

# Logical Data Expiration

David Toman

School of Computer Science



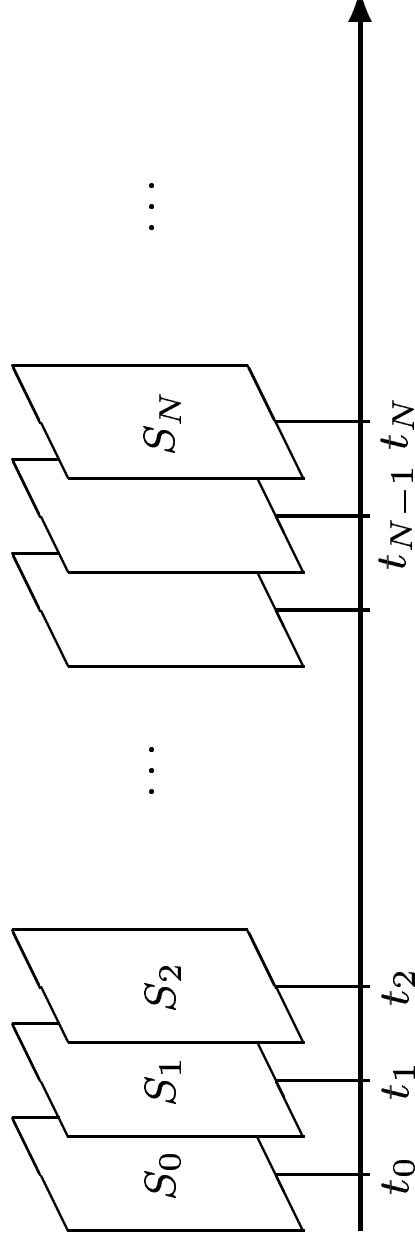
# List of Slides

- |    |                                       |  |
|----|---------------------------------------|--|
| 2  | Data Evolution and Histories          |  |
| 3  | Data Access and Queries               |  |
| 4  | Expiration                            |  |
| 5  | Examples                              |  |
| 6  | Outline of the Talk                   |  |
| 7  | Temporal Databases and Histories      |  |
| 8  | Example                               |  |
| 9  | Temporal Queries                      |  |
| 10 | Example                               |  |
| 11 | Finite vs. Infinite Histories         |  |
| 12 | Expiration Operator                   |  |
| 13 | Examples                              |  |
| 14 | More Examples                         |  |
| 15 | Expiration vs. Queries Revisited      |  |
| 16 | How Good is an Expiration Operator?   |  |
| 17 | Example                               |  |
| 18 | Finite Histories                      |  |
| 19 | Administrative Approaches             |  |
| 20 | Vacuuming                             |  |
| 21 | Query Driven Expiration               |  |
| 22 | Query Driven Approaches               |  |
| 23 | Past Temporal Logic                   |  |
| 24 | Unfolding and Materialized Views      |  |
| 25 | Example                               |  |
| 26 | Example (cont.)                       |  |
| 27 | Space Utilization                     |  |
| 28 | Adding Fixpoints                      |  |
| 29 | Example                               |  |
| 30 | Metric Temporal Logic                 |  |
| 31 | Future Temporal Logic                 |  |
| 32 | Biquantified Formulas                 |  |
| 33 | Two-sorted First-order Language       |  |
| 34 | Expiration Revisited                  |  |
| 35 | Handling History Extensions           |  |
| 36 | Query Specialization                  |  |
| 37 | Example                               |  |
| 38 | Duplicate Information Removal         |  |
| 39 | Equivalence in Extensions             |  |
| 40 | Example                               |  |
| 41 | Residual History Reconstruction       |  |
| 42 | Example                               |  |
| 43 | Properties of the Expiration Operator |  |
| 44 | Space: Lower Bound                    |  |
| 45 | Limits of Bounded Encoding            |  |
| 46 | Counting                              |  |
| 47 | Duplicates                            |  |
| 48 | Retroactive Updates                   |  |
| 49 | Infinite Histories                    |  |
| 50 | Infinite Histories (cont.)            |  |
| 51 | Related Issues                        |  |
| 52 | Open Problems                         |  |
| 53 | Acknowledgment                        |  |

# Data Evolution and Histories

2

Changes of data can be captured (conceptually) by *histories*:



- states  $S_i$  describe system state
  - transitions  $S_i \rightarrow S_{i+1}$  represent system evolution
- $\Rightarrow$  append only histories (new states appear at the end)

# Data Access and Queries

Data is accessed using *queries*

- simple value look-ups vs. complex query languages
- current state only vs. access to *past states*
  - ⇒ analysis of data warehouse evolution
  - ⇒ enforcement of dynamic/temporal integrity constraints
  - ⇒ monitoring applications

# Expiration

1. *Policy*-driven expiration
2. *Query*-driven (logical) expiration

The data to be removed (expired) is determined by  
**the (class of) queries we are allowed to ask**  
in **all possible extensions** of a history

# Examples

- Record keeping/business rules:
  - ⇒ tax forms must be kept 5 years back
- Dynamic integrity constraints:
  - ⇒ don't hire anyone you've fired in the past
- Caching policies
  - ⇒ what data should be moved to backup storage?
- Moving window queries, etc...

# Outline of the Talk

- Temporal Database Primer
- Expiration Operators
  - ⇒ How good is an expiration operator?
- Administrative Approaches to Expiration
- Query-driven Expiration
  - ⇒ Temporal Logic and Materialized Views
  - ⇒ First-order Queries and Partial Evaluation
- Space Limits for Expiration Operators
- Infinite Extensions of Histories and Potential Answers

# Temporal Databases and Histories

System states: Relational structures (fixed schema)

Time: discrete (integer-like)  $\{0, \dots, N, \dots\}$

## 1. Snapshot Temporal Database:

- ⇒ time-indexed sequence of relational structures
- ⇒ History, Kripke structure

## 2. Timestamp Temporal Database:

- ⇒ time-indexed tuples (i.e., additional temporal attribute)
- ⇒ **append-only**:  $H; D_{N+1}$

Choices 1 and 2 equivalent [Chomicki and Toman, 1998]



# Example

Information about TA and courses by semester:

0	{(John, CS448)}
1	{(John, CS448), (Sue, CS234)}
2	{(John, CS448)}
3	{(Sue, CS234)}

# Temporal Queries

Queries: first-order formulas (over a fixed schema)

1. Temporal logic (FOTL)
  - ⇒ modal (temporal) connectives
  - ⇒ implicit references to time
2. Temporal Relational Calculus (2-FOL):
  - ⇒ temporal variables/attributes/quantifiers
  - ⇒ explicit access to time and ordering of time

**Proposition 1** ([Abiteboul et al., 1996, Toman and Niwinski, 1996])  
*FOTL cannot express all 2-FOL queries.*

# Example

Students who TA'ed at least one class twice:

- in (past) FOTL:

$$\{x : \blacklozenge(\exists y. \text{TA}(x, y) \wedge \bullet \blacklozenge \text{TA}(x, y))\}$$

- in 2-FOL:

$$\{x : \exists t_1, t_2. t_1 < t_2 \wedge \exists y. \text{TA}(t_1, x, y) \wedge \text{TA}(t_2, x, y)\}$$

# Finite vs. Infinite Histories

Semantics of queries defined w.r.t.:

1. current (finite) history  
⇒ query evaluation on a finite temporal database
2. a completion of current history  
⇒ hypothetical reasoning

# Expiration Operator

- provides an *inductive definition*

$$\mathcal{E}(\langle \rangle) = 0^\mathcal{E} \quad (\text{initial state})$$

$$\mathcal{E}(H; D) = \Delta^\mathcal{E}(\mathcal{E}(H), D) \quad (\text{extension maintenance})$$

for an induced operator on histories, and

- maintains the following invariant:

$$Q(H) = Q^\mathcal{E}(\mathcal{E}(H)) \quad (\text{answer preservation})$$

# Examples

- the *identity* operator:

$$0^{\mathcal{E}_{\text{id}}} = \langle \rangle$$

$$\Delta^{\mathcal{E}_{\text{id}}} = \lambda H \lambda S.H; S$$

$$Q^{\mathcal{E}_{\text{id}}} = Q$$

- the *current* operator:

$$0^{\mathcal{E}_{\text{now}}} = \langle \rangle$$

$$\Delta^{\mathcal{E}_{\text{now}}} = \lambda H \lambda S.\langle S \rangle$$

$$Q^{\mathcal{E}_{\text{now}}} = Q$$

Note that the supported query languages are *different*...

# More Examples

- *compression based operator:*

$$0^{\mathcal{E}_{\text{compress}}} = \text{compress}(\langle \rangle)$$

$$\Delta^{\mathcal{E}_{\text{compress}}} = \lambda H \lambda S. \text{compress}(\text{decompress}(H); S)$$

$$Q^{\mathcal{E}_{\text{compress}}} = \lambda H. Q(\text{decompress}(H))$$

$\Rightarrow$  **compress and decompress are lossless.**

$\Rightarrow$  **accounts for *interval encoding* of temporal databases.**

# Expiration vs. Queries Revisited

1. Given an *expiration operator*
  - for what class of queries it preserves answers?
    - $\Rightarrow$  can these be characterized syntactically?
2. Given a *fixed set* of temporal queries:
  - is there an expiration operator that
    - maintains answers to these queries?
    - $\Rightarrow$  that minimizes  $|\mathcal{E}(H)|$ ?
    - $\Rightarrow$  can it be found algorithmically?
  - what query language can we formulate the queries?



# How Good is an Expiration Operator?

16

What is the space needed by  $\mathcal{E}(H)$  in terms of

1. size of the original history,  $|H|$ ,
2. length of  $H$  (number of states,  $|\text{dom}_T|$ ),
3. the size of the *active data domain* of  $H$  (number of constants that have appeared in  $H$ ,  $|\text{dom}_D|$ ),
4. size of the queries.

**Goal:** make the size of  $\mathcal{E}(H)$  independent of length of  $H$ .  
 $\Rightarrow$  **bounded expiration operator**

# Example

**Proposition 2**  $\mathcal{E}_{\text{now}}$  is bounded.

**Proposition 3** Let compress and decompress define lossless compression scheme. Then  $\mathcal{E}_{\text{compress}}$  cannot be bounded.

... how about  $\mathcal{E}_Q$  for a temporal query  $Q$ ?

# Finite Histories

Query answers defined with respect to a finite history

$$\langle D_0, D_1, \dots, D_n \rangle$$

$\Rightarrow$  active domain semantics.

# Administrative Approaches

*query-independent expiration policies.*

- characterize queries whose answers are not affected, or
- detect attempts to access the *missing data* at run-time.

Most common approach: *history truncation* or *cutoff point*

1. policies based on *fixed absolute cutoff point*, or
2. policies based on *now-relative cutoff point*.

A generalization of the  $\mathcal{E}^{\text{id}}$  and the  $\mathcal{E}^{\text{now}}$  operators

# Vacuuming

[Jensen, 1995]:

- $\rho(R) : e$  (a *remove* specification), and
- $\kappa(R) : e$  (a *keep* specification).

$R$  is a temporal relation;  $e$  a selection condition

$\Rightarrow$  a special constant symbol *now*

# Query Driven Expiration

**Proposition 4** *Finite relational structures can be completely characterized by first-order queries.*

**GOAL:** an expiration operator for a fixed query  $Q$ .

- query language for  $Q$ ?
  - $\Rightarrow$  Past FOTL (and variants)
  - $\Rightarrow$  Future FOTL
  - $\Rightarrow$  2-FOL

**Proposition 5** *Optimal expiration operator is not possible.*

$\Rightarrow$  we try for a *bounded expiration operator*.

# Query Driven Approaches

## 1. Removal of “old” states (expiration)

- ⇒ removes a **subset** of existing states
- ⇒ no other changes (maps a history to another history)

## 2. Auxiliary (non-temporal) view maintenance

- ⇒ maintains **auxiliary** relations
- ⇒ maps a history to a *single extended state*

## 3. Specialization of queries

- ⇒ specializes a given query w.r.t. the known prefix  $H$ .

# Past Temporal Logic

- Syntax: First-order logic past temporal operators

$$Q ::= R(\mathbf{x}) \mid F \mid Q \wedge Q \mid \neg Q \mid \exists x.Q \mid \bullet Q \mid Q \text{ since } Q$$

$\Rightarrow$  queries over unbounded past:  $\{x : \blacklozenge R(x)\}$

- Semantics:

$$Q(H) = \{\theta : H, \theta, n \models Q\}$$

where  $n$  is the *last* time instant in  $H$ .



# Unfolding and Materialized Views

- Crux of the approach:

$$Q_1 \text{ since } Q_2 \equiv Q_1 \wedge (\bullet Q_2 \vee \bullet(Q_1 \text{ since } Q_2))$$

- $\Rightarrow$  make an auxiliary view for each temporal subformula
- $\Rightarrow$  use recurrent definitions of PastTL connectives  
to maintain the views.

$\alpha$	$R_\alpha^0$	$R_\alpha^n$
$\bullet Q$	false	$Q^{n-1}$
$Q_1 \text{ since } Q_2$	false	$Q_1^n \wedge (Q_2^{n-1} \vee R_\alpha^{n-1})$

# Example

- Query:  
*Students who have TA'ed at least one class twice.*

$$\{x : \blacklozenge(\exists y. \text{TA}(x, y) \wedge \bullet\blacklozenge\text{TA}(x, y))\}$$

- Temporal subqueries:  
 $\alpha_1 = \blacklozenge\text{TA}(x, y)$  and  
 $\alpha_2 = \bullet\blacklozenge\text{TA}(x, y)$  and  
 $\alpha_3 = \blacklozenge\exists y. \text{TA}(x, y) \wedge \blacklozenge\text{TA}(x, y)$ .

# Example (cont.)

inductive maintenance of views:

$$R_{\alpha_1}(x, y)$$

$$\{(\text{John}, \text{CS448})\}$$

$$\{(\text{John}, \text{CS448}), (\text{Sue}, \text{CS234})\}$$

$$\{(\text{John}, \text{CS448}), (\text{Sue}, \text{CS234})\}$$

$$\{(\text{John}, \text{CS448}), (\text{Sue}, \text{CS234})\}$$

$$R_{\alpha_2}(x, y)$$

$$\{\}$$

$$\{(\text{John}, \text{CS448})\}$$

$$\{(\text{John}, \text{CS448}), (\text{Sue}, \text{CS234})\}$$

$$\{(\text{John}, \text{CS448}), (\text{Sue}, \text{CS234})\}$$

$$R_{\alpha_3}(x, y)$$

$$\{\}$$

$$\{\text{John}\}$$

$$\{\text{John}\}$$

$$\{\text{John}, \text{Sue}\}$$

# Space Utilization

- $Q = \diamond(p(x_1) \wedge \dots \wedge p(x_k))$
- $H = \langle \{a_1\}, \{a_2\}, \{a_3\}, \dots, \{a_n\} \rangle$ .

For  $\alpha = \diamond(p(x_1) \wedge \dots \wedge p(x_k))$ :

$$|R_\alpha| = (n - 1)^k$$

... the same holds for every prefix of  $H$ .

Full details: [Chomicki, 1995], subsumes approaches based on TRA [Yang and Widom, 1998, Yang and Widom, 2000].

# Adding Fixpoints

- Syntax:  $Q ::= R(\mathbf{x}) \mid F \mid Q \wedge Q \mid \neg Q \mid \exists x.Q \mid \bullet Q \mid \mu X.Q$ .
- Unfolding of fixpoint:  $\mu X.Q \equiv Q(\mu X.Q)$
- Inductive maintenance of auxiliary relation:

$\alpha$	$R_\alpha^0$	$R_\alpha^n$
$\bullet Q$	false	$Q^{n-1}$
$\mu X.Q$	$Q^0$	$Q^n$

# Example

- Query: *students who TA'ed in "even" terms*

$$\mu X. \exists y. TA(x, y) \vee \bullet \bullet X$$

- Temporal subformulas:

$$\alpha_1 = \mu X. \exists y. TA(x, y) \vee \bullet \bullet X, \alpha_2 = \bullet \bullet X, \text{ and } \alpha_3 = \bullet X.$$

	$R_{\alpha_1}(x)$	$R_{\alpha_2}(x)$	$R_{\alpha_3}(x)$
0	{John}	{}	{}
1	{John, Sue}	{}	{John}
2	{John}	{John}	{John, Sue}
3	{John, Sue}	{John, Sue}	{John}

# Metric Temporal Logic

- access to *real time* instants
  - $\Rightarrow$  a  $\text{clk}$  constant in each state (current *real time*)
  - $\Rightarrow$  not part of the active data domain

- additional temporal operators

$$Q ::= \dots \mid \mathbf{since}_{\sim c} \mid \bullet_{\sim c}$$

- $\Rightarrow$  semantics respects  $\sim c$  distances
- materialized views now contain *distance* values
  - $\Rightarrow$  bounded by  $c$
  - $\Rightarrow$  bounded expiration if  $\text{clk}^i - \text{clk}^{i-1} \geq \epsilon > 0$

# Future Temporal Logic

- Syntax:  $Q ::= R(\mathbf{x}) \mid F \mid Q \wedge Q \mid \neg Q \mid \exists x.Q \mid \circ Q \mid Q \text{ until } Q$
- Semantics:

$$Q(H) = \{\theta : H, \theta, 0 \models Q\}$$

where 0 is the *first* time instant in  $H$ .

- $\Rightarrow$  but still active domain semantics
- Unfolding rule (similarly to PastTL):

$$Q_1 \text{ until } Q_2 \equiv Q_1 \wedge (\circ Q_2 \vee \circ(Q_1 \text{ until } Q_2))$$

- $\Rightarrow$  but now we need to represent a formula with *holes*  
to be substituted when the history is extended.



# Biquantified Formulas

- Automata-based approach
  - ⇒ designed in the *propositional* setting
  - ⇒ interleaving quantifiers and temporal connectives?
- [Lipeck and Saake, 1987, Lipeck et al., 1994]
  - ⇒ restrictions to Future FOTL syntax: 3 layers
    1. FO formulas (evaluated in a *state*,
    2. TL(FO) formulas (temporal operators on top of (1),
    3. Universal quantifiers on top of (2)
- bounded expiration based on an automaton for (2) implemented by *triggers*.

# Two-sorted First-order Language

- Temporal Relational Calculus (2-FOL)

$$L ::= R(t, \mathbf{x}) \mid x = x' \mid t < t' \mid t = t' \mid L \wedge L \mid L \wedge \neg L \mid L \vee L \mid \exists x.L \mid \exists t.L$$

where  $R(t, \mathbf{x})$  is true in  $H$  iff  $R(\mathbf{x})$  is true in  $D_t$

Does a **bounded expiration operator** exist for 2-FOL?

$\Rightarrow$  conjectured that it does **NOT** exist

NOTE: 2-FOL queries with *unbounded answers*

cannot have bounded expiration operator

$\Rightarrow$  consider only *bounded queries*

# Expiration Revisited

**Idea:** remove those states that

1. do not contribute to query answer (due to  $\wedge$ )
2. contribute duplicate information (due to  $\exists$ )

Easy for a fixed history:

- $\Rightarrow$  compute answer to  $Q$  bottom-up
- $\Rightarrow$  propagate “back” to remove redundant data

# Handling History Extensions

Atomic formulas:

$$\begin{aligned} \bullet [x] \equiv & \begin{cases} x = a & a \in \text{dom}_D \\ \forall a \in \text{dom}_D. x \neq a & a = \bullet \end{cases} \\ \bullet [t] \equiv & \begin{cases} t = s & s \in \text{dom}_T \\ t > \text{maxtime}(\text{dom}_T) & s = \bullet \end{cases} \end{aligned}$$

Specialization of base relations *and their extensions*:

$$R(t, \mathbf{x}) \equiv \left( \bigvee_{a \in R_{D_s}} \text{true}_{[sa]}^{t\mathbf{x}} \right) \vee \left( \bigvee_{a \in \text{dom}_D \cup \{\bullet\}} R(t, \mathbf{x})_{[a]}^{t\mathbf{x}} \right)$$

$\Rightarrow$  disjoint union

$\Rightarrow$  depends **only** on the future extensions

# Query Specialization

$$\left. \begin{aligned}
 & \{\text{true}_{[sa]}^{tx} : R(s, \mathbf{a}) \in D\} \\
 & \cup \{R(t, \mathbf{x})_{[\bullet \mathbf{a}]}^{tx} : \mathbf{a} \in (\text{dom}_D \cup \{\bullet\})^{|\mathbf{x}|}\} \\
 & \{Q'_1[\mathbf{x}] : Q'_1[\mathbf{x}] \in \text{PE}_H(Q_1), \models [\mathbf{x}] \wedge F\} \\
 & \{Q'_1 \wedge Q'_2[\mathbf{x}] : Q'_1[\mathbf{x}] \in \text{PE}_H(Q_1), Q'_2[\mathbf{y}] \in \text{PE}_H(Q_2), \models [\mathbf{x}] \wedge Q_2\} \\
 & \{(\exists y. \bigvee_{Q'_1[\mathbf{x}y] \in \text{PE}_H(Q_1)} Q'_1[\mathbf{x}] : \exists b. Q''_1[\mathbf{x}y] \in \text{PE}_H(Q_1)\} \\
 & \{(\exists t. \bigvee_{Q'_1[\mathbf{x}t] \in \text{PE}_H(Q_1)} Q'_1[\mathbf{x}] : \exists s. Q''_1[\mathbf{x}t] \in \text{PE}_H(Q_1)\} \\
 & \{Q'_1 \wedge \neg Q'_2[\mathbf{x}] : Q'_1[\mathbf{x}] \in \text{PE}_H(Q_1), Q'_2[\mathbf{x}] \in \text{PE}_H(Q_2)\} \\
 & \cup \{Q'_1[\mathbf{x}] : Q'_1[\mathbf{x}] \in \text{PE}_H(Q_1), Q'_2[\mathbf{x}] \notin \text{PE}_H(Q_2)\} \\
 & \{Q'_1 \vee Q'_2[\mathbf{x}] : Q'_1 \in \text{PE}_H(Q_1), Q'_2[\mathbf{x}] \in \text{PE}_H(Q_2)\} \\
 & \cup \{Q'_1[\mathbf{x}] : Q'_1[\mathbf{x}] \in \text{PE}_H(Q_1), Q'_2[\mathbf{x}] \notin \text{PE}_H(Q_2)\} \\
 & \cup \{Q'_2[\mathbf{x}] : Q'_1[\mathbf{x}] \notin \text{PE}_H(Q_1), Q'_2[\mathbf{x}] \in \text{PE}_H(Q_2)\} \\
 & \cup \{Q'_1 \vee Q'_2\} \\
 & Q \equiv R(t, \mathbf{x}) \\
 & Q \equiv Q_1 \wedge F \\
 & Q \equiv Q_1 \wedge Q_2 \\
 & Q \equiv \exists y. Q_1 \\
 & Q \equiv \exists t. Q_1 \\
 & Q \equiv Q_1 \wedge \neg Q_2 \\
 & Q \equiv Q_1 \vee Q_2
 \end{aligned} \right\} \text{PE}_H(Q) =$$

# Example

The  $PE_H$  operator applied on the subquery

$$\exists t_1, t_2. t_1 < t_2 \wedge \exists y. TA(t_1, x, y) \wedge TA(t_2, x, y)$$

yields the following set of formulas:

$$\text{true} \left[ \begin{array}{l} t_1 t_2 x \\ 1 \ 2 \ \text{John} \end{array} \right]$$

$$\text{true} \left[ \begin{array}{l} t_1 t_2 x \\ 1 \ 3 \ \text{John} \end{array} \right]$$

$$\text{true} \left[ \begin{array}{l} t_1 t_2 x \\ 2 \ 3 \ \text{John} \end{array} \right]$$

$$TA(x, CS448, t_2) \left[ \begin{array}{l} t_1 t_2 x \\ 1 \bullet \ \text{John} \end{array} \right]$$

$$TA(x, CS448, t_2) \left[ \begin{array}{l} t_1 t_2 x \\ 2 \bullet \ \text{John} \end{array} \right]$$

$$TA(x, CS448, t_2) \left[ \begin{array}{l} t_1 t_2 x \\ 3 \bullet \ \text{John} \end{array} \right]$$

$$\text{true} \left[ \begin{array}{l} t_1 t_2 x \\ 2 \ 4 \ \text{Sue} \end{array} \right]$$

$$TA(x, CS234, t_2) \left[ \begin{array}{l} t_1 t_2 x \\ 2 \bullet \ \text{Sue} \end{array} \right]$$

$$TA(x, CS234, t_2) \left[ \begin{array}{l} t_1 t_2 x \\ 4 \bullet \ \text{Sue} \end{array} \right]$$

# Duplicate Information Removal

Modify the  $PE_H$  for quantification over time:

$$(\exists t. \bigvee_{\substack{Q'_1[as_1] \in PE_H(Q_1) \\ s \in TB_a(t)}} Q'_1[as_1]^x] \text{ where } Q''_1[as_1] \in PE_H(Q_1) \text{ for some } s \leftarrow \text{ what is this?}$$

**Definition 1:** Let  $Q_1[as_1], Q_2[as_2] \in PE_H(Q)$  for  $s_1 \neq s_2$ .

We define  $[as_1] \sim_Q^D [as_2]$  iff for any extension  $D'$  of  $D$

$$(a, s_1) \in Q(D; D') \iff (a, s_2) \in Q(D; D')$$

**Definition 2:**  $TB_a(t)$  is the set of representatives of the

$[as_1] \sim_Q^D [as_2]$  equivalence classes [min in time order].

# Equivalence in Extensions

$$Q = R: [x]_{a_1} \sim_Q^D [x]_{a_2} \iff ((Q_1 = Q_2 = \text{true}) \vee (a_1 = a_2))$$

$$Q = Q' \wedge F: [x]_{a_1} \sim_Q^D [x]_{a_2} \iff$$

$([x]_{a_1} \sim_{Q'}^D [x]_{a_2})$  where  $[x]_{a_1} \wedge F$  and  $[x]_{a_2} \wedge F$  are satisfiable),

$$Q = \exists y.Q': \text{Let } S_1 = \{b : Q'_1 [y^x]_{ba_1}\} \in \text{PE}_H(Q'),$$

$$S_2 = \{b : Q'_2 [y^x]_{ba_2}\} \in \text{PE}_H(Q'). [x]_{a_1} \sim_Q^D [x]_{a_2} \iff$$

$$((\forall b \in S_1 \exists c \in S_2. [y^x]_{ba_1} \sim_{Q'}^D [y^x]_{ca_2}) \wedge (\forall c \in S_2 \exists b \in S_1. [y^x]_{ba_1} \sim_{Q'}^D [y^x]_{ca_2})),$$

$$Q = \exists t.Q': \text{Let } S_1 = \{s : Q'_1 [tx]_{sa_1}\} \in \text{PE}_H(Q'),$$

$$S_2 = \{s : Q'_2 [tx]_{sa_2}\} \in \text{PE}_H(Q'). [x]_{a_1} \sim_Q^D [x]_{a_2} \iff$$

$$((\forall r \in S_1 \exists s \in S_2. [tx]_{ra_1} \sim_{Q'}^D [tx]_{sa_2}) \wedge (\forall r \in S_2 \exists s \in S_1. [tx]_{ra_1} \sim_{Q'}^D [tx]_{sa_2})),$$

$$Q = Q' \wedge Q'': [x]_{a_1} \sim_Q^D [x]_{a_2} \iff$$

$([x']_{a'_1} \sim_{Q'}^D [x']_{a'_2} \wedge [x'']_{a''_1} \sim_{Q''}^D [x'']_{a''_2})$ , for  $[x]_{a_i} = [x'x'']_{a'_ia''_i}$  satisfiable),

$$Q = Q' \wedge \neg Q'' \text{ or } Q = Q' \vee Q'':$$

$$[x]_{a_1} \sim_Q^D [x]_{a_2} \iff ([x]_{a_1} \sim_{Q'}^D [x]_{a_2}) \wedge [x]_{a_1} \sim_{Q''}^D [x]_{a_2}.$$



# Example

$$\left\{ \begin{bmatrix} t_1 t_2 x \\ 1 \ 2 \text{ John} \end{bmatrix}, \begin{bmatrix} t_1 t_2 x \\ 1 \ 3 \text{ John} \end{bmatrix}, \begin{bmatrix} t_1 t_2 x \\ 2 \ 3 \text{ John} \end{bmatrix} \right\},$$

$$\left\{ \begin{bmatrix} t_1 t_2 x \\ 1 \bullet \text{ John} \end{bmatrix}, \begin{bmatrix} t_1 t_2 x \\ 2 \bullet \text{ John} \end{bmatrix}, \begin{bmatrix} t_1 t_2 x \\ 3 \bullet \text{ John} \end{bmatrix} \right\},$$

$$\left\{ \begin{bmatrix} t_1 t_2 x \\ 2 \ 4 \text{ Sue} \end{bmatrix} \right\},$$

$$\left\{ \begin{bmatrix} t_1 t_2 x \\ 2 \bullet \text{ Sue} \end{bmatrix}, \begin{bmatrix} t_1 t_2 x \\ 4 \bullet \text{ Sue} \end{bmatrix} \right\}$$

# Residual History Reconstruction

- *Specialization-based* expiration:

$$Q(H) = PE_H(Q)(\emptyset)$$

$$PE_{H;H'}(Q) \equiv PE_{H'}(PE_H(Q))$$

- We use  $PE_H(Q)$  to construct  $\mathcal{E}(H)$

$\Rightarrow$  for each temporal variable  $t_i$  we define a unary relation

$$T_i(t) = \bigcup_a TB_a(t).$$

$\Rightarrow$  each quantifier  $\exists t_i.Q'$  in  $Q$  is restricted to  $T_i(t)$

$\Rightarrow$  a state  $D_j \in H$  is expired if  $j \notin \bigcup_i T_i$ .

# Example

$$TB_{2,\text{John}}(t_1) = \{1\}$$

$$TB_{3,\text{John}}(t_1) = \{1\}$$

$$TB_{\bullet,\text{John}}(t_1) = \{1\}$$

$$TB_{4,\text{Sue}}(t_1) = \{2\}$$

$$TB_{\bullet,\text{Sue}}(t_1) = \{2\}$$

$\Rightarrow$  is sufficient to keep only states 1 and 2  
as valuations for the variable  $t_1$ .

# Properties of the Expiration Operator

- $Q(H; H') = Q(\mathcal{E}_Q(H); H')$

for all  $H, H'$  histories and  $Q$  FO query

- $|\mathcal{E}_Q(H)| \leq f(|\mathbf{dom}_D|, |Q|)$ ,

$f$  is an exponential tower in number of nested  $\exists$ .

- $|\mathcal{E}_Q(H)| \leq |H| + |\mathbf{dom}_T||Q|$

... and can be implemented by FO queries/updates.

# Space: Lower Bound

**Example:**  $\exists t_1, t_2. t_1 < t_2 \wedge \forall x. R(t_1, x) \iff R(t_2, x)$

- Potentially we need to keep all states for which  $R$  contains distinct subsets of  $\text{dom}_D$ 
  - $\Rightarrow$  potentially all subsets of  $\text{dom}_D$
  - $\Rightarrow$  therefore any expired history is exponential in  $|\text{dom}_D|$ .
- extended to *sequences of states* yields more exponents.

# Limits of Bounded Encoding

Clearly, this cannot work for all possible queries:

**Example 1:** Query  $\{t : R(t)\}$ .

$$\Rightarrow \text{answer} \sim |\text{dom}_T H|$$

**Example 2:** Query  $\{t : R(t) \wedge \forall t'. R(t') \rightarrow t \geq t'\}$ .

$$\Rightarrow \text{answer} \sim \log(|\text{dom}_T H|)$$

# Counting

**Example:** “is the number of states containing  $a$  greater than the number of states containing  $b$ ?”  
 $\Rightarrow$  we need  $\Omega(\log(|\text{dom}_T|))$  space to represent counter(s)  
 $\Rightarrow \mathcal{O}(\log(|\text{dom}_T|))$  is sufficient.

**Conjecture:** we can use the above technique (but remember counts of the expired values) to answer queries with counting  
 $\Rightarrow |\mathcal{E}_Q(H)| \leq \text{POLY}(\log(|\text{dom}_T|))$

# Duplicates

**Example** (in SQL-style syntax):

```
( select '1'  
  from R  
  where R.x='a' ) except all ( select '1'  
                               from R  
                               where R.x='b' )
```

is nonempty if and only if the number of states containing  $a$   
is greater than the number of states containing  $b$

⇒ just like counting ...



# Retroactive Updates

**Example:**

```
while  $\exists t. R(t, a) \wedge \exists t'. R(t, b)$  do    { while both  $a$  and  $b$  exist in  $R$  }  
  delete  $R(t, a)$   
  where  $\forall t'. R(t', a) \supset t' > t;$       { delete (chronologically) first  $a$  }  
  delete  $R(t, b)$   
  where  $\forall t'. R(t', b) \supset t' > t;$       { delete (chronologically) first  $b$  }  
return  $\exists t. R(t, a)$                     { return true if  $R$  contains an  $a$  }
```

$\Rightarrow$  we need  $\Omega(\log(|\text{dom}_T|))$  space to represent counter(s)

$\Rightarrow$  just like for counting ...

# Infinite Histories

**Definition 6** *Let  $H$  be a finite history,  $Q$  a query (in an appropriate query language), and  $\theta$  a substitution.*

- *$\theta$  is a potential answer for  $Q$  with respect to  $H$  if there is an infinite completion  $H'$  of  $H$  such that  $H', \theta \models Q$ .*
- *$\theta$  is a certain answer for  $Q$  with respect to  $H$  if for all infinite completions  $H'$  of  $H$  we have  $H', \theta \models Q$ .*

The notion of *potential answer* is a direct generalization of the notion of *potential constraint satisfaction* [Chomicki, 1995].

# Infinite Histories (cont.)

**Proposition 7 ([Gabbay et al., 1994])** *The satisfaction problem for two dimensional propositional temporal logic over natural numbers-based time domain is not decidable.*

**Proposition 8 ([Chomicki, 1995])** *For past formulas potential constraint satisfaction is undecidable.*

**Proposition 9 ([Chomicki and Niwinski, 1995])** *For biquantified formulas with no internal quantifiers (called universal), potential constraint satisfaction is decidable (in exponential time). For biquantified formulas with a single internal quantifier, potential constraint satisfaction is undecidable.*

# Related Issues

- garbage collection in programming languages
  - temporal/dynamic integrity constraint enforcement
  - model checking
  - materialized view maintenance
- ⇒ self-maintainable views and expiration for SAGAs

# Open Problems

**FutureTL.** expiration operator for full FutureTL

⇒ combined Past-Future TL?

**Fixpoints in 2-FOL.**

**Rich Temporal Domains.** more than linear  $\leq$

⇒ constraint database techniques? [Libkin et al., 2000]

**Space Bounds For Aggregate Queries.**

⇒ a weaker bound, e.g.,  $|\mathcal{E}H| \in O(\log(|\text{dom}_T H|))$ ?

**Query Languages with Decidable Potential Answers.**

⇒ Optimal Expiration Operators?

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