

# Expressivity and Complexity of MongoDB queries

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# MongoDB

a document database system



- Very popular
- Stores JSON-like documents
- Offers powerful **ad hoc** query languages

## Example: JSON document

From a collection (of documents) about distinguished computer scientists

```
{ "_id": 4,  
  "awards": [ {"award": "Rosing Prize", "year": 1999},  
             {"award": "Turing Award", "by": "ACM", "year": 2001},  
             {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],  
  "birth": "1926-08-27",  
  "contribs": ["OOP", "Simula"],  
  "death": "2002-08-10",  
  "name": {"first": "Kristen", "last": "Nygaard"}  
}
```

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```
{ "_id": 4,  
  "awards": [ {"award": "Rosing Prize", "year": 1999},  
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  "birth": "1926-08-27",  
  "contribs": ["OOP", "Simula"],  
  "death": "2002-08-10",  
  "name": {"first": "Kristen", "last": "Nygaard"}  
}
```

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```
{ "_id": 4,  
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              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],  
  "birth": "1926-08-27",  
  "contribs": ["OOP", "Simula"],  
  "death": "2002-08-10",  
  "name": {"first": "Kristen", "last": "Nygaard"}  
}
```

Values

## Example: JSON document

From a collection (of documents) about distinguished computer scientists

```
{ "_id": 4,  
  "awards": [ {"award": "Rosing Prize", "year": 1999},  
              {"award": "Turing Award", "by": "ACM", "year": 2001},  
              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],  
  "birth": "1926-08-27",      Literals  
  "contribs": ["OOP", "Simula"],  
  "death": "2002-08-10",  
  "name": {"first": "Kristen", "last": "Nygaard"}  
}
```

## Example: JSON document

From a collection (of documents) about distinguished computer scientists

```
{ "_id": 4,  
  "awards": [ {"award": "Rosing Prize", "year": 1999},  
              {"award": "Turing Award", "by": "ACM", "year": 2001},  
              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],  
  "birth": "1926-08-27",  
  "contribs": ["OOP", "Simula"],  
  "death": "2002-08-10",  
  "name": {"first": "Kristen", "last": "Nygaard"}  
}
```

Nested Objects

## Example: JSON document

From a collection (of documents) about distinguished computer scientists

```
{ "_id": 4,  
  "awards": [ {"award": "Rosing Prize", "year": 1999},  
              {"award": "Turing Award", "by": "ACM", "year": 2001},  
              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],  
  "birth": "1926-08-27",  
  "contribs": ["OOP", "Simula"],  
  "death": "2002-08-10",  
  "name": {"first": "Kristen", "last": "Nygaard"}  
}
```

Arrays

## Example: Find query

```
db.bios.find(  
  {$and: [  
    {"awards.year": {$eq: 1999}},  
    {"name.first": {$eq: "Kristen"}}  
  ]},  
  {"name": true, "birth": true}  
)
```

## Example: Find query

```
db.bios.find(  
  {$and: [  
    {"awards.year": {$eq: 1999}},  
    {"name.first": {$eq: "Kristen"}}  
  ]},  
  {"name": true, "birth": true}  
)
```

When evaluated over the document about Kristen Nygaard:

```
{  
  "_id": 4,  
  "birth": "1926-08-27",  
  "name": { "first": "Kristen", "last": "Nygaard" }  
}
```

## Example: Aggregation Framework query

Retrieves scientists who received two awards in the same year.

```
db.bios.aggregate([
    {$project: { "name": true,
                "award1": "$awards", "award2": "$awards" } },
    {$unwind: "$award1"}, 
    {$unwind: "$award2"}, 
    {$project: { "name": true, "award1": true, "award2": true,
                "twoInOneYear": { $and: [
                    {$eq: ["$award1.year", "$award2.year"]},
                    {$ne: ["$award1.award", "$award2.award"]}
                ]} }},
    {$match: { "twoInOneYear": true } },
])
])
```

## Example: Aggregation Framework query

Retrieves scientists who received two awards in the same year.

```
db.bios.aggregate([
  {$project: { "name": true,
    "award1": "$awards", "award2": "$awards" } },
  {$unwind: "$award1"}, 
  {$unwind: "$award2"}, 
  {$project: { "name": true, "award1": true, "award2": true,
    "twoInOneYear": { $and: [
      { $eq: ["$award1.year", "$award2.year"]},
      { $ne: ["$award1.award", "$award2.award"] }
    ]} }},
  {$match: { "twoInOneYear": true } },
])
])
```

When evaluated over the document about Kristen Nygaard:

```
{ "_id": 4,
  "name": {"first": "Kristen", "last": "Nygaard"},
  "award1": {"award": "Turing Award", "by": "ACM", "year": 2001},
  "award2": {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"},
  "twoInOneYear": true }
```

## Example: Aggregation Framework query

Retrieves scientists who received two awards in the same year.

```
db.bios.aggregate([
  {$project: { "name": true,
    "award1": "$awards", "award2": "$awards" } },
  {$unwind: "$award1"}, 
  {$unwind: "$award2"}, 
  {$project: { "name": true, "award1": true, "award2": true,
    "twoInOneYear": { $and: [
      {$eq: ["$award1.year", "$award2.year"]},
      {$ne: ["$award1.award", "$award2.award"]}
    ]} }},
  {$match: { "twoInOneYear": true } },
])
])
```

When evaluated over the document about Kristen Nygaard:

```
{ "_id": 4,
  "name": {"first": "Kristen", "last": "Nygaard"},
  "award1": {"award": "Turing Award", "by": "ACM", "year": 2001},
  "award2": {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"},
  "twoInOneYear": true }
```

This query performs a **join within a document**.

## Example: Another Aggregation Framework query

Retrieves pairs of scientists who received the same award the same year.

```
db.bios.aggregate([
    {$unwind: "$awards"},
    {$project: { "awards": 1,
                "doc._id": "$_id",
                "doc.name": "$name" }},
    {$group: { _id: { "awardYear": "$awards.year",
                      "awardName": "$awards.award" },
               "docs": { $addToSet: "$doc" } }},
    {$project: { "doc1": "$docs",
                "doc2": "$docs" }},
    {$unwind: "$doc1"},
    {$unwind: "$doc2"},
    {$project: { "name1": "$doc1.name",
                "name2": "$doc2.name",
                "awardName": "$_id.awardName",
                "awardYear": "$_id.awardYear",
                "toJoin": { $ne: ["$doc1._id", "$doc2._id"] } }},
    {$match: {"toJoin": true}}
])
```

## Example: Another Aggregation Framework query

Retrieves pairs of scientists who received the same award the same year.

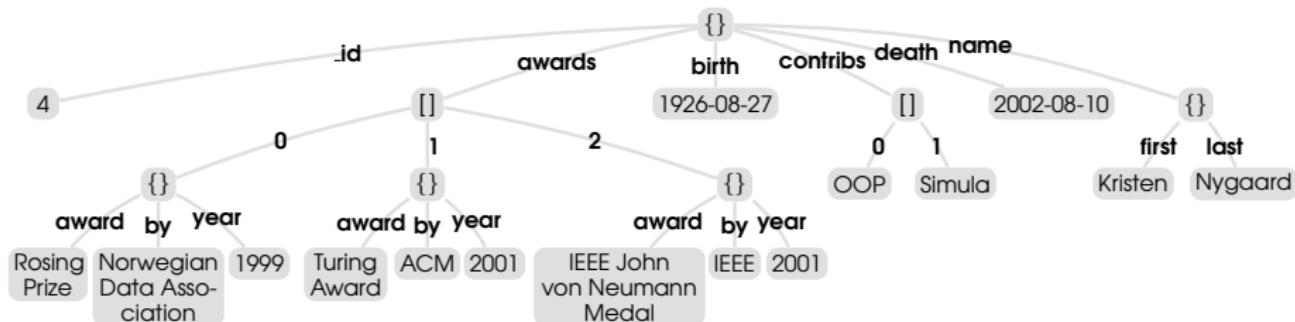
```
db.bios.aggregate([
    {$unwind: "$awards"},
    {$project: { "awards": 1,
                "doc._id": "$_id",
                "doc.name": "$name" }},
    {$group: { _id: { "awardYear": "$awards.year",
                      "awardName": "$awards.award" },
               "docs": { $addToSet: "$doc" } }},
    {$project: { "doc1": "$docs",
                "doc2": "$docs" }},
    {$unwind: "$doc1"},
    {$unwind: "$doc2"},
    {$project: { "name1": "$doc1.name",
                "name2": "$doc2.name",
                "awardName": "$_id.awardName",
                "awardYear": "$_id.awardYear",
                "toJoin": { $ne: ["$doc1._id", "$doc2._id"] } }},
    {$match: { "toJoin": true}}
])
```

This query performs a **join across documents**.

# Our Contributions

- ① formalised the JSON data model
- ② formalised a fragment of the **aggregation framework** query language ⇒ MQuery
- ③ analysed the **expressivity** and **complexity** of MQuery

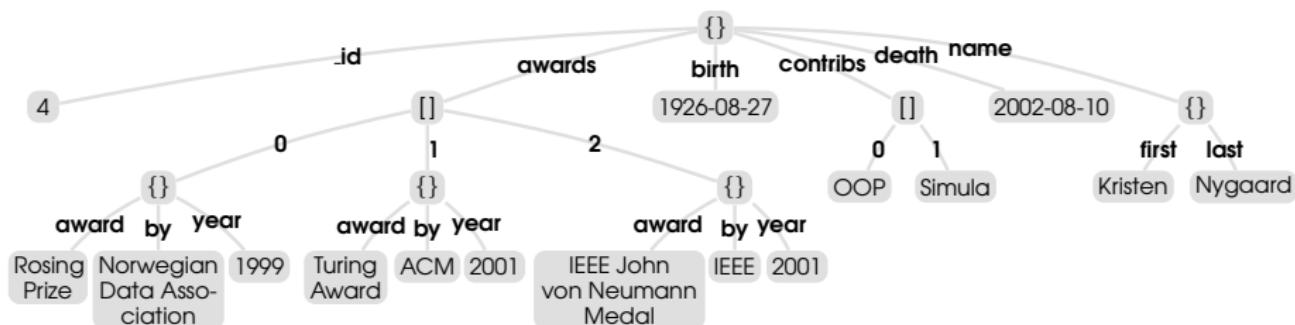
# Formalisation of the data model



Document: finite unordered, unranked, node- and edge-labeled tree

Collection: a forest of unique trees (primary key)

# Formalisation of the data model



Document: finite unordered, unranked, node- and edge-labeled tree

Collection: a forest of unique trees (primary key)

## Simplifying assumptions (set semantics)

- No order between
  - ▶ documents in the collection
  - ▶ key-value pairs
  - ▶ values in an array
- Multiplicity of values in an array is ignored

## MongoDB aggregation framework: MQuery



- A query is a multi-stage **pipeline** applied to collection
- A stage is a forest transformation operator

**match** selects trees according to a Boolean criterion

**unwind** flattens arrays at a given path

**project** modifies trees by renaming, introducing, or removing paths

**group** combines different trees, may create arrays

**lookup** joins input trees with trees in an external collection

## MongoDB aggregation framework: MQuery



- A query is a multi-stage **pipeline** applied to collection
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**match** selects trees according to a Boolean criterion

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**project** modifies trees by renaming, introducing, or removing paths

**group** combines different trees, may create arrays

**lookup** joins input trees with trees in an external collection

We formalised a fragment of this language as MQuery, or  $M^{\text{MUPGL}}$ .

# Match operator: $\mu_\varphi$

Selects trees according the criterion  $\varphi$

## Query 1

```
db.bios.aggregate([
  {$match: {"name.first": {$eq: "Kristen"}}}
])
```

**bios**  $\triangleright \mu_{\text{name.first}=\text{"Kristen"}}$

## input = output

```
{ "_id": 4,
  "awards": [ {"award": "Rosing Prize", "year": 1999},
              {"award": "Turing Award", "by": "ACM", "year": 2001},
              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],
  "birth": "1926-08-27",
  "contribs": ["OOP", "Simula"],
  "death": "2002-08-10",
  "name": {"first": "Kristen", "last": "Nygaard"}
}
```

Match operator:  $\mu_\varphi$   
Selects trees according the criterion  $\varphi$

## Query 2

```
db.bios.aggregate([
    {$match: {"awards.year": {$eq: 1999}}}
])
```

**bios**  $\triangleright \mu_{\text{awards.year}=1999}$

## input = output

```
{ "_id": 4,
  "awards": [ {"award": "Rosing Prize", "year": 1999},
              {"award": "Turing Award", "by": "ACM", "year": 2001},
              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],
  "birth": "1926-08-27",
  "contribs": ["OOP", "Simula"],
  "death": "2002-08-10",
  "name": {"first": "Kristen", "last": "Nygaard"}
}
```

# Match operator: $\mu_\varphi$

Selects trees according the criterion  $\varphi$

## Query 3

```
db.bios.aggregate([
    {$match: {"awards": {$eq: {"award": "Rosing Prize", "year": 1999}}}}
])
```

**bios**  $\triangleright \mu_{\text{awards}=\{\text{"award": "Rosing Prize", "year": 1999}\}}$

## input = output

```
{ "_id": 4,
  "awards": [ {"award": "Rosing Prize", "year": 1999},
              {"award": "Turing Award", "by": "ACM", "year": 2001},
              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],
  "birth": "1926-08-27",
  "contribs": ["OOP", "Simula"],
  "death": "2002-08-10",
  "name": {"first": "Kristen", "last": "Nygaard"}
}
```

# Match operator: $\mu_\varphi$

Selects trees according the criterion  $\varphi$

## Query 4

```
db.bios.aggregate([
    {$match: {"awards": {$eq: {"year": 1999, "award": "Rosing Prize"}}}}
])
```

**bios**  $\triangleright \mu_{\text{awards}=\{\text{"year": 1999, "award": "Rosing Prize"\}}$

Filtered out by the implementation but kept with our semantics

```
{ "_id": 4,
  "awards": [ {"award": "Rosing Prize", "year": 1999},
              {"award": "Turing Award", "by": "ACM", "year": 2001},
              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],
  "birth": "1926-08-27",
  "contribs": ["OOP", "Simula"],
  "death": "2002-08-10",
  "name": {"first": "Kristen", "last": "Nygaard"}
}
```

## Unwind operator: $\omega_p$

Flattens arrays at a given path  $p$

### Query 1

```
db.bios.aggregate([
  {$unwind: "$awards"}
])
```

**bios**  $\triangleright \omega_{\text{awards}}$

### Input

```
{ "_id": 4,
  "awards": [ {"award": "Rosing Prize", "year": 1999},
              {"award": "Turing Award", "by": "ACM", "year": 2001},
              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],
  "birth": "1926-08-27",
  "contribs": ["OOP", "Simula"],
  "death": "2002-08-10",
  "name": {"first": "Kristen", "last": "Nygaard"}
}
```

## Unwind operator: $\omega_p$

Flattens arrays at a given path  $p$

### Query 1

```
db.bios.aggregate([
  {$unwind: "$awards"}
])
```

**bios**  $\triangleright \omega_{\text{awards}}$

### Output

```
{
  "_id": 4,
  "awards": {"award": "Rosing Prize", "year": 1999},
  "birth": "1926-08-27",
  "contribs": ["OOP", "Simula"],
  "death": "2002-08-10",
  "name": {"first": "Kristen", "last": "Nygaard"}
}
{
  "_id": 4,
  "awards": {"award": "Turing Award", "by": "ACM", "year": 2001},
  "birth": "1926-08-27",
  "contribs": ["OOP", "Simula"],
  "death": "2002-08-10",
  "name": {"first": "Kristen", "last": "Nygaard"}
}
...
...
```

## Unwind operator: $\omega_p$

Flattens arrays at a given path  $p$

### Query 2

```
db.bios.aggregate([
  {$unwind: "$publications"}
])
```

**bios**  $\triangleright \omega_{\text{publications}}$

### Input

```
{ "_id": 4,
  "awards": [ {"award": "Rosing Prize", "year": 1999},
              {"award": "Turing Award", "by": "ACM", "year": 2001},
              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],
  "birth": "1926-08-27",
  "contribs": ["OOP", "Simula"],
  "death": "2002-08-10",
  "name": {"first": "Kristen", "last": "Nygaard"}
}
```

### Output

Empty

# Project operator: $\rho_{p/d, \dots}$

Projects path  $p$  according to its definition  $d$

## Query 1

```
db.bios.aggregate([
  {$project: { "awards": true,
    "awardNames": "$awards.award",
    "firstName": "$name.first" }},
])
```

**bios**  $\triangleright \rho_{\text{awards}, \text{awardNames}/\text{awards.award}, \text{firstName}/\text{name.first}}$

## Input

```
{ "_id": 4,
  "awards": [ {"award": "Rosing Prize", "year": 1999},
              {"award": "Turing Award", "by": "ACM", "year": 2001},
              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],
  "birth": "1926-08-27",
  "contribs": ["OOP", "Simula"],
  "death": "2002-08-10",
  "name": {"first": "Kristen", "last": "Nygaard"}
}
```

# Project operator: $\rho_{p/d, \dots}$

Projects path  $p$  according to its definition  $d$

## Query 1

```
db.bios.aggregate([
  {$project: { "awards": true,
    "awardNames": "$awards.award",
    "firstName": "$name.first" }},
])
```

**bios**  $\triangleright \rho_{\text{awards}, \text{awardNames}/\text{awards.award}, \text{firstName}/\text{name.first}}$

## Output

```
{ "_id": 4,
  "awards": [ {"award": "Rosing Prize", "year": 1999},
              {"award": "Turing Award", "by": "ACM", "year": 2001},
              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],
  "awardNames": [ "Rosing Prize", "Turing Award", "IEEE John von Neumann Medal" ],
  "firstName": "Kristen"
}
```

# Project operator: $\rho_{p/d, \dots}$

Projects path  $p$  according to its definition  $d$

## Query 2

```
db.bios.aggregate([
    {$project: { "calledJohn": { $eq: ["$name.first", "John"] },
                "sameFirstAndLastNames": { $eq: ["$name.first", "$name.last"] },
                "newArray": ["$name.first", "$name.last"],
                "condValue": { $cond: { if: { $eq: ["$_id", 4] },
                                         then: "$name.first",
                                         else: "$awards" } },
                "invisible": "$abc" }
  })
])
```

**bios**  $\triangleright \rho_{\text{calledJohn}/(\text{name.first}=\text{"John"}), \text{sameFirstAndLastNames}/(\text{name.first}=\text{name.last}), \text{newArray}/[\text{name.first}, \text{name.last}], \text{condValue}/(\text{_id}=4?\text{name.first}:\text{awards})}$

## Input

```
{ "_id": 4,
  "awards": [ {"award": "Rosing Prize", "year": 1999},
              {"award": "Turing Award", "by": "ACM", "year": 2001},
              {"award": "IEEE John von Neumann Medal", "year": 2001, "by": "IEEE"} ],
  "birth": "1926-08-27",
  "contribs": ["OOP", "Simula"],
  "death": "2002-08-10",
  "name": { "first": "Kristen", "last": "Nygaard" }
}
```

# Project operator: $\rho_{p/d, \dots}$

Projects path  $p$  according to its definition  $d$

## Query 2

```
db.bios.aggregate([
  {$project: { "calledJohn": { $eq: ["$name.first", "John"] },
    "sameFirstAndLastNames": { $eq: ["$name.first", "$name.last"] },
    "newArray": [ "$name.first", "$name.last" ],
    "condValue": { $cond: { if: { $eq: ["$_id", 4] },
      then: "$name.first",
      else: "$awards" } },
    "invisible": "$abc" }
  })
])
```

$\text{bios} \triangleright \rho_{\text{calledJohn}/(\text{name.first}=\text{"John"}), \text{sameFirstAndLastNames}/(\text{name.first}=\text{name.last}), \text{newArray}/[\text{name.first}, \text{name.last}], \text{condValue}/(\text{.id}=4?\text{name.first}:\text{awards})}$

## Output

```
{ "_id": 4,
  "calledJohn": false,
  "sameFirstAndLastNames": false,
  "newArray": [ "Kristen", "Nygaard" ],
  "condValue": "Kristen"
}
```

## Group operator: $\gamma_{G:A}$

Groups trees according to G and collects values according to A

### Query

```
db.bios.aggregate([
    {$unwind: "$awards"},
    {$group: { "_id": {"year": "$awards.year"}, "names": {$addToSet: "$name"} }},
])
```

$\text{bios} \triangleright \omega_{\text{awards}} \triangleright \gamma_{\text{year}/\text{awards.year}: \text{names}/\text{name}}$

### Input

```
{ "_id": 4,
  "awards": [ { "award": "Rosing Prize", "year": 1999 },
              { "award": "Turing Award", "year": 2001 },
              { "award": "IEEE John von Neumann Medal", "year": 2001 } ],
  "name": { "first": "Kristen", "last": "Nygaard" }
}

{ "_id": 6,
  "awards": [ { "award": "Award for the Advancement of Free Software", "year": 2001 },
              { "award": "NLUUG Award", "year": 2003 } ],
  "name": { "first": "Guido", "last": "van Rossum" }
}
```

## Group operator: $\gamma_{G:A}$

Groups trees according to G and collects values according to A

### Query

```
db.bios.aggregate([
    {$unwind: "$awards"},
    {$group: { "_id": {"year": "awards.year"},  
              "names": {$addToSet: "$name"} }},
])
```

$\text{bios} \triangleright \omega_{\text{awards}} \triangleright \gamma_{\text{year}/\text{awards.year}: \text{names}/\text{name}}$

### Output

```
{ "_id": { "year": 2003 },
  "names": [ { "first": "Guido", "last": "van Rossum" } ]
},
{ "_id": { "year": 2001 },
  "names": [ { "first": "Kristen", "last": "Nygaard" },
             { "first": "Guido", "last": "van Rossum" } ]
},
{ "_id": { "year": 1999 },
  "names": [ { "first": "Kristen", "last": "Nygaard" } ]
}
```

# Lookup operator: $\lambda_p^{p_1=C.p_2}$

Performs left outer join to the collection C and stores joined documents under p

## Query

```
db.bios.aggregate([
    {$unwind: "$awards"},
    {$group: {_id: {"year": "$awards.year"}, "names": {$addToSet: "$name"} }},
    {$lookup: { from: "Events", localField: "_id.year",
                foreignField: "year",
                as: "joinedDocs" }}
])
```

$\text{bios} \triangleright \omega_{\text{awards}} \triangleright \gamma_{\text{year}/\text{awards.year}: \text{names}/\text{name}} \triangleright \lambda_{\text{joinedDocs}}^{\text{id.year} = \text{Events.year}}$

## bios

```
{ "_id": 4,
  "awards": [ { "award": "Rosing Prize", "year": 1999 },
              { "award": "Turing Award", "year": 2001 },
              { "award": "IEEE John von Neumann Medal", "yea: } ],
  "name": { "first": "Kristen", "last": "Nygaard" }
}

{ "_id": 6,
  "awards": [ { "award": "Award for the Advancement of Free Software",
                "year": 2003 } ],
  "name": { "first": "Guido", "last": "van Rossum" }
}
```

## Events

```
{ "_id": 1,
  "year": 1997,
  "event": "Deep Blue defeats Garry Kasparov"

{ "_id": 2,
  "year": 1999,
  "event": "Melissa virus outbreak"

{ "_id": 3,
  "year": 1999,
  "event": "Jeff Bezos is person of the year"
}
```

# Lookup operator: $\lambda_p^{p_1=C.p_2}$

Performs left outer join to the collection C and stores joined documents under p

## Query

```
db.bios.aggregate([
    {$unwind: "$awards"},
    {$group: {_id: {"year": "$awards.year"}, "names": {$addToSet: "$name"} }},
    {$lookup: { from: "Events", localField: "_id.year",
               foreignField: "year",
               as: "joinedDocs" }}
])
```

$\text{bios} \triangleright \omega_{\text{awards}} \triangleright \gamma_{\text{year}/\text{awards.year}: \text{names}/\text{name}} \triangleright \lambda_{\text{joinedDocs}}^{\text{id.year} = \text{Events.year}}$

## Output

```
{ "_id": { "year": 2003 },
  "names": [ { "first": "Guido", "last": "van Rossum" } ],
  "joinedDocs": []
},
{ "_id": { "year": 2001 },
  "names": [ { "first": "Kristen", "last": "Nygaard" },
             { "first": "Guido", "last": "van Rossum" } ],
  "joinedDocs": []
},
{ "_id": { "year": 1999 },
  "names": [ { "first": "Kristen", "last": "Nygaard" } ],
  "joinedDocs": [ { "_id": 2, "year": 1999, "event": "Melissa virus outbreak" },
                 { "_id": 3, "year": 1999, "event": "Jeff Bezos is person of the year" } ]
}
```

# Expressivity of MQuery

Characterized in terms of Nested Relational Algebra (NRA)

- ① Nested relational view of JSON documents
- ② Translation from NRA to MQuery
- ③ Translation from MQuery to NRA

## Nested Relational View

_id	awards		birth	contribs lit	death	name.first	name.last
	award	year					
4	Rosing Prize	1999	1926-08-27	OOP Simula	2002-08-10	Kristen	Nygaard
	Turing Award	2001					
	IEEE John von Neumann Medal	2001					

Only possible for **well-typed** forests

- Each path is typed
- Analogous to complex object types and JSON schema

# Nested Relational Algebra (NRA)

Recap.

- Relational Algebra operators:

- ▶ Selection
- ▶ Extended projection
- ▶ Cross-product
- ▶ Union
- ▶ Minus

- **Unnest**: flattens a nested sub-relation

_id	awards		name.first
	award	year	
4	Rosing Prize	1999	Kristen
	Turing Award	2001	
	IEEE John von...	2001	

$\xrightarrow{\text{X}_{\text{awards}}}$

_id	award	year	name.first
4	Rosing Prize	1999	Kristen
4	Turing Award	2001	Kristen
4	IEEE John von...	2001	Kristen

- **Nest**: creates nested sub-relation

_id	award	year	name.first	awards	
				award	
4	Rosing Prize	1999	Kristen	Rosing Prize	
4	Turing Award	2001	Kristen	Turing Award	
4	IEEE John von...	2001	Kristen	IEEE John von...	

$\xrightarrow{\nu_{\{\text{award}\}} \rightarrow \text{awards}}$

_id	award	year	name.first
4	Rosing Prize	1999	Kristen
4	Turing Award	2001	Kristen
4	IEEE John von...	2001	Kristen

# Compact Translation from NRA to MQuery

## Expressivity

- MQuery ( $\mathcal{M}^{\text{MUPGL}}$ ) captures NRA
- $\mathcal{M}^{\text{MUPG}}$  captures NRA over a single collection

## Main technical challenge

“Linearize” a tree-shaped NRA expression into a MongoDB pipeline

# Compact Translation from NRA to MQuery

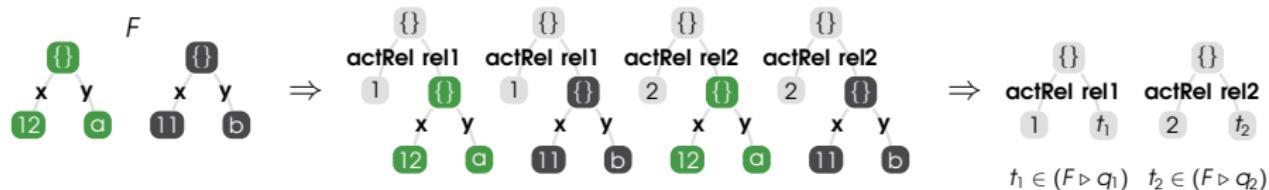
## Expressivity

- MQuery ( $\mathcal{M}^{\text{MUPGL}}$ ) captures NRA
- $\mathcal{M}^{\text{MUPG}}$  captures NRA over a single collection

## Main technical challenge

“Linearize” a tree-shaped NRA expression into a MongoDB pipeline

For two MQueries  $q_1$  and  $q_2$ , we construct a pipeline that does the following:



# Compact Translation from MQuery to NRA

## Expressivity

Well-typed MQuery is captured by NRA

- Stages that transform well-typed forests into well-typed forests
- match  $\Rightarrow$  selection
- unwind  $\Rightarrow$  unnest
- project  $\Rightarrow$  projection
- group  $\Rightarrow$  nest
- lookup  $\Rightarrow$  left outer join

## Challenges

MQuery stages can “look” inside arrays

# Complexity of MQuery

Data complexity: AC<sup>0</sup>

Fragment	Query complexity	Combined complexity
$\mathcal{M}^M$ $\mathcal{M}^{MP}, \mathcal{M}^{MPGL}$	LOGSPACE-complete PTIME-complete	
$\mathcal{M}^{MU}$	LOGSPACE-complete	NP-complete
$\mathcal{M}^{MUP}, \mathcal{M}^{MUL}, \mathcal{M}^{MUPL}$ $\mathcal{M}^{MUG}$	NP-complete PSPACE-hard	
$\mathcal{M}^{MUPG}, \mathcal{M}^{MUPGL}$ NRA	TA[ $2^{n^{O(1)}}, n^{O(1)}$ ]-complete* TA[ $2^{n^{O(1)}}, n^{O(1)}$ ]-complete	

\* The class of problems solvable by an alternating Turing machine running in exponential time with polynomially many alternations.

# Concluding remarks

## Technical report

<http://arxiv.org/abs/1603.09291>

## (Expected) Outcomes

- Enable the integration of MongoDB within the OBDA framework
- Could influence the evolution of MongoDB

## Future work

- Relaxed notion of well-typedness
- Bag and list semantics
- New operators (e.g. graph-lookup)

See you  
at the poster!