

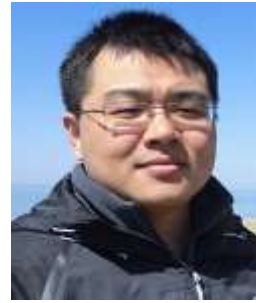
# Detecting Performance Anti-patterns for Applications Developed Using Object-Relational Mapping



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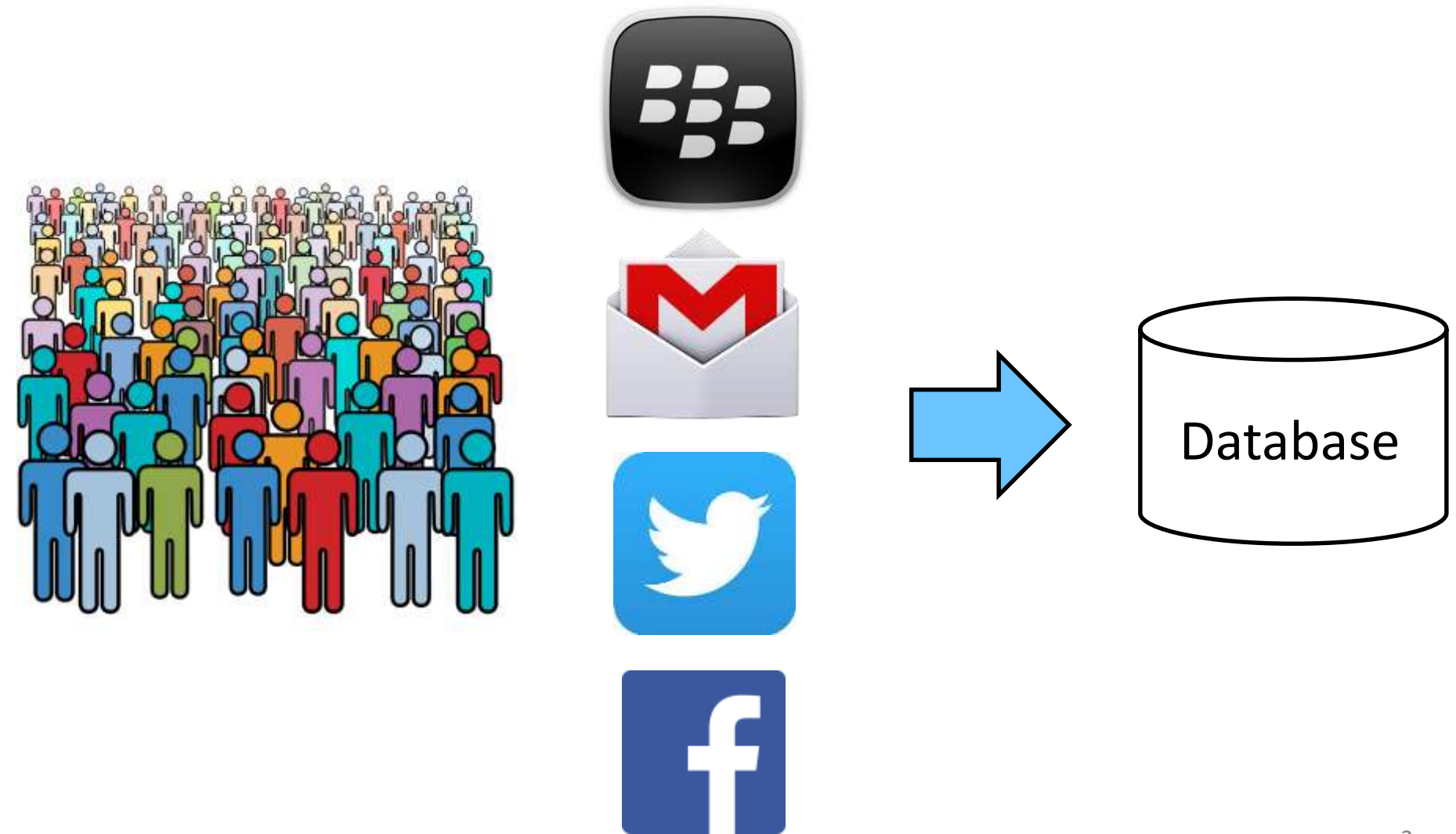
Ahmed E. Hassan



Mohamed Nasser, Parminder Flora



# Databases are essential in large-scale software systems



# Application developers work with objects



*More intuitive if we can  
map objects directly to DB*

# Object-Relational Mapping eliminates the gap between objects and SQL



## Problem of using raw SQLs

- Lots of **boilerplate code**
- Need to **manage object-DB translations** manually

# ORM is widely used in practice



- Java Hibernate has *more than 8 million* downloads
- In 2013, *15% of the 17,000* Java developer jobs require ORM experience (dice.com)

## Different ORM technologies



# An example class with ORM code

User class is mapped to “user” table in DB

id is mapped to the column “id” in the user table

A user can belong to multiple teams

Eagerly retrieve associated teams when retrieving a user object

```
User.java

@Entity
@Table(name = “user”)
public class User{

    @Column(name=“id”)
    private int id;

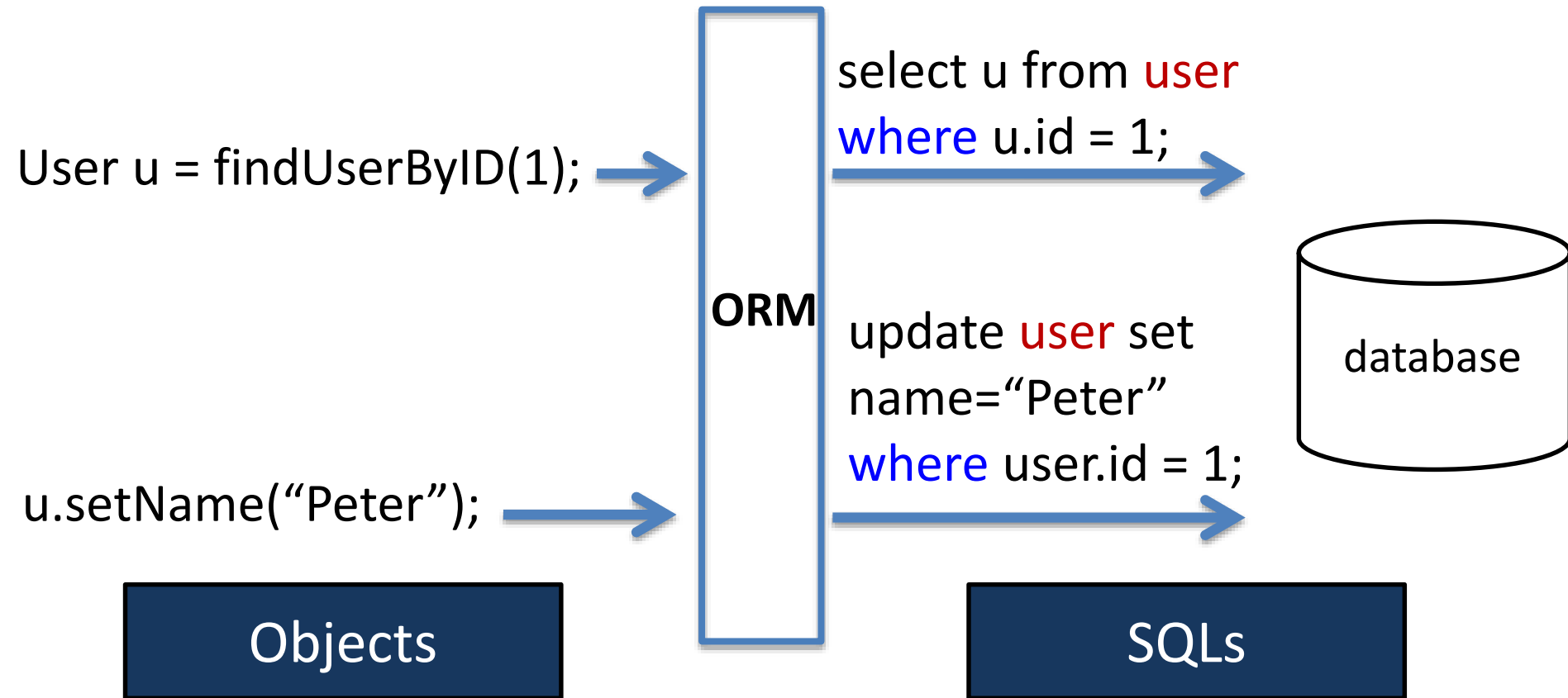
    @Column(name=“name”)
    String userName;

    @OneToMany(fetch=FetchType.EAGER)
    List<Team> teams;

    public void setName(String n){
        userName = n
    }

    ... other getter and setter methods
```

# Accessing the database using ORM





# Developers may not be aware of database access

Wow! I don't need to worry about DB code!

```
public class TcpClientSample
{
    public static void Main()
    {
        byte[] data = new byte[1024];
        TcpClient server;
        try{
            server = new TcpClient("localhost", 8080);
        }catch (SocketException){
            Console.WriteLine("Unable to connect to server");
        }
        return;
    }
    NetworkStream ns = server.GetStream();
    int recv = ns.Read(data, 0, data.Length);
    stringData = Encoding.ASCII.GetString(data, 0, recv);
    Console.WriteLine(stringData);
    while(true){
        input = Console.ReadLine();
        if (input == "exit") break;
        newchild.Properties["ou"].Add("Auditing Department");
        newchild.CommitChanges();
        newchild.Close();
    }
}
```



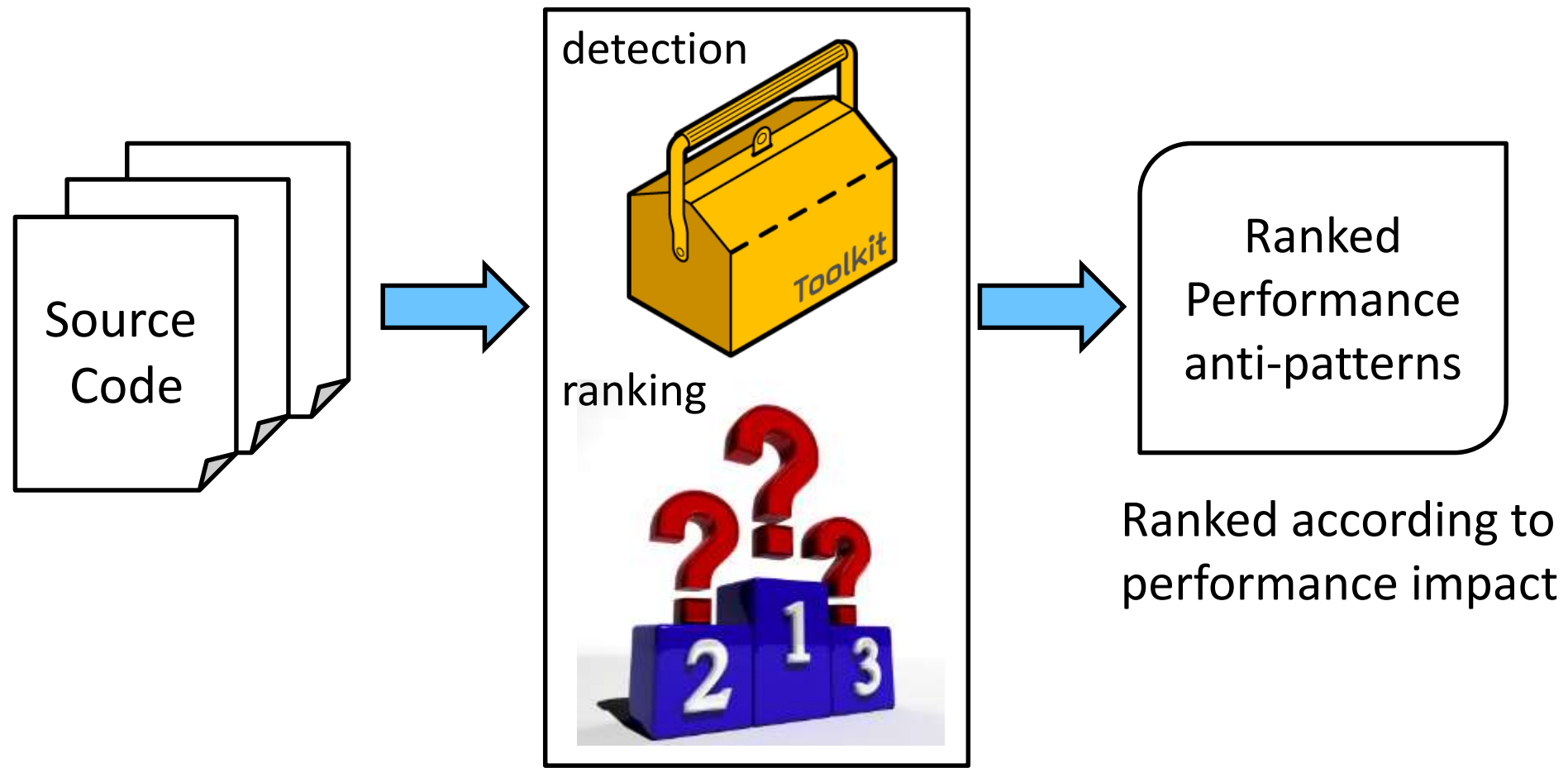
Bad system performance

ORM code with performance anti-patterns

**The performance difference can be LARGE!**

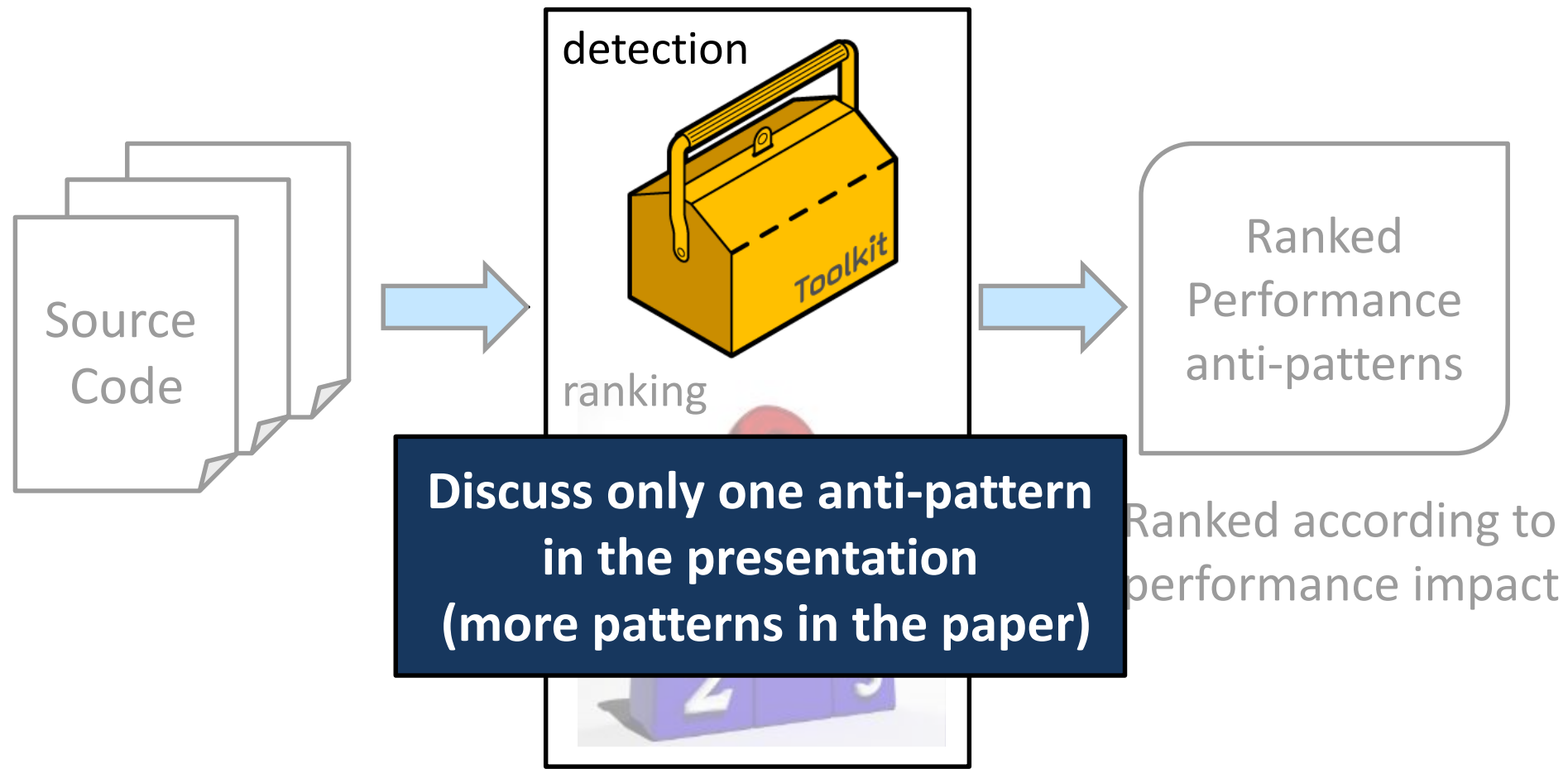


# Performance anti-pattern detection framework

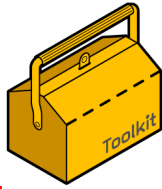


Performance anti-pattern detection and  
ranking framework

# Performance anti-pattern detection framework



Performance anti-pattern detection and ranking framework



# ORM excessive data anti-pattern

```
Class User{  
    @EAGER List<Team> teams;  
}
```

Eagerly retrieve  
teams from DB

Objects

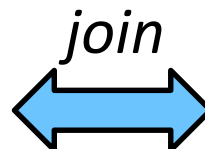
```
User u = findUserById(1);  
u.getName();  
EOF
```

SQL

User Table



Team Table



**Team data is never  
used!**

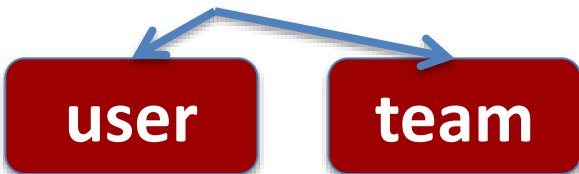
# Detecting excessive data using static analysis



```
Class User{  
    @EAGER  
    List<Team> teams;  
}
```

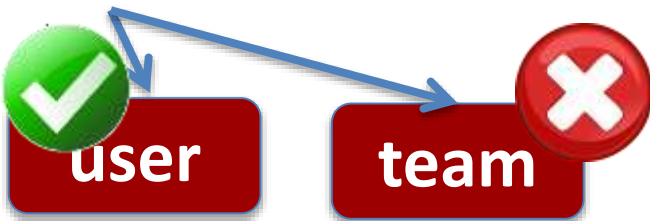
First find all the objects that  
eagerly retrieve data from DB

User user = findUserByID(1);



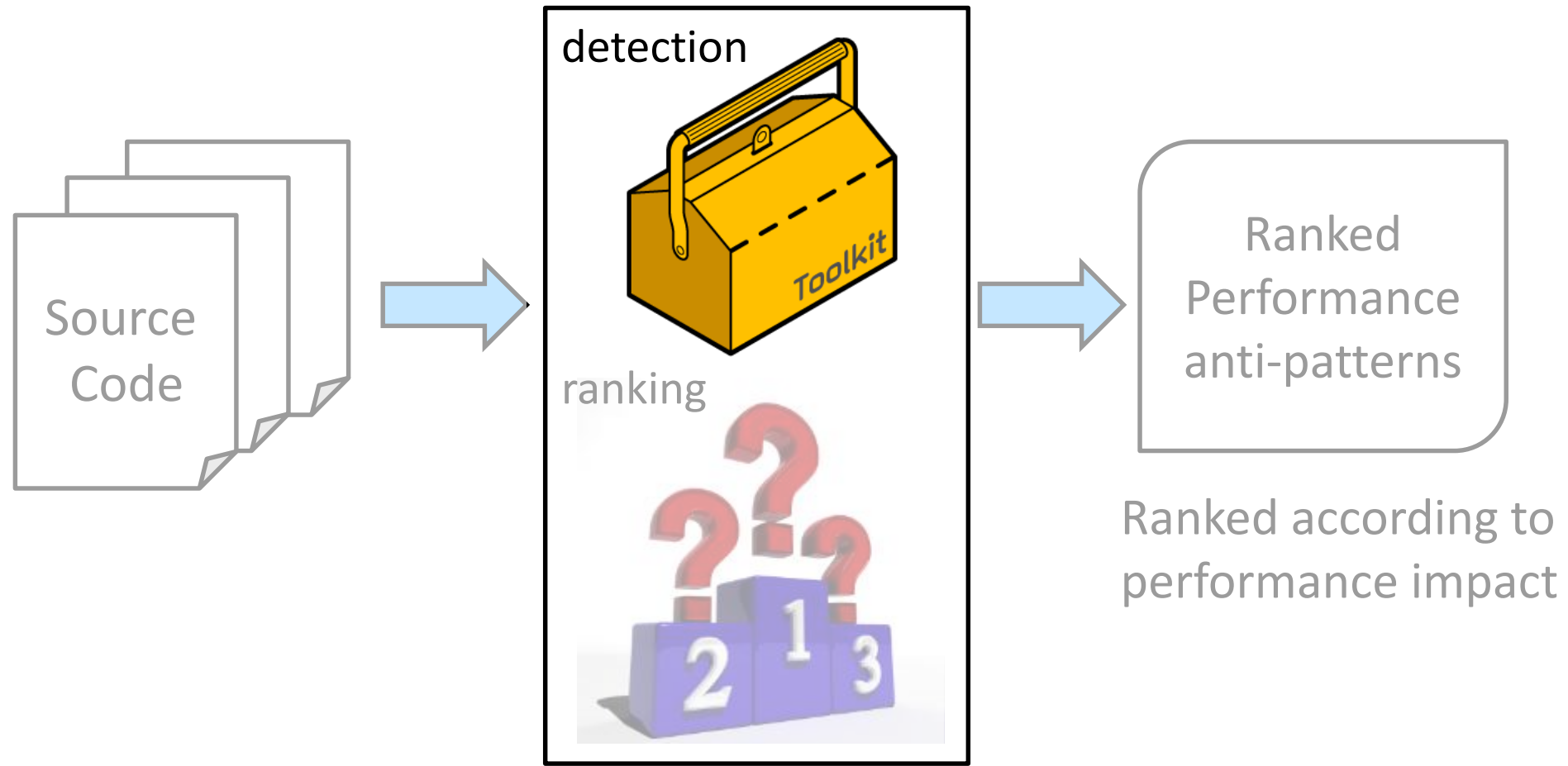
Identify all the data usages of  
objects

user.getName();



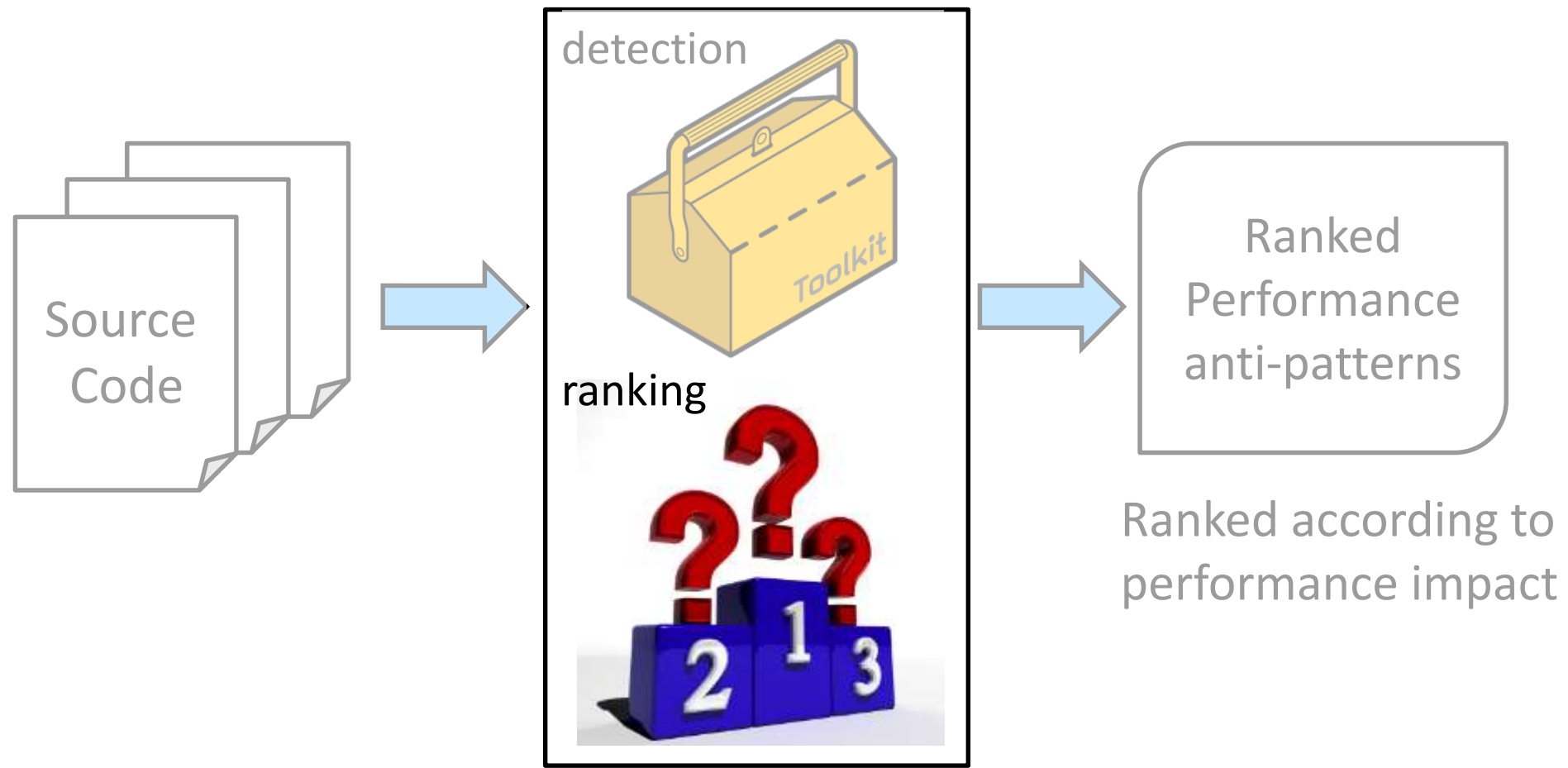
Check if the retrieved data is ever  
used

# Performance anti-pattern detection framework



Performance anti-pattern detection and  
ranking framework

# Performance anti-pattern detection framework

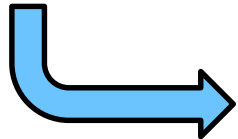


Performance anti-pattern detection and  
ranking framework

# Performance anti-patterns have different impacts

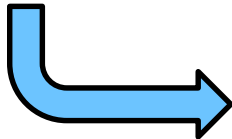


```
User user_in_1_team = findUserID(1);
```



Retrieving **1 user** and **1 team**

```
User user_in_100_teams = findUserID(100);
```



Retrieving **1 user** and **100 teams!**

**One can only reveal performance  
impact by execution**



# Measuring the impact using repeated measurements and effect sizes



## Performance measurements are unstable:

We repeat each test 30 times to obtain stable measurement results



## Size of performance impact is not defined:

We use **effect sizes (Cohen's *D*)** to measure the performance impact



$$\text{Effect sizes} = \begin{cases} \text{trivial} & \text{if } \text{Cohen's } d \leq 0.2 \\ \text{small} & \text{if } 0.2 < \text{Cohen's } d \leq 0.5 \\ \text{medium} & \text{if } 0.5 < \text{Cohen's } d \leq 0.8 \\ \text{large} & \text{if } 0.8 < \text{Cohen's } d \end{cases}$$

# Studied systems and detection results



Large open-source  
e-commerce system  
> 1,700 files  
> 206K LOC

482 excessive data



Enterprise system  
> 3,000 files  
> 300K LOC

> 10 excessive data



Spring open-source system  
Online system for a pet clinic  
51 files  
3.3K LOC

10 excessive data

# Research questions



Performance impact

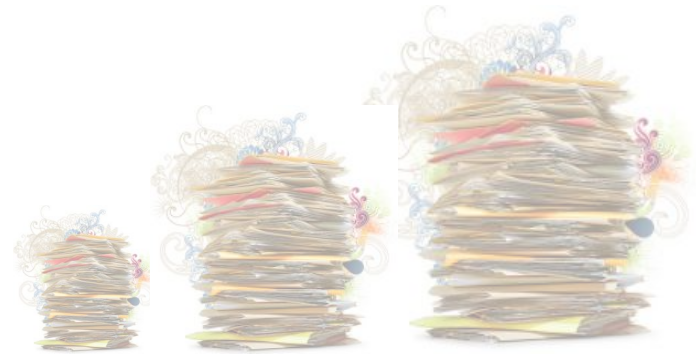


Ranks of the anti-patterns at different scales

# Research questions

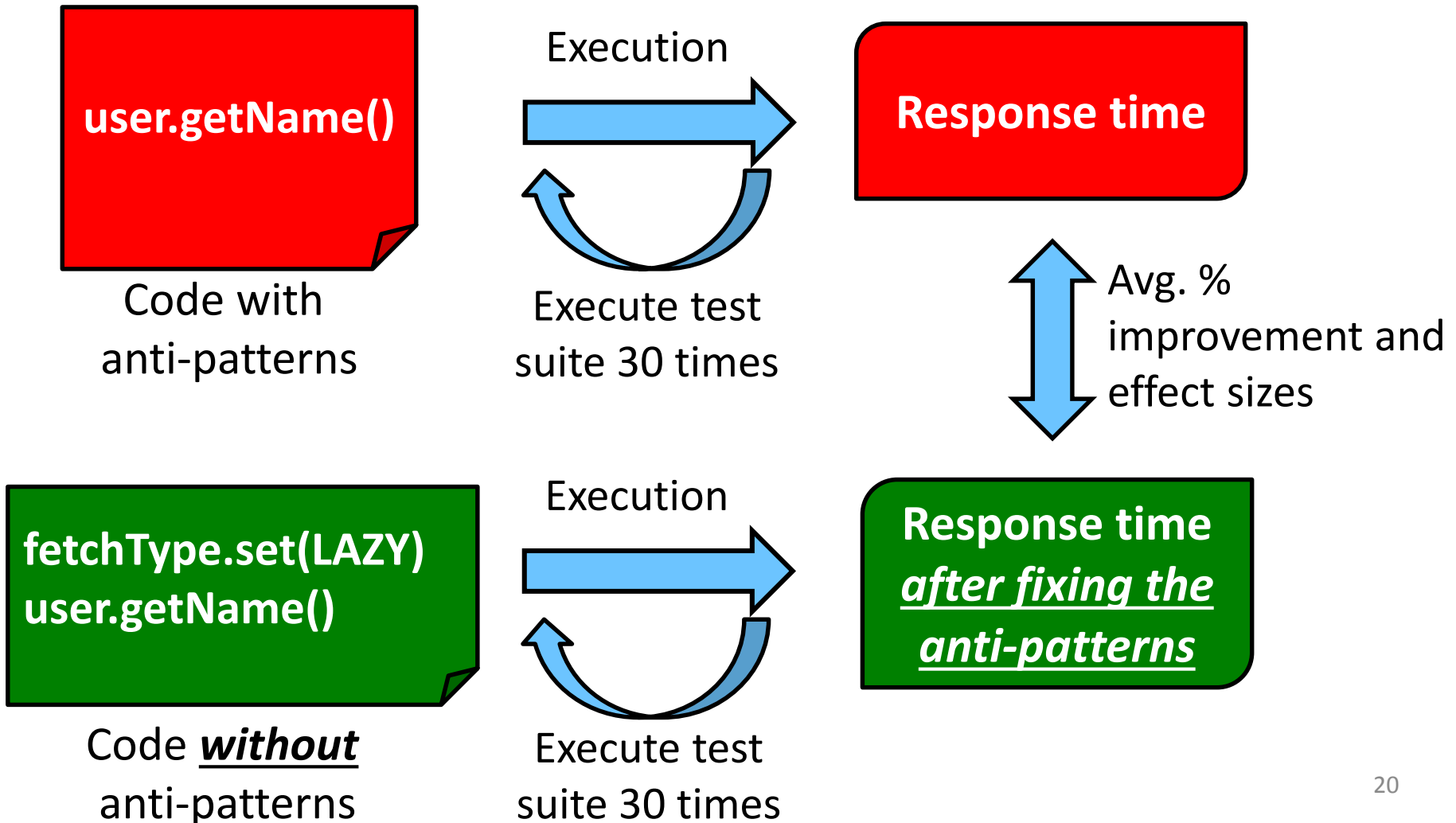


Performance impact



Ranks of the anti-patterns at different scales

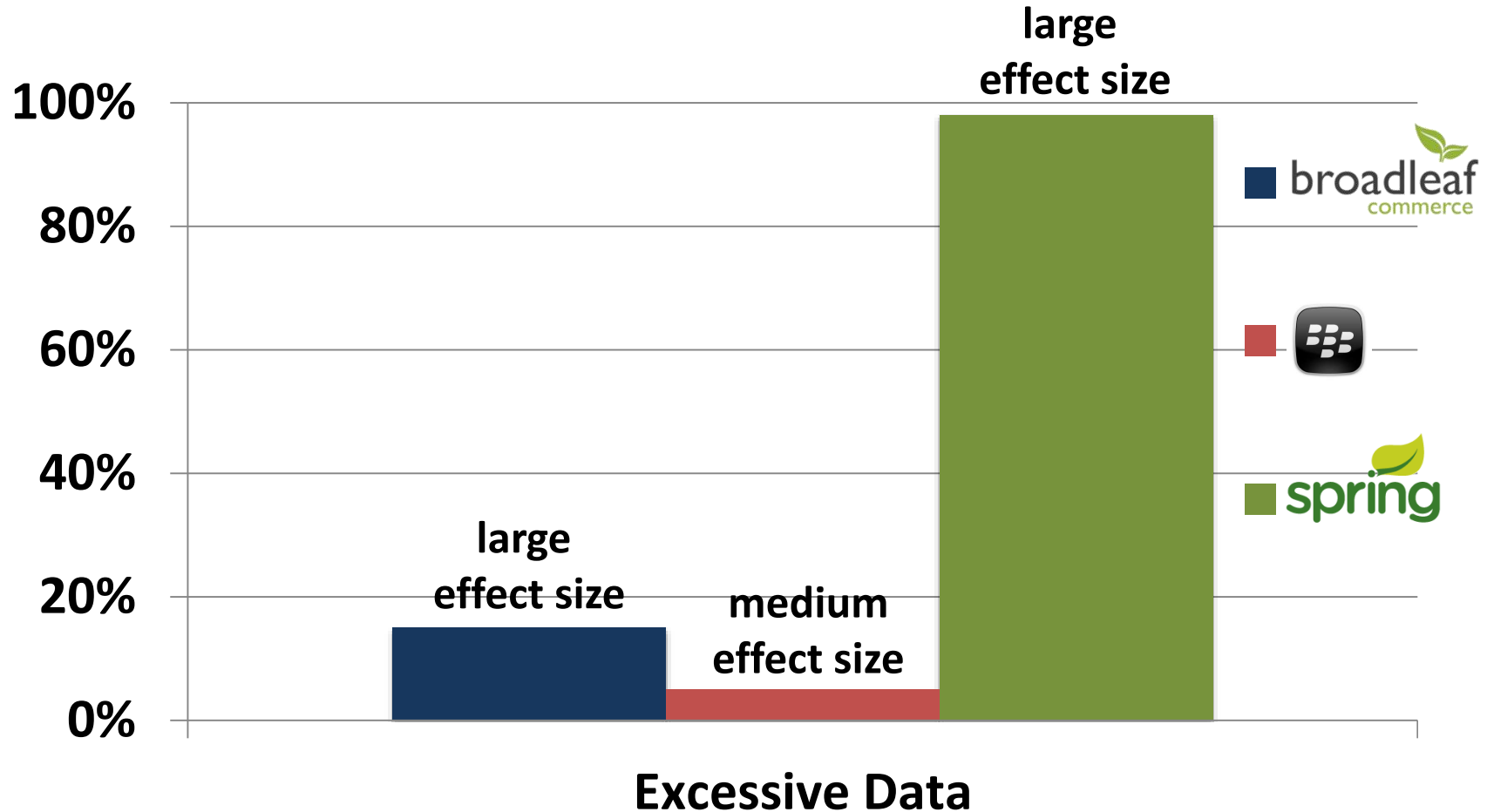
# Assessing anti-pattern impact by fixing the anti-patterns



# Performance anti-patterns have medium to large effect sizes



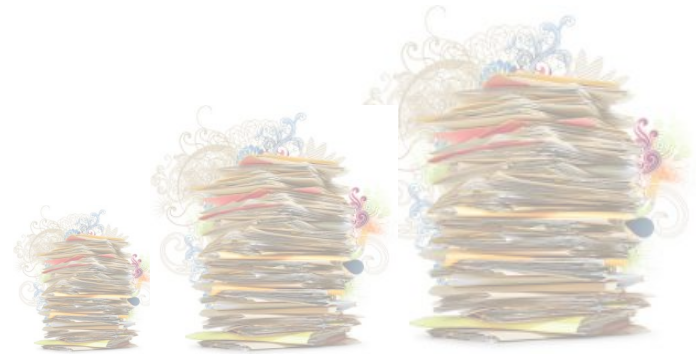
% improvement in response time



# Research questions



Performance impact



Ranks of the anti-patterns at different scales

**Removing anti-pattern  
improves response by ~35%**



# Research questions



Performance impact



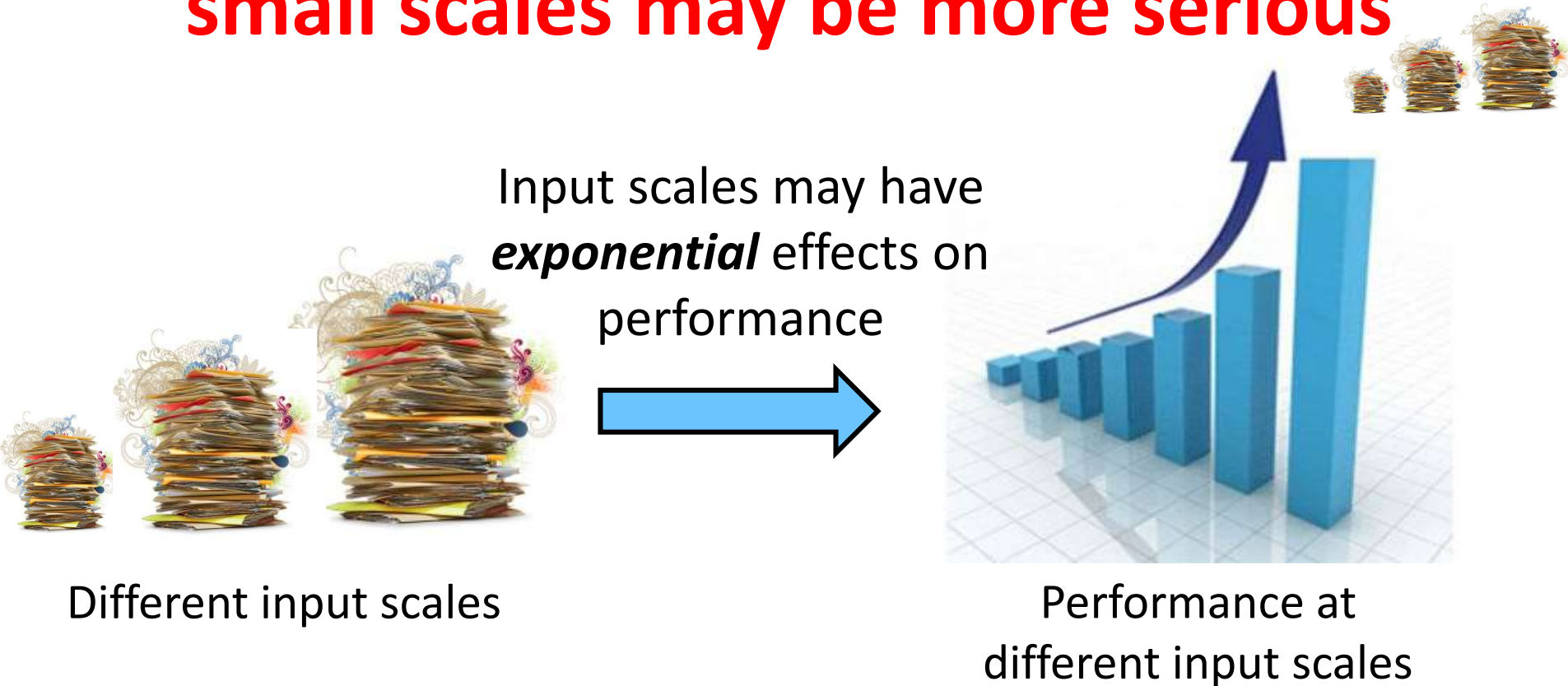
Ranks of the anti-patterns at different scales

**Removing anti-pattern  
improves response by ~35%**

# Performance problems usually arise under large load



# Performance problems revealed at small scales may be more serious

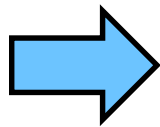


**We should first fix the anti-patterns that have larger effects at smaller scales**

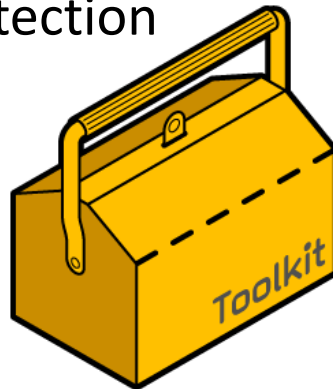
# Comparing ranked anti-patterns at different data scales



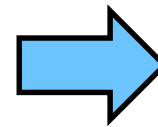
Small size input



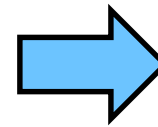
detection



ranking



Ranked  
Performance  
anti-patterns  
from small data



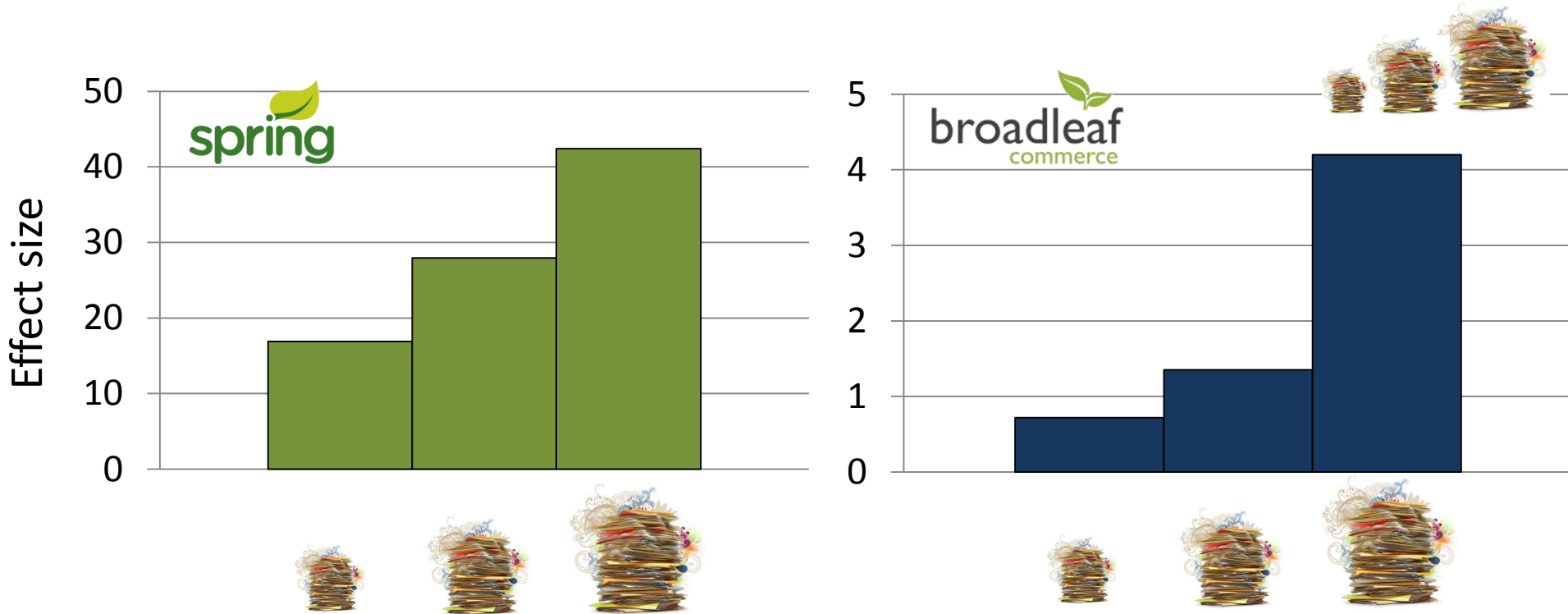
Ranked  
Performance  
anti-patterns  
from large data



Large size input



# Anti-patterns have large effects on performance even at smaller data scales



Effect sizes and the ranks of the anti-patterns are consistent in different data scales

# Research questions



Performance impact

**Removing anti-pattern  
improves response by ~35%**



Ranks of the anti-patterns at  
different scales

**Ranks of the anti-patterns  
are consistent in different  
data scales**

# Object-Relational Mapping eliminates the gap between objects and SQL

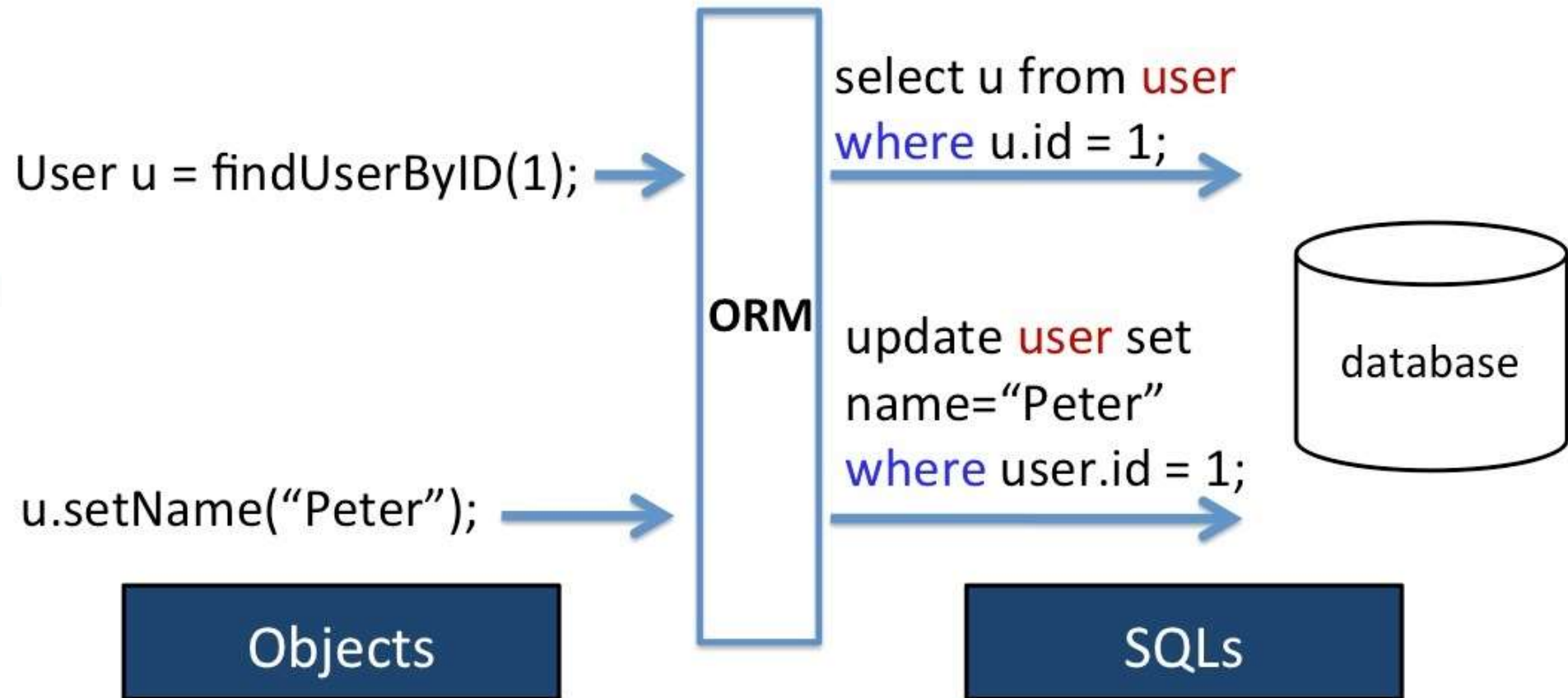


## Problem of using raw SQLs

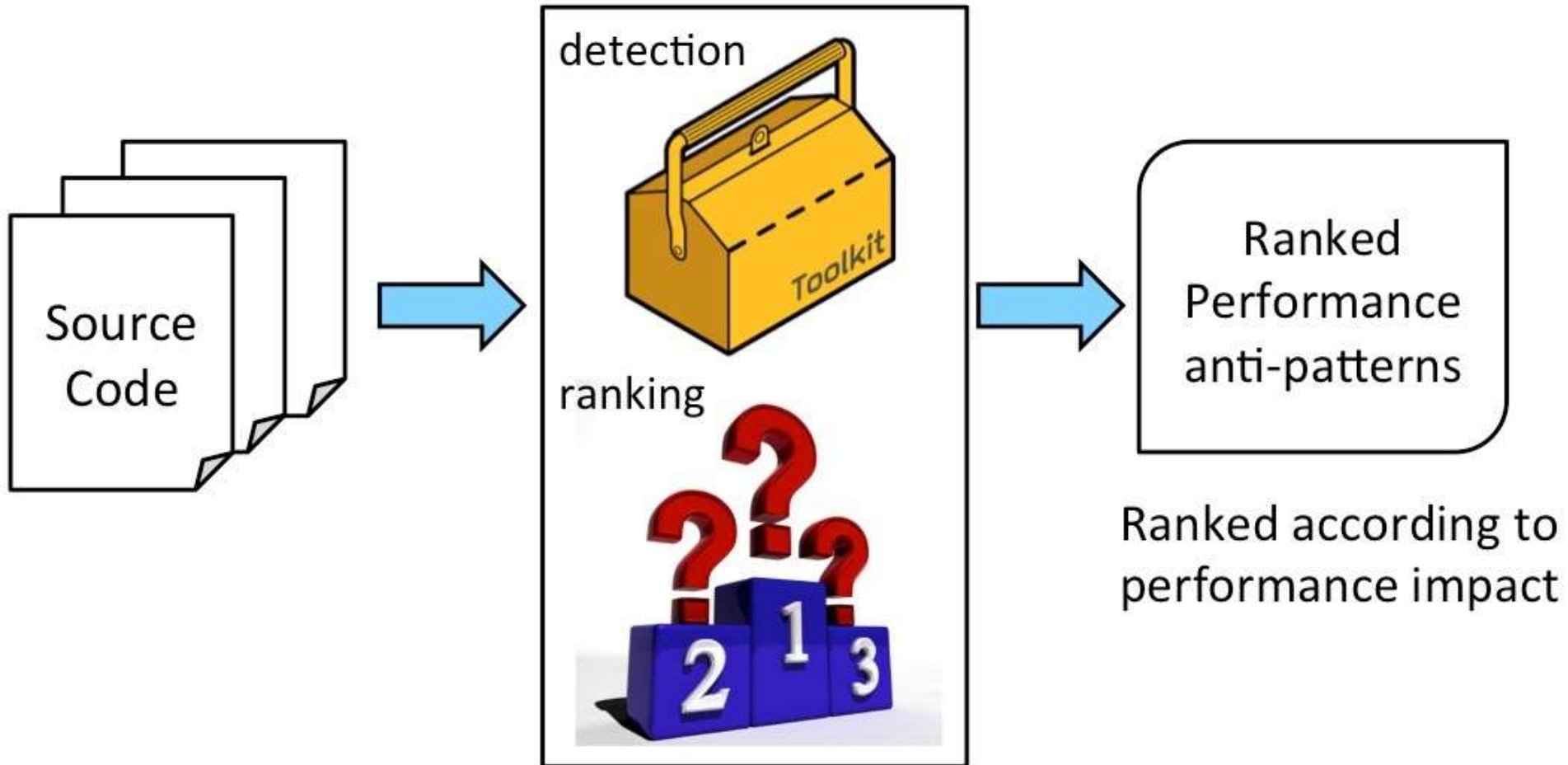
- Lots of **boilerplate code**
- Need to **manage object-DB translations** manually



# Accessing the database using ORM



# Performance anti-pattern detection framework



Performance anti-pattern detection and  
ranking framework

# Research questions



Performance impact

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Ranks of the anti-patterns at  
different scales

**Ranks of the anti-patterns  
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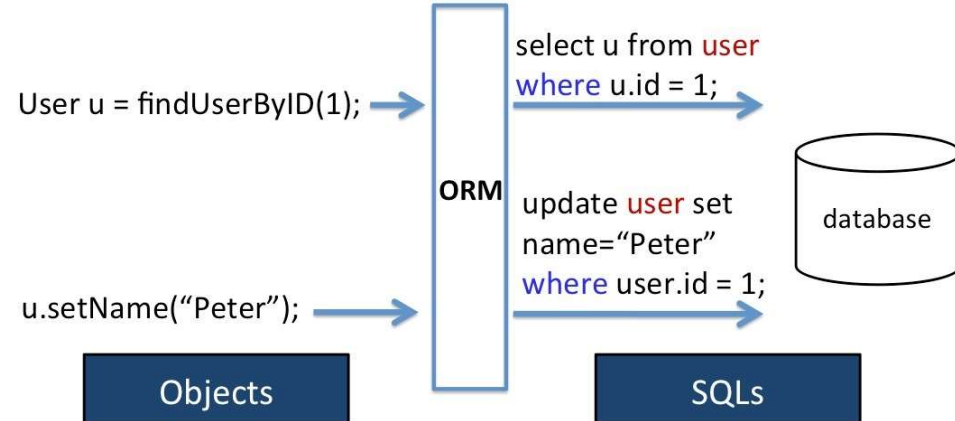
# Object-Relational Mapping eliminates the gap between objects and SQL



## Problem of using raw SQLs

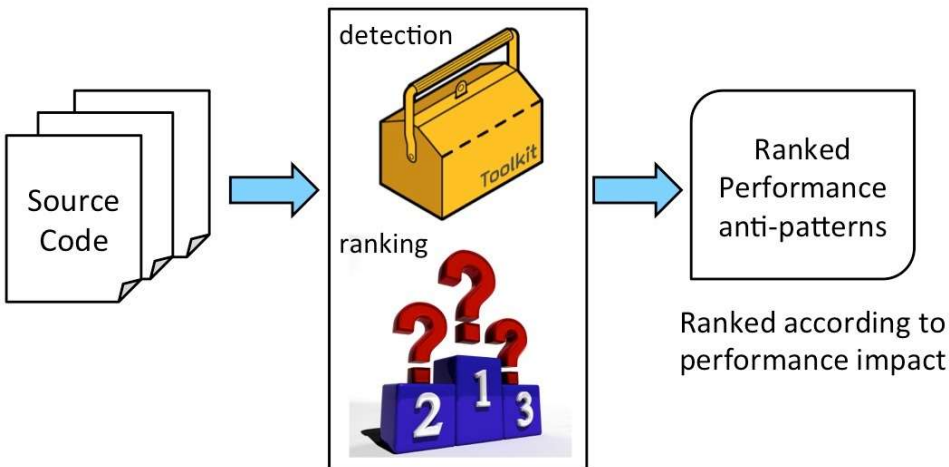
- Lots of **boilerplate code**
- Not **type-safe**
- **tr**

# Accessing the database using ORM



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# Performance anti-pattern detection framework



Performance anti-pattern detection and ranking framework



Performance impact

Removing anti-pattern improves response by ~35%



Ranks of the anti-patterns at different scales

Ranks of the anti-patterns are consistent in different data scales