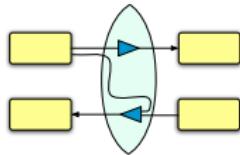


# Bidirectional Programming Languages

Nate Foster  
University of Pennsylvania

April 2009



data

update convert  
extract  
clean  
analyze  
replicate  
integrate  
query  
mashup  
transform  
analyze  
curate  
reconcile  
modify  
hide  
evolve  
synchronize  
redact  
summarize  
exchange



We *can* write complicated data transformations in C...



or Java...



or C++...



...or a tool specifically designed for the task!

# Domain-specific languages

---

- Clean semantics
- Natural syntax
- Better tools

A word cloud centered around the word "data". The word "data" is the largest and most prominent word, colored blue. Surrounding it are various other words related to data management and processing, each with a different color and orientation. Some of the words include "update" (green), "convert" (orange), "clean" (light blue), "extract" (green), "summarize" (green), "exchange" (orange), "replicate" (blue), "integrate" (red), "analyze" (green), "query" (orange), "curate" (green), "mashup" (orange), "transform" (blue), "reconcile" (blue), "hide" (blue), "synchronize" (red), "evolve" (orange), and "maintain" (blue).

data

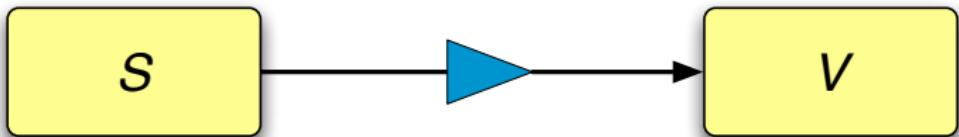
update convert clean extract summarize exchange replicate integrate analyze query mashup transform reconcile synchronize hide evolve maintain

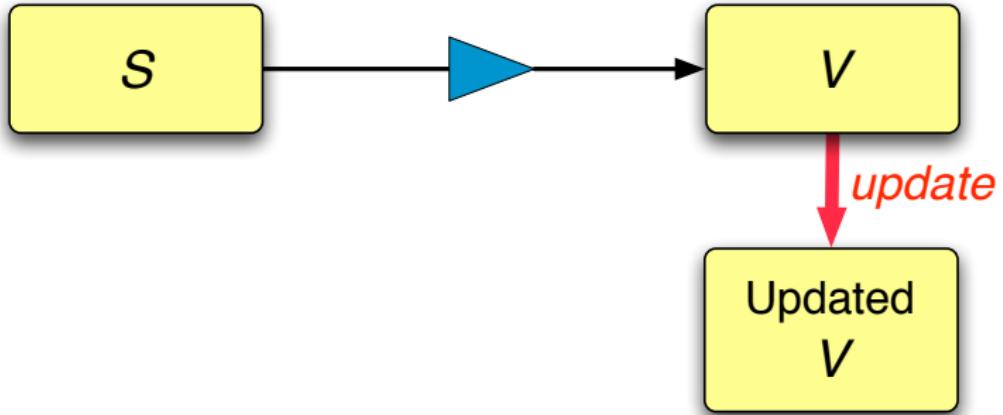
The image features a central, large green word 'update' and a large blue word 'data'. Surrounding these central words are numerous other terms in various colors, including red, orange, yellow, and light blue. These surrounding words represent different data management and processing operations. The colors of the words appear to be randomly assigned or based on their frequency or importance in the context of data management.

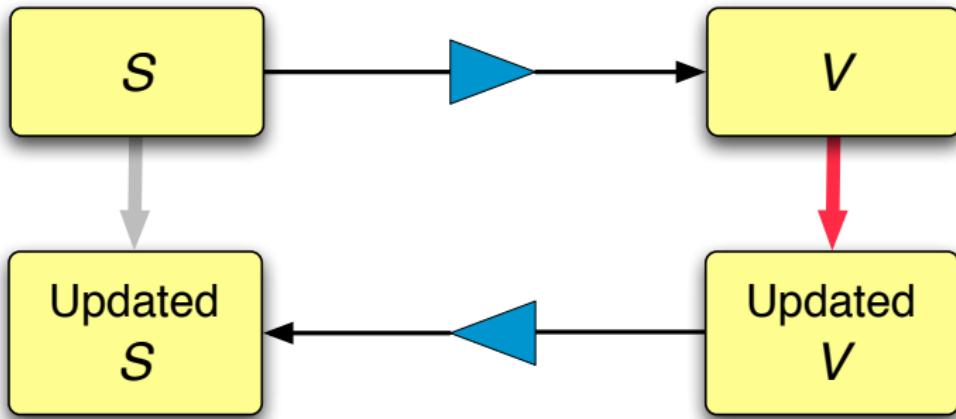
update

data

convert  
exchange  
replicate  
clean  
extract  
summarize  
integrate  
analyze  
mashup  
transform  
curate  
reconcile  
redact  
query  
modify  
hide  
synchronize  
evolve  
maintain

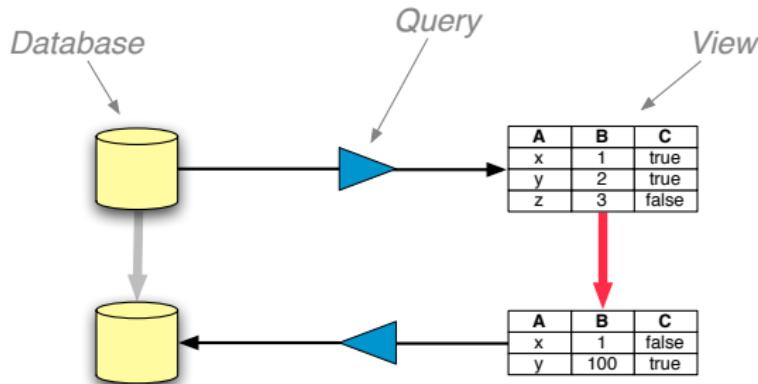






# The View Update Problem

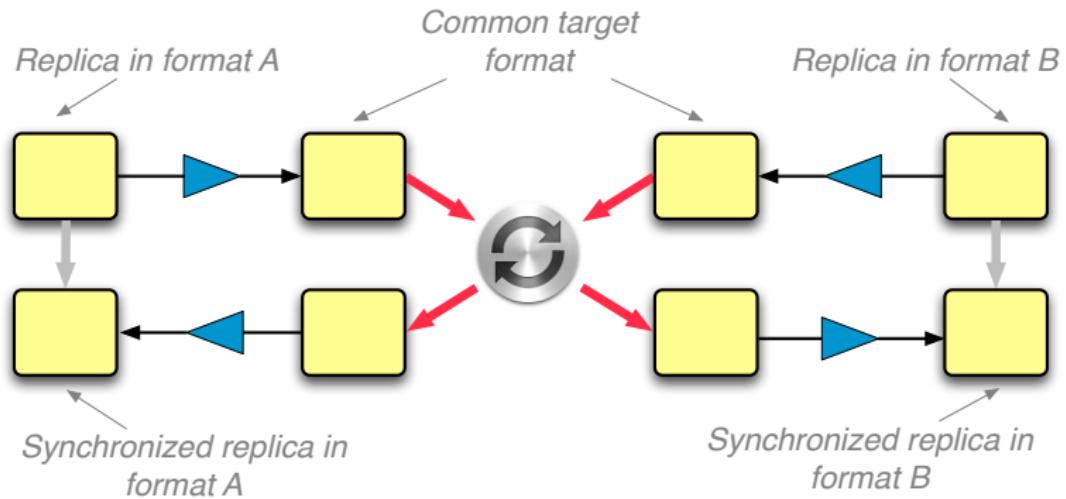
In databases, this is known as the **view update problem**.



[Bancilhon, Spryatos '81]

# The View Update Problem In Practice

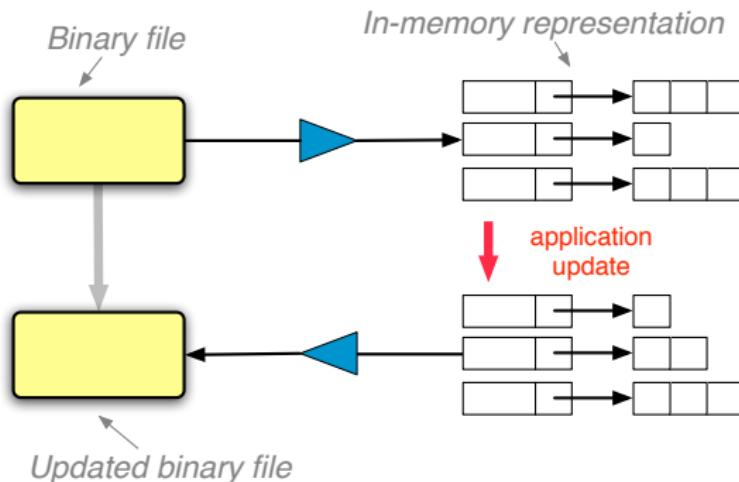
It also arises in **data converters** and **synchronizers**...



[Foster, Greenwald, Pierce, Schmitt JCSS '07]— Harmony

# The View Update Problem In Practice

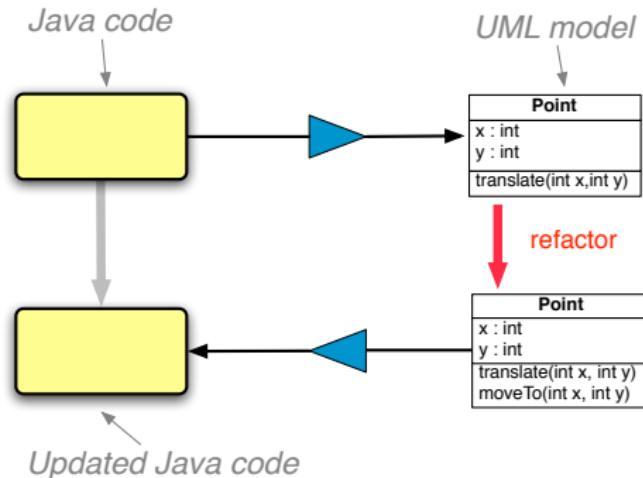
...in **picklers** and **unpicklers**...



[Fisher, Gruber '05]— PADS

# The View Update Problem In Practice

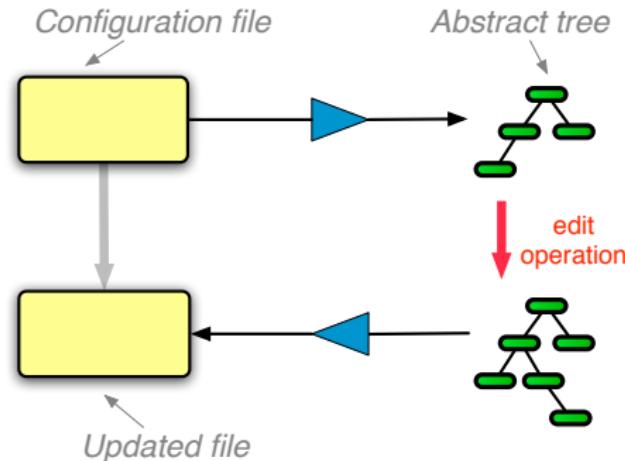
...in model-driven software development...



[Stevens '07]— bidirectional model transformations

# The View Update Problem In Practice

...in tools for managing operating system configurations...

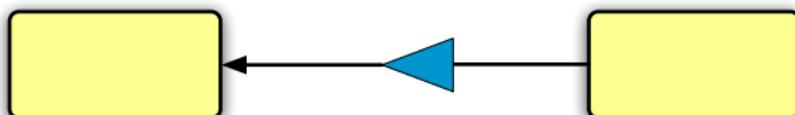
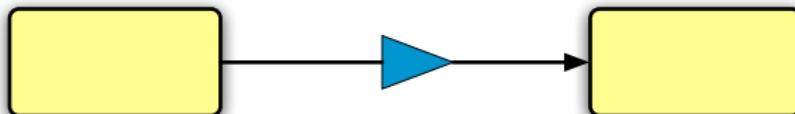


[Lutterkort '08]—Augeas

# Problem

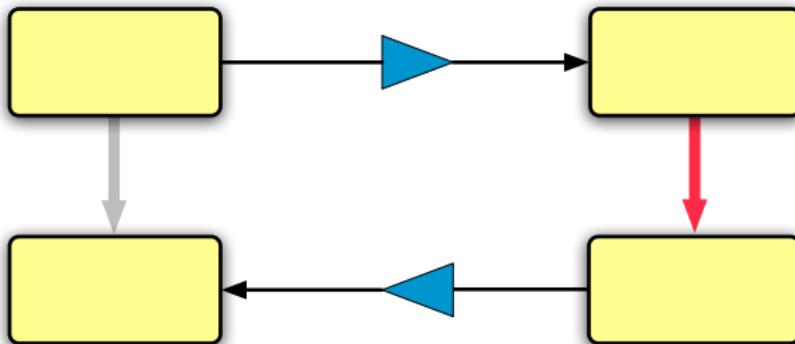
---

How do we write these **bidirectional transformations**?



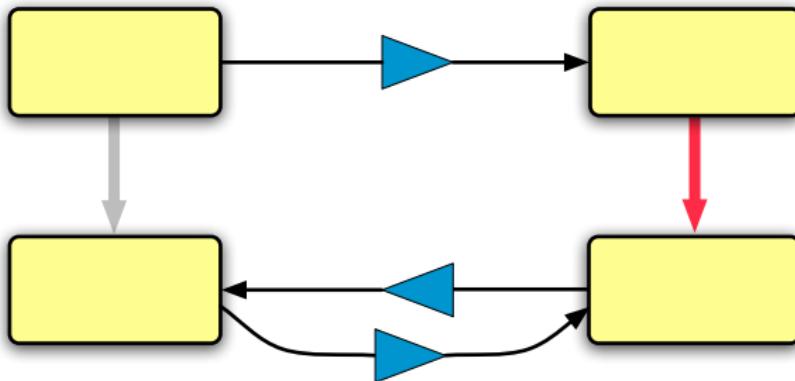
# Problem: Why is it hard?

We want updates to the view to be translated “exactly” ...



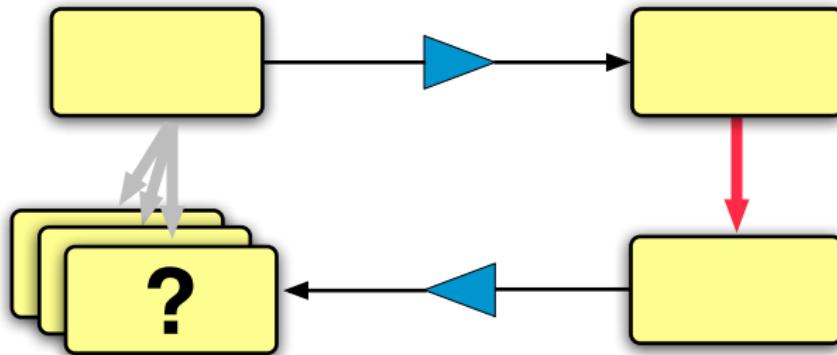
# Problem: Why is it hard?

We want updates to the view to be translated “exactly” ...



# Problem: Why is it hard?

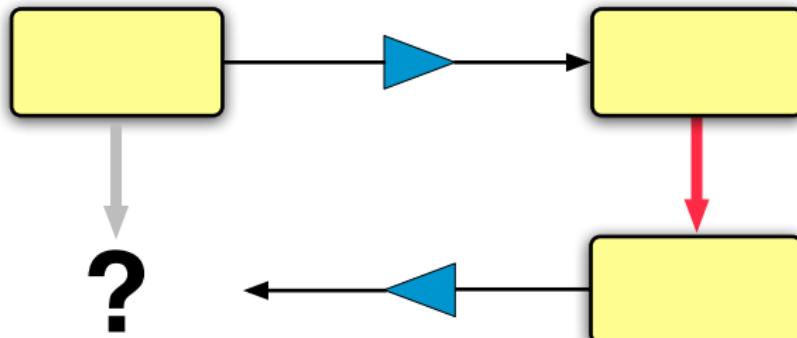
...but some updates have *many* corresponding source updates...



# Problem: Why is it hard?

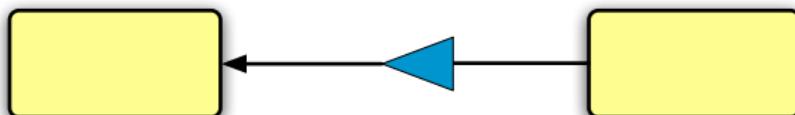
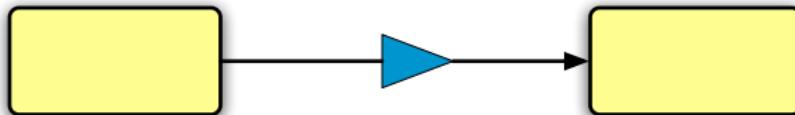
---

...while others have *none*!



# Possible Approaches

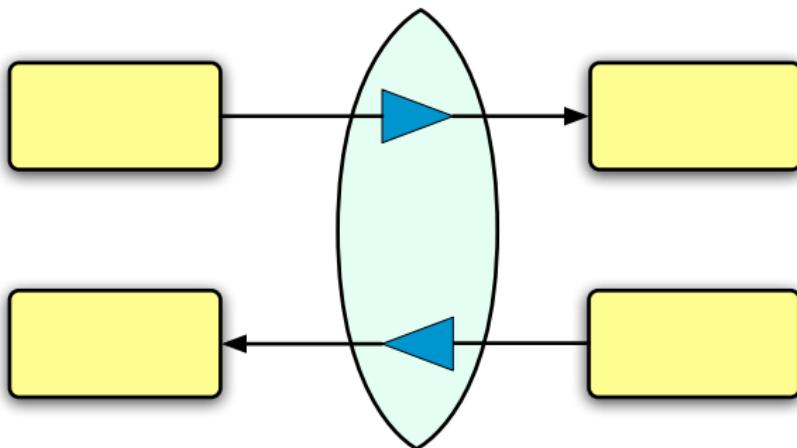
---



**Bad:** write the two transformations as **separate functions**.

- tedious to program
- difficult to get right
- a nightmare to maintain

# Possible Approaches



**Good:** derive both transformations from the *same program*.

- Clean semantics: behavioral laws guide language design
- Natural syntax: parsimonious and compositional
- Better tools: type system guarantees well-behavedness

# This talk: Goal

---

“Bidirectional programming languages are an effective and elegant means of describing updatable views”

# This talk: Outline

---

## 1. Lenses

- ▶ Design goals
- ▶ Semantics

## 2. String Lenses

- ▶ Core operators
- ▶ Type system

## 3. Boomerang

- ▶ Ordered data
- ▶ Ignorable data
- ▶ Implementation & Applications

## 4. Ongoing Work

- ▶ Updatable Security Views

## 5. Future Directions

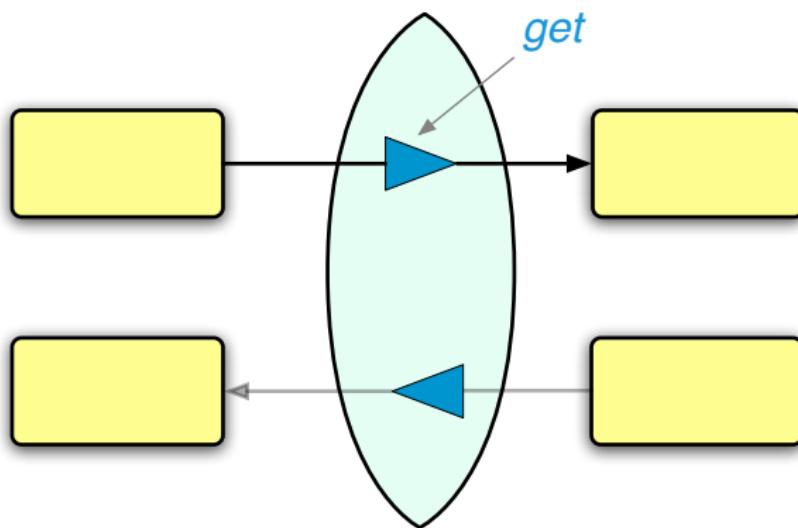
- ▶ Data provenance
- ▶ Model transformations

# Lenses

“Never look back unless  
you are planning to go that way”  
—H D Thoreau

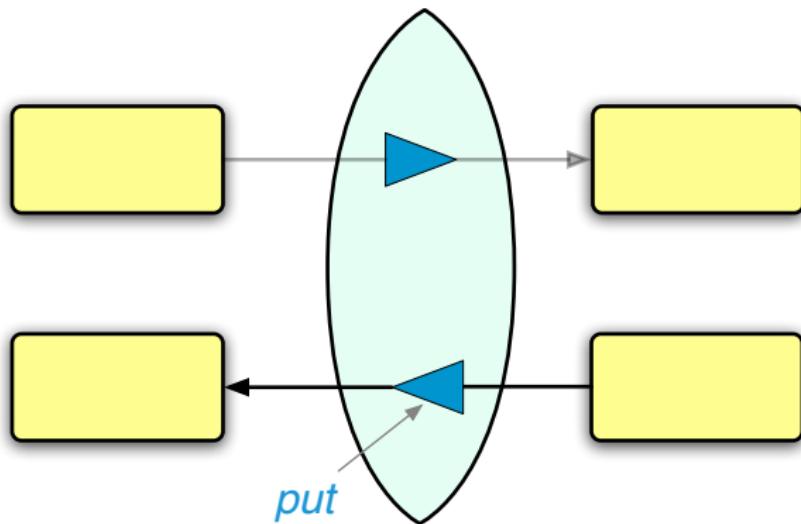
# Terminology

---



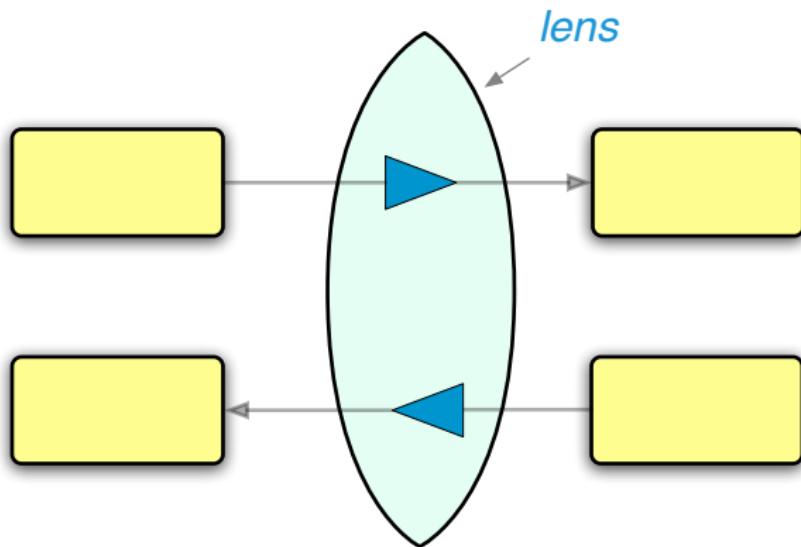
# Terminology

---



# Terminology

---



# Bidirectional vs. Bijective

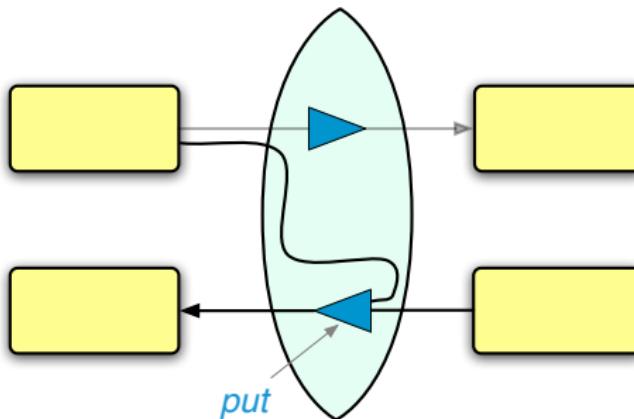
---

Goal #1: lenses should be capable of hiding source data.

# Bidirectional vs. Bijective

Goal #1: lenses should be capable of hiding source data.

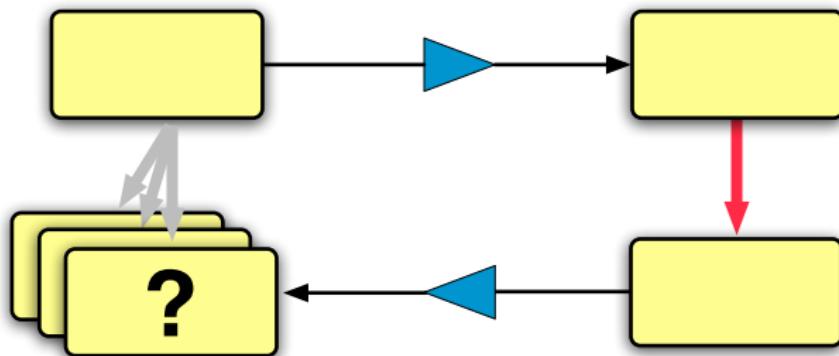
- In general, **get** may be non-injective
- and so **put** needs to take the original source as an argument



(Of course, the purely bijective case is also very interesting.)

# Choice of Put Function

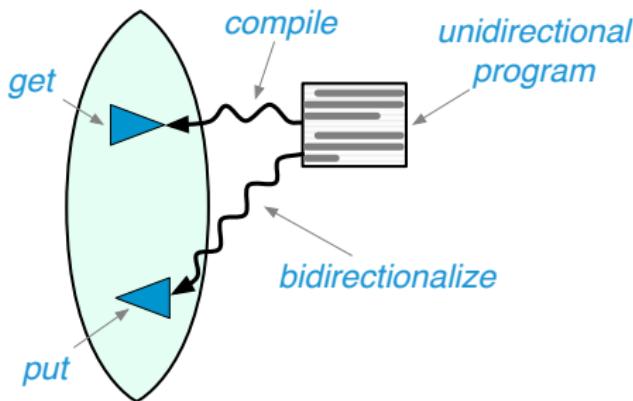
Recall that for some view updates there are *many* corresponding source updates.



# Choice of Put Function

Goal #2: programmers should be able to choose a **put** function that embodies an appropriate policy for propagating updates back to sources.

“Bidirectionalization” appears attractive...

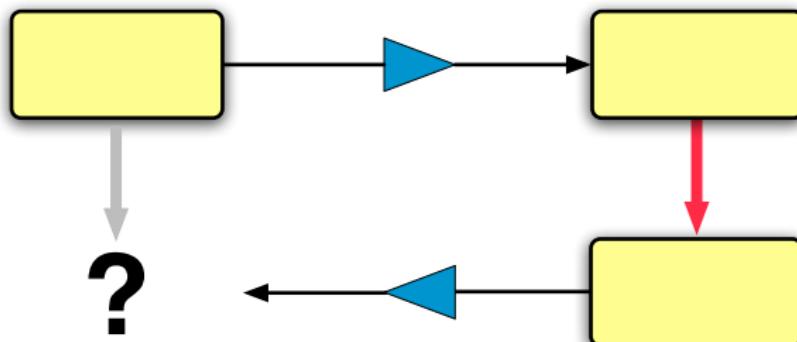


...but does not provide a way to make this choice.

# Totality

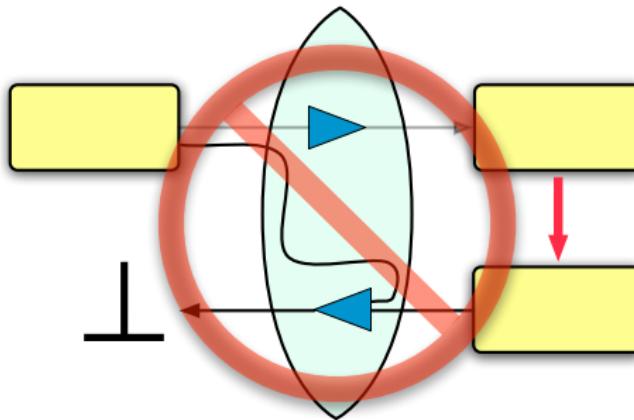
---

Recall that some view updates do not have *any* corresponding source updates.



# Totality

Goal #3: the **put** function should be a **total** function, capable of doing *something* reasonable with every view and source.



Totality ensures that the view is a **robust abstraction**, but forces us to use an **extremely precise** type system.

# Well-Behaved Lenses

A lens  $l$  mapping between a set  $S$  of sources and  $V$  of view is a pair of total functions

$$l.\text{get} \in S \rightarrow V$$

$$l.\text{put} \in V \rightarrow S \rightarrow S$$

obeying “round-tripping” laws

$$l.\text{get}(l.\text{put } v s) = v \quad (\text{PUTGET})$$

$$l.\text{put}(l.\text{get } s) s = s \quad (\text{GETPUT})$$

for every  $s \in S$  and  $v \in V$ .

# Related Frameworks

---

Databases: *many* related ideas

- [Dayal, Bernstein '82] “exact translation”
- [Bancilhon, Spryatos '81] “constant complement”
- [Gottlob, Paolini, Zicari '88] “dynamic views”

User Interfaces: [Meertens '98] “constraint maintainers”

See [Foster *et. al* TOPLAS '07] for details...

# Related Languages

## Harmony Group @ Penn

- [Foster *et al.* TOPLAS '07] — trees
- [Bohannon, Pierce, Vaughan PODS '06] — relations
- [Foster *et al.* JCSS '07] — data synchronizer

## Bijective languages

- [PADS Project @ AT&T] — picklers and unpicklers
- [Hosoya, Kawanaka '06] — biXid
- [Braband, Møller, Schwartzbach '05] — XSugar

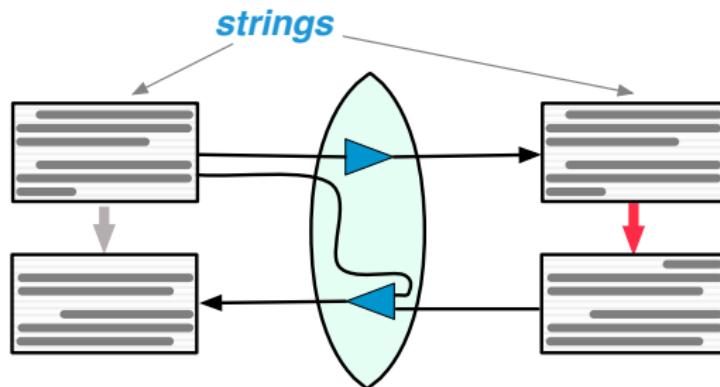
## Bidirectional languages

- [PSD @ Tokyo] — “bidirectionalization”, structure editors
- [Gibbons, Wang @ Oxford] — Wadler’s views
- [Voigtlaender '09] — bidirectionalization “for free”
- [Stevens '07] — lenses for model transformations

# String Lenses

“The art of progress is  
to preserve order amid change  
and to preserve change amid order.”  
—A N Whitehead

# Data Model

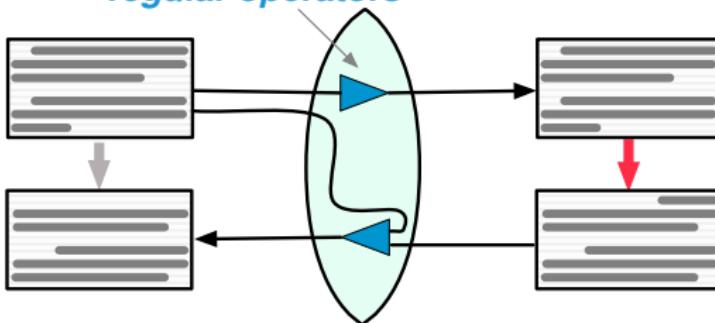


## Why strings?

1. Simple setting → exposes fundamental issues
2. There's a **lot** of string data in the world
3. Programmers are already comfortable with regular operators (union, concatenation, and Kleene star)

# Computation Model

*based on  
regular operators*

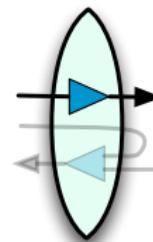


## Why strings?

1. Simple setting → exposes fundamental issues
2. There's a **lot** of string data in the world
3. Programmers are already comfortable with regular operators (union, concatenation, and Kleene star)

# Example: Redacting Lens (Get)

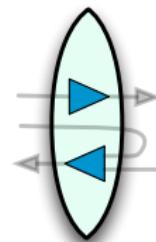
\*08:30 Coffee with Sara (Starbucks)  
12:15 PLClu (Seminar room)  
\*15:00 Workout (Gym)



08:30 BUSY  
12:15 PLClu  
15:00 BUSY

# Example: Redacting Lens (Update)

\*08:30 Coffee with Sara (Starbucks)  
12:15 PLClu (Seminar room)  
\*15:00 Workout (Gym)



08:30 BUSY  
12:15 PLClu  
15:00 BUSY



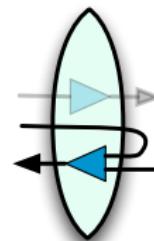
08:30 BUSY  
12:15 **PLClub**  
15:00 BUSY  
**16:00 Meeting**

# Example: Redacting Lens (Put)

\*08:30 Coffee with Sara (Starbucks)  
12:15 PLClu (Seminar room)  
\*15:00 Workout (Gym)



\*08:30 Coffee with Sara (Starbucks)  
12:15 **PLClub** (Seminar room)  
\*15:00 Workout (Gym)  
**16:00 Meeting (Unknown)**



08:30 BUSY  
12:15 PLClu  
15:00 BUSY



08:30 BUSY  
12:15 **PLClub**  
15:00 BUSY  
**16:00 Meeting**

# Example: Redacting Lens (Definition)

```
(* regular expressions *)
let TEXT : regexp = ([^\n\\()]+ "\\(" | "\\)" | "\\\\")*
let TIME : regexp = DIGIT{2} . COLON . DIGIT{2} . SPACE
let LOCATION : regexp = SPACE . LPAREN . TEXT . RPAREN

(* helper lenses *)
let public : lens =
  del SPACE .
  copy TIME .
  copy TEXT .
  default (del LOCATION) " (Unknown)"

let private : lens =
  del ASTERISK .
  copy TIME .
  default (TEXT . LOCATION <-> "BUSY") "Unknown (Unknown)"

let event : lens =
  (public | private) .
  copy NL

(* main lens *)
let redact : lens = event*
```

# Example: Redacting Lens (Definition)

(\* regular expressions \*)

```
let TEXT : regexp = ([^\n\\() ] | "\\(" | "\\)" | "\\\\")*
```

```
let TIME : regexp = DIGIT{2} . COLON . DIGIT{2} . SPACE
```

```
let LOCATION : regexp = SPACE . LPAREN . TEXT . RPAREN
```

(\* helper lenses \*)

```
let public : lens =
```

```
  del SPACE .
```

```
  copy TIME .
```

```
  copy TEXT .
```

```
  default (del LOCATION) " (Unknown)"
```

```
let private : lens =
```

```
  del ASTERISK .
```

```
  copy TIME .
```

```
  default (TEXT . LOCATION <-> "BUSY") "Unknown (Unknown)"
```

```
let event : lens =
```

```
  (public | private) .
```

```
  copy NL
```

(\* main lens \*)

```
let redact : lens = event*
```

# Example: Redacting Lens (Definition)

```
(* regular expressions *)
let TEXT : regexp = ([^\n\\() ] | "\\(" | "\\)" | "\\\\")*
let TIME : regexp = DIGIT{2} . COLON . DIGIT{2} . SPACE
let LOCATION : regexp = SPACE . LPAREN . TEXT . RPAREN

(* helper lenses *)
let public : lens =
    del SPACE .
    copy TIME .
    copy TEXT .
    default (del LOCATION) " (Unknown)"

let private : lens =
    del ASTERISK .
    copy TIME .
    default (TEXT . LOCATION <-> "BUSY") "Unknown (Unknown)"

let event : lens =
    (public | private) .
    copy NL

(* main lens *)
let redact : lens = event*
```

# Example: Redacting Lens (Definition)

```
(* regular expressions *)
let TEXT : regexp = ([^\n\\()]+ "\\(" | "\\)" | "\\\\")*
let TIME : regexp = DIGIT{2} . COLON . DIGIT{2} . SPACE
let LOCATION : regexp = SPACE . LPAREN . TEXT . RPAREN

(* helper lenses *)
let public : lens =
  del SPACE .
  copy TIME .
  copy TEXT .
  default (del LOCATION) " (Unknown)"

let private : lens =
  del ASTERISK .
  copy TIME .
  default (TEXT . LOCATION <-> "BUSY") "Unknown (Unknown)"

let event : lens =
  (public | private) .
  copy NL

(* main lens *)
let redact : lens = event*
```

# Example: Redacting Lens (Definition)

```
(* regular expressions *)
let TEXT : regexp = ([^\\n\\() ] | "\\(" | "\\)" | "\\\\\")*
let TIME : regexp = DIGIT{2} . COLON . DIGIT{2} . SPACE
let LOCATION : regexp = SPACE . LPAREN . TEXT . RPAREN

(* helper lenses *)
let public : lens =
  del SPACE .
  copy TIME .
  copy TEXT .
  default (del LOCATION) " (Unknown)"

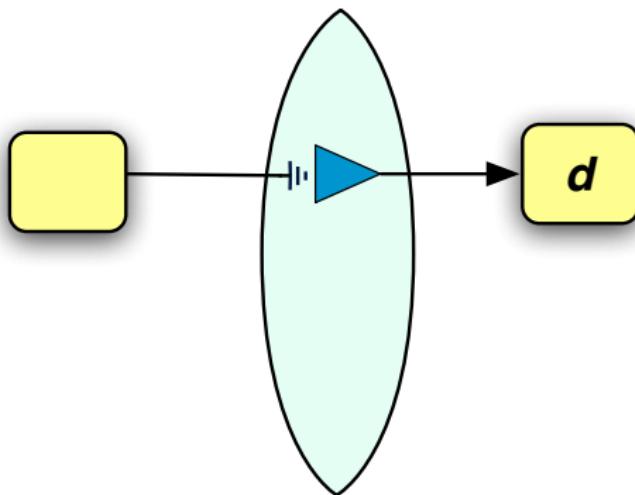
let private : lens =
  del ASTERISK .
  copy TIME .
  default (TEXT . LOCATION <-> "BUSY") "Unknown (Unknown)"

let event : lens =
  (public | private) .
  copy NL

(* main lens *)
let redact : lens = event*
```

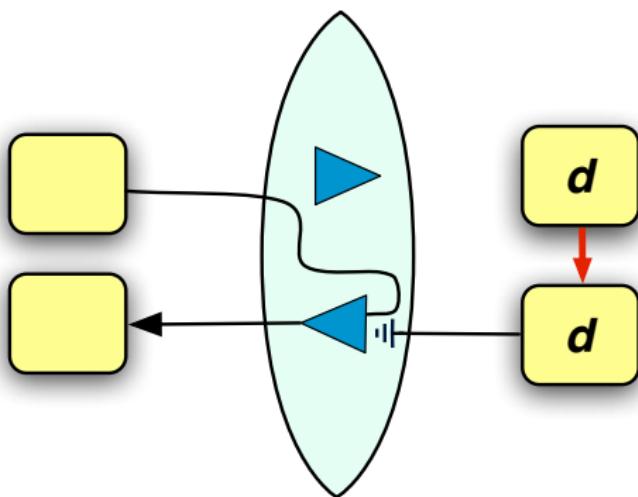
$E \leftrightarrow d$ 

(Get)



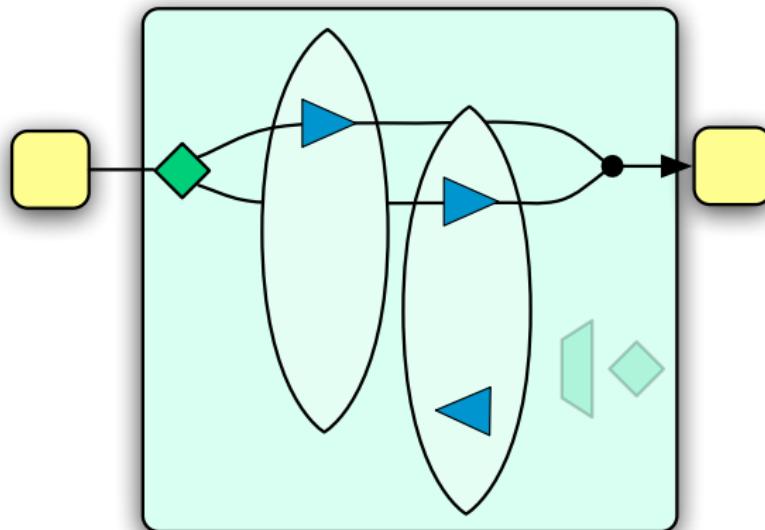
$E \leftrightarrow d$ 

(Put)



$(l_1 \mid l_2)$ 

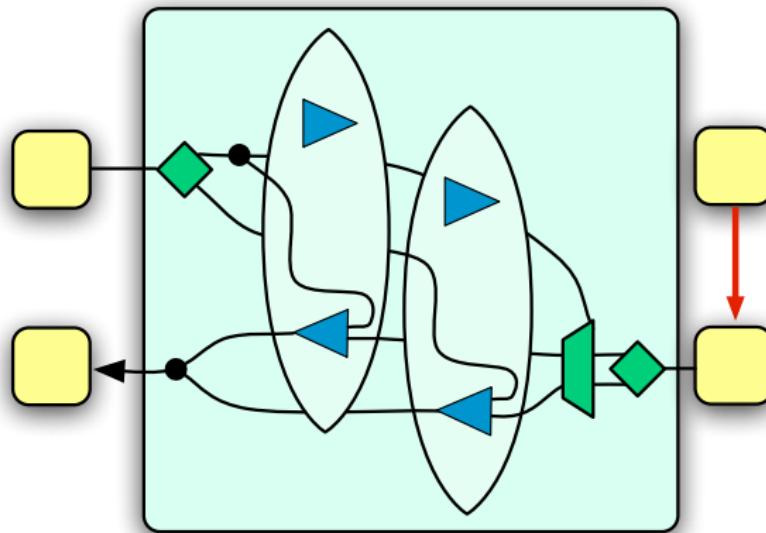
(Get)



Type system ensures that choice is deterministic.

$(I_1 \mid I_2)$ 

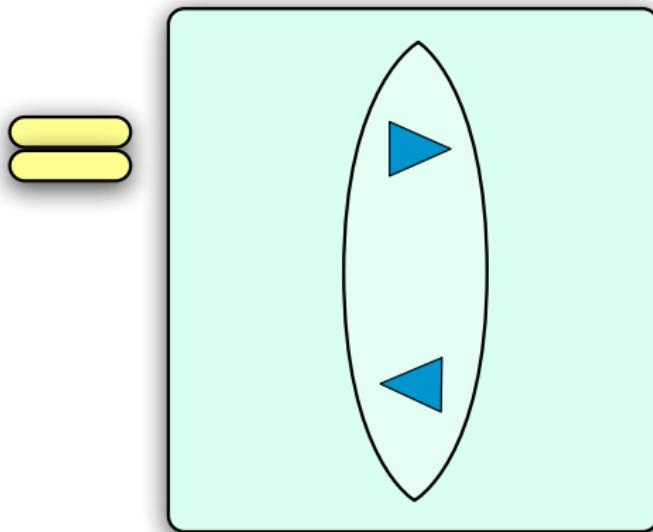
(Put)



Type system ensures that choice is deterministic.

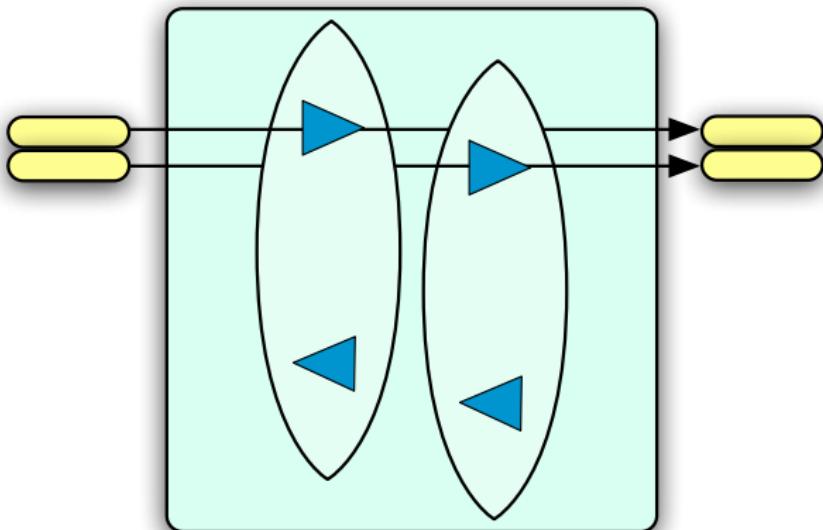
/\*

(Get)



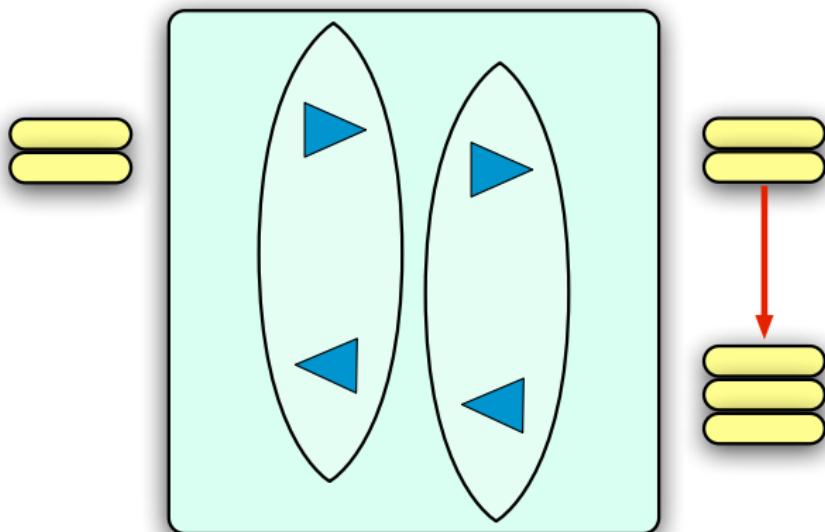
/\*

(Get)



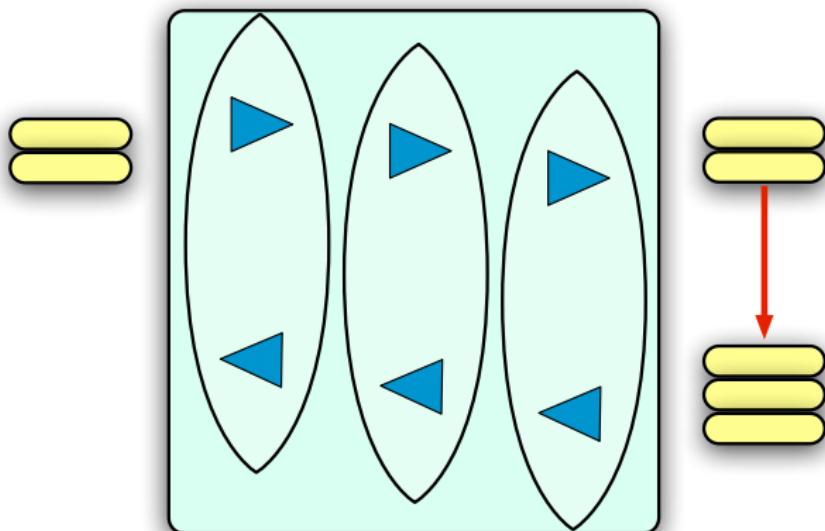
/\*

(Put)



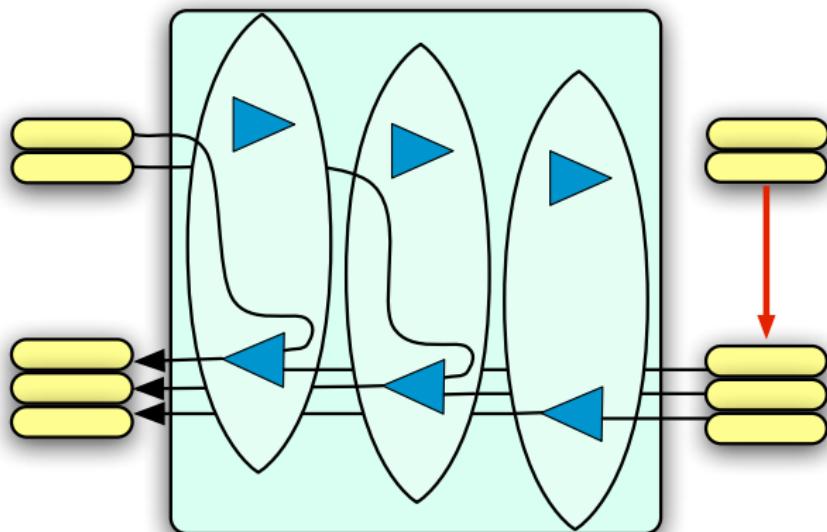
/\*

(Put)



/\*

(Put)



Type system ensures that strings are split the same way.

# String Lens Type System

Based on [regular expression](#) types...

# String Lens Type System

Based on regular expression types...

$$\text{copy } E \in \llbracket E \rrbracket \iff \overline{\llbracket E \rrbracket}$$

$$E \leftrightarrow d \in \llbracket E \rrbracket \iff \{d\}$$

$$\frac{I \in S \iff V \quad d \in \llbracket S \rrbracket}{\text{default } I \ d \in S \iff V}$$

$$\frac{\begin{array}{c} I_1 \in S_1 \iff V_1 & S_1 \cdot^! S_2 \\ I_2 \in S_2 \iff V_2 & V_1 \cdot^! V_2 \end{array}}{(I_1 \cdot I_2) \in S_1 \cdot S_2 \iff V_1 \cdot V_2}$$

$$\frac{\begin{array}{c} I_1 \in S_1 \iff V_1 \quad S_1 \cap S_2 = \emptyset \\ I_2 \in S_2 \iff V_2 \end{array}}{(I_1 \mid I_2) \in S_1 \cup S_2 \iff V_1 \cup V_2}$$

$$\frac{I \in S \iff V \quad S^{!*} \quad V^{!*}}{I^* \in S^* \iff V^*}$$

$S_1 \cdot^! S_2$  (or  $S^{!*}$ ) means that the concatenation (or iteration) is unambiguous.

# String Lens Type System

Based on regular expression types...

$$\overline{\text{copy } E \in \llbracket E \rrbracket \iff \llbracket E \rrbracket}$$

$$E \leftrightarrow d \in \llbracket E \rrbracket \iff \{d\}$$

$$\frac{I \in S \iff V \quad d \in \llbracket S \rrbracket}{\text{default } I \ d \in S \iff V}$$

$$\frac{\begin{array}{c} I_1 \in S_1 \iff V_1 & S_1 \cdot^! S_2 \\ I_2 \in S_2 \iff V_2 & V_1 \cdot^! V_2 \end{array}}{(I_1 \cdot I_2) \in S_1 \cdot S_2 \iff V_1 \cdot V_2}$$

$$\boxed{\frac{\begin{array}{c} I_1 \in S_1 \iff V_1 & S_1 \cap S_2 = \emptyset \\ I_2 \in S_2 \iff V_2 \end{array}}{(I_1 \mid I_2) \in S_1 \cup S_2 \iff V_1 \cup V_2}}$$

$$\frac{I \in S \iff V \quad S^{!*} \quad V^{!*}}{I^* \in S^* \iff V^*}$$

$S_1 \cdot^! S_2$  (or  $S^{!*}$ ) means that the concatenation (or iteration) is unambiguous.

# String Lens Type System

Based on regular expression types...

$$\overline{\text{copy } E \in \llbracket E \rrbracket \iff \llbracket E \rrbracket}$$

$$E \leftrightarrow d \in \llbracket E \rrbracket \iff \{d\}$$

$$\frac{I \in S \iff V \quad d \in \llbracket S \rrbracket}{\text{default } I \ d \in S \iff V}$$

$$\frac{\begin{array}{l} I_1 \in S_1 \iff V_1 \\ I_2 \in S_2 \iff V_2 \end{array}}{(I_1 \cdot I_2) \in S_1 \cdot S_2 \iff V_1 \cdot V_2}$$

$S_1 \cdot^! S_2$        $V_1 \cdot^! V_2$

$$\frac{\begin{array}{l} I_1 \in S_1 \iff V_1 \\ I_2 \in S_2 \iff V_2 \end{array}}{(I_1 \mid I_2) \in S_1 \cup S_2 \iff V_1 \cup V_2}$$

$S_1 \cap S_2 = \emptyset$

$$\frac{I \in S \iff V}{I^* \in S^* \iff V^*}$$

$S^{!*} \quad V^{!*}$

$S_1 \cdot^! S_2$  (or  $S^{!*}$ ) means that the concatenation (or iteration) is unambiguous.

## Theorem

If  $I \in S \iff V$  then  $I$  is a well-behaved lens.



## Comparison: String Lens

```
View and
Source
```

## to View

## Source

[Bohannon, Foster, Pierce, Pilkiewicz, Schmitt POPL '08]  
[Foster, Pierce, Pilkiewicz ICFP '08]



# Boomerang

“Good men must not obey  
the laws too well”  
—R W Emerson

# Challenge: Ignorable Data

Many real-world data formats contain **inessential** data.

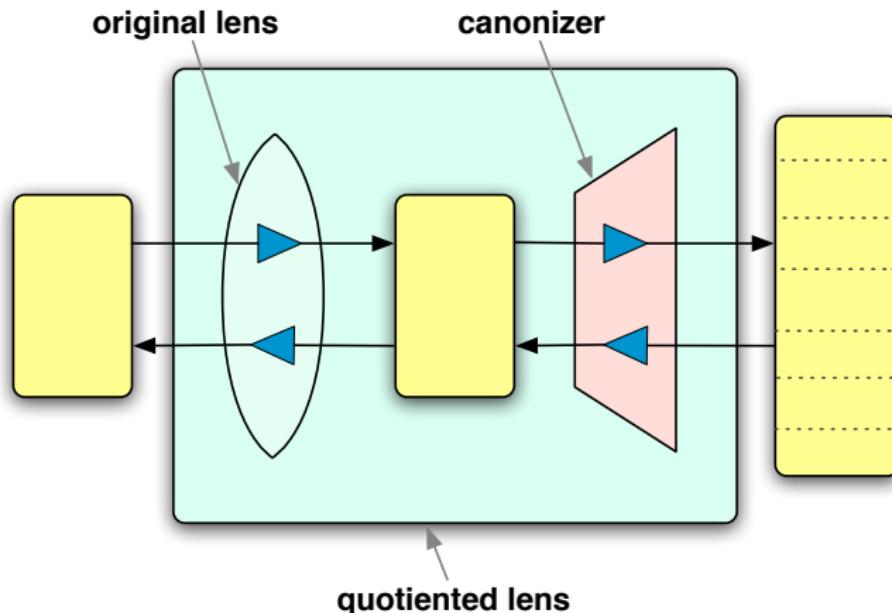
- whitespace, wrapping of long lines of text
- order of fields in record-structured data
- escaping of special characters
- aggregate values, timestamps, etc.

In practice, to handle these details, we need lenses that are well behaved modulo equivalence relations on the source and view.

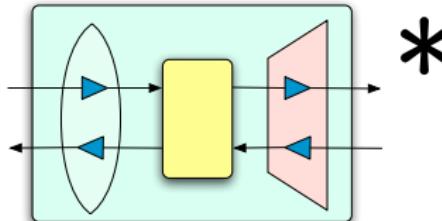
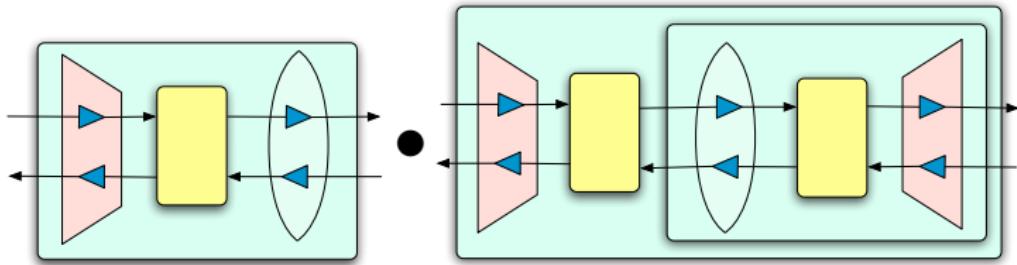
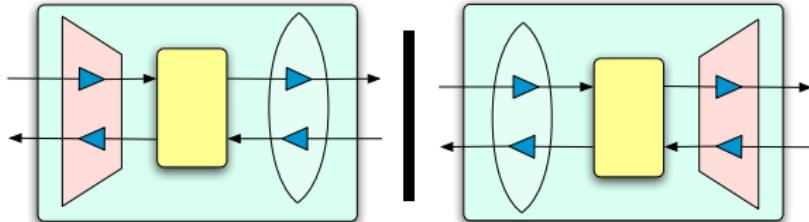
$$l.\text{get}\ (l.\text{put}\ v\ s) \sim_V v \quad (\text{PUTGET})$$

$$l.\text{put}\ (l.\text{get}\ s)\ s \sim_S s \quad (\text{GETPUT})$$

# Quotient Lenses



# Quotient Lenses



## Challenge: Ordered Data

---

The lenses we have seen so far align data by [position](#).

But, in practice, we often need to align data according to different criteria—e.g., by [key](#).

# Challenge: Ordered Data

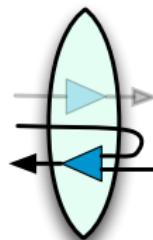
The lenses we have seen so far align data by **position**.

But, in practice, we often need to align data according to different criteria—e.g., by **key**.

\*08:30 Coffee with Sara (Starbucks)  
12:15 PLClu (Seminar room)  
\*15:00 Workout (Gym)



\*08:30 Coffee with Sara (Starbucks)  
\*15:00 Unknown (Unknown)  
16:00 Meeting (Unknown)



08:30 BUSY  
12:15 PLClu  
15:00 BUSY



08:30 BUSY  
15:00 BUSY  
16:00 Meeting

# A Better Redact Lens

---

Similar to previous version but with a key annotations and a combinator (<1>) that identifies “chunks”

```
(* helper lenses *)
let location : lens = default (del LOCATION) " (Unknown)"

let public : lens =
  del SPACE .
  key TIME .
  copy TEXT .
  default (del LOCATION) " (Unknown)"

let private : lens =
  del ASTERISK .
  key TIME .
  default (TEXT . LOCATION <-> "BUSY") "Unknown (Unknown)" .

let event : lens =
  (public | private) .
  copy NL

(* main lens *)
let redact : lens = <~ event>*
```

# A Better Redact Lens

Similar to previous version but with a key annotations and a combinator (<1>) that identifies “chunks”

```
(* helper lenses *)
let location : lens = default (del LOCATION) " (Unknown)"

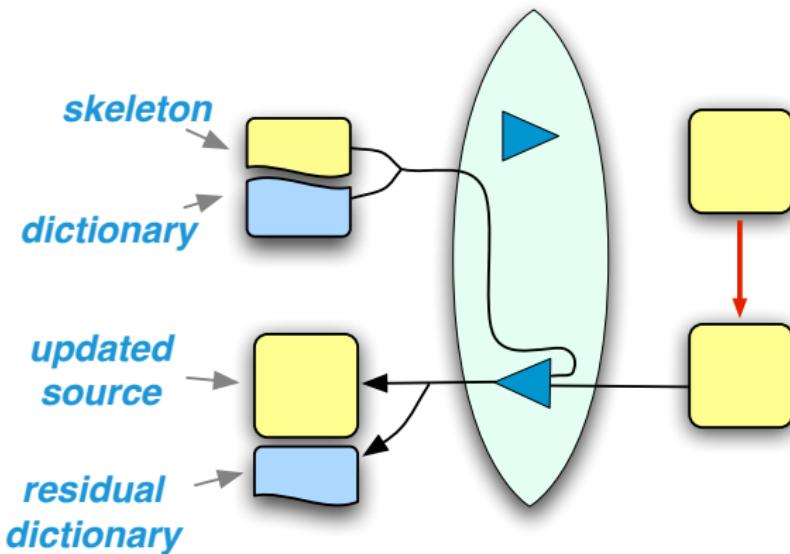
let public : lens =
  del SPACE .
  key TIME .
  copy TEXT .
  default (del LOCATION) " (Unknown)"

let private : lens =
  del ASTERISK .
  key TIME .
  default (TEXT . LOCATION <-> "BUSY") "Unknown (Unknown)" .

let event : lens =
  (public | private) .
  copy NL

(* main lens *)
let redact : lens = <` event>*
```

# Dictionary Lenses

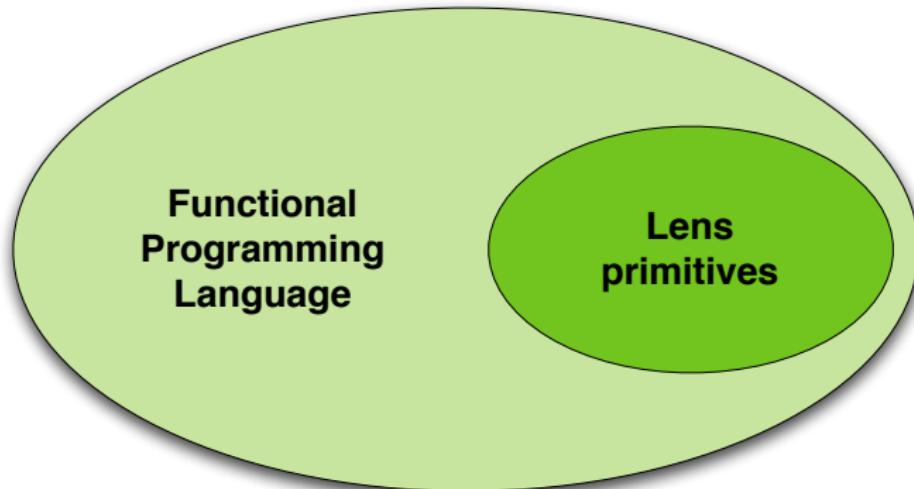


The **put** function works on a **dictionary** structure where chunks are organized by **key**.

# Challenge: Language Design

Writing big programs only using combinators would not be fun!

Boomerang is a full-blown functional language over the base types `string`, `regexp`, `lens`, ...



# Additional Features

---

Boomerang has *many* other lens primitives

- partition
- filter
- permute
- sort
- duplicate
- merge
- sequentially compose
- columnize
- normalize
- clobber
- probe
- etc.

and an extremely rich type system

- regular expression types
- dependent types
- refinement types
- polymorphism
- user-defined datatypes
- modules

implemented in hybrid style [Flanagan '06][Findler, Wadler '09]

# Challenge: Typechecker Engineering

---

Typechecking uses *many* automata-theoretic operations.

- “Expensive” operations like intersection, difference, and interleaving are used often in practice
- Algorithms for checking ambiguity are computationally expensive rarely implemented

Implementation strategy:

- Compile compact automata [Brzozowski '64]
- Aggressive memoization [Foster *et al.* PLAN-X '07]

# The Boomerang System

## Lenses

- Bibliographies (BibTeX, RIS)
- Address Books (vCard, XML, ASCII)
- Calendars (iCal, XML, ASCII)
- Scientific Data (SwissProt, UniProtKB)
- Documents (MediaWiki, literate source code)
- Apple Preference Lists (e.g., iTunes)
- CSV

## Libraries

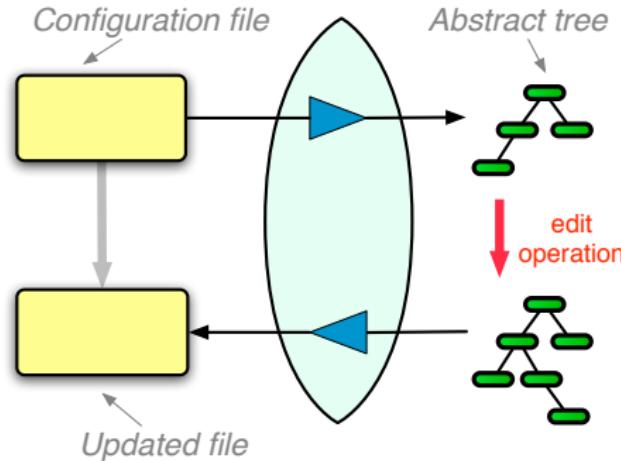
- Escaping
- Sorting
- Lists
- XML

## System

- Stable prototype complete
  - Available under LGPL
- [Unison Integration](#)
- On the way...



Augeas "a configuration API."





Augeas "a configuration API."

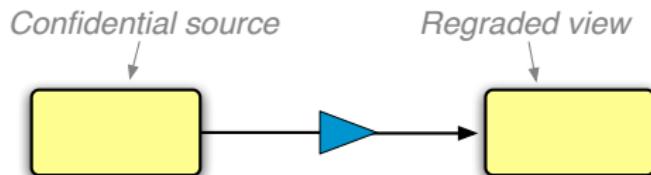
aliases.aug	fstab.aug	monit.aug	rsyncd.aug	sysctl.aug
aptpreferences.aug	gdm.aug	ntp.aug	samba.aug	util.aug
aptsources.aug	group.aug	openvpn.aug	services.aug	vsftpd.aug
bbhosts.aug	grub.aug	pam.aug	shellvars.aug	webmin.aug
darkice.aug	hosts.aug	passwd.aug	slapd.aug	xinetd.aug
dhclient.aug	inifile.aug	php.aug	soma.aug	xorg.aug
dnsmasq.aug	inittab.aug	phpvars.aug	spacevars.aug	yum.aug
dpkg.aug	interfaces.aug	postfix_main.aug	squid.aug	
dput.aug	limits.aug	postfix_master.aug	sshd.aug	
exports.aug	logrotate.aug	puppet.aug	sudoers.aug	

## Also used in

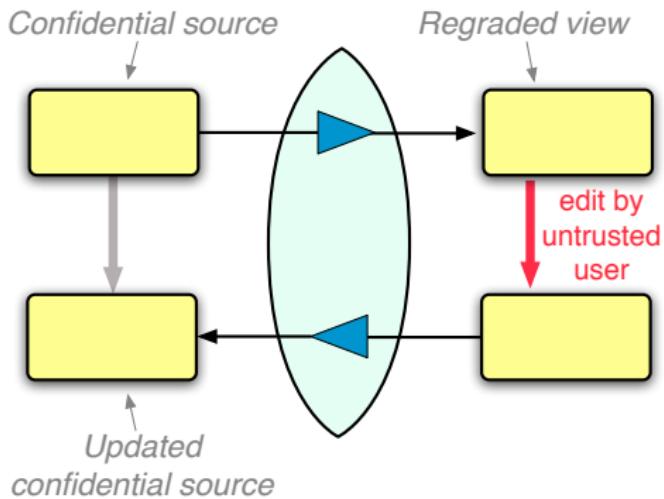
- Puppet – declarative configuration management tool
- Show – SQL-like queries on the filesystem
- Netcf – a network configuration library

# Ongoing Work

# Security Views

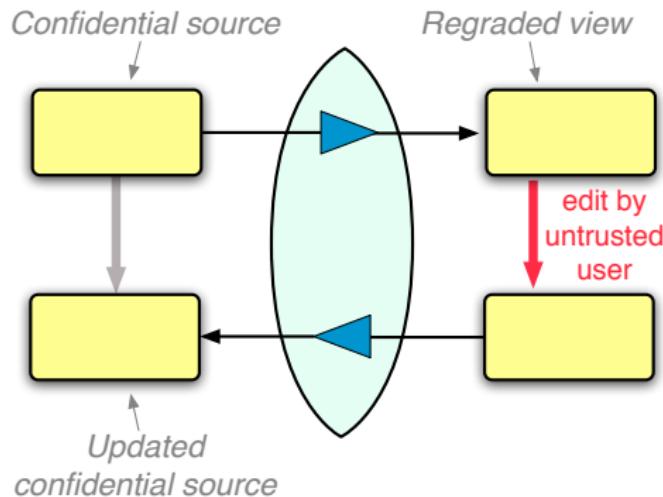


# Updatable Security Views



[Foster, Pierce, Zdancewic CSF '09]

# Requirements for Updatable Security Views

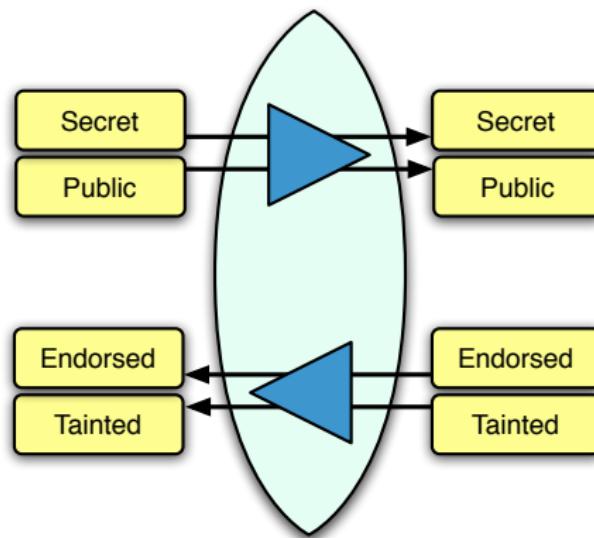


[Foster, Pierce, Zdancewic CSF '09]

1. Confidentiality: **get** does not leak secret data
2. Integrity: **put** does not taint endorsed data

# Non-interference

Requirements can be formulated as **non-interference** properties.



# Secure Lenses

---

To distinguish high and low-security data we use equivalences

- $\sim_k$  — “agree on  $k$ -public data”
- $\approx_k$  — “agree on  $k$ -endorsed data”

# Secure Lenses

To distinguish high and low-security data we use equivalences

- $\sim_k$  — “agree on  $k$ -public data”
- $\approx_k$  — “agree on  $k$ -endorsed data”

described using annotated regular expressions.

$$\mathcal{R} ::= \emptyset \mid u \mid \mathcal{R} \cdot \mathcal{R} \mid \mathcal{R} | \mathcal{R} \mid \mathcal{R}^* \mid \mathcal{R}:k$$

# Secure Lenses

To distinguish high and low-security data we use equivalences

- $\sim_k$  — “agree on  $k$ -public data”
- $\approx_k$  — “agree on  $k$ -endorsed data”

described using annotated regular expressions.

$$\mathcal{R} ::= \emptyset \mid u \mid \mathcal{R} \cdot \mathcal{R} \mid \mathcal{R} | \mathcal{R} \mid \mathcal{R}^* \mid \mathcal{R}:k$$

A secure lens obeys refined laws:

$$\frac{s \sim_k s'}{l.\text{get } s \sim_k l.\text{get } s'} \quad (\text{GETNoLEAK})$$

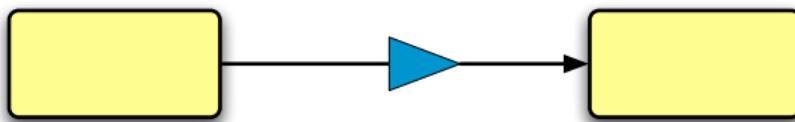
$$\frac{v \approx_k (l.\text{get } s)}{l.\text{put } v s \approx_k s} \quad (\text{GETPUT})$$

(See paper for a dynamic approach to integrity tracking.)

# Future Directions

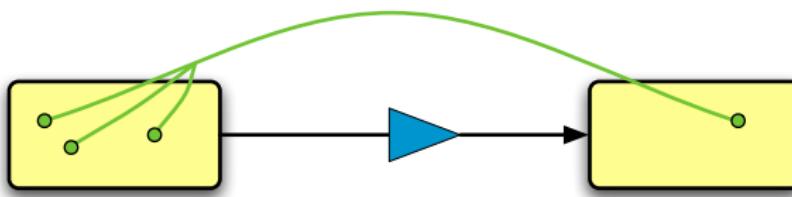
# Data Provenance

---



# Data Provenance

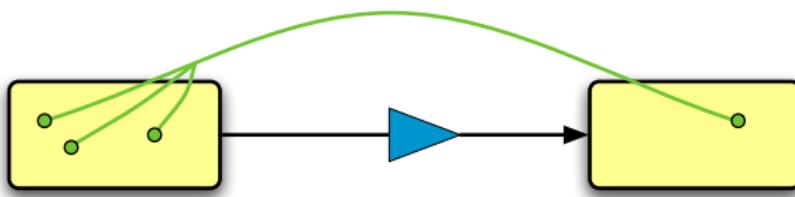
---



Provenance is metadata that describes the origin and causal history of pieces of data.

# Data Provenance

---

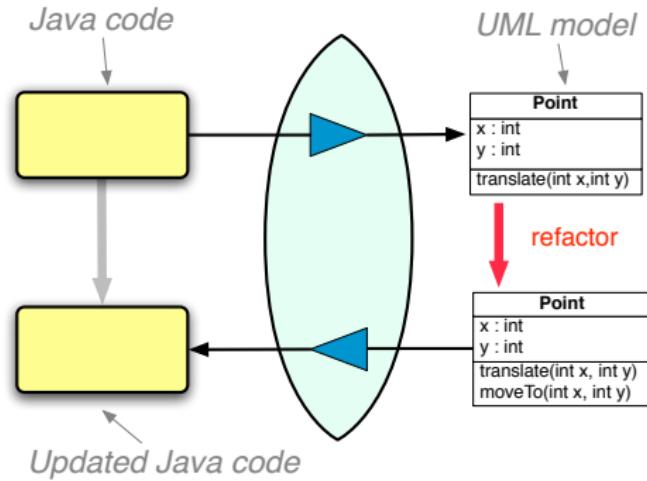


Provenance is metadata that describes the origin and causal history of pieces of data.

In the context of lenses, provenance is useful

- for fine-grained tracking of confidentiality and integrity  
[Foster, Green, Tannen PODS '08]
- for incremental view maintenance
- as an additional input to the **put** function

# Model Transformations



Much interest in the software engineering community in using lenses for bidirectional model transformations [Stevens '07]  
[Czarnecki, Foster, Hu, Lämmel, Schürr, Terwilliger ICMT '09]

Requires lenses for richer structures — e.g., graphs.

# Conclusion

---

“Bidirectional programming languages are an effective and elegant means of describing updatable views”

## Lenses

- Semantic space of well-behaved bidirectional transformations
- Provides foundation for bidirectional languages

## Boomerang

- Language for lenses on strings
- Natural syntax based on regular operators
- Extensions to handle ordered and ignorable data
- Type system guarantees well-behavedness and totality

## Implementation & Applications

- Lenses for a number of real-world formats
- Adoption in Augeas
- Updatable security views

# Thank You!

---

Collaborators: Benjamin Pierce, Alexandre Pilkiewicz, Aaron Bohannon, Michael Greenberg, and Alan Schmitt.



Want to play? Boomerang is available for download.

- Source code (LGPL)
- Precompiled binaries for Linux, OS X, Windows
- Research papers
- Tutorial and demos

<http://www.seas.upenn.edu/~harmony/>