

# Integrating the Property Graph and RDF Data Models

**Olaf Hartig**

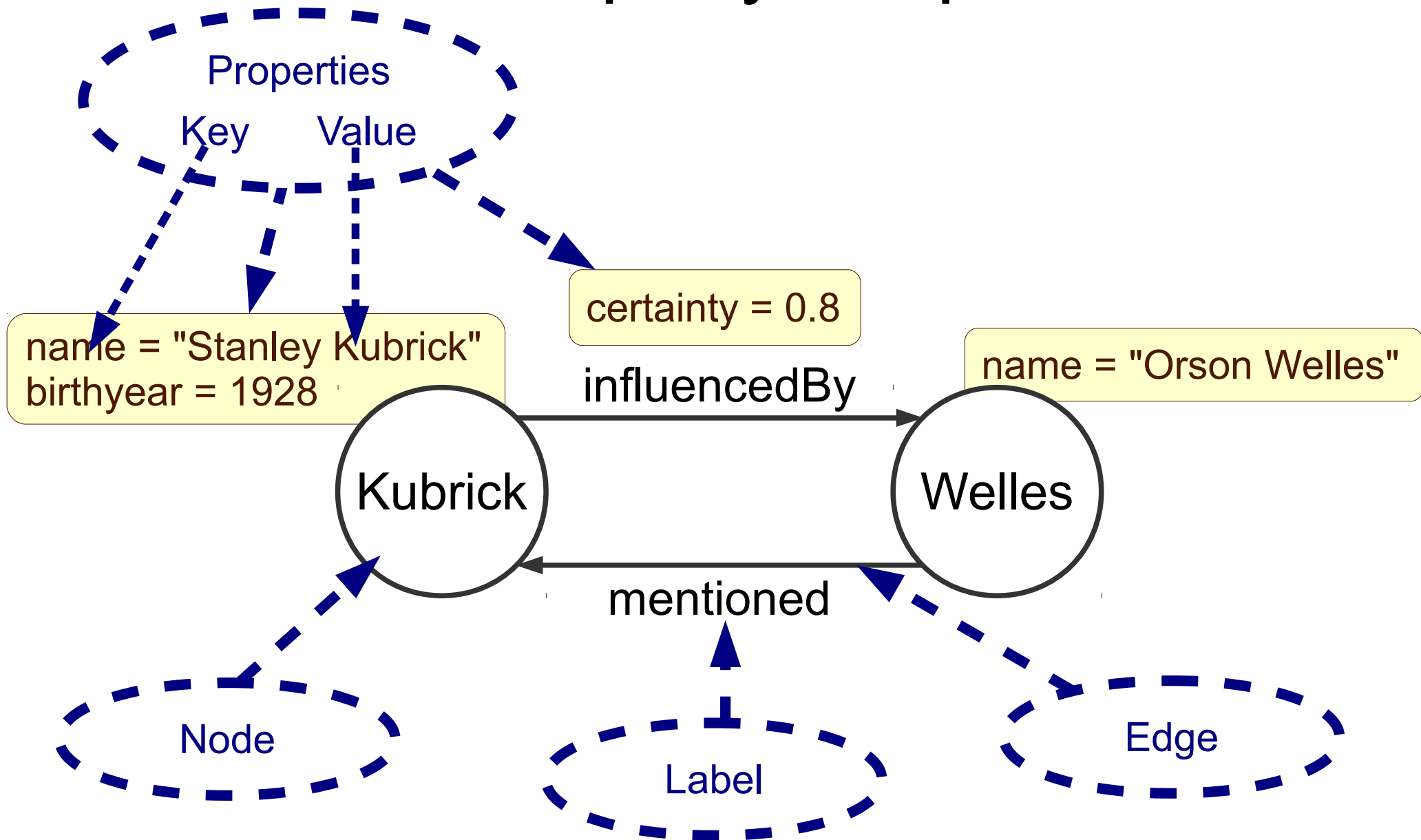
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The work presented in this talk is based on discussions with the following colleagues (in alphabetical order): Alejandro Flores, Bryan Thompson, Grant Weddell, Juan Sequeda, Kavitha Srinivas, Maria-Esther Vidal, Mike Personick, Orri Erling, Peter Boncz, Tamer Özsu, and Yrjänä Rankka.

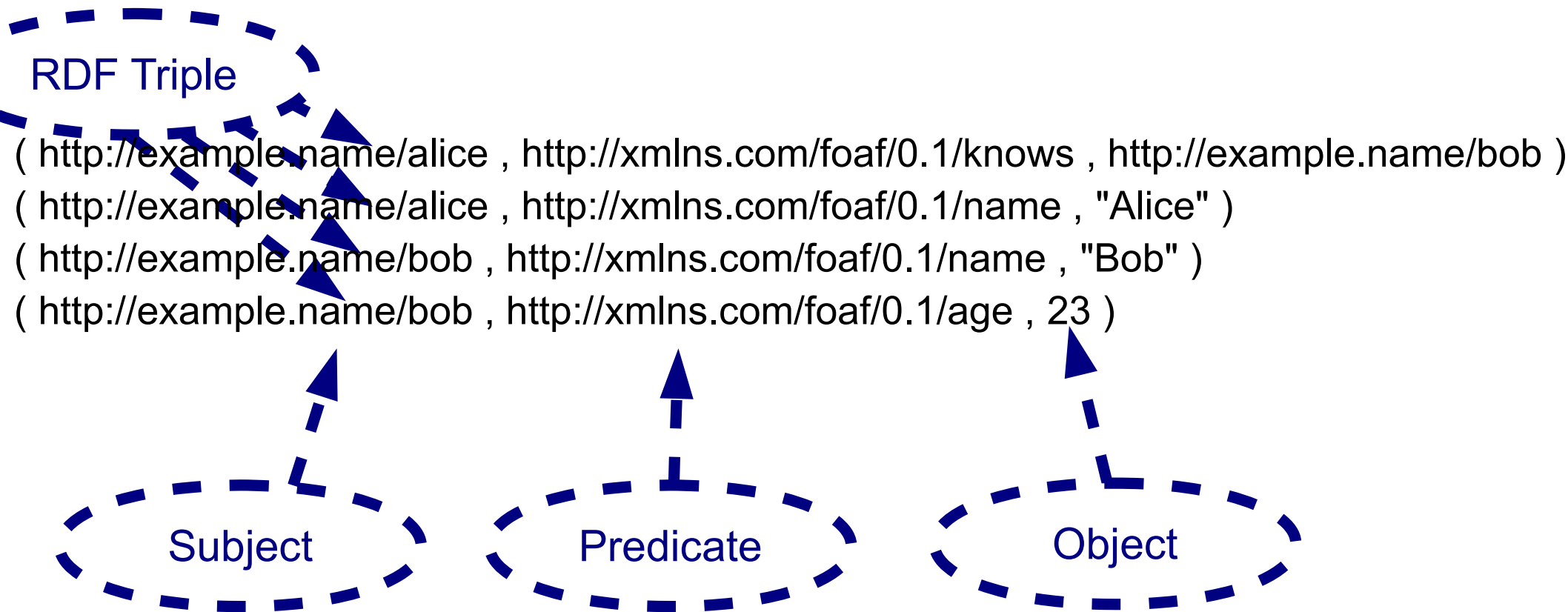
# Outline

1. The Data Models
2. Property Graphs to RDF
3. RDF to Property Graphs

# A Property Graph



# An RDF “Graph”



# An RDF “Graph”

prefix foaf: <http://xmlns.com/foaf/0.1/>

prefix ex: <http://example.name/>

( ex:alice , foaf:knows , ex:bob )

( ex:alice , foaf:name , "Alice" )

( ex:bob , foaf:name , "Bob" )

( ex:bob , foaf:age , 23 )

# An RDF “Graph”

prefix foaf: <http://xmlns.com/foaf/0.1/>

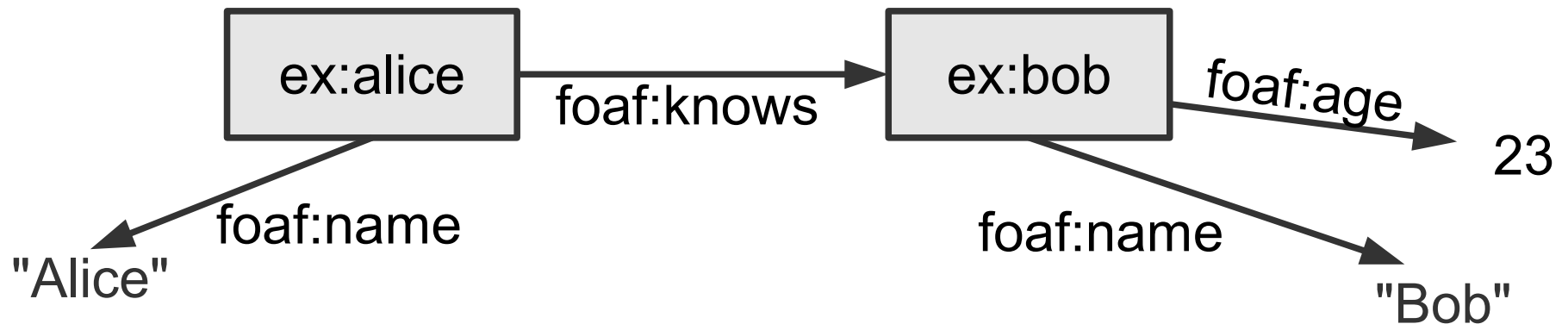
prefix ex: <http://example.name/>

( ex:alice , foaf:knows , ex:bob )

( ex:alice , foaf:name , "Alice" )

( ex:bob , foaf:name , "Bob" )

( ex:bob , foaf:age , 23 )



# Statement-level Metadata?

prefix foaf: <http://xmlns.com/foaf/0.1/>

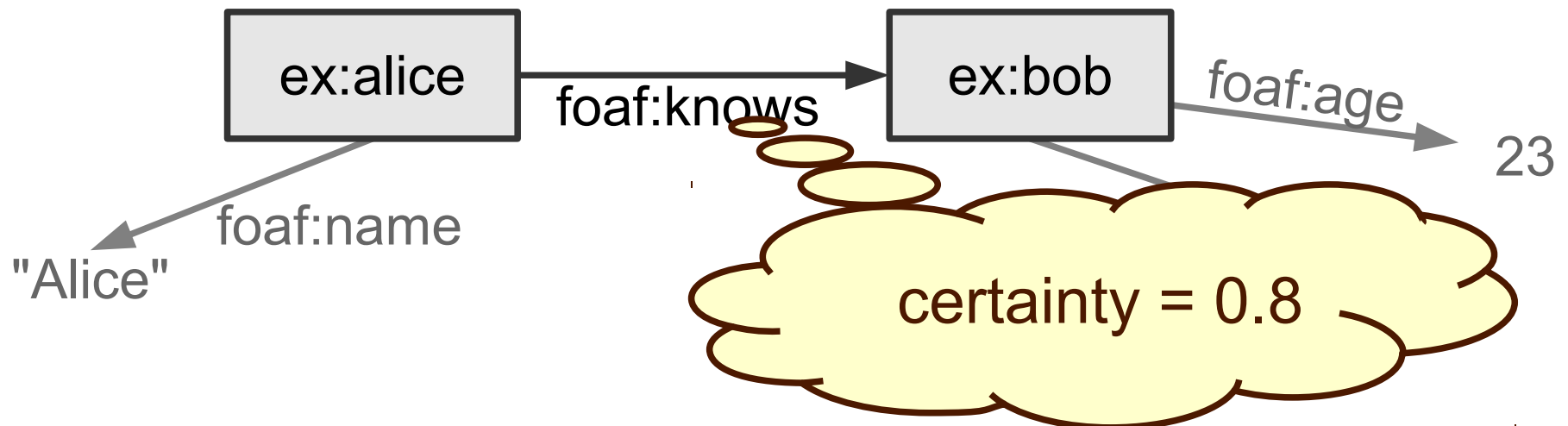
prefix ex: <http://example.name/>

( ex:alice , foaf:knows , ex:bob )

( ex:alice , foaf:name , "Alice" )

( ex:bob , foaf:name , "Bob" )

( ex:bob , foaf:age , 23 )



# RDF Reification

prefix foaf: <http://xmlns.com/foaf/0.1/>

prefix ex: <http://example.name/>

( ex:alice , foaf:knows , ex:bob )

( ex:alice , foaf:name , "Alice" )

( ex:bob , foaf:name , "Bob" )

( ex:bob , foaf:age , 23 )

( \_:b1 , rdf:type , rdf:Statement )

( \_:b1 , rdf:subject , ex:alice )

( \_:b1 , rdf:predicate , foaf:knows )

( \_:b1 , rdf:object , ex:bob )

( \_:b1 , ex:certainty , 0.8 )



# Querying with SPARQL

```
SELECT ?c
WHERE {
    ?s  rdf:type  rdf:Statement .
    ?s  rdf:subject  ex:alice .
    ?s  rdf:predicate  foaf:knows .
    ?s  rdf:object  ex:bob .
    ?s  ex:certainty  ?c
}
```

# Querying with SPARQL

```
SELECT ?c
WHERE {
    ?s  rdf:type  rdf:Statement .
    ?s  rdf:subject  ex:alice .
    ?s  rdf:predicate  foaf:knows .
    ?s  rdf:object  ex:bob .
    ?s  ex:certainty  ?c .
    ex:alice foaf:known ex:bob
}
```

# RDF\*

prefix foaf: http://xmlns.com/foaf/0.1/

prefix ex: http://example.name/

(( ex:alice , foaf:knows , ex:bob ) , ex:certainty , 0.8 )

( ex:alice , foaf:name , "Alice" )

( ex:bob , foaf:name , "Bob" )

( ex:bob , foaf:age , 23 )

# RDF\*

Metadata triple

prefix foaf: http://xmlns.com/foaf/0.1/

prefix ex: http://example.name/

( ( ex:alice , foaf:knows , ex:bob ) , ex:certainty , 0.8 )

( ex:alice , foaf:name , "Alice" )

( ex:bob , foaf:name , "Bob" )

( ex:bob , foaf:age , 23 )

# SPARQL\*

```
SELECT ?c
WHERE {
    <<ex:alice foaf:knows ex:bob>> ex:certainty ?c
}
```

# SPARQL\*

```
SELECT ?c
WHERE {
    <<ex:alice foaf:knows ex:bob>> ex:certainty ?c
}
```

```
SELECT ?c
WHERE {
    ?s rdf:type rdf:Statement .
    ?s rdf:subject ex:alice .
    ?s rdf:predicate foaf:knows .
    ?s rdf:object ex:bob .
    ?s ex:certainty ?c .
    ex:alice foaf:known ex:bob
}
```

# Outline

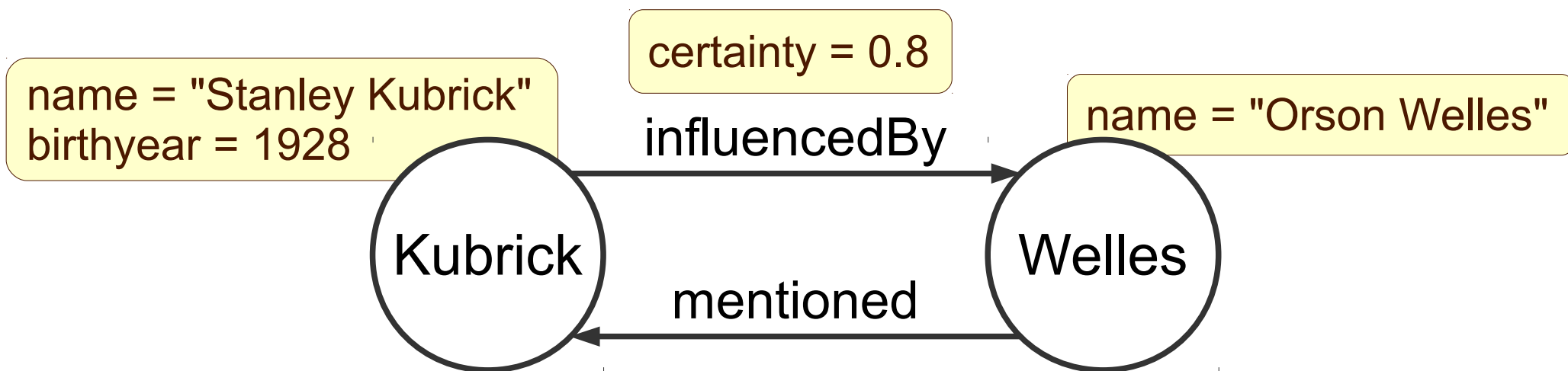
1. The Data Models ✓
2. Property Graphs to RDF
3. RDF to Property Graphs

# Outline

1. The Data Models ✓
2. Property Graphs to RDF\*
3. RDF\* to Property Graphs

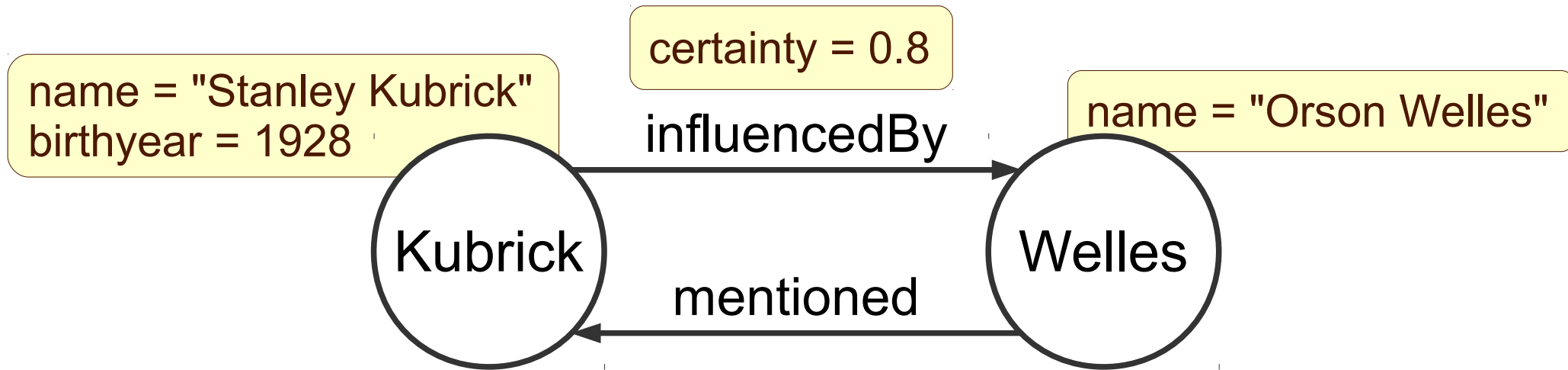


# PGs to RDF\* Preliminaries



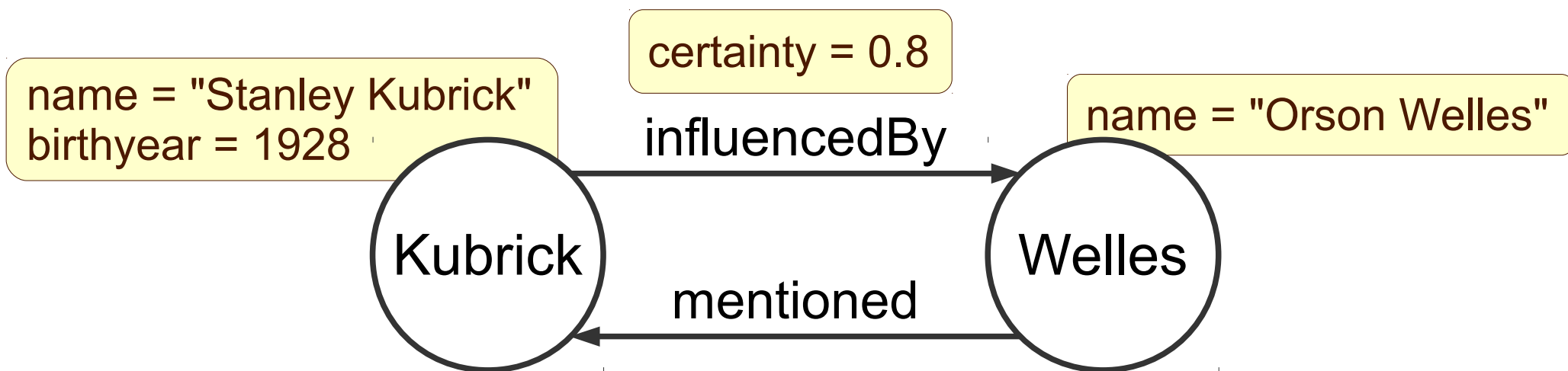
- Assume a *vertex identity mapping*, e.g.,  $(\text{Kubrick}) \rightarrow \_:\text{b1}$
- Assume an *edge label mapping*,  
e.g., mentioned  $\rightarrow$  <http://example.org/relationship/mentioned>
- Assume a *property key mapping*,  
e.g., name  $\rightarrow$  <http://example.org/property/name>
- Assume a *value to literal mapping*

# PGs to RDF\* Idea



- Transform each edge (+ its label) to an ordinary triple
- Transform each node property into an ordinary triple
- Transform each edge property to a metadata triple

# PGs to RDF\* Example



prefix p: <http://example.org/property/>

prefix r: <http://example.org/relationship/>

( \_:b1 , p:name , "Stanley Kubrick" )

( \_:b1 , p:birthyear , 1928 )

( \_:b2 , p:name , "Orson Welles" )

( \_:b2 , r:mentioned , \_:b1 )

( ( \_:b1 , r:influencedBy , \_:b2 ) , p:certainty , 0.8 )

# Querying the Resulting RDF\*

```
SELECT ?n WHERE {  
  ?p p:name ?n .  
  <<?p r:influencedBy ?w>> p:certainty ?c .  
  ?w p:name "Orson Welles" .  
}  
ORDER BY ?c
```

```
( _:b1 , p:name , "Stanley Kubrick" )  
( _:b1 , p:birthyear , 1928 )  
( _:b2 , p:name , "Orson Welles" )  
( _:b2 , r:mentioned , _:b1 )  
( ( _:b1, r:influencedBy, _:b2 ) , p:certainty , 0.8 )
```

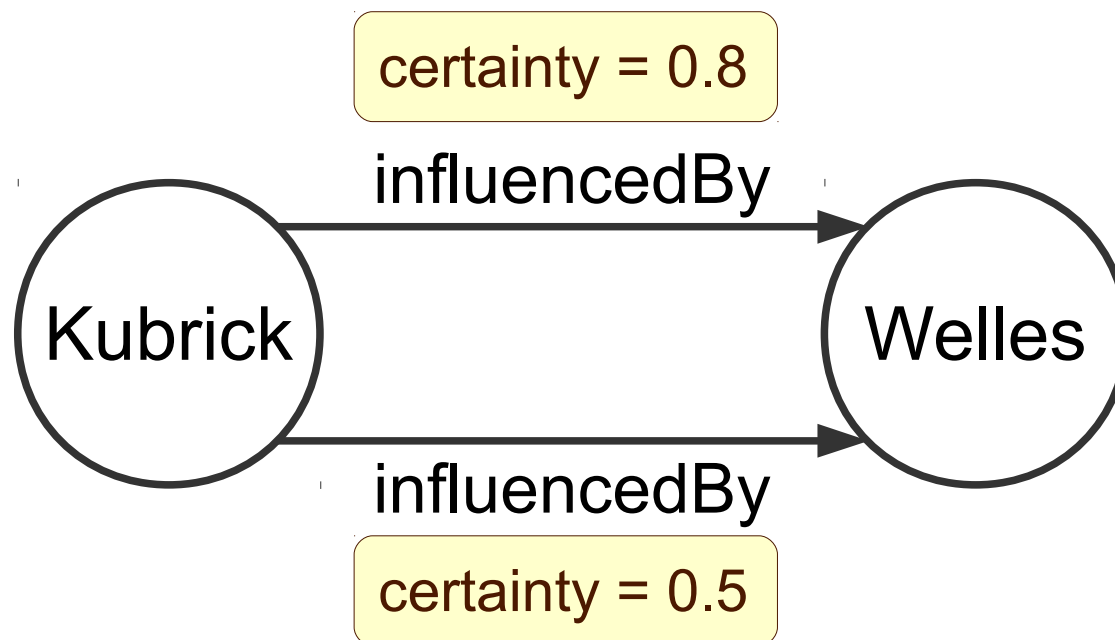
# “Equivalent” Cypher Query

```
SELECT ?n WHERE {  
  ?p p:name ?n .  
  <<?p r:influencedBy ?w>> p:certainty ?c .  
  ?w p:name "Orson Welles" .  
}  
ORDER BY ?c
```

```
START p=node(*)  
MATCH (p)-[x:influencedBy]->( w { name="Orson Welles" } )  
RETURN p.name  
ORDER BY x.certainty
```

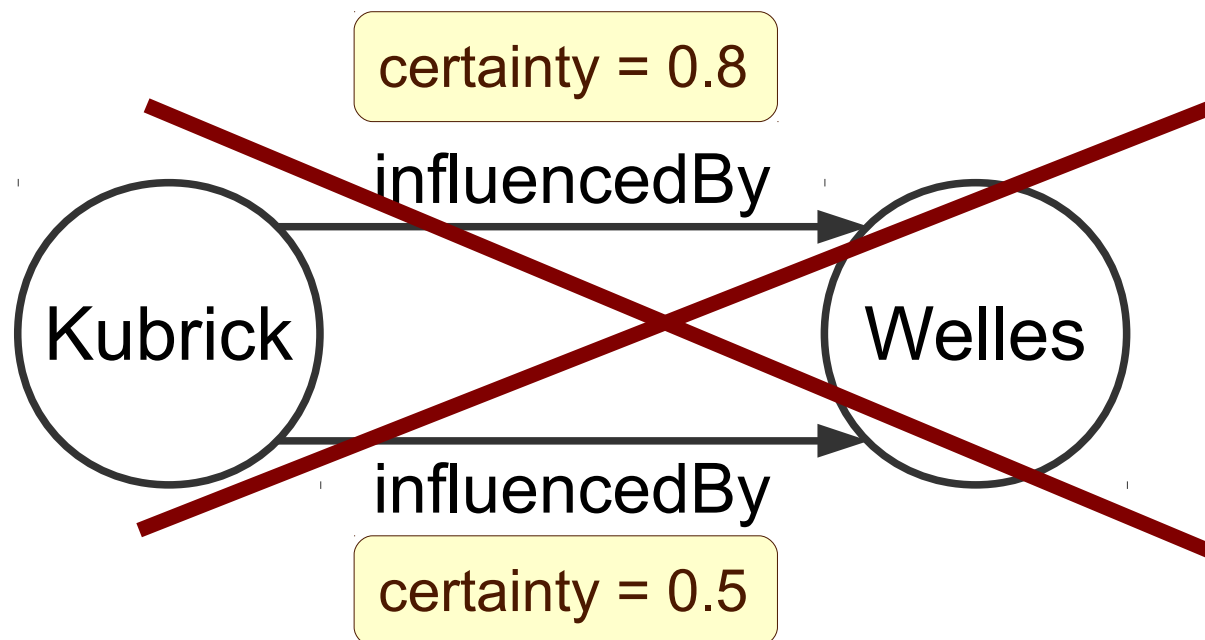
# Limitation

- Distinct edges with the same source node, the same target node, and the same label would be mapped to a single RDF triple
  - RDF graphs / RDF\* graphs are sets



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  - RDF graphs / RDF\* graphs are sets



# Outline

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2. Property Graphs to RDF\* ✓
3. RDF\* to Property Graphs



# RDF\* to PGs Idea

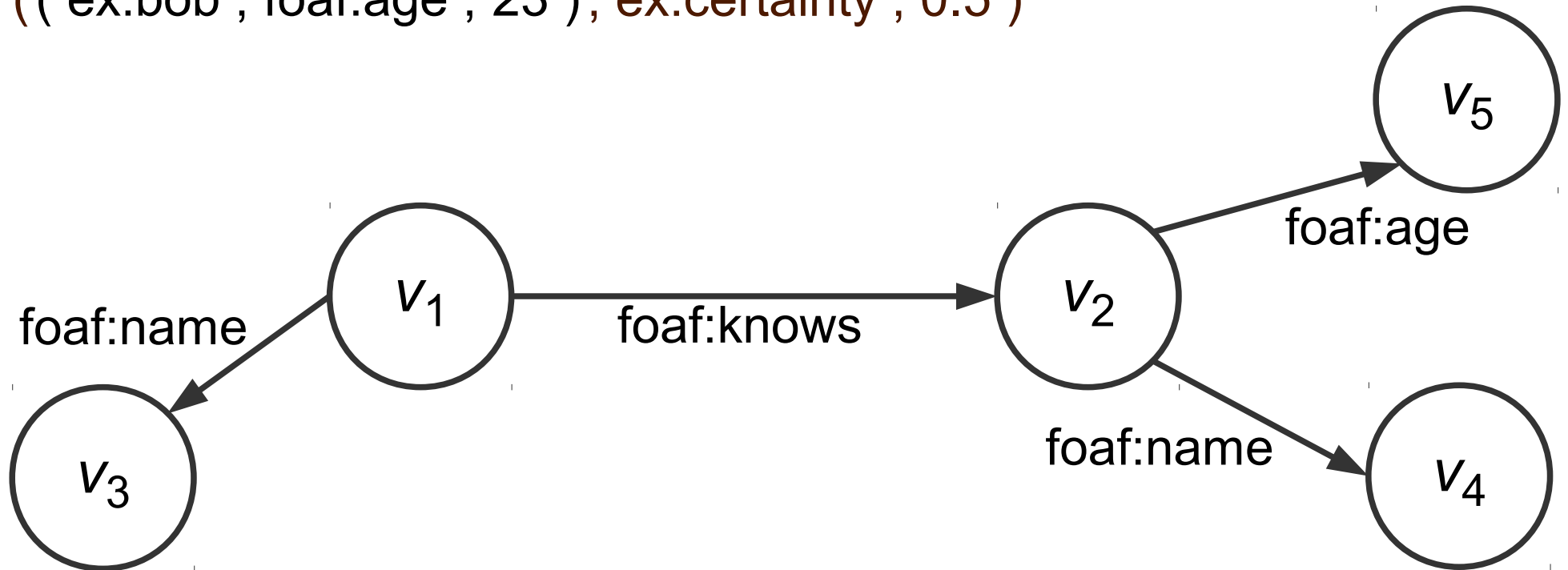
- Transform each ordinary triple to an edge
- Transform each metadata triple to an edge property

# RDF\* to PGs Example

(( ex:alice , foaf:knows , ex:bob ) , ex:certainty , 0.8 )  
( ex:alice , foaf:name , "Alice" )  
( ex:bob , foaf:name , "Bob" )  
(( ex:bob , foaf:age , 23 ) , ex:certainty , 0.5 )

# RDF\* to PGs Example

(( ex:alice , foaf:knows , ex:bob ) , ex:certainty , 0.8 )  
( ex:alice , foaf:name , "Alice" )  
( ex:bob , foaf:name , "Bob" )  
(( ex:bob , foaf:age , 23 ) , ex:certainty , 0.5 )



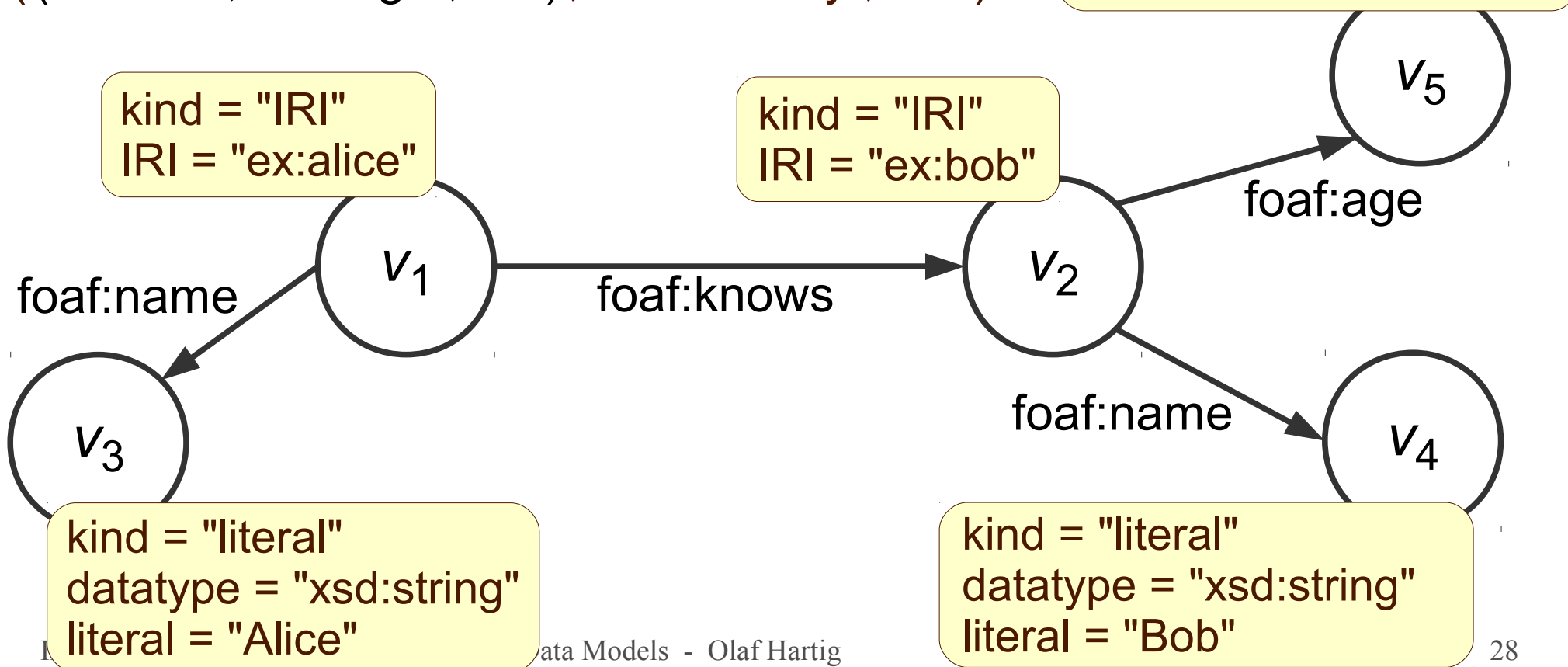
# RDF\* to PGs Example

(( ex:alice , foaf:knows , ex:bob ) , ex:certainty , 0.8 )

( ex:alice , foaf:name , "Alice" )

( ex:bob , foaf:name , "Bob" )

(( ex:bob , foaf:age , 23 ) , ex:certainty , 0.5 )



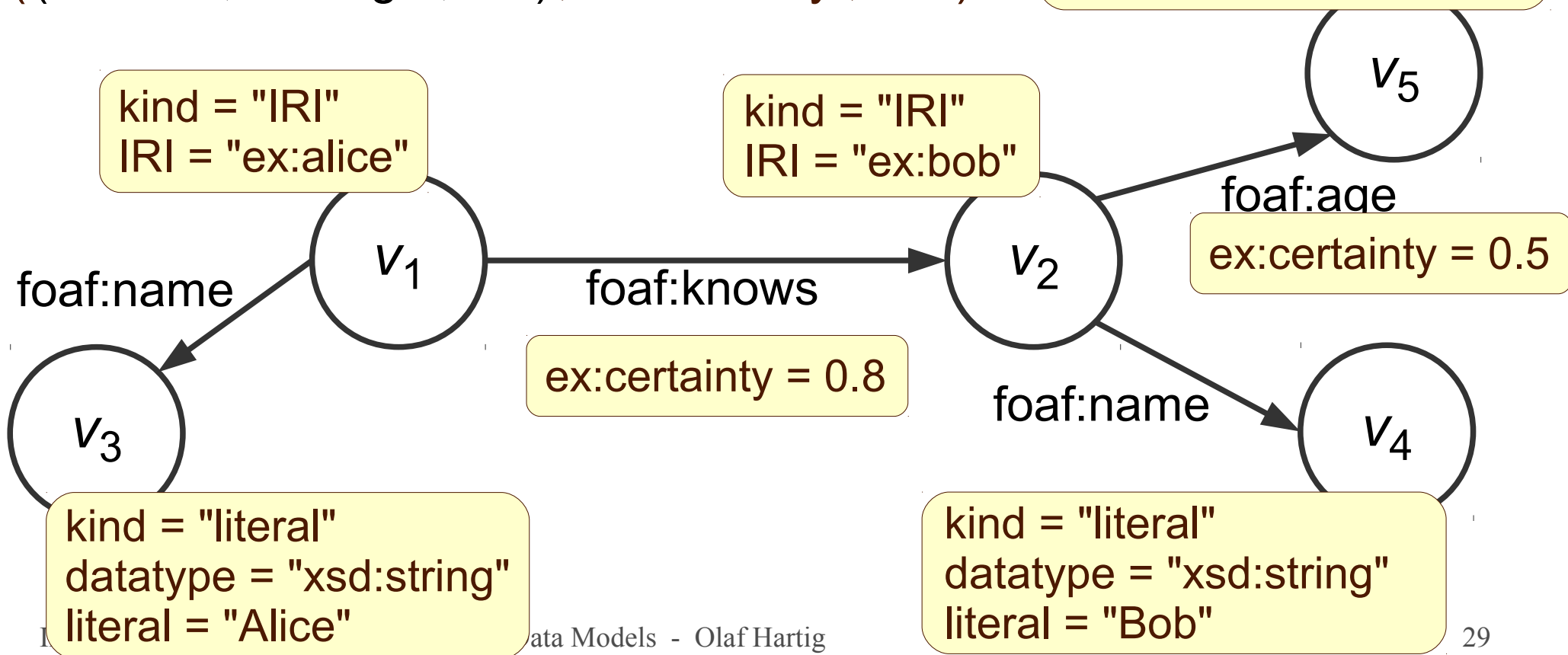
# RDF\* to PGs Example

(( ex:alice , foaf:knows , ex:bob ) , ex:certainty , 0.8 )

( ex:alice , foaf:name , "Alice" )

( ex:bob , foaf:name , "Bob" )

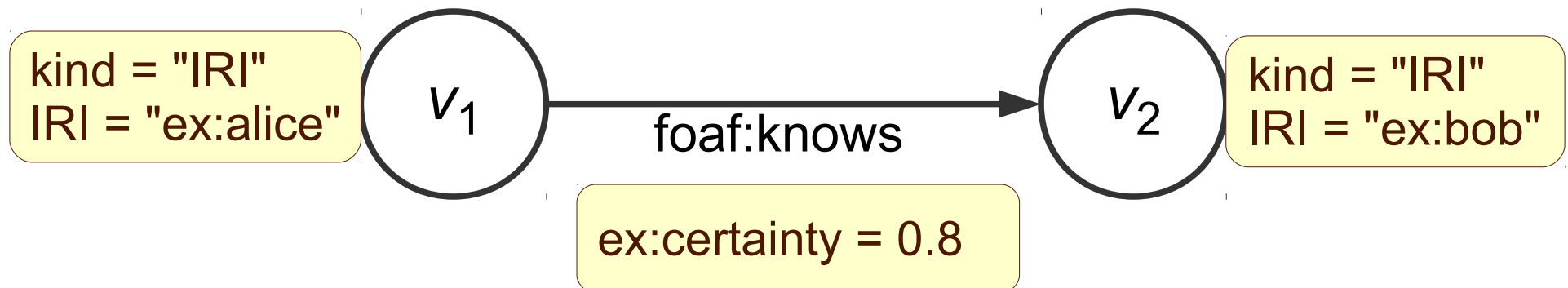
(( ex:bob , foaf:age , 23 ) , ex:certainty , 0.5 )



# PG-Convertible RDF\* Graphs

Condition 1: Metadata triples are not nested

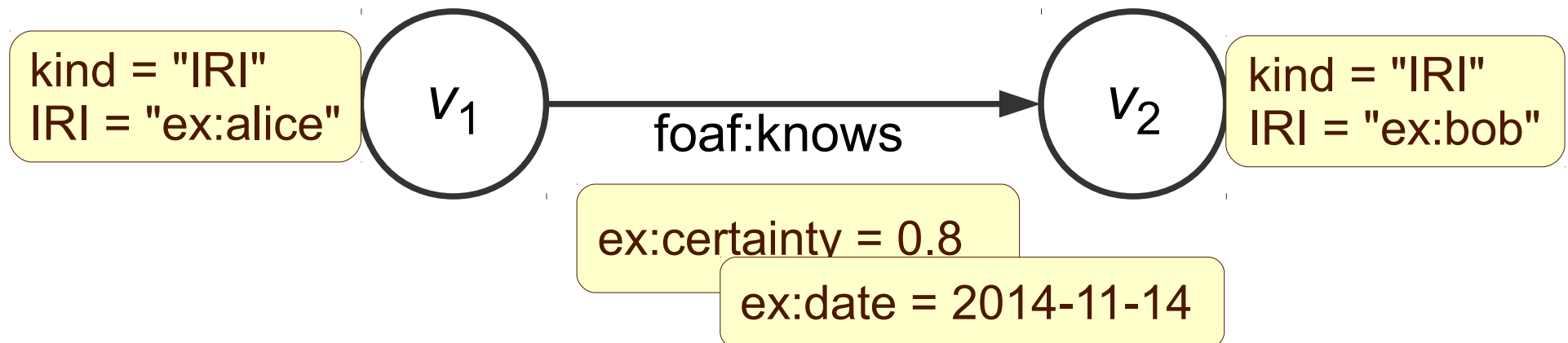
( (ex:alice,foaf:knows,ex:bob) , ex:certainty, 0.8 )



# PG-Convertible RDF\* Graphs

Condition 1: Metadata triples are not nested

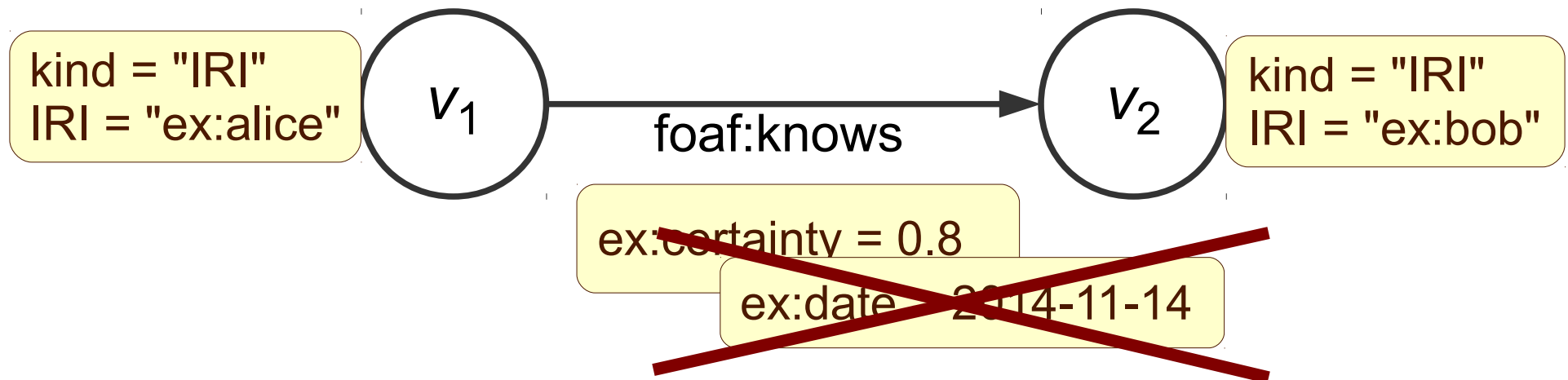
( ( (ex:alice,foaf:knows,ex:bob) , ex:certainty, 0.8 ) ,  
ex:date, 2014-11-14 )



# PG-Convertible RDF\* Graphs

Condition 1: Metadata triples are not nested

~~( ( (ex:alice, foaf:knows, ex:bob) , ex:certainty, 0.8 ) ,  
ex:date, 2014-11-14 )~~



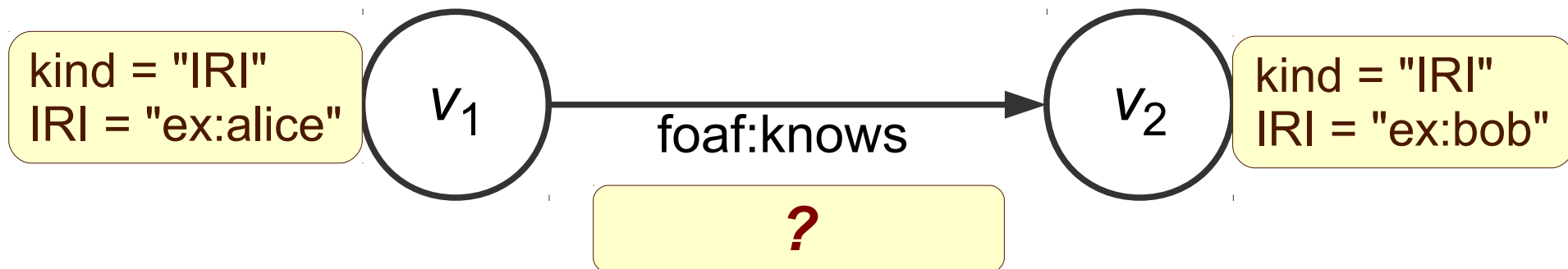


# PG-Convertible RDF\* Graphs

Condition 1: Metadata triples are not nested

Condition 2: Triples embedded as subject only

( ex:olaf , ex:believes , ( ex:alice,foaf:knows,ex:bob) )

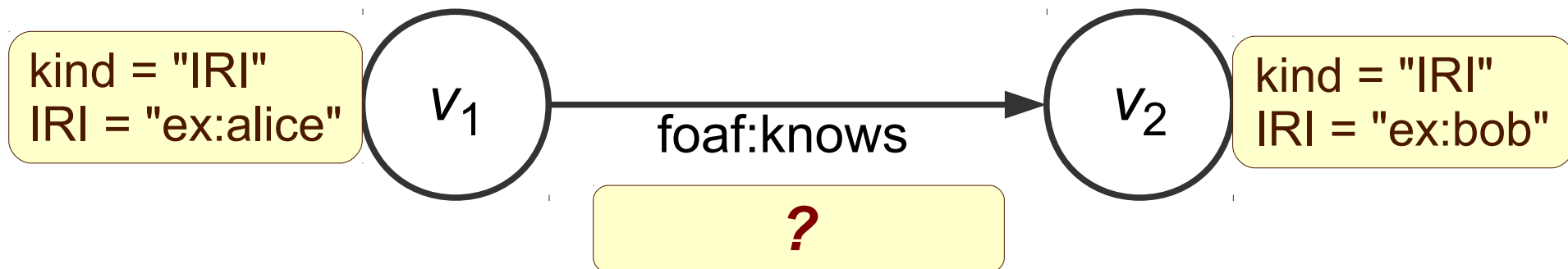


# PG-Convertible RDF\* Graphs

Condition 1: Metadata triples are not nested

Condition 2: Triples embedded as subject only

~~( ex:olaf , ex:believes ( ex:alice, foaf:knows, ex:bob ) )~~



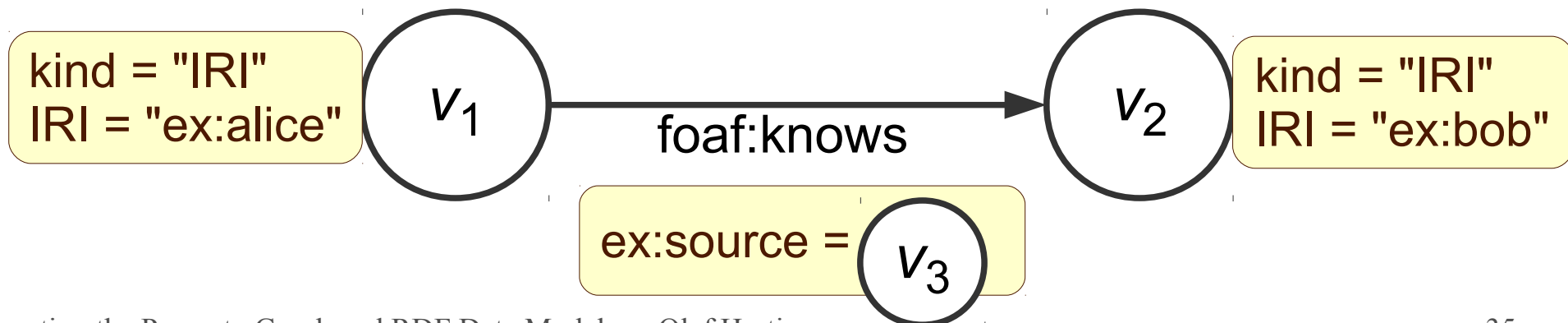
# PG-Convertible RDF\* Graphs

Condition 1: Metadata triples are not nested

Condition 2: Triples embedded as subject only

Condition 3: Object of any metadata triple must be a literal

( (ex:alice,foaf:knows,ex:bob) , ex:source , ex:olaf )



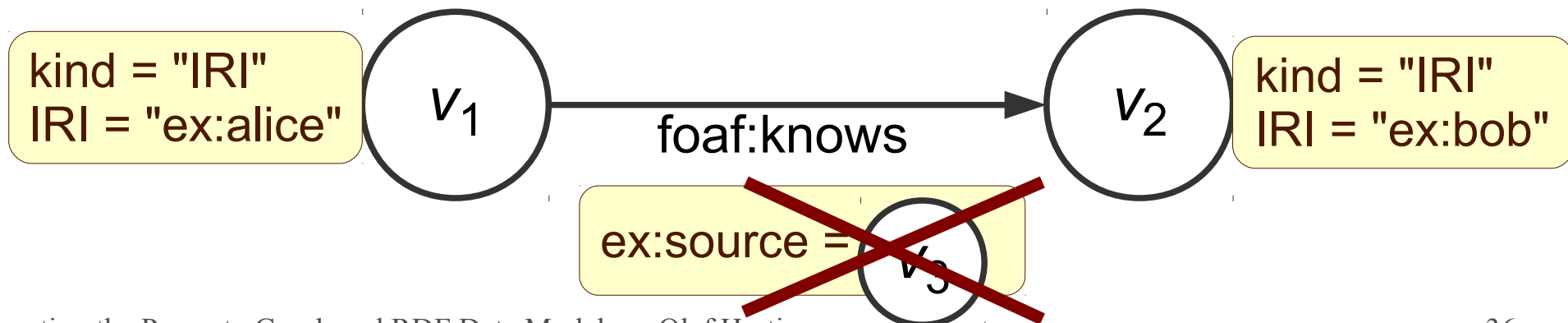
# PG-Convertible RDF\* Graphs

Condition 1: Metadata triples are not nested

Condition 2: Triples embedded as subject only

Condition 3: Object of any metadata triple must be a literal

~~( (ex:alice,foaf:knows,ex:bob) , ex:source , ex:olaf )~~



# PG-Convertible RDF\* Graphs

Condition 1: Metadata triples are not nested

Condition 2: Triples embedded as subject only

Condition 3: Object of any metadata triple must be a literal

Condition 4: Any literal must be convertible to a value of some (programming language specific) data type

# Properties of the Mapping

- **Lossless:** any Property Graph produced by the mapping contains all information present in the original RDF\* graph
  - Resulting Property Graphs are “RDF-like”
- For PG users, such Property Graphs may be “unnatural” and too complex
  - Nodes for literals
  - Queries become quite verbose

# Example Queries

```
SELECT ?pn WHERE {  
  ?a foaf:name "Alice" .  
  ?a foaf:knows ?p .  
  ?p foaf:name ?pn }
```

```
START a=node(*)  
MATCH (a)-[:foaf:name]->(bn { literal="Alice" } ) ,  
      (a)-[:foaf:knows]->(p)-[:foaf:name]->(pn)  
RETURN pn.literal
```

# Example Queries

```
SELECT ?pn WHERE {  
  ?a foaf:name "Alice" .  
  ?a foaf:knows ?p .  
  ?p foaf:name ?pn }
```

```
START a=node(*)  
MATCH (a)-[:foaf:name]->(bn { literal="Alice" } ) ,  
      (a)-[:foaf:knows]->(p)-[:foaf:name]->(pn)  
RETURN pn.literal
```

```
START a=node(*)  
MATCH (a {foaf:name="Alice"})-[:foaf:knows]->(p)  
RETURN p.foaf:name
```



# Outline

1. The Data Models ✓
2. Property Graphs to RDF\* ✓
3. RDF\* to
  - ... “RDF like” Property Graphs ✓
  - ... “Simple” Property Graphs

# RDF\* to “Simple” PGs

(( ex:alice , foaf:knows , ex:bob ) , ex:certainty , 0.8 )

( ex:alice , foaf:name , "Alice" )

( ex:bob , foaf:name , "Bob" )

( ex:bob , foaf:age , 23 )

1. Transform each *relationship triple* to an edge

– i.e., ordinary triples with an IRI or bnode object

# RDF\* to “Simple” PGs

(( ex:alice , foaf:knows , ex:bob ) , ex:certainty , 0.8 )  
( ex:alice , foaf:name , "Alice" )  
( ex:bob , foaf:name , "Bob" )  
( ex:bob , foaf:age , 23 )

1. Transform each *relationship triple* to an edge
  - i.e., ordinary triples with an IRI or bnode object



# RDF\* to “Simple” PGs

(( ex:alice , foaf:knows , ex:bob ) , ex:certainty , 0.8 )  
( ex:alice , foaf:name , "Alice" )  
( ex:bob , foaf:name , "Bob" )  
( ex:bob , foaf:age , 23 )

## 2. Transform *attribute triples* to node properties

– i.e., ordinary triples with a literal as object



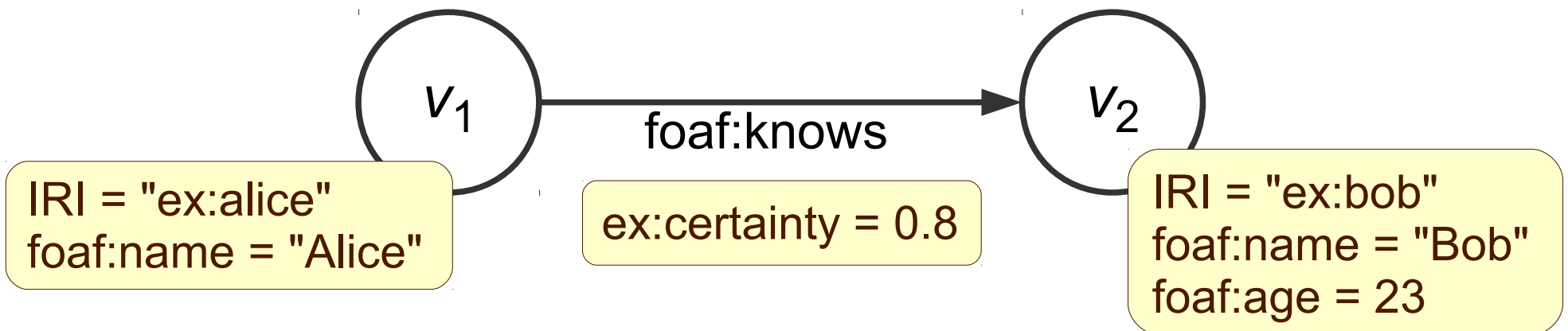
IRI = "ex:alice"  
foaf:name = "Alice"

IRI = "ex:bob"  
foaf:name = "Bob"  
foaf:age = 23

# RDF\* to “Simple” PGs

(( ex:alice , foaf:knows , ex:bob ) , ex:certainty , 0.8 )  
( ex:alice , foaf:name , "Alice" )  
( ex:bob , foaf:name , "Bob" )  
( ex:bob , foaf:age , 23 )

3. Transform each metadata triple about a relationship triple to an edge property

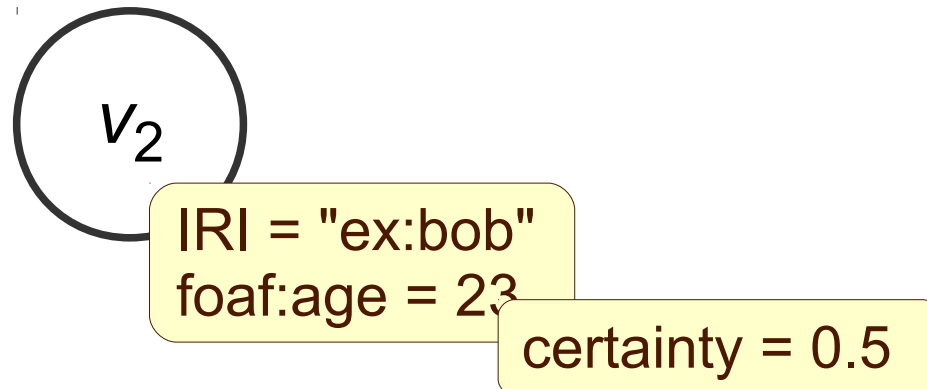


# Strong PG-Convertibility

Condition 1: PG-convertibility

Condition 2: No metadata triple about an attribute triple

( (ex:bob , foaf:age , 23) , ex:certainty , 0.5 )

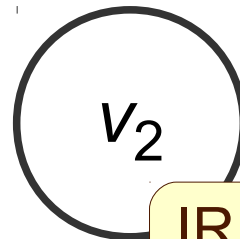


# Strong PG-Convertibility

Condition 1: PG-convertibility

Condition 2: No metadata triple about an attribute triple

~~( (ex:bob , foaf:age , 23) , ex:certainty , 0.5 )~~



IRI = "ex:bob"  
foaf:age = 23

~~certainty = 0.5~~

# Summary

- RDF\* – an compact form of RDF reification
  - Turtle\*, SPARQL\*

- Mappings:
  - PG-convertible RDF\*  
to “RDF-like” PGs  
(lossless)
  - by  
“unfolding”  
metadata triples



- Documents: [arxiv/1409.3288](https://arxiv.org/abs/1409.3288) ([arxiv/1406.3399](https://arxiv.org/abs/1406.3399))



Thanks!

Questions?

# Backup Slides

# Named Graphs

prefix foaf: http://xmlns.com/foaf/0.1/

prefix ex: http://example.name/

```
ex:mygraph { ( ex:alice , foaf:knows , ex:bob ) }  
             ( ex:alice , foaf:name , "Alice" )  
             ( ex:bob , foaf:name , "Bob" )  
             ( ex:bob , foaf:age , 23 )  
  
             ( ex:mygraph , ex:certainty , 0.8 )
```

# Querying Named Graphs

```
SELECT ?c
WHERE {
  GRAPH ?g { ex:alice foaf:knows ex:bob }
  ?g ex:certainty ?c
}
```

# Querying Named Graphs

```
SELECT ?c
WHERE {
  GRAPH ?g {
    ex:alice foaf:knows ex:bob
    { SELECT ( COUNT(*) AS ?cnt )
      WHERE { ?s ?p ?o } }
  }
  FILTER ( ?cnt = 1 )
}
           ?g ex:certainty ?c
```

# SPARQL\*

```
SELECT ?c
WHERE {
    <<ex:alice foaf:knows ex:bob>> ex:certainty ?c
}
```

```
SELECT ?c
WHERE {
    BIND ( <<ex:alice foaf:knows ex:bob>> AS ?s )
    ?s ex:certainty ?c
}
```

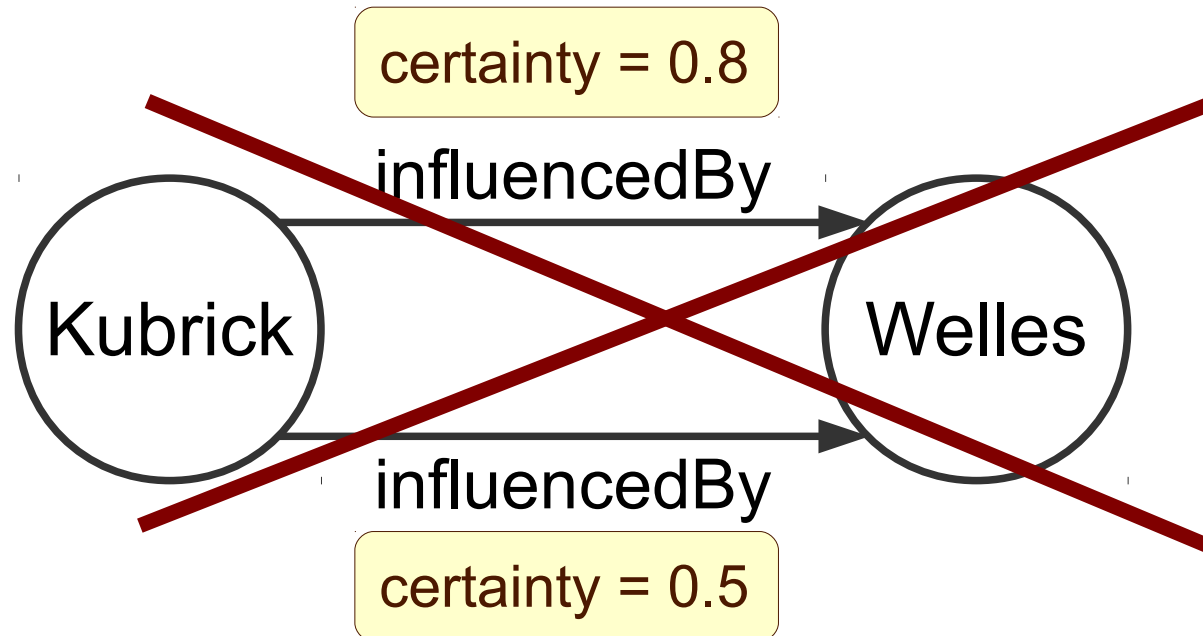
# Definition: Property Graph

A *Property Graph* is a tuple  $G=(V,E,src,tgt,lbl,\Phi)$  s.t.

- $(V,E,src,tgt,lbl)$  is a labeled multigraph, i.e.,
  - $V$  and  $E$  are vertices and edges, respectively,
  - $src: E \rightarrow V$ ,  $tgt: E \rightarrow V$ , and  $lbl: E \rightarrow S$ ; and
- $\Phi$  is a function that maps every vertex and edge to a finite set of pairs  $p = (k,v)$  such that  $k$  is a string and  $v$  is a value from the domain of some (programming language specific) datatype.

# Definition: Edge Uniqueness

A Property Graph  $G = (V, E, src, tgt, lbl, \Phi)$  is *edge-unique* if it does not contain a pair of distinct edges  $e$  and  $e'$  such that  $src(e) = src(e')$ ,  $tgt(e) = tgt(e')$ , and  $lbl(e) = lbl(e')$ .





# Definition: Property Uniqueness

Property Graph  $G = (V, E, src, tgt, lbl, \Phi)$  is *property-unique* if, for each vertex or edge  $x$ ,  $k \neq k'$  for all pairs of distinct properties  $(k, v)$  and  $(k', v')$  in  $\Phi(x)$ .

- Implementations usually assume (resp. enforce) property uniqueness
- For some RDF\* graphs, the transformations result in a Property Graph that is *not* property-unique.