Flattening Nested Database Queries

Ben Lippmeier University of New South Wales FP-SYD 2014/05/28

Nested array representation

```
arr = [[1 2] [3 4 5] [] [6]]
segd = [2 3 0 1]
data = [1 2 3 4 5 6]
```

Flat vs Nested Data Parallelism

Flat Parallelism: Worker function is sequential.

```
thingo xs = mapP (\x. x + 1) xs
```

Nested Parallelism: Worker function is parallel.

```
thingo xss
= mapP (\xs. zipWithP g xs ys) xss
```

 The Flattening / Vectorisation transform converts nested parallelism into flat parallelism.

```
f:: Int -> Int
f x = x + 1

g:: Array Int -> Array Int
g ys = mapP f ys
```

```
f:: Int -> Int
f x = x + 1

g:: Array Int -> Array Int
g ys = mapP f ys
```

```
fL :: Array Int -> Array Int
fL xs = xs +L (replicate n 1)
  where n = length xs

g :: Array Int -> Array Int
g ys = fL ys
```

```
f:: Int -> Int
f x = x + 1

g:: Array Int -> Array Int
g ys = mapP f ys
```

```
fL :: Array Int -> Array Int
fL xs = zipWithP (+) xs (replicate n 1)
  where n = length xs

g :: Array Int -> Array Int
g ys = fL ys
```

```
f:: Int -> Int
f x = x + 1

g:: Array Int -> Array Int
g ys = mapP f ys

h:: Array (Array Int) -> Array (Array Int)
h zss = mapP g zss
```

```
f :: Int -> Int
f x = x + 1
g :: Array Int -> Array Int
q ys = mapP f ys
h :: Array (Array Int) -> Array (Array Int)
h zss = mapP g zss
g :: Array Int -> Array Int
g ys = fL ys
gL :: Array (Array Int) -> Array (Array Int)
qL yss = fLL yss
```

```
f :: Int -> Int
f x = x + 1
g :: Array Int -> Array Int
q ys = mapP f ys
h :: Array (Array Int) -> Array (Array Int)
h zss = mapP q zss
g :: Array Int -> Array Int
q ys = fL ys
gL :: Array (Array Int) -> Array (Array Int)
gL yss = unconcatP yss (fL (concatP yss))
```

Nested array representation

```
arr = [[1 2] [3 4 5] [] [6]]
segd = [2 3 0 1]
data = [1 2 3 4 5 1]
```

Relational Algebra: Mother Tongue—XQuery: Fluent

Torsten Grust Jens Teubner
University of Konstanz
Department of Computer & Information Science
Box D 188, 78457 Konstanz, Germany
{grust,teubner}@inf.uni-konstanz.de

ABSTRACT

This work may be seen as a further proof of the versatility of the relational database model. Here, we add XQuery to the catalog of languages which RDBMSs are able to "speak" fluently.

Given suitable relational encodings of sequences and ordered, unranked trees—the two data structures that form
the backbone of the XML and XQuery data models—we describe a compiler that translates XQuery expressions into a
simple and quite standard relational algebra which we expect to be efficiently implementable on top of any relational
query engine. The compilation procedure is fully compositional and emits algebraic code that strictly adheres to the
XQuery language semantics: document and sequence order
as well as node identity are obeyed. We exercise special
care in translating arbitrarily nested XQuery FLWOR iteration
constructs into equi-joins, an operation which RDBMSs can
perform particularly fast. The resulting purely relational
XQuery processor shows promising performance figures in
experiments.

types onto tables. Such encodings have also been proposed for ordered, unranked trees, the data type that forms the backbone of the XML data model. These mappings turn RDBMSs into relational XML processors. Furthermore, if the tree encoding is designed such that core operations on trees—XPath axis traversals—lead to efficient table operations, this can result in high-performance relational XPath implementations [8, 10].

In this work we extend the relational XML processing stack and propose the fully relational evaluation of XQuery [1] expressions. We give a compositional set of translation rules that compile XQuery expressions into a standard, quite primitive relational algebra. We expect any relational query engine to be able to efficiently implement the operators of this algebra. The operators were, in fact, designed to match the capabilities of modern SQL-based relational database systems (e.g., the row numbering operator ϱ exactly mirrors SQL:1999 OLAP ranking functionality) [9].

By design, we only have minimalistic assumptions on the underlying tree encoding, met by several XML encoding schemes [4, 13]. Our algebra can be easily modified to oper-

Nested XQueries

```
s \left\{egin{array}{l} 	ext{for } \$v_0 	ext{ in (1,2) return} \ & \left\{sv_0, 	ext{for } \$v_{0\cdot 0} 	ext{ in (10,20) return} \ & s_{0\cdot 0} \left\{\ (\$v_0, \$v_{0\cdot 0}) \ 
ight. \end{array}
ight. 
ight.
```

Nested XQueries

iter	pos	item
1	1	"1"
1	2	"10"
2	1	"1"
2	2	"20"
3	1	"2"
3	2	"10"
4	$\bar{1}$	"2"
$\tilde{4}$	$\tilde{2}$	"20"
-	_	

iter	pos	item
1	1	"1"
1	2	"10"
1	3	"1"
1	4	"20"
2	1	"2"
2	2	"10"
2	3	"2"
2	4	"20"

iter	pos	item
1	1	"1"
1	2 3	"1"
1	3	"10"
1	4	"1"
1	5	"20"
1	6	"2"
1	7	"2"
1	8	"10"
1	9	"2"
1	10	"20"

- result in $s_{0.0}$.
- (a) Intermediate (b) Intermediate (c) Final result in
 - result in s_0 . top-level scope.

Nested array representation

```
arr = [[1 2] [3 4 5] [] [6]]
segd = [2 3 0 1]
data = [1 2 3 4 5 1]
```

Nested array representation

```
arr = [[1 2] [3 4 5] [] [6]]
segd = [2 3 0 1]
data = [1 2 3 4 5 1]

segdA' = [0 0 1 1 1 3]
segdB' = [0 1 0 1 2 0]
```

```
e := c atomic constants

| v  variables

| (e,e)  sequence construction

| e/\alpha :: n  loc. step (axis \alpha, node test n)

| element \ t \ \{e\}  element constructor (tag t)

| for \ v \ in \ ereturn \ e iteration

| let \ v := ereturn \ e let binding

| e+e  addition
```

```
e := c atomic constants

| $v$ variables

| (e,e) sequence construction

| e/\alpha :: n loc. step (axis \alpha, node test n)

| element t \{e\} element constructor (tag t)

| for $v$ in e return e iteration

| let $v := e$ return e let binding

| e+e addition
```

```
\begin{array}{lll} \pi_{a_1:b_1,...,a_n:b_n} & \text{projection (and renaming)} \\ \sigma_a & \text{selection} \\ \dot{\cup} & \text{disjoint union} \\ \times & \text{cartesian product} \\ \bowtie_{a=b} & \text{equi-join} \\ \varrho_{b:\langle a_1,...,a_n\rangle/p} & \text{row numbering} \\ \square_{\alpha,n} & \text{XPath axis join (axis $\alpha$, node test $n$)} \\ \varepsilon & \text{element construction} \\ \circledast_{b:\langle a_1,...,a_n\rangle} & n\text{-ary arithmetic/comparison operator } * \\ a \mid b & \text{literal table} \end{array}
```

$$\Gamma$$
; loop; $\Delta \vdash e \Rightarrow (q, \Delta')$

$$\frac{}{\Gamma; \mathsf{loop}; \Delta \vdash c \mapsto \left(\mathsf{loop} \times \frac{pos \,|\, item}{1 \,|\, c}, \Delta\right)} \; . \tag{Const}$$

 $L_n[c] = replicate n c$

$$\Gamma$$
; loop; $\Delta \vdash e \Rightarrow (q, \Delta')$

$$\frac{\Gamma; \mathsf{loop}; \Delta \vdash e_1 \Rightarrow (q_1, \Delta_1) \quad \Gamma; \mathsf{loop}; \Delta_1 \vdash e_2 \Rightarrow (q_2, \Delta_2)}{\Gamma; \mathsf{loop}; \Delta \vdash e_1 + e_2 \Rightarrow \left(\pi_{iter,pos,item:res} \left(\bigoplus_{res:\langle item,item' \rangle} (q_1 \bowtie_{iter=iter'} \left(\pi_{iter':iter,item':item} q_2) \right) \right), \Delta_2 \right)}$$

$$\Gamma$$
; loop; $\Delta \vdash e \Rightarrow (q, \Delta')$

$$\Gamma$$
; loop; $\Delta \vdash e_1 \Rightarrow (q_1, \Delta_1)$ Γ ; loop; $\Delta_1 \vdash e_2 \Rightarrow (q_2, \Delta_2)$

$$\overline{\Gamma; \mathsf{loop}; \Delta \vdash e_1 + e_2 \Rightarrow \left(\pi_{iter,pos,item:res}\left(\bigoplus_{res:\langle item,item'\rangle} (q_1 \bowtie_{iter=iter'} (\pi_{iter':iter,item':item} q_2)\right)), \Delta_2\right)}$$

iter	pos	item	iter	pos	item	iter	pos	item
1	1	"1"	1	1	"1"	1	1	"1"
1	2	"10"	1	2	"10"	1	2	"1"
2	1	"1"	1	3	"1"	1	3	"10"
2	2	"20"	1	4	"20"	1	4	"1"
3	1	"2"	2	1	"2"	1	5	"20"
3	2	"10"	2	2	"10"	1	6	"2"
4	1	"2"	2	3	"2"	1	7	"2"
4	2	"20"	2	4	"20"	1	8	"10"
'	'		,	'	'	1	9	"2"
						1	10	"20"

- (a) Intermediate result in $s_{0.0}$.
- (b) Intermediate (c) Final result in
 - result in s_0 . top-level scope.

$$\Gamma$$
; loop; $\Delta \vdash e \Rightarrow (q, \Delta')$

$$\Gamma$$
; loop; $\Delta \vdash e_1 \Rightarrow (q_1, \Delta_1)$ Γ ; loop; $\Delta_1 \vdash e_2 \Rightarrow (q_2, \Delta_2)$

$$\overline{\Gamma; \mathsf{loop}; \Delta \vdash e_1 + e_2 \Rightarrow \left(\pi_{iter,pos,item:res}\left(\bigoplus_{res:\langle item,item'\rangle} \left(q_1 \bowtie_{iter=iter'} \left(\pi_{iter':iter,item':item} q_2\right)\right)\right), \Delta_2\right)}$$

iter	pos	item	iter	pos	item	iter	pos	item
1	1	"1"	1	1	"1"	1	1	"1"
1	2	"10"	1	2	"10"	1	2	"1"
$\frac{2}{2}$	1	"1"	1	3	"1"	1	3	"10"
2	2	"20"	1	4	"20"	1	4	"1"
3	1	"2"	2	1	"2"	1	5	"20"
3	2	"10"	2	2	"10"	1	6	"2"
4	1	"2"	2	3	"2"	1	7	"2"
4	2	"20"	2	4	"20"	1	8	"10"
	•	'		'	1	1	9	"2"
						1	10	"20"

- (a) Intermediate result in $s_{0.0}$.
- (b) Intermediate (c) Final result in result in s_0 . top-level scope.

$$L_n[e_1 + e_2] = Ln[e_1] + L Ln[e_2]$$

```
 \{ \dots, \$v_i \mapsto q_{v_i}, \dots \}; \mathsf{loop}; \Delta \vdash e_1 \mapsto (q_1, \Delta_1) \qquad q_v \equiv \frac{pos}{1} \times \pi_{iter:inner,item} \left(\varrho_{inner:\langle iter, pos \rangle} q_1\right) \\ \mathsf{loop}_v \equiv \pi_{iter} q_v \qquad \mathsf{map} \equiv \pi_{outer:iter,inner} \left(\varrho_{inner:\langle iter, pos \rangle} q_1\right) \\ \underbrace{\{ \dots, \$v_i \mapsto \pi_{iter:inner,pos,item} \left(q_{v_i} \bowtie_{iter=outer} \mathsf{map}\right), \dots \} + \{\$v \mapsto q_v\} \, ; \mathsf{loop}_v; \Delta_1 \vdash e_2 \mapsto (q_2, \Delta_2)}_{\{ \dots, \$v_i \mapsto q_{v_i}, \dots \}; \mathsf{loop}; \Delta \vdash \mathsf{for} \, \$v \, \, \mathsf{in} \, e_1 \, \mathsf{return} \, e_2 \mapsto \left(\pi_{iter:outer,pos:pos_1,item} \left(\varrho_{pos_1:\langle iter,pos \rangle/outer} \left(q_2 \bowtie_{iter=inner} \mathsf{map}\right)\right), \Delta_2 \right) }
```

(For)

Purely Relational FLWORs

Torsten Grust
Technical University of Munich
Department of Computer Science, Database Systems
Munich, Germany
grust@in.tum.de

ABSTRACT

We report on a compilation procedure that derives relational algebra plans from arbitrarily nested XQuery FLWOR blocks. While recent research was able to develop relational encodings of trees which may turn RDBMSs into highly efficient XPath and XML Schema processors, here we describe relational encodings of nested iteration, variables, and the item sequences to which variables are bound. The developed techniques are purely relational in more than one sense:

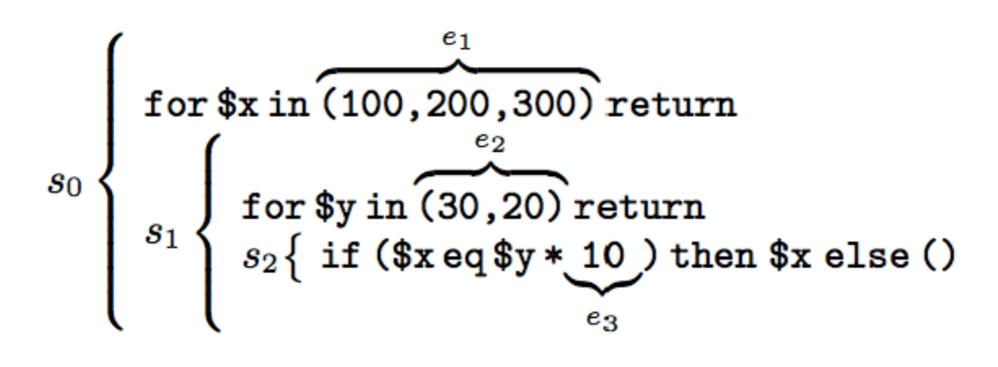
(a) we rely on a standard (or rather: classical) algebra that is readily supported by relational engines, and (b) we use re-

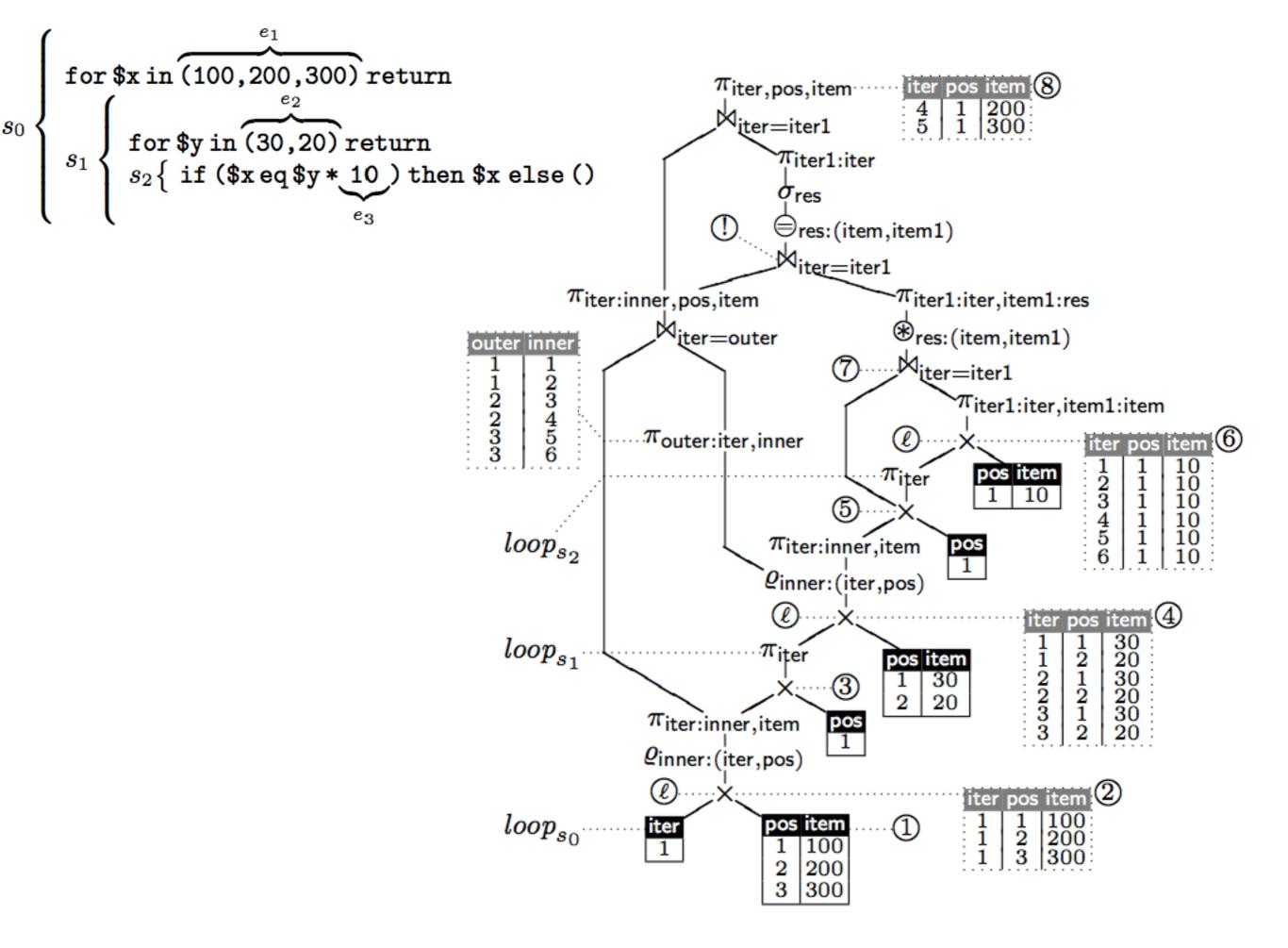
other benefits, the resulting systems inherit the scalability of the underlying relational back-ends [3]. It is legitimate to hope that this technology may be developed into full-fledged XQuery implementations, given that we can find relational ways to also express XQuery concepts beyond XPath axis traversals.

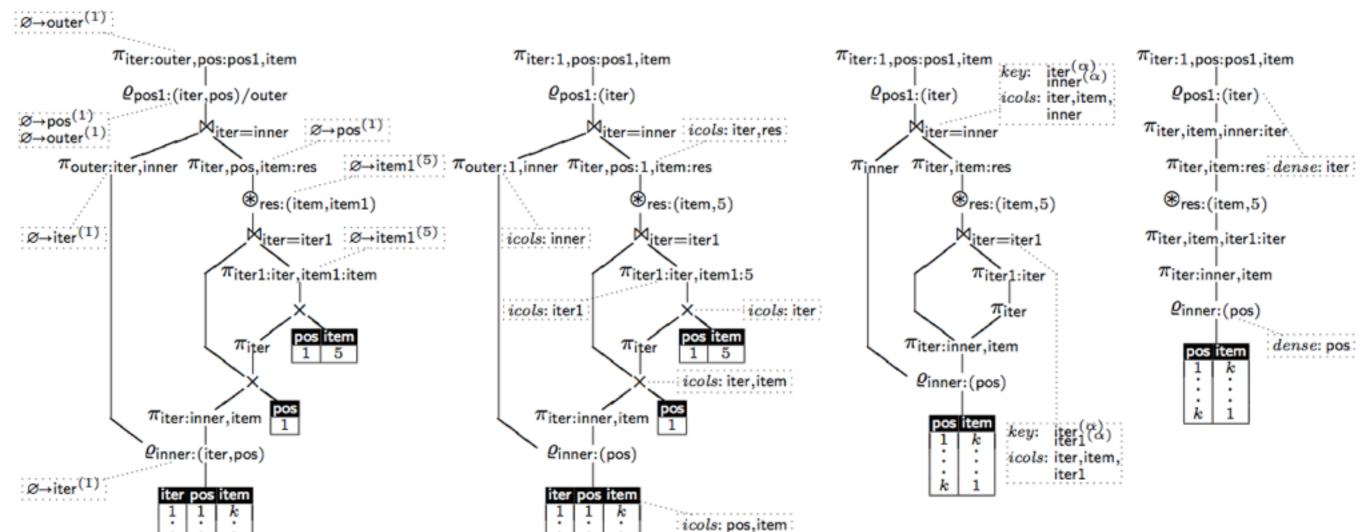
To this end, this paper does *not* talk about XPath evaluation at all but shifts focus to *the* central XQuery language feature, the for-let-where-order by-return (or FLWOR) block [2]. The presence of arbitrarily nested iteration as well as the possibility to bind and then refer to variables in

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XIME-P 2005, June 16-17, Baltimore, Maryland.







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FERRY — Database–Supported Program Execution

Torsten Grust, Manuel Mayr, Jan Rittinger, and Tom Schreiber

WSI, Universität Tübingen Tübingen, Germany

⟨firstname.lastname⟩@uni-tuebingen.de

```
1 let e = table Employees (id int, name string,
                            dept string, salary int)
2
          with keys ((id))
3
   in for x in e
      group by x.dept
5
                                                         П
      return (the (x.dept),
6
               take (2, for y in zip (x.name, x.salary)
7
                         order by y.2 descending
8
                         return y))
9
                                                         ┙
```

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Haskell Boards the Ferry Database-Supported Program Execution for Haskell

George Giorgidze, Torsten Grust, Tom Schreiber, and Jeroen Weijers

Wilhelm-Schickard-Institut für Informatik, Eberhard Karls Universität Tübingen

{george.giorgidze,torsten.grust,tom.schreiber,jeroen.weijers}@uni-tuebingen.de

2010

- [j8] 🖹 😃 🧡 Torsten Grust: **Der Lehrstuhl für Datenbanksysteme am Wilhelm-Schickard-Institut der Universität Tübingen.** <u>Datenbank-Spektrum 10(2): 105-106 (2010)</u>
- [j7] 🖹 🕹 🤄 Torsten Grust, Jan Rittinger, Tom Schreiber: Avalanche-Safe LINQ Compilation. PVLDB 3(1): 162-172 (2010)
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- [c29] ☐ ♣ ♥ George Giorgidze, Torsten Grust, Tom Schreiber, Jeroen Weijers: Haskell Boards the Ferry Database-Supported Program Execution for Haskell. IFL 2010: 1-18

A study of the exact relationship between DPH and DSH still lies ahead. We conjecture that DSH's loop-lifting compilation strategy does have an equivalent formulation in terms of vectorisation or Blelloch's flattening transformation [4].

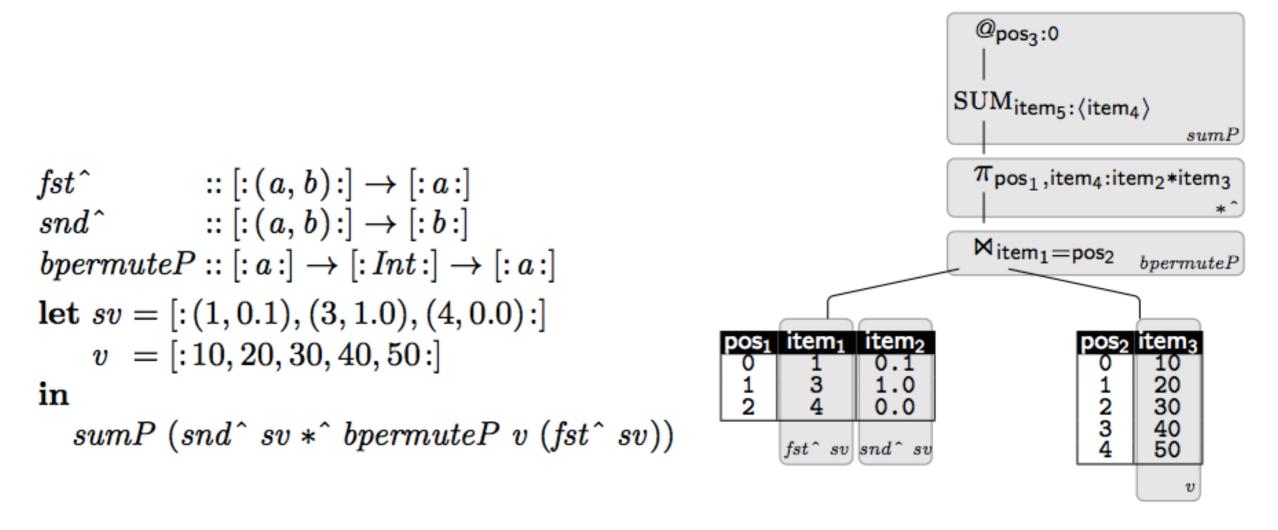


Fig. 6. Intermediate code generated for the sparse vector multiplication example of Fig. 5: DPH (left) vs. DSH (right).