml do  
    for s in (%db).xml do  
      if root.parent = -1 && (%path(p))(root, s) then  
        yield s @>
```

# Examples



`/ * / *`

`run(xpath(Seq(Axis(Child), Axis(Child))))`

`[2; 4]`

`// * [following-sibling : : d]`

`run(xpath(Seq(Axis(Descendant),`

`Filter(Seq(Axis(FollowingSibling),`

`NameTest("d"))))))`

`[2]`