

# Migration to Microservices: A Comparative Study of Decomposition Strategies and Analysis Metrics

SERVICE  
COMPUTATION  
2023



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Meryam Chaieb \*  
Laval University



Khaled Sellami  
Laval University



Mohamed Aymen Saied  
Laval University

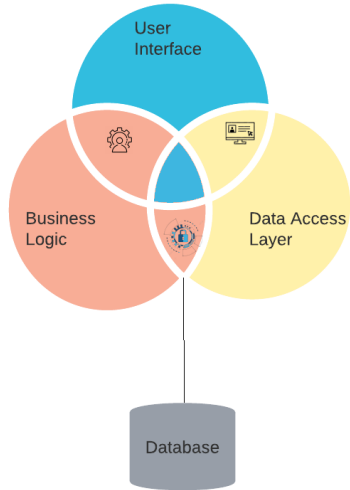
# Outline:

- Context
- Related Work
- Proposed Approach
- Research Questions
- Conclusion



# Context <sup>1/2</sup>

## Monolith architecture



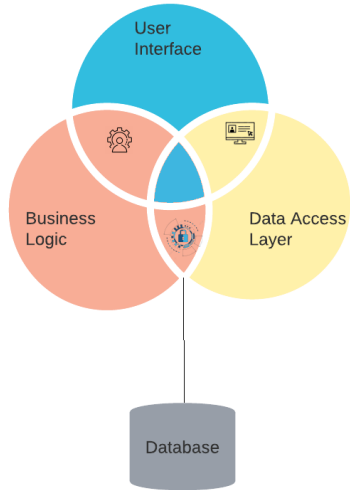
- ✗ Lack of Scalability
- ✗ Decreased Fault Isolation
- ✗ Limited Development Team Autonomy

## Microservice architecture



# Context <sup>1/2</sup>

## Monolith architecture

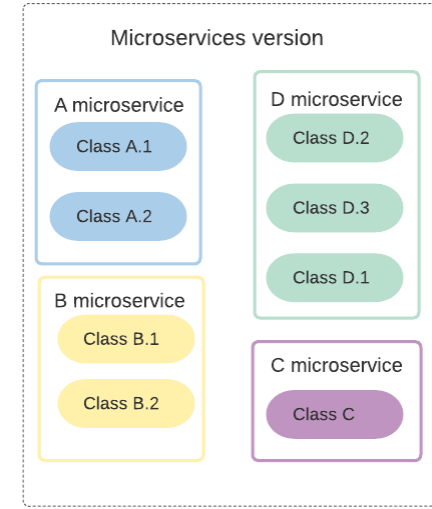
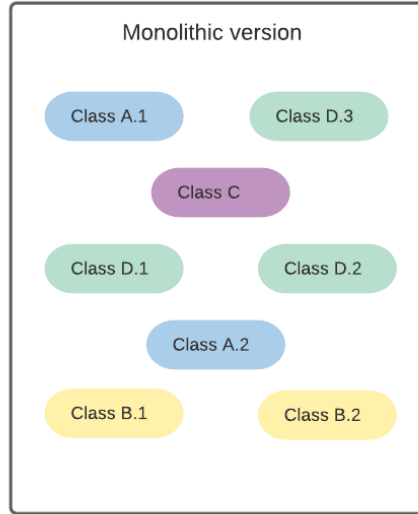
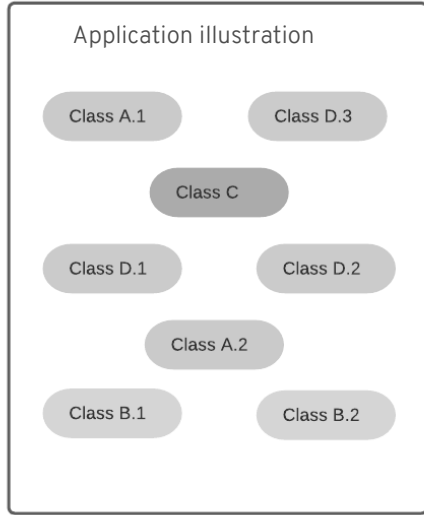


## Microservice architecture



- ✓ Scalability and flexibility
- ✓ Fault Isolation and Resilience
- ✓ Team Autonomy

# Context 2/2



Monolithic application

Decomposing process



Microservice application



# Related Work <sup>1/2</sup>

## Input Type

### Source code

```
package rentalstore;
import java.util.Enumeration;
import java.util.Vector;

class Customer {
    private String _name;
    private Vector<Rental> _rentals = new Vector<Rental>();

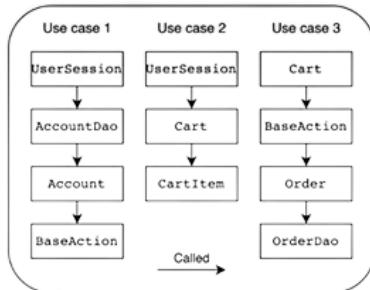
    public Customer(String name) {
        _name = name;
    }

    public String getMovie(Movie movie) {
        Rental rental = new Rental(new Movie("", Movie.NEW_RELEASE), 10);
        Movie m = rental._movie;
        return movie.getTitle();
    }

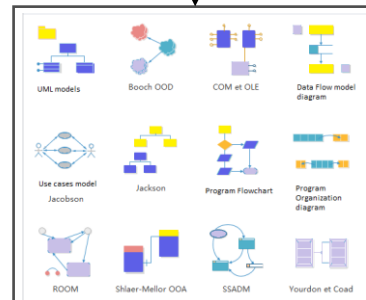
    public void addRental(Rental arg) {
        _rentals.add(lement(arg));
    }

    public String getName() {
        return _name;
    }
}
```

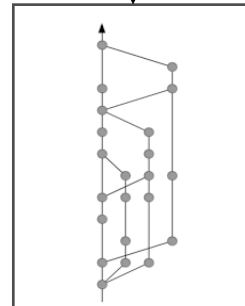
### Execution trace



### Diagrams



### Git Commit History



**Bunch** B. S. Mitchell and S. Mancoridis, “On the evaluation of the bunch search-based software modularization algorithm,” *Soft Computing* 2008

**HierDecomp** K. Sellami, M. A. Saied, and A. Ouni, “A hierarchical dbscan method for extracting microservices from monolithic applications,” in *The International Conference on Evaluation and Assessment in Software Engineering* 2022

**Mono2Micro** K. Kalia, X. Jin, K. Rahul, S. Saurabh, V. Maja, and B. Debasish, “Mono2micro: A practical and effective tool for decomposing monolithic java applications to microservices,” *Proceedings of the 29th ACM Joint Meeting on European Software Engineering Conference and Symposium on the Foundations of Software Engineering*, 2021.

**FOSCI** W. Jin, T. Liu, Y. Cai, R. Kazman, R. Mo, and Q. Zheng, “Service candidate identification from monolithic systems based on execution traces,” *IEEE Transactions on Software Engineering* 2021

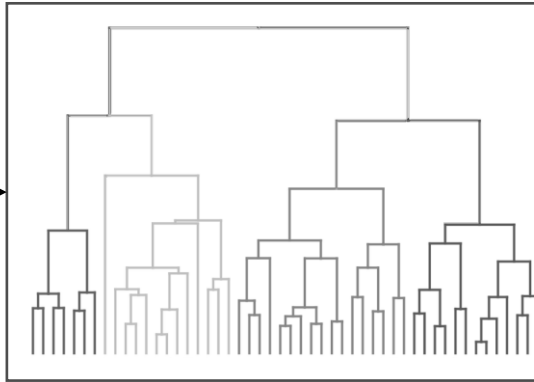
## Service cutter

Michael Gysel, Lukas Kolbener, Wolfgang Giershe, Olaf Zimmermann, “Service Cutter: A Systematic Approach to Service Decomposition” *LNPSE*, 2016

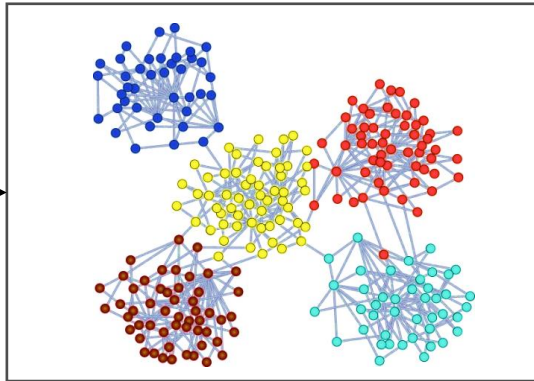
**MEM** G. Mazlami, J. Cito, and P. Leitner, “Extraction of microservices from monolithic software architectures,” in *2017 IEEE International Conference on Web Services (ICWS)*

# Related Work <sub>2/2</sub>

**Output type**



- HierDecomp
- HyDecomp
- FOSCI



- Mono2Micro
- Service Cutter
- Bunch

# Proposed Approach <sup>1/10</sup>

```
package rentalstore;
import java.util.Enumeration;
import java.util.Vector;

class Customer {
    private String _name;
    private Vector<Rental> _rentals = new Vector<Rental>();

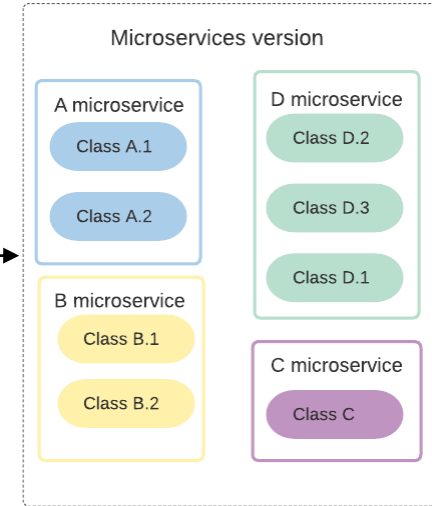
    public Customer(String name) {
        _name = name;
    }

    public String getMovie(Movie movie) {
        Rental rental = new Rental(new Movie("", Movie.NEW_RELEASE), 10);
        Movie m = rental._movie;
        return movie.getTitle();
    }

    public void addRental(Rental arg) {
        _rentals.addElement(arg);
    }

    public String getName() {
        return _name;
    }
}
```

Proposed Approach





# Proposed Approach 2/10

## Proposed Approach

```
public void test() {
    // ...
}

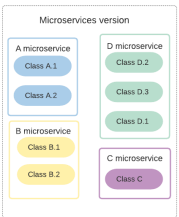
class Customer {
    private String name;
    private Vector<Order> _orders = new Vector<Order>();

    public Customer(String name) {
        this.name = name;
    }

    public void addOrder(Order order) {
        _orders.add(order);
    }

    public void getOrders() {
        return _orders;
    }

    public void getOrders() {
        return _orders;
    }
}
```



# Proposed Approach 2/10

## Proposed Approach

```
import java.util.Date;
import java.util.HashMap;
import java.util.Map;
import java.util.Vector;

class Customer {
    private String name;
    private Vector<Order> orders;

    public Customer(String name) {
        this.name = name;
    }

    public void addOrder(Order order) {
        orders.add(order);
    }

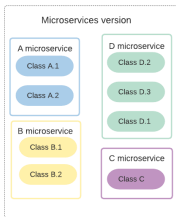
    public void removeOrder(Order order) {
        orders.remove(order);
    }

    public void printOrders() {
        for (Order order : orders) {
            System.out.println("Order: " + order);
        }
    }
}
```

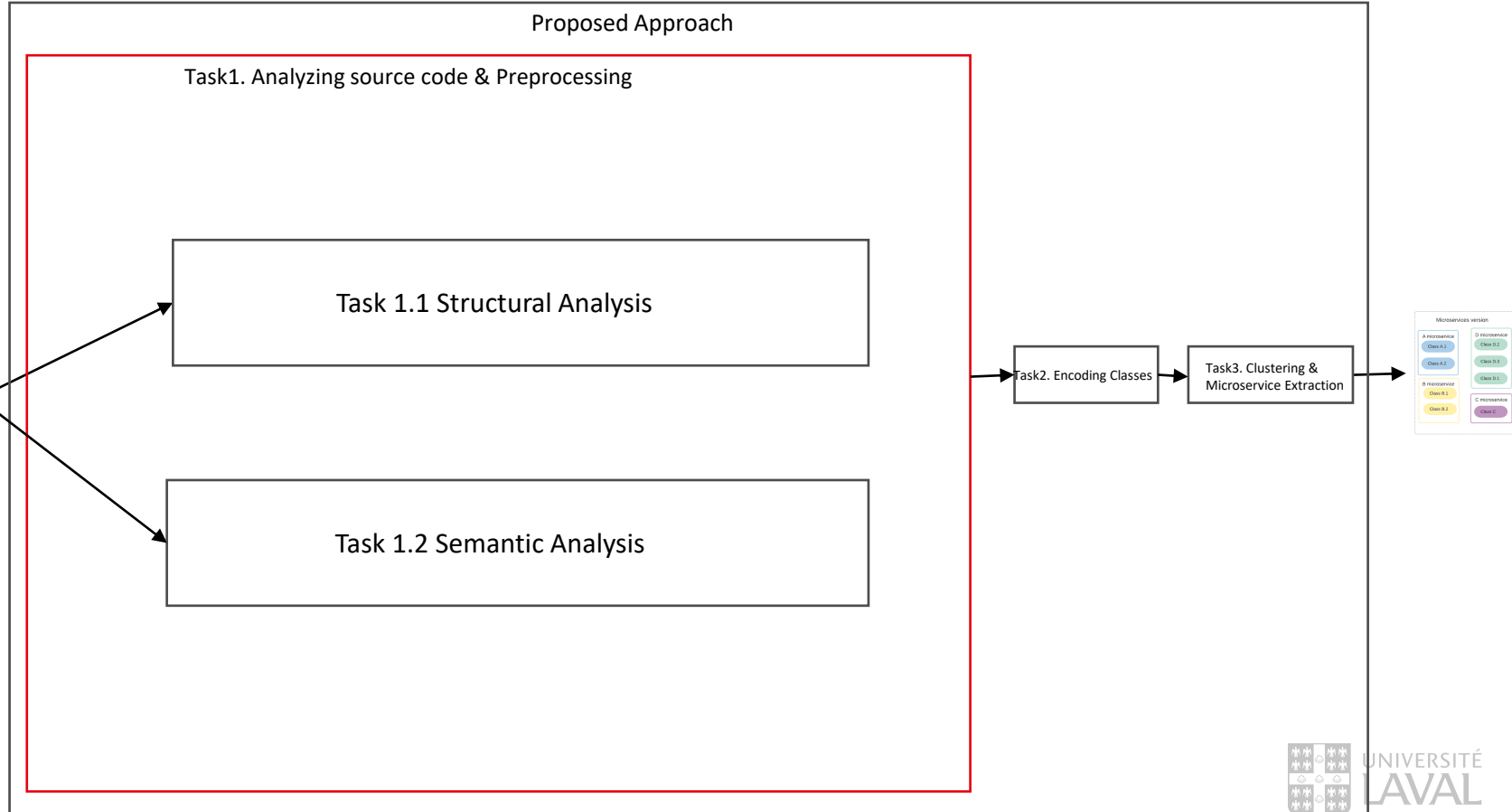
Task1. Analyzing source code & Preprocessing

Task2. Encoding Classes

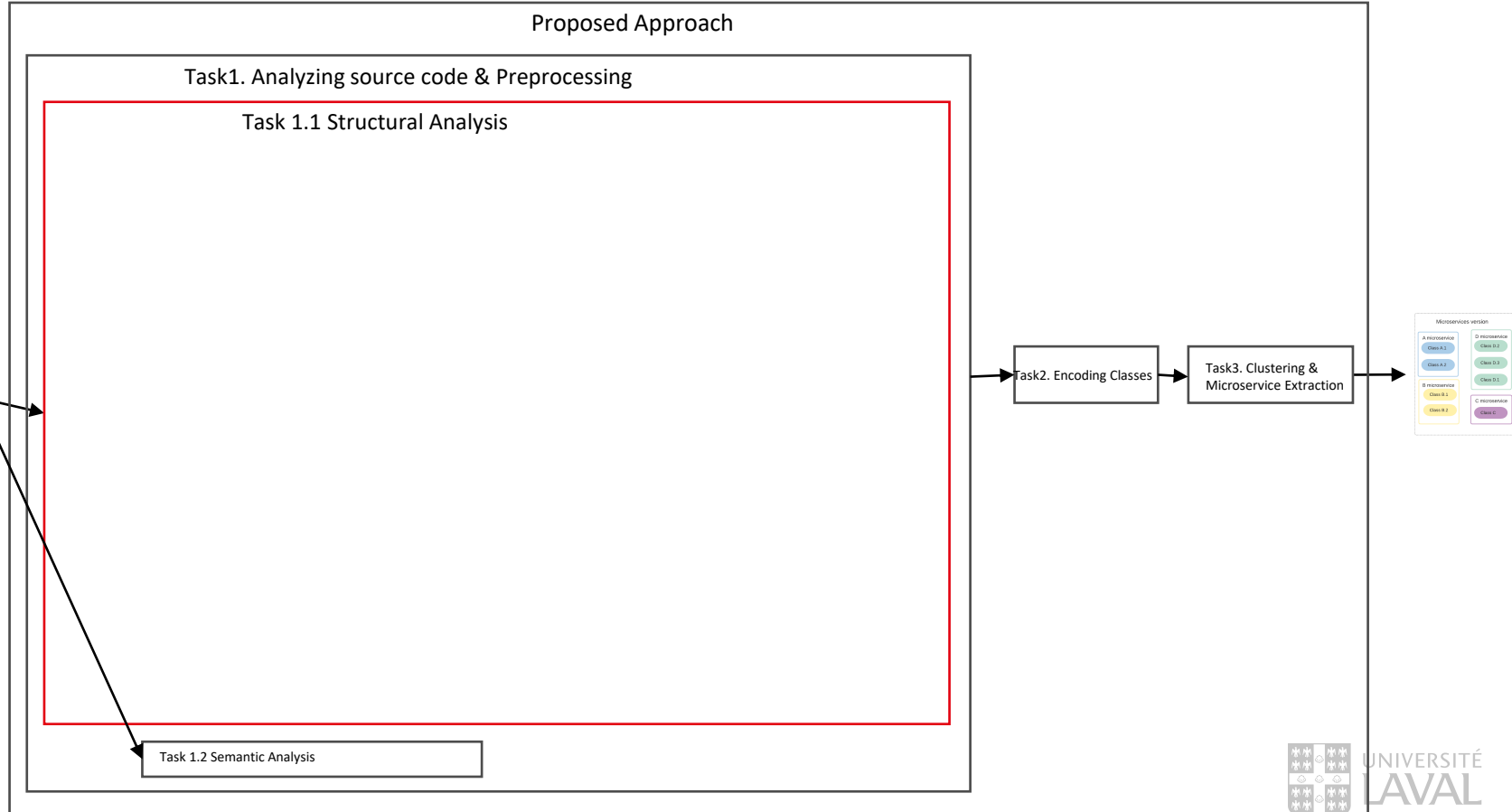
Task3. Clustering & Microservice Extraction



# Proposed Approach 3/10

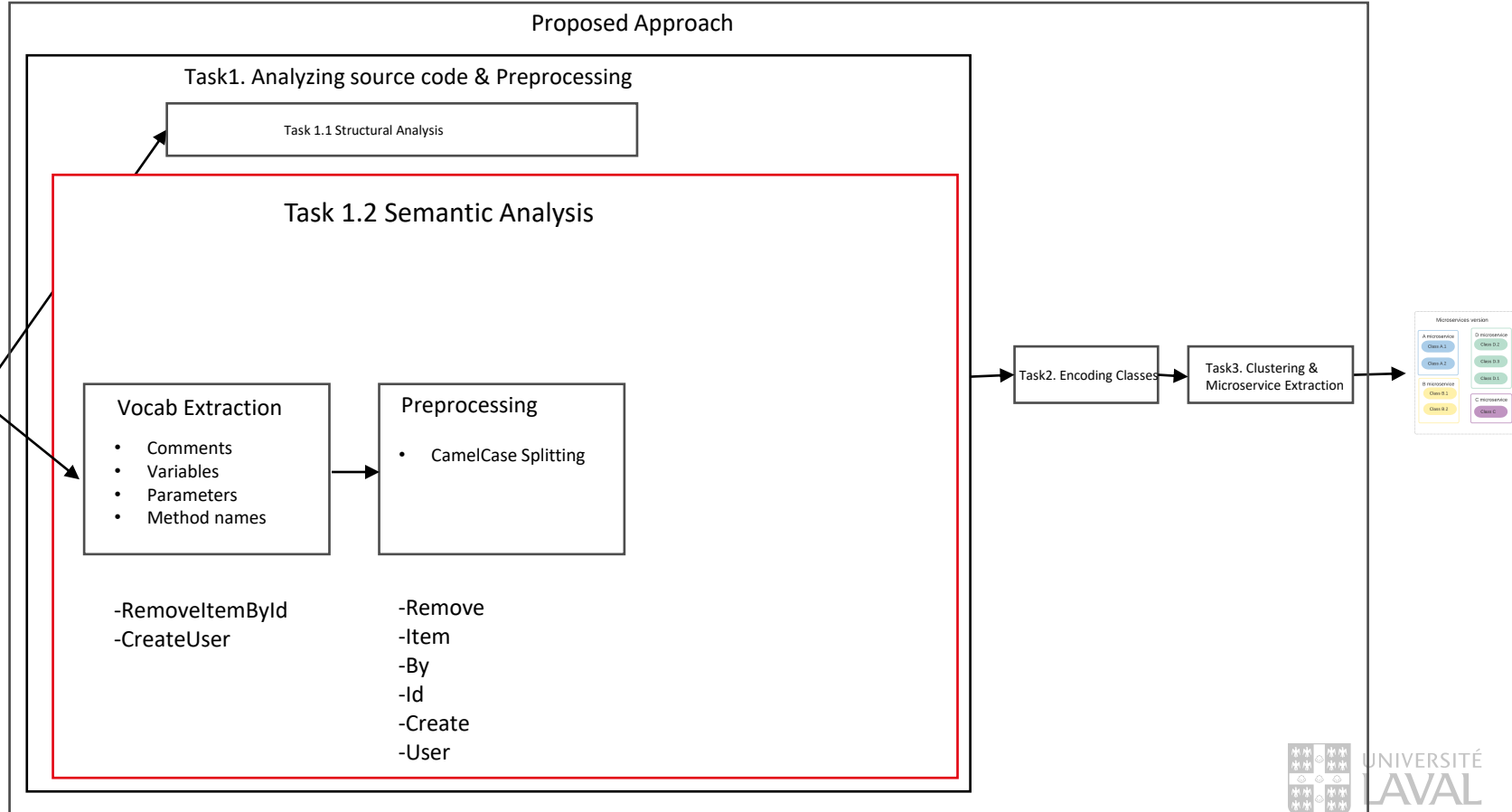


# Proposed Approach 3/10

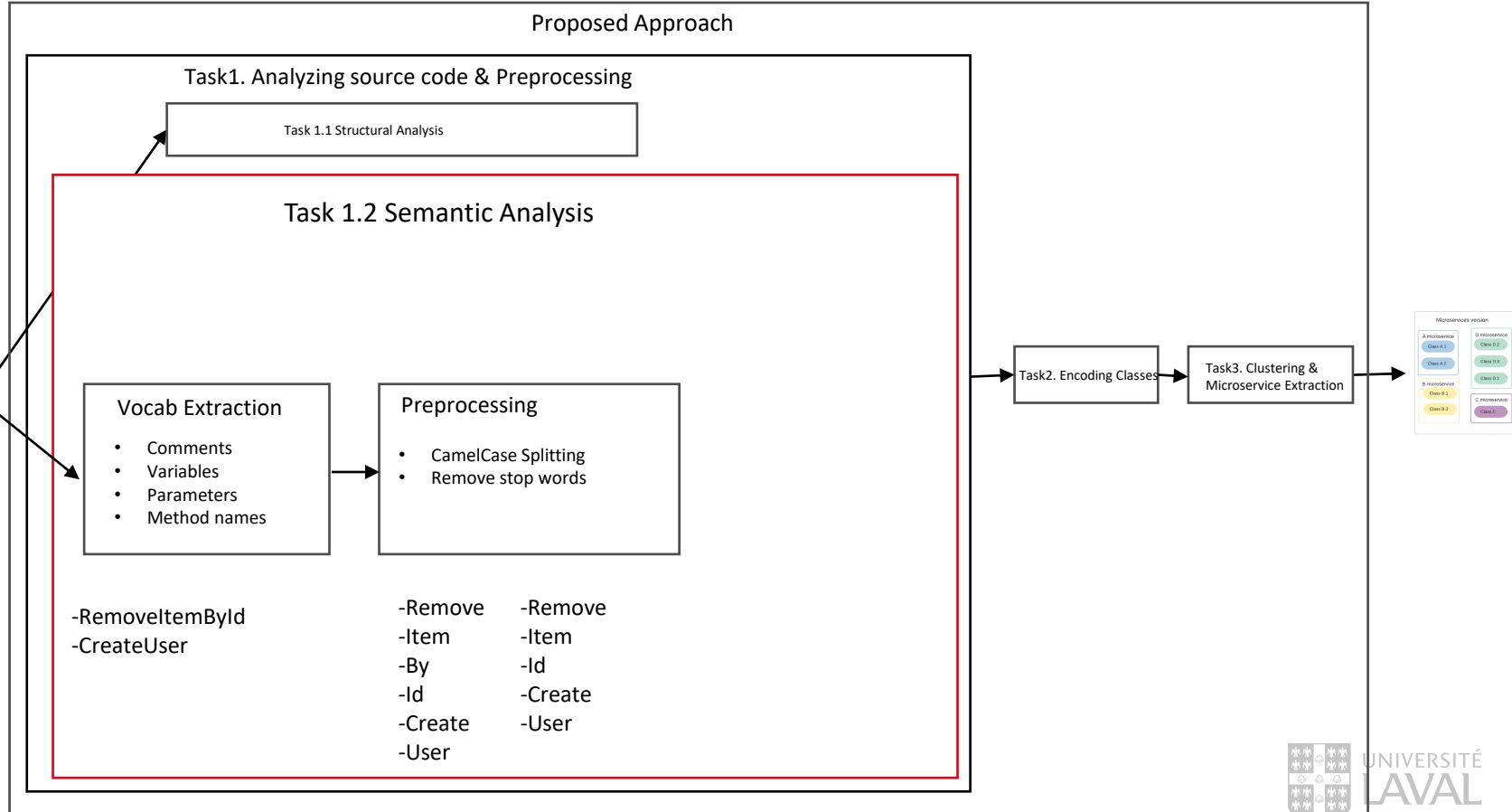




# Proposed Approach 5/10

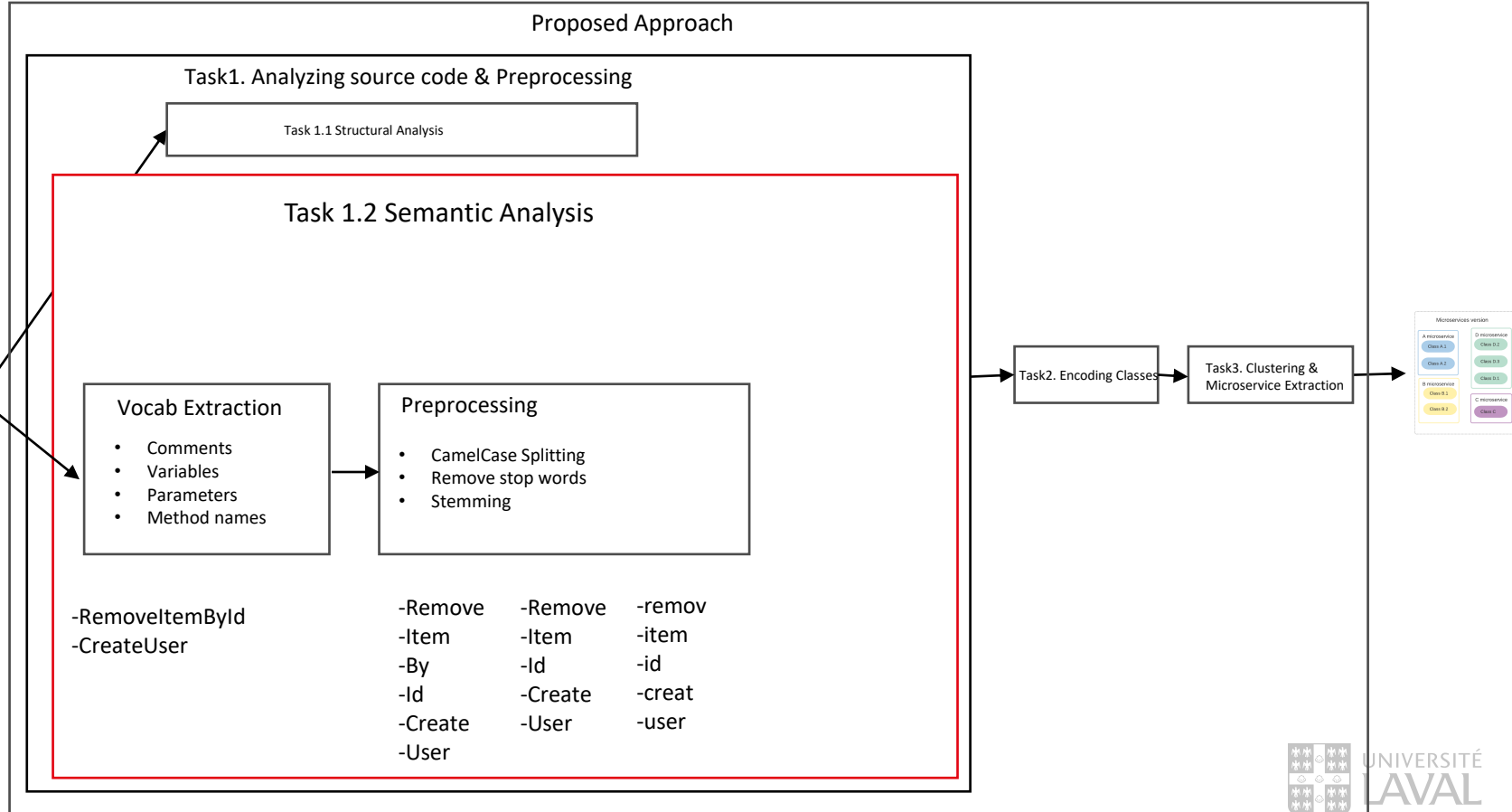


# Proposed Approach 5/10

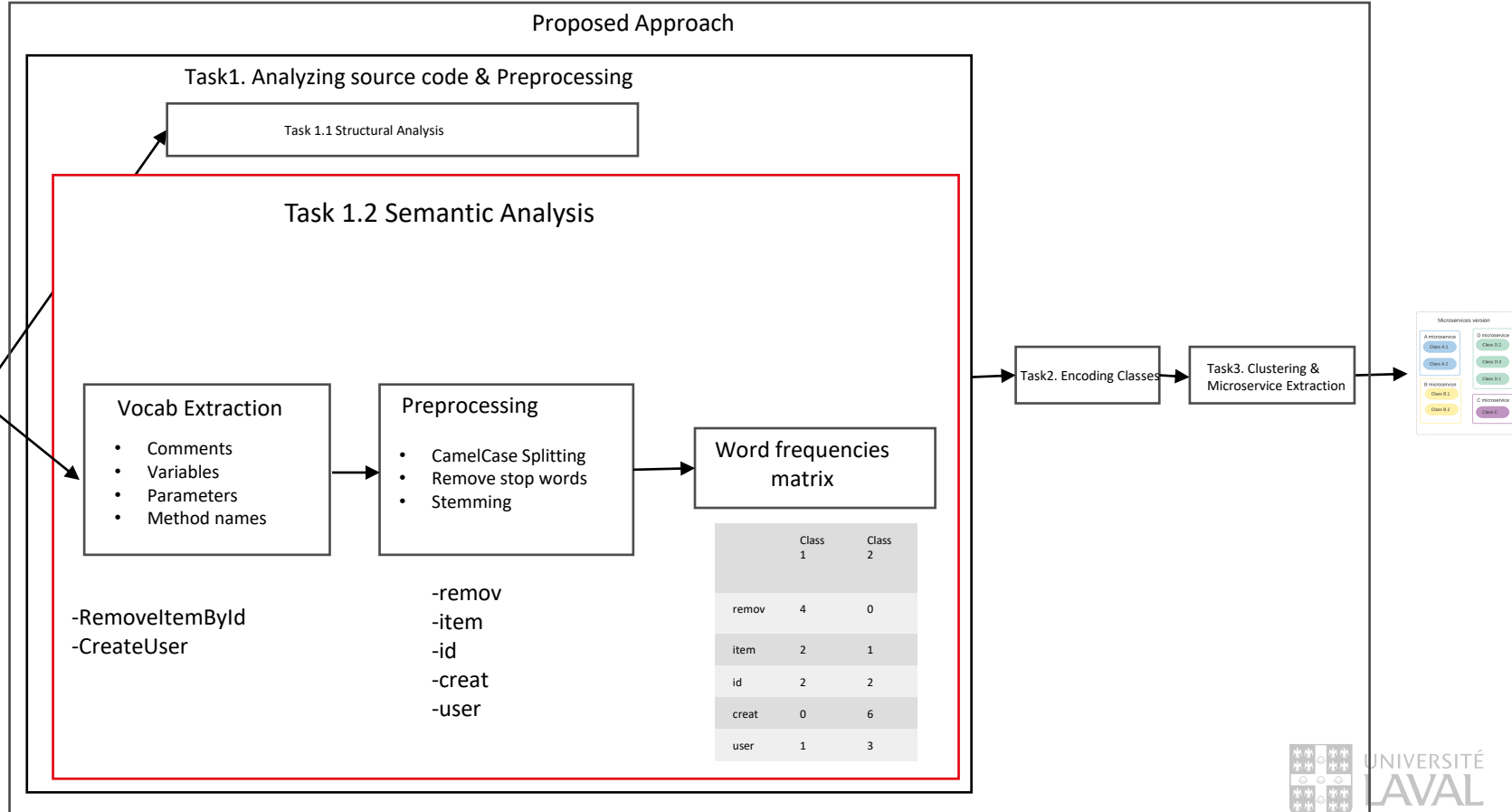




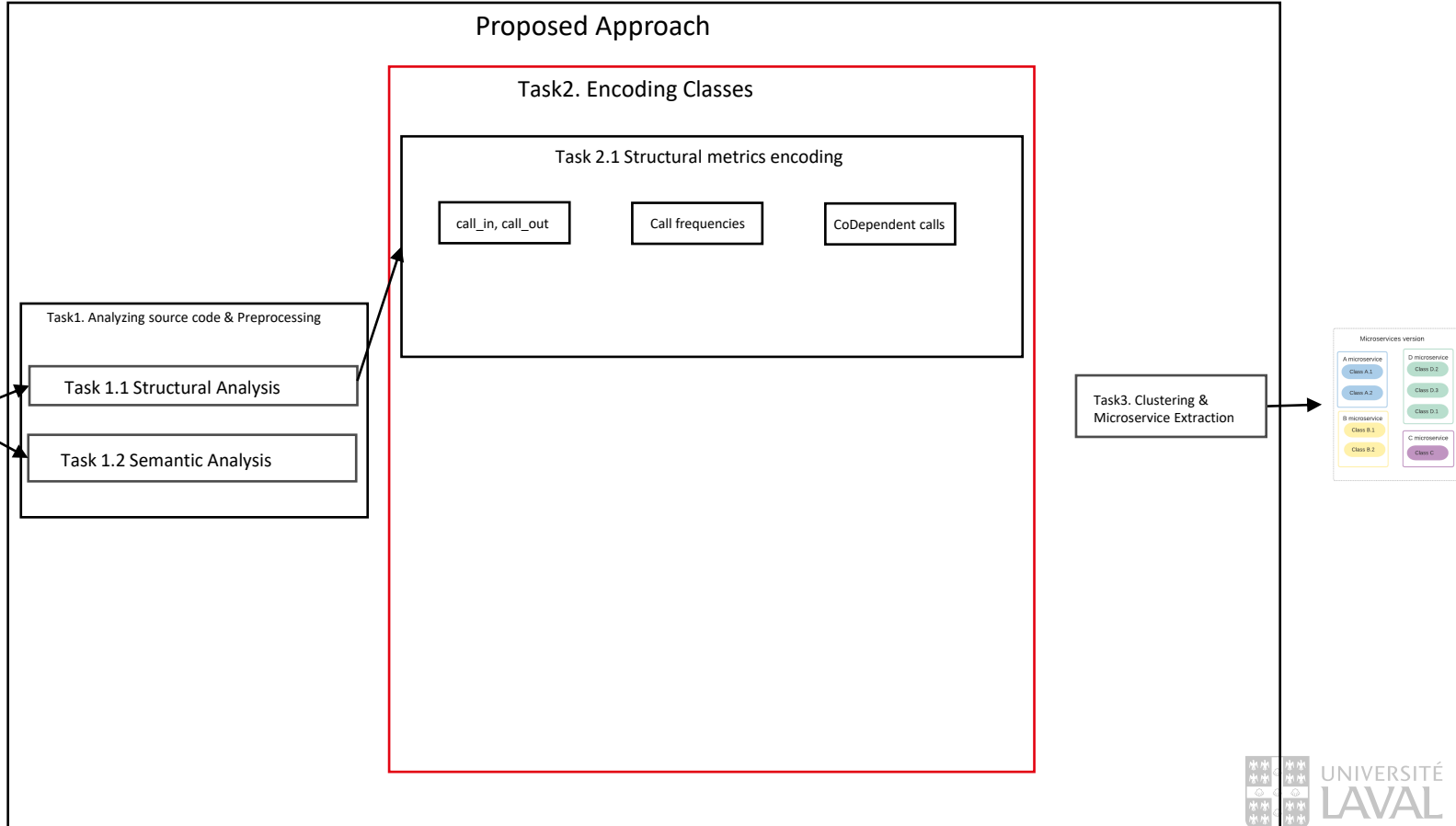
# Proposed Approach 5/10



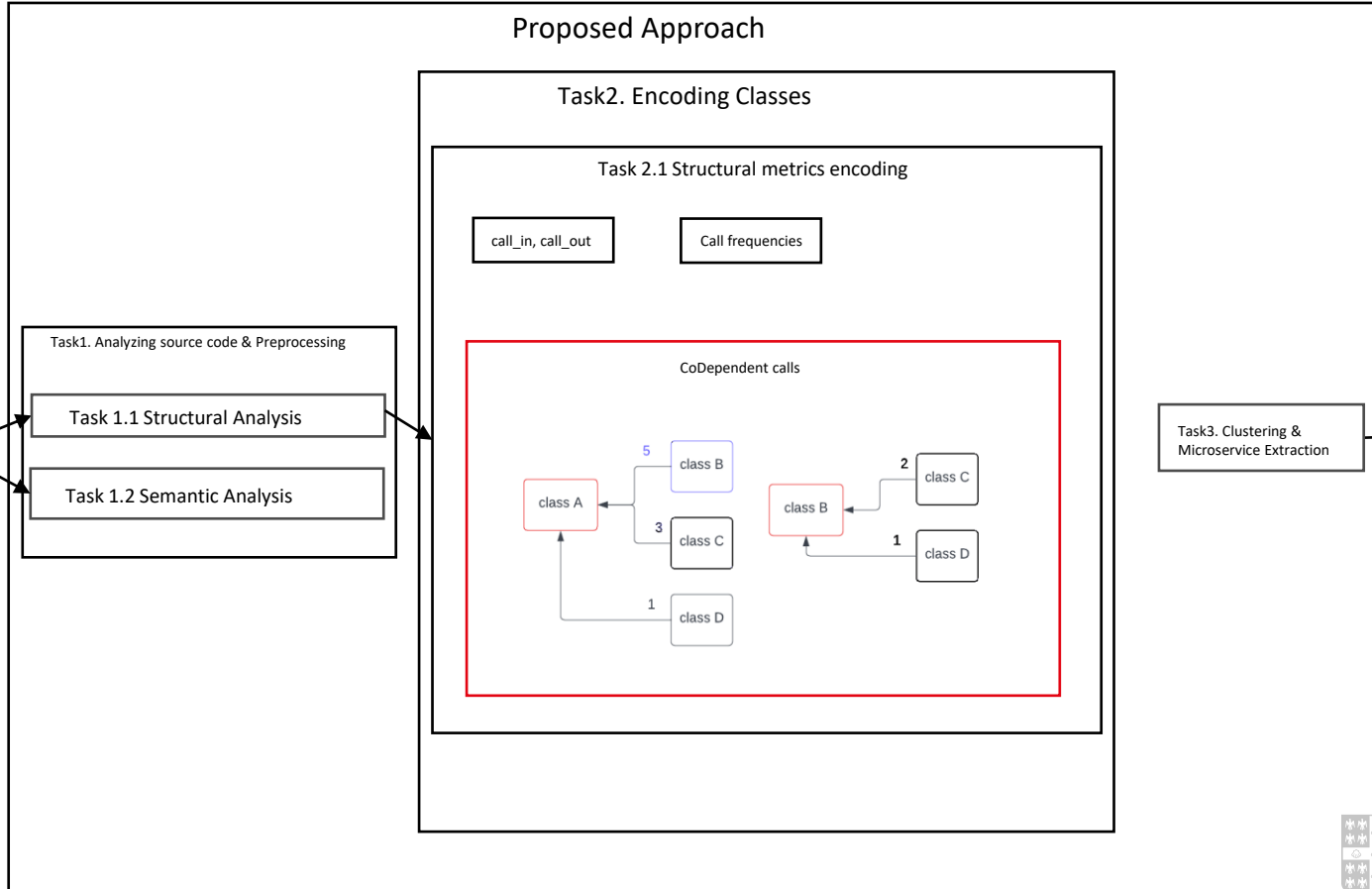
# Proposed Approach 5/10



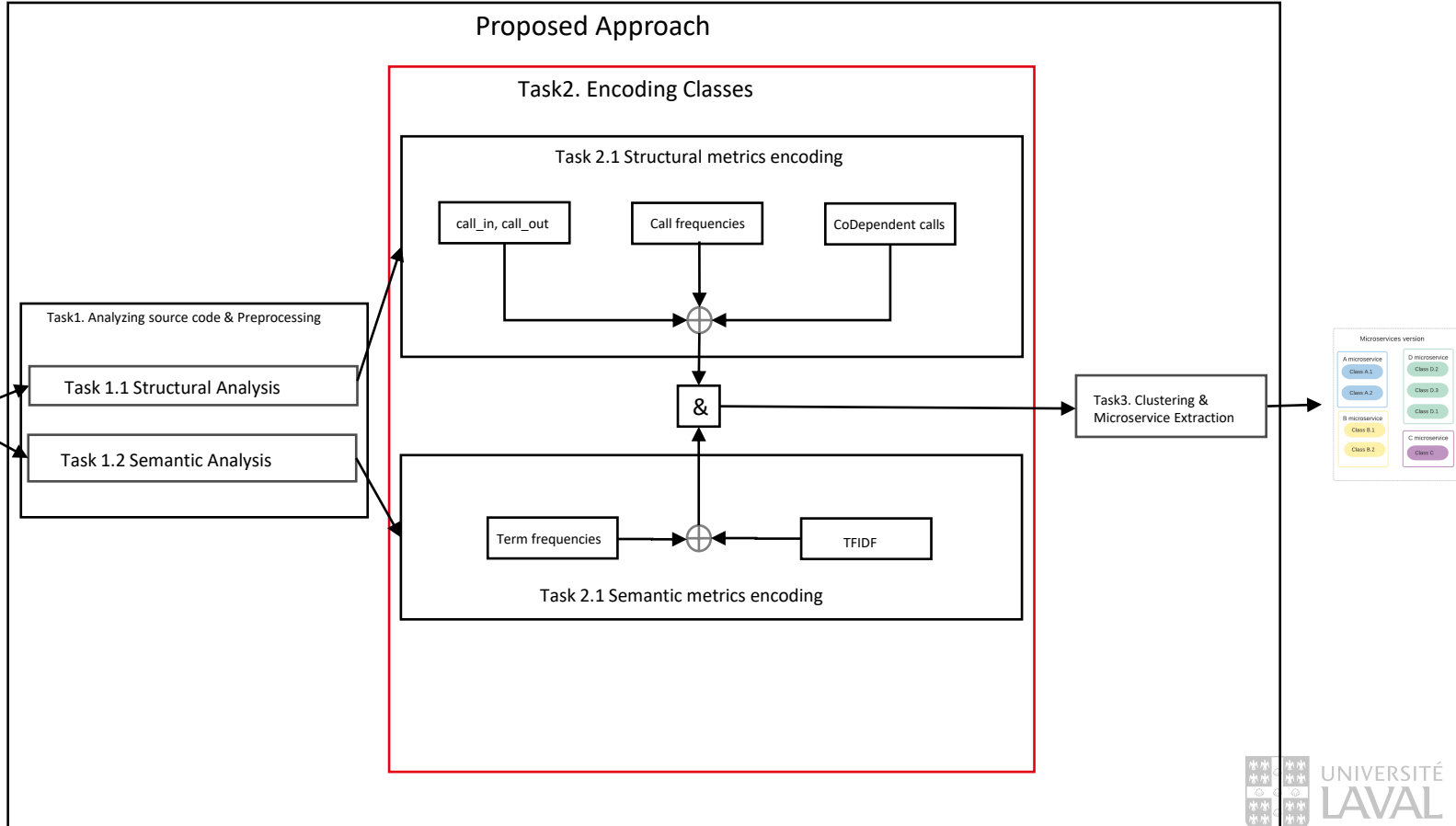
# Proposed Approach 6/10



# Proposed Approach 6/10

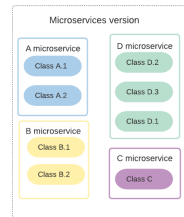
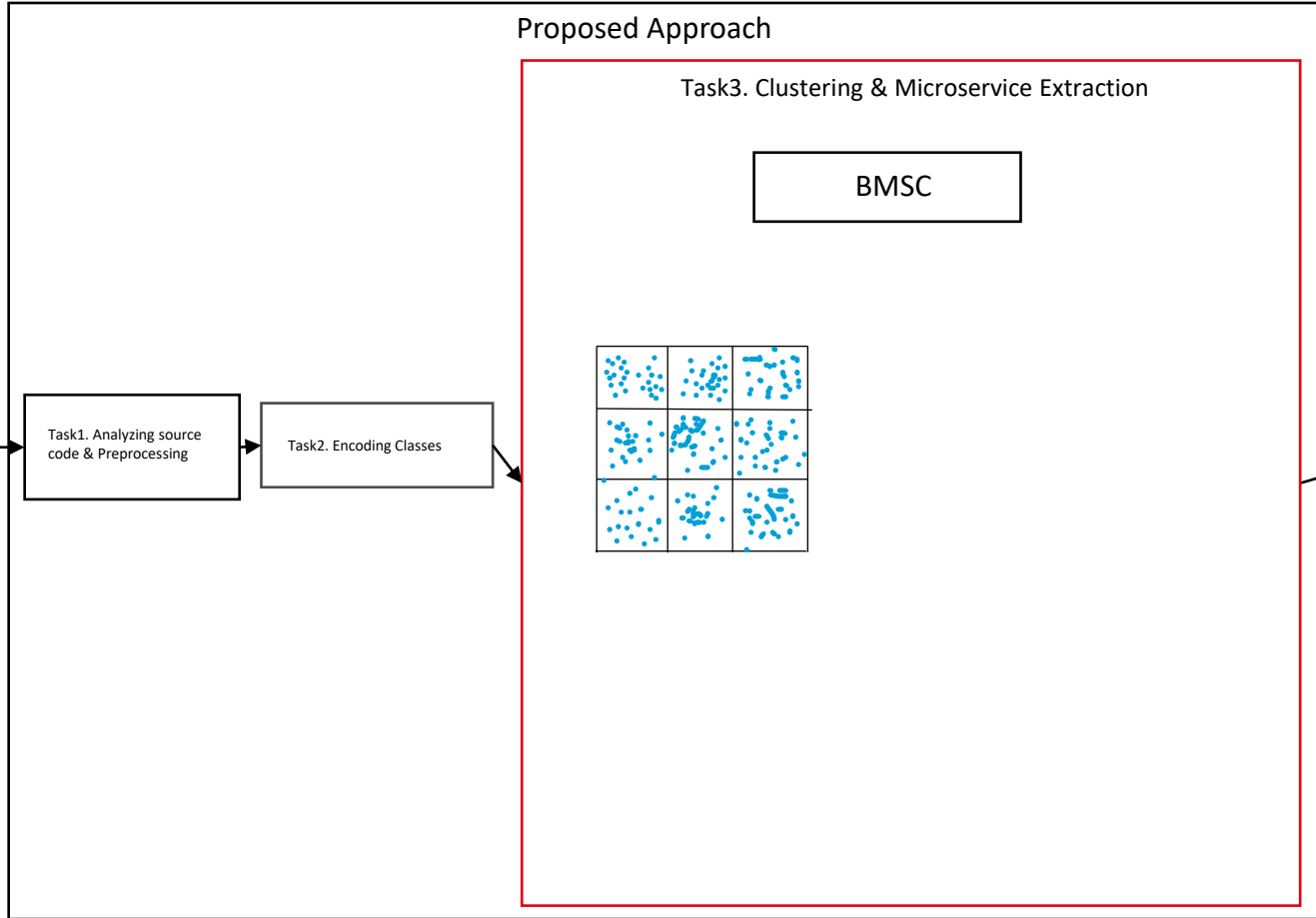


# Proposed Approach 1/10



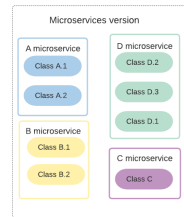
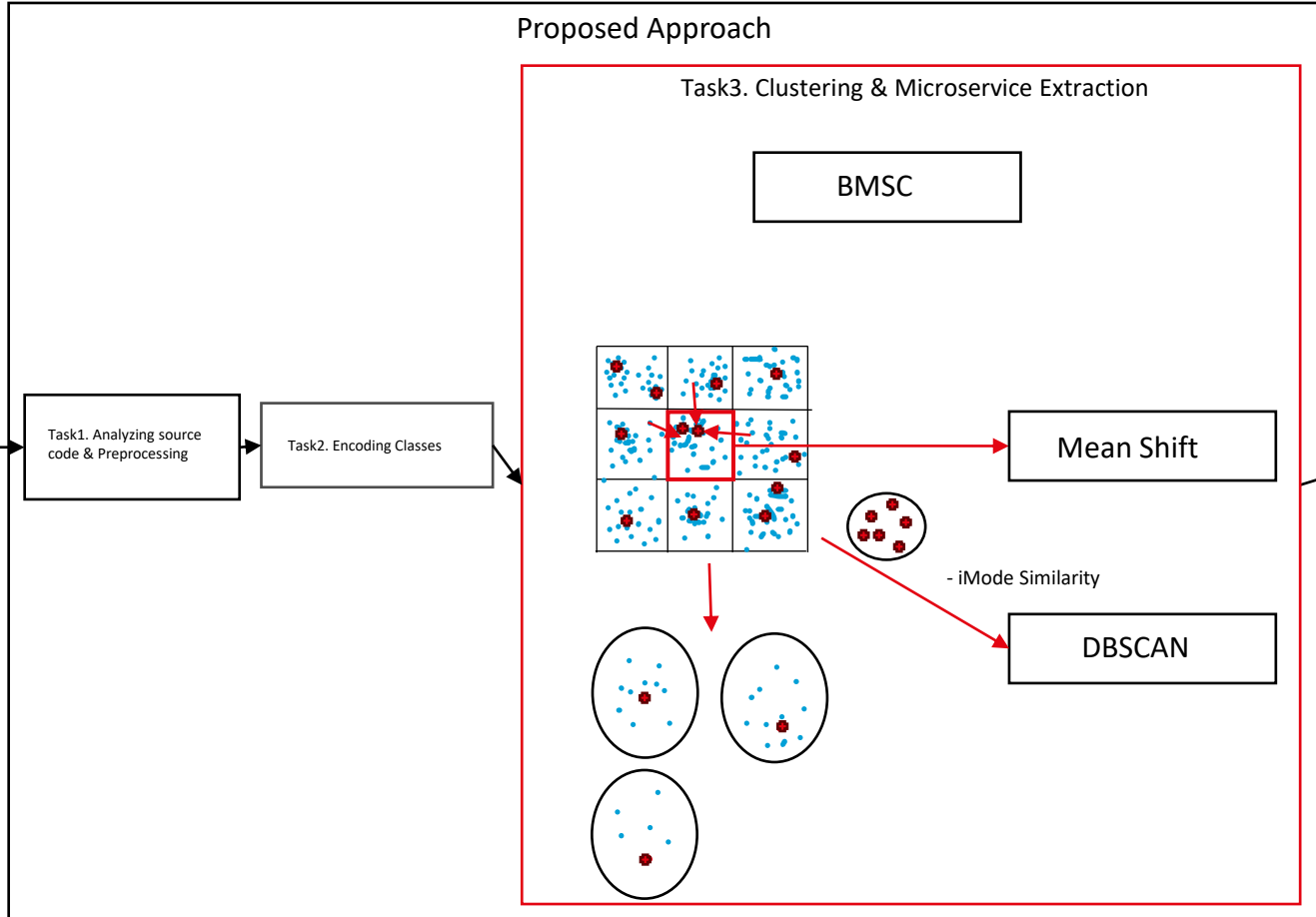


# Proposed Approach 8/10





# Proposed Approach 8/10



# Proposed Approach 9/10

## Proposed Approach

### Task3. Clustering & Microservice Extraction

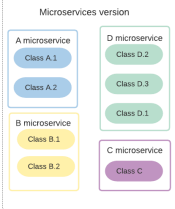
BMSC

Mean Shift

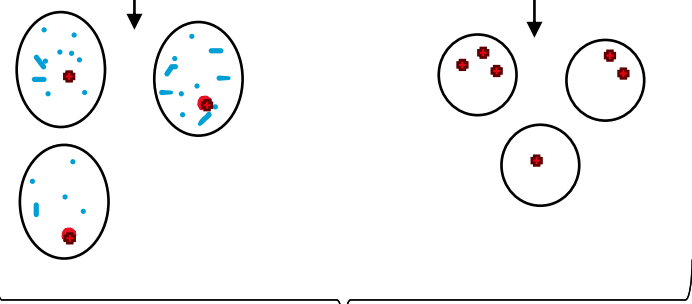
DBSCAN

Task1. Analyzing source code & Preprocessing

Task2. Encoding Classes



```
public void check() {  
    // ...  
}  
  
public void check() {  
    // ...  
}  
  
public void check() {  
    // ...  
}  
  
public void check() {  
    // ...  
}
```



# Proposed Approach 10/10

## Proposed Approach

### Task3. Clustering & Microservice Extraction

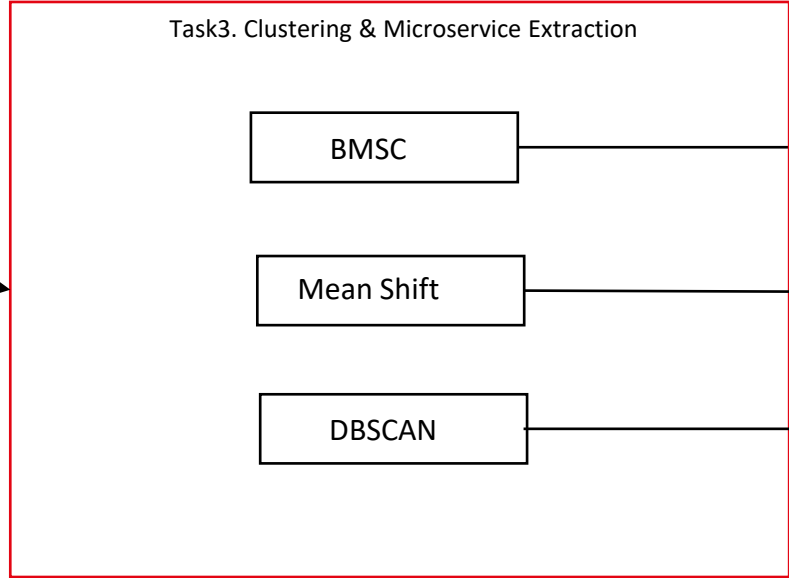
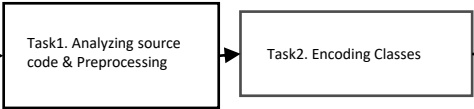
BMSC

Mean Shift

DBSCAN



```
public void initialize() {  
    this.setName("Microservice");  
    this.setUrl("http://localhost:8080");  
    this.setVersion("1.0.0");  
}  
  
public void start() {  
    this.setName("Microservice");  
    this.setUrl("http://localhost:8080");  
    this.setVersion("1.0.0");  
}  
  
public void stop() {  
    this.setName("Microservice");  
    this.setUrl("http://localhost:8080");  
    this.setVersion("1.0.0");  
}
```



What is the most effective and promising option among the various choices in our approach?

Project:

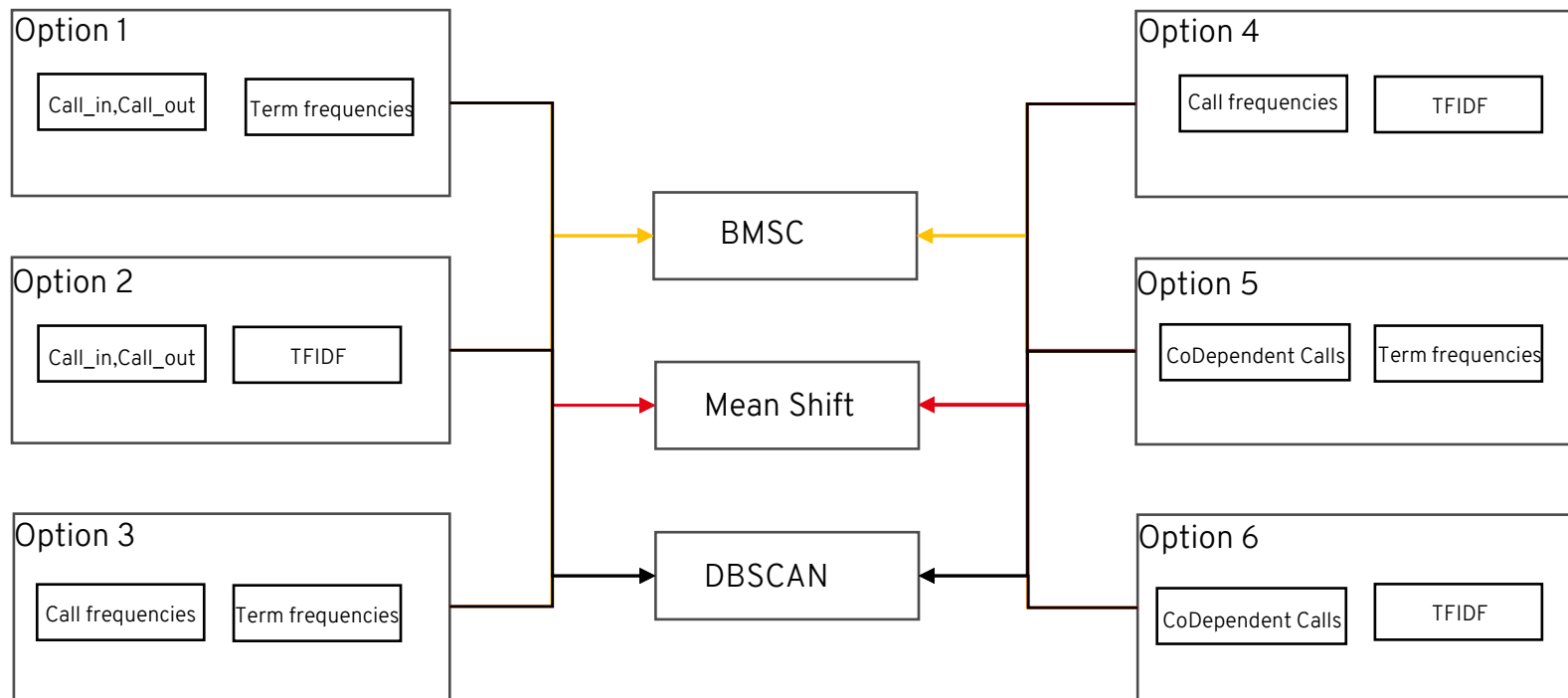
DayTrader: 118 classes



# How can we evaluate the performance of the strategies?: Metrics

- Structural Modularity (SM)
- Inter Call Percentage (ICP)
- InterFace Number (IFN)
- Non-Extreme Distribution (NED)

# What is the most effective and promising option among the choices of our approach?: Protocol



# What is the most effective and promising option among the choices of our approach?: Results

## Evaluation Results using Mean Shift Algorithm

Metrics	Option 1	Option 2	Option 3	Option 4	Option 5	Option 6
SM	0.8526	0.7853	0.7944	0.8614	0.8575	0.8742
IFN	1.235	1.8	1.277	1.0454	1.0	1.214
ICP	1.0	0.9	1.0	1.0	1.0	1.0
NED	1.0	0.9	1.0	1.0	1.0	1.0
# microservices	17	10	18	22	21	14
size of the largest micro	98	102	97	92	97	104

## Evaluation Results using DBSCAN Algorithm

Metrics	Option 1	Option 2	Option 3	Option 4	Option 5	Option 6
SM	0.120	0.1085	0.2702	0.2718	0.2487	0.1116
IFN	0.120	0.1085	0.2702	0.2718	0.2487	0.1116
ICP	0.3244	0.1426	0.1591	0.2859	0.3482	0.0079
NED	0.5	0.666	1.0	0.5	0.5	0.333
# microservices	2	3	2	2	2	3
size of the largest micro	108	86	116	113	113	104

## Evaluation Results using BMSC Algorithm

Metrics	Option 1	Option 2	Option 3	Option 4	Option 5	Option 6
SM	0.3696	0.3435	0.3887	0.4697	0.40545	0.4052
IFN	1.0344	1.250	1.0370	0.9677	1.0769	1.318
ICP	0.6500	0.591	0.618	0.6432	0.6257	0.639
NED	0.7241	0.6666	0.7037	0.7419	0.6538	0.636
# microservices	29	24	27	31	26	22
size of the largest micro	13	13	13	13	16	17



# What is the most effective and promising option among the choices of our approach?: Results

Evaluation Results using Mean Shift Algorithm

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Evaluation Results using Mean Shift Algorithm

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# What is the most effective and promising option among the choices of our approach?: Results

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# microservices	29	24	27	31	26	22
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Option 6 is the optimal approach for all three clustering algorithms. It uses co-dependent calls metric as structural information and TF-IDF vector as semantic information. Consequently, our work will continue to focus on this strategy.

## Evaluation Results using Mean Shift Algorithm

Metrics	Option 1	Option 2	Option 3	Option 4	Option 5	Option 6
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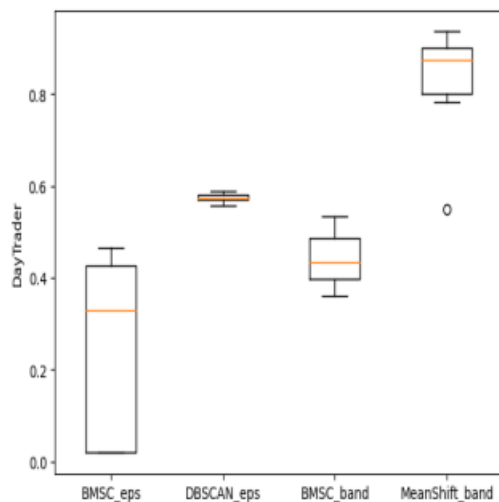
How does the stability and robustness of BMSC algorithms compare to that of Mean Shift and DBSCAN?

Hyperparams:

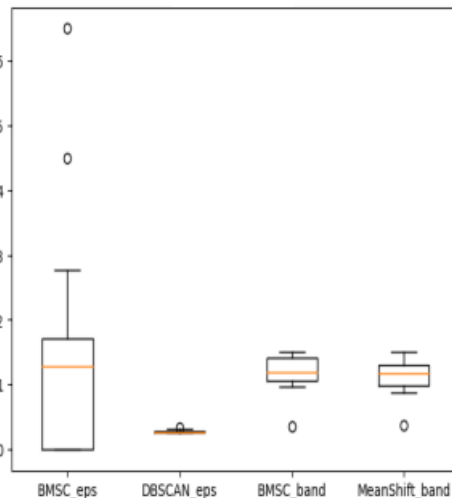
- Bandwidth
- Epsilon
- MinPts =5

# How does the stability and robustness of BMSC algorithms compare to that of Mean Shift and DBSCAN?: Results

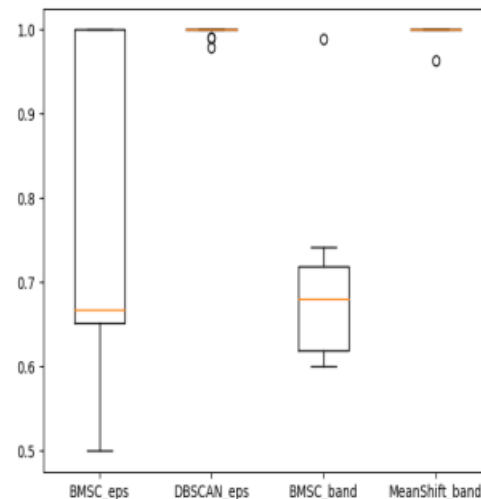
Structural Modularity (SM)



InterFace Number (IFN)

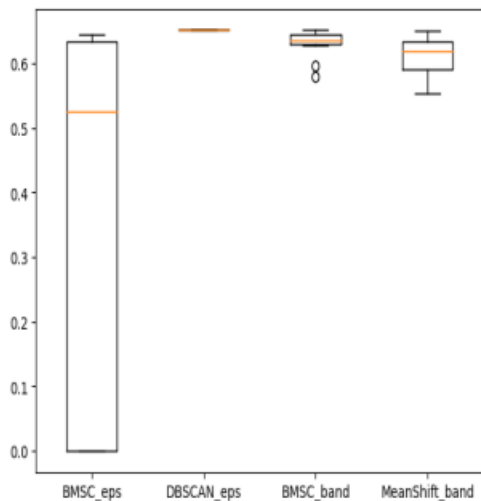


Inter Call Percentage (ICP)

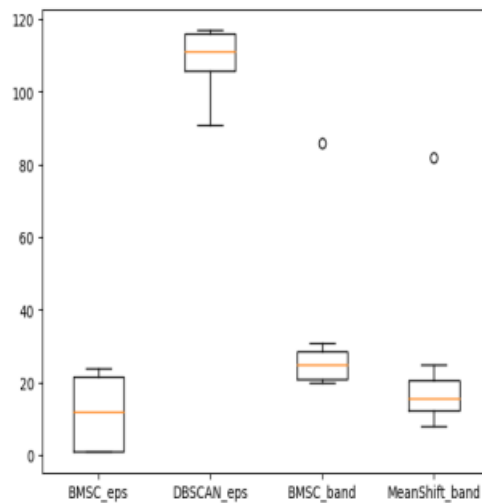


# How does the stability and robustness of BMSC algorithms compare to that of Mean Shift and DBSCAN?: Results

Non Extreme Distribution(NED)



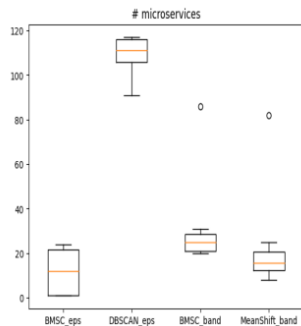
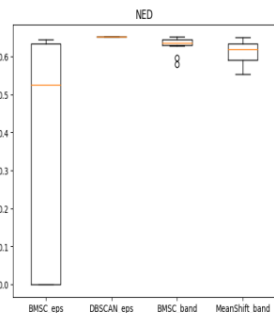
# microservices



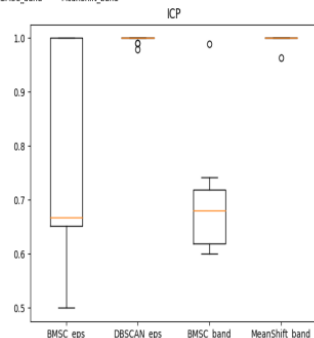
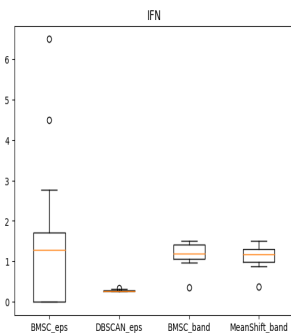
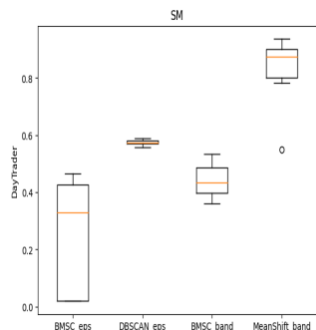


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In contrast to the literature, our analysis suggests that for our case, BMSC is more susceptible to the selection of its hyperparameters, specifically the epsilon parameter, compared to DBSCAN and Mean Shift when used independently. However, BMSC demonstrates greater consistency in the resulting decompositions across hyperparameter variations.



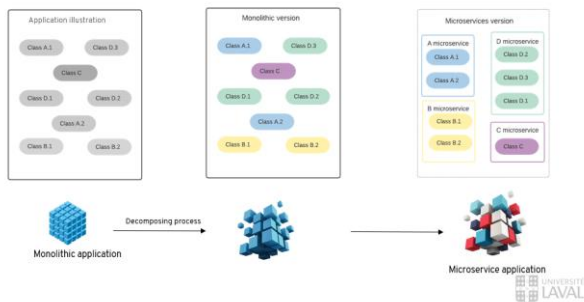
Structural Modularity (SM)

InterFace Number (IFN)

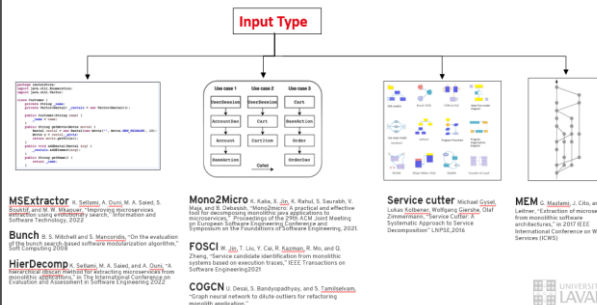
Inter Call Percentage (ICP)

# Conclusion

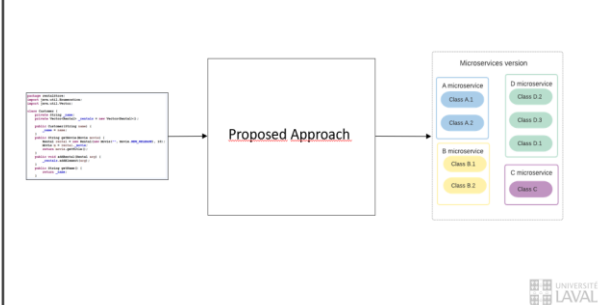
## Context 2/2



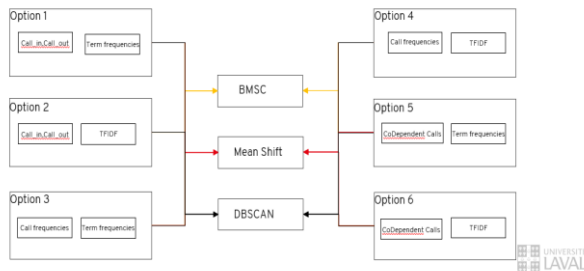
## Related Work 1/2



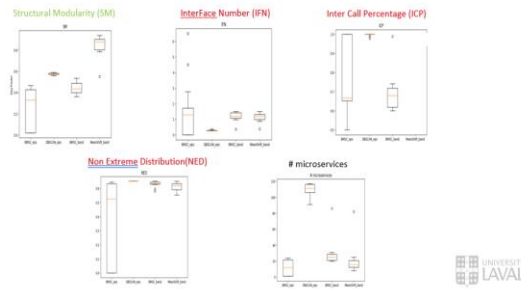
## Proposed Approach 1/2



## What is the most effective and promising option among the choices of our approach?: Protocol



## What is the most effective and promising option among the choices of our approach?: Results



# Questions ?