CacheDOCS: A Dynamic Key-Value Object Caching Service

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Key-Value Store

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Stores pairs of $\{k, v\}$:

k_1	v_1
k_2	v_2
k_3	v_3
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Example - Database Context

```
String sql =
    "SELECT * FROM DATA";
if (cache.contains(sql)) {
    return cache.get(sql);
}
Object result = db.query(sql);
cache.put(sql, result);
return result;
```

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- Caching can be deployed as part of a system
- Or offered as a service in the cloud

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  - put(*"Julien"*, *serialize*(P_1))

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- Assuming player P_1, we must serialize the object to store it
  - put$("Julien", serialize(P_1))$
- Upon P_1 changing (i.e., moving), then we must reserialize P_1:
  - put$("Julien", serialize(P_1))$

Retrieving an Object

Player.java

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Assuming a game with many players, which are cached:

Retrieving a cached player

```java
Player p;
while(true) {
    p = unserialize(cache.get("Julien"));
    sleep(100);
}
```

Complex Object

Designing a Collaborative Drawing Application

```
public class Drawing {
    Color[][] pixels;

    void drawLine(int x1, int y1, int x2, int y2, Color color);
    void drawRectangle(int x1, int y1,
        int x2, int y2, Color color);
    void fill(int color);
    void getPixel(int x, int y) { return pixels(x,y); };
} //...
```

CacheDOCS

CacheDOCS - Object Caching as a Service:

Large-Scale Games

- Many players & in-game objects
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- Increasing scalability

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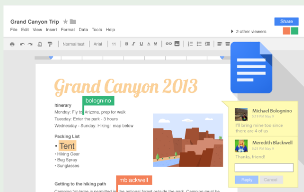
Collaborative Document Editing



- Hosting many live documents (several millions)
- Many users can collaborate on the same document
- Increasing scalability

High-Level Architecture

1. Motivation
2. High-Level Architecture
3. Update Propagation
4. Implementation & Evaluation
5. Conclusion

Object Caching as a Service

CacheDOCS API

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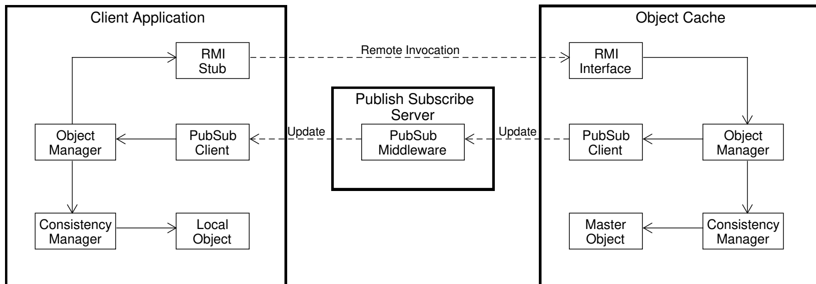
Publish/Subscribe (Topic-Based)

Use pub/sub to disseminate updates of cached objects to interested clients:

- `getAddSubscribe`(k) $\Rightarrow$ `subscribe`(k)
- v is modified $\Rightarrow$ `publish`(k,"v")

Architecture



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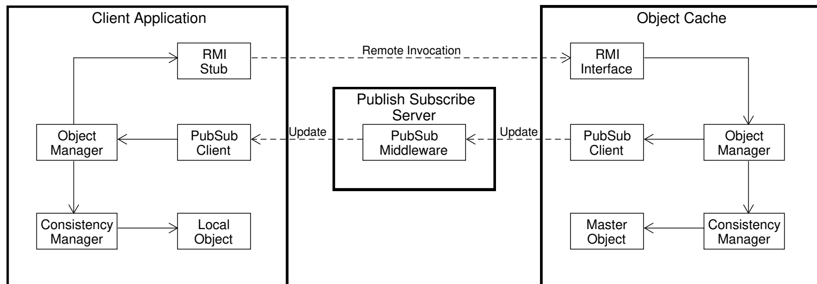

Object Cache

- Caches Java Objects ($\{k, v_r\}$ pairs)
- Holds the *masters* (v_r)
- Exposed through RMI
- Pub/Sub Interface
  - Push changes to objects

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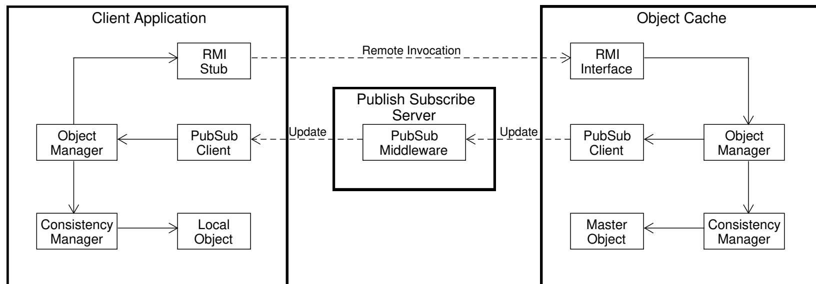

Client Application

- get(k), put(k, v), getAddSubscribe(k)
- Maintains local copies v_l of cached objects
- Synchronizes changes with master objects (v_r)

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Update Propagation

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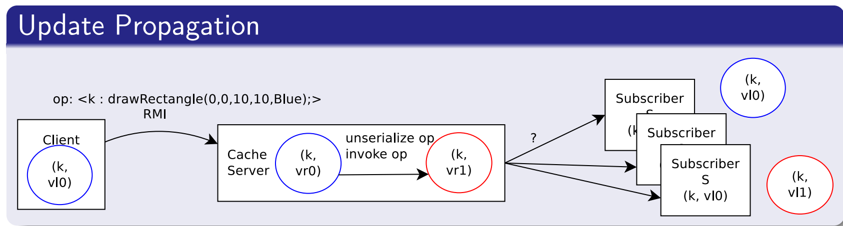
Propagating Updates

Method invocation sent to master.
Upon the state of a cached object $\{k, v_r\}$ changing:

Update Propagation



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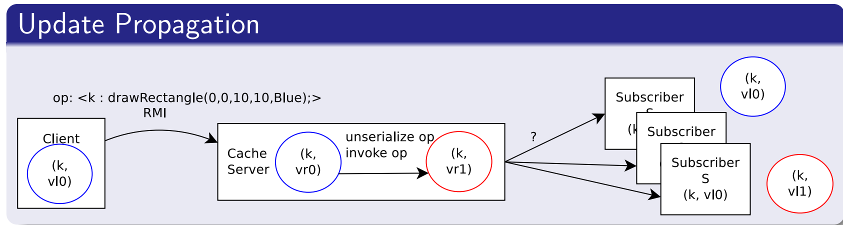

Propagating Updates

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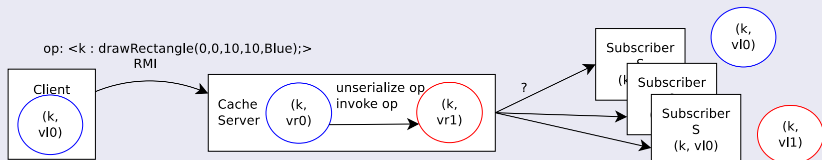
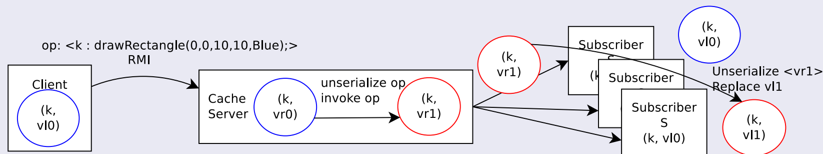
- Four different propagation strategies

Update Propagation



1- Serialized Update Strategy

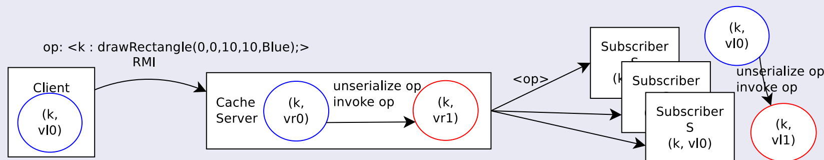
Principle - Serialized Update Strategy



1. v_{r1} serialized and sent to all $S \in \mathbb{S}$
2. All S deserialize v_{r1}, and replace v_{l0} by v_{r1} in the local cache

2- Operation Update Strategy

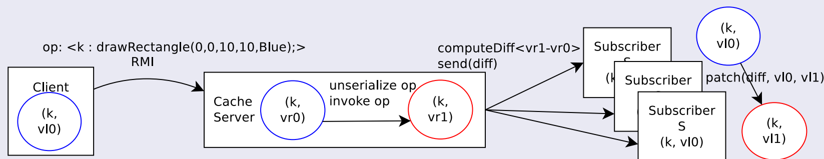
Principle - Operation Update Strategy



1. Operation serialized and sent to all $S \in \mathbb{S}$
2. All S unserialize and execute the operation on v_{l0} to obtain v_{l1}

3- Binary Diff Update Strategy

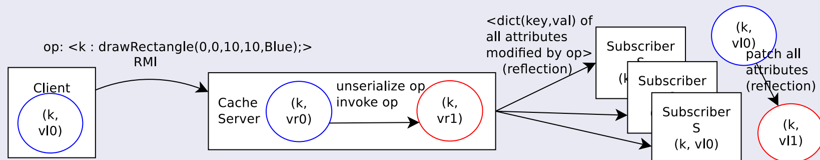
Principle - Binary Diff Update Strategy



1. Cache serializes v_{r0} and v_{r1} computes the binary diff $v_{r0} \rightarrow v_{r1}$
2. Binary diff sent to all $S \in \mathbb{S}$
3. All S patch the serialized v_{l0} with the diff, and deserialize to obtain v_{r1}

4- Attribute Patch Update Strategy

Principle - Attribute Patch Update Strategy



1. Cache sends dict of modified attributes ($v_{r0} \rightarrow v_{r1}$) to $S \in \mathbb{S}$
2. All S patch v_{l0} with the new attributes to obtain v_{l1}

Handling Concurrency

- S_1: Local object at state v_{l0}
- S_2: Local object at state v_{l0}
- Cache: Object at state v_{r0}

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- S_2 receives update and patches to version 1 (v_{l1})
- S_2 can retry the operation

Implementation & Evaluation

1 Motivation

2 High-Level Architecture

3 Update Propagation

4 Implementation & Evaluation

5 Conclusion

Implementation

- Implementation in Java
- Supports the caching of Java objects
- RMI-based API and client-side library
- Dynamoth Pub/Sub service over Redis for update propagation

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Future Work

Global performance & scalability of CacheDOCS with many clients in the cloud

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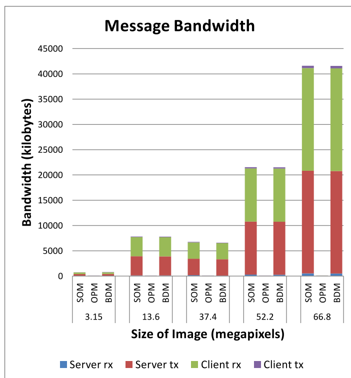

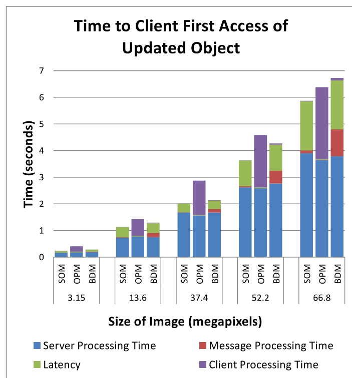

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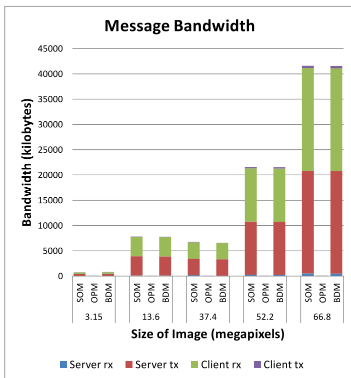

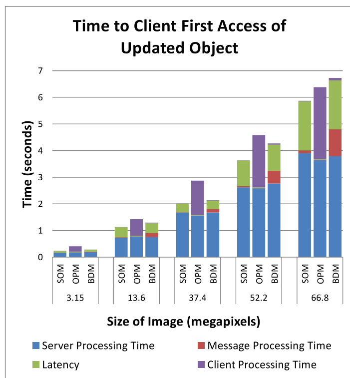

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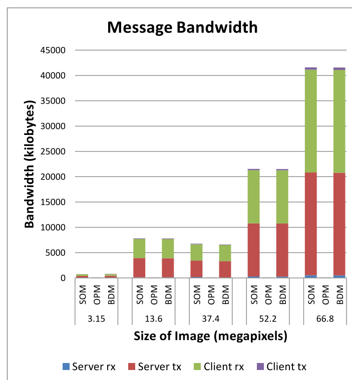

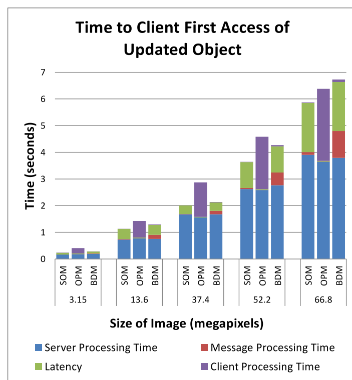

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2) Sending Operation <u>Low bandwidth, slightly higher time</u>

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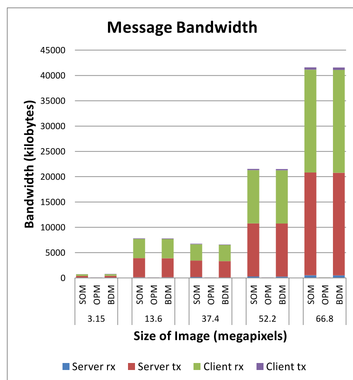

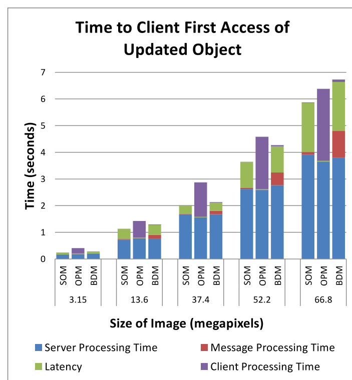

1) Sending Serialized Object High bandwidth
2) Sending Operation Low bandwidth, slightly higher time
3) Sending Binary Diff High bandwidth (rotation affects all pixels)

Conclusion

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Conclusion and Future Work

Contributions

- Caching of full dynamic (Java) objects
- Invokation of remote operations over local copies of cached objects
- Forwarded to the master cached copy
- Push-based dissemination of updates: several strategies
- Consistency management
- Experiments with 3 different use cases

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Future Work

- Better support for object nesting & inter-object links
- Testing & optimizing CacheDOCS in the cloud (large-scale)
- Dynamic selection of best propagation strategy

Invoking Methods

Invoked over synchronized copy v_l of cached object v_r with key k.

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Drawing Class Example

```
void drawLine(int x1, int y1, int x2, int y2, Color color); // Type B
void drawRectangle(int x1, int y1,
    int x2, int y2, Color color); // Type B
void fill(int color); // Type B
void getPixel(int x, int y) { return pixels(x,y); }; // Type A
```

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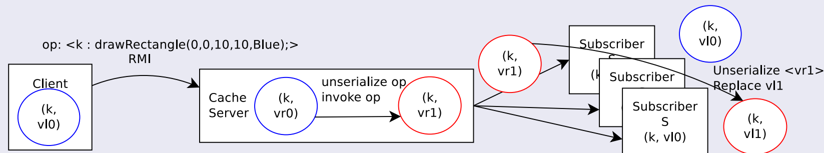
Principle - Serialized Update Strategy



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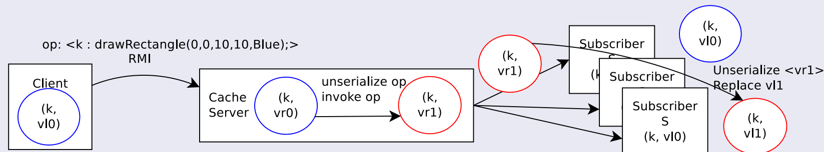

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  - CPU Intensive operations
- For small objects:
  - Low propagation time
  - Low bandwidth

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op: <k : drawRectangle(0,0,10,10,Blue);>
RMI
Client
(k, vl0)
Cache Server
(k, vr0)
unserialize op
invoke op
(k, vr1)
(k, vr1)
Subscriber
Subscriber
Subscriber S
(k, vl0)
(k, vl0)
Unserialize <vr1>
Replace vl1
(k, vl1)

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Cons

- Large objects:
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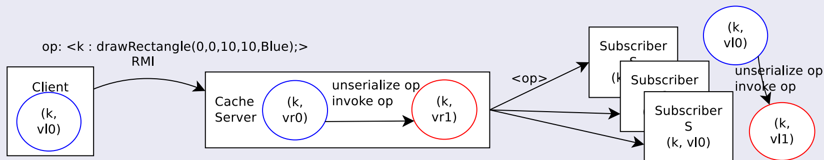
  - Long propagation time
  - High bandwidth

2- Operation Update Strategy

Principle - Operation Update Strategy



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2. All S unserialize and execute the operation on v_{l0} to obtain v_{l1}

2- Operation Update Strategy

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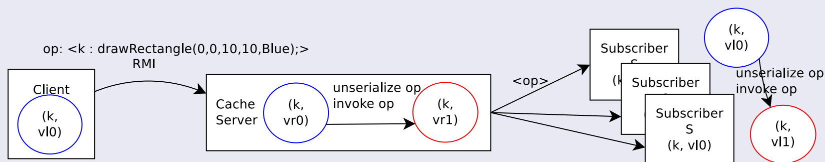

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  - They don't have to be serialized
  - Example: *Drawing* class

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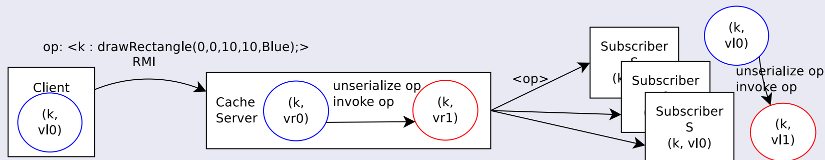

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Pros

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  - They don't have to be serialized
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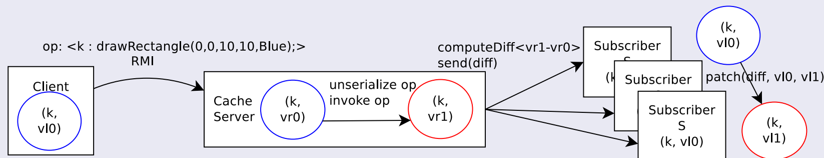
Cons

- If the operation takes a long time to execute
  - Execution will occur twice (cache & client-side)

3- Binary Diff Update Strategy

Principle - Binary Diff Update Strategy



1. Cache serializes v_{r0} and v_{r1} computes the binary diff $v_{r0} \rightarrow v_{r1}$
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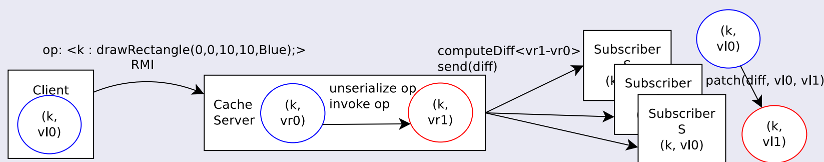

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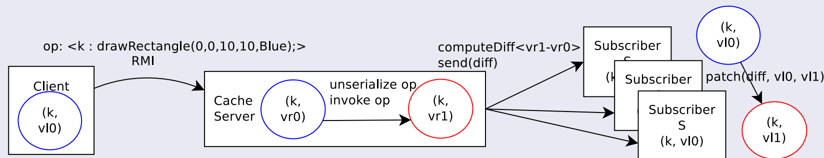

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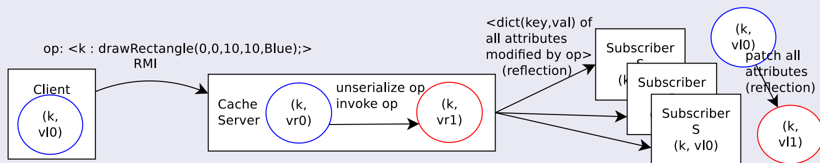
Cons

- Can be CPU-costly and thus can take time

4- Attribute Patch Update Strategy

Principle - Attribute Patch Update Strategy



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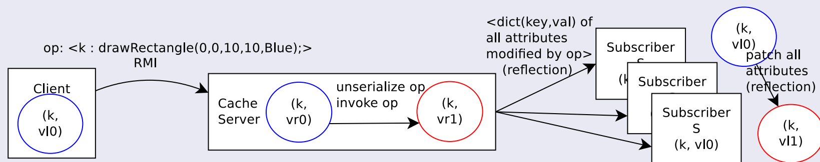

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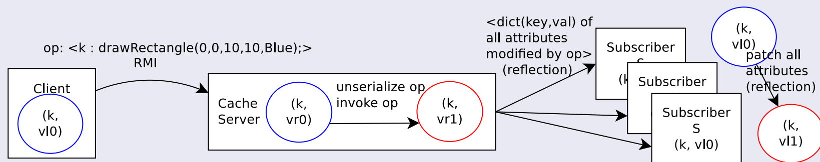

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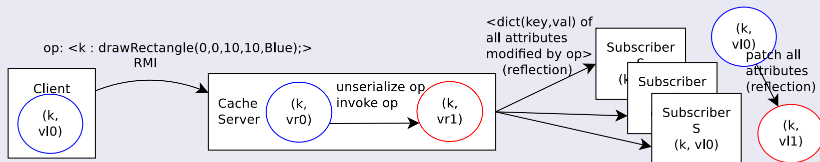

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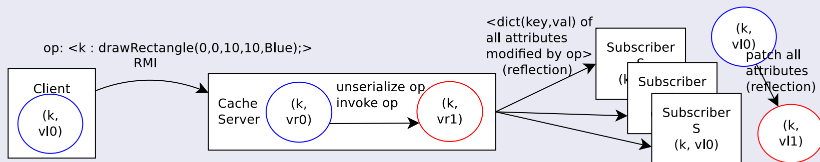

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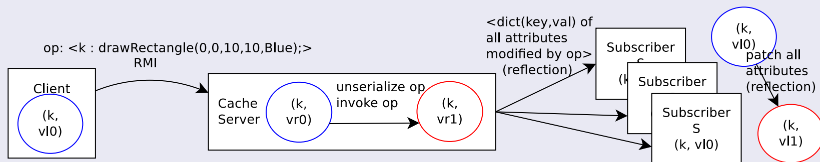

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Experiment 2 - Maze Multiplayer Game Pathfinding

- Cache: stores *mazes* which contain cells and players
- Client: performs a "movePlayer" operation ⇒ pathfinding to check if move legal. If yes, player position changed. Attributes: {list of all players}.

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Bandwidth (kilobytes)

Size of Maze (cells^2)

Server rx, Server tx, Client rx, Client tx

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Time to Client First Access of Updated Object

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Server Processing Time, Message Processing Time, Latency, Client Processing Time

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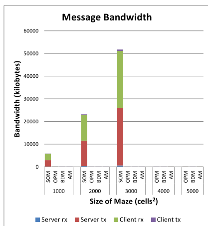

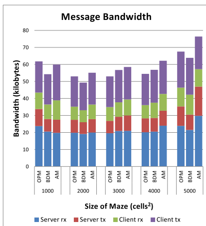

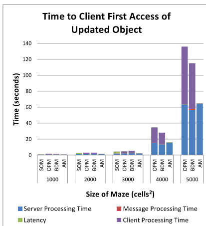

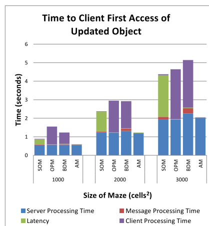

1) Sending Serialized Object Very high bandwidth (n^2 #cells)

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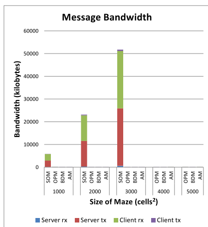

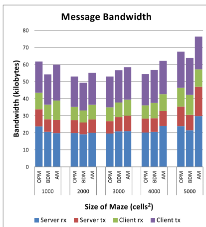

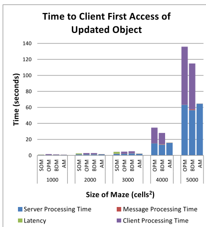

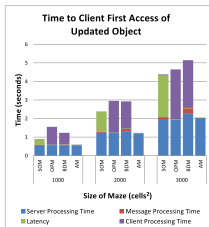

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2) Sending Operation Very low bandwidth, high execution time

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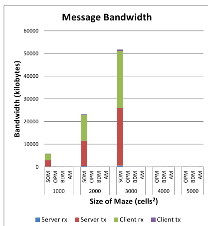

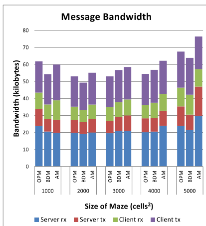

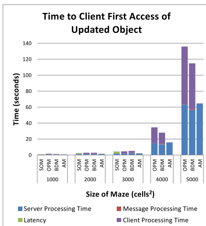

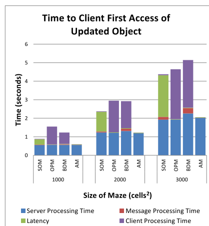

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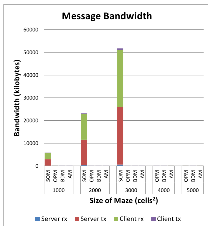

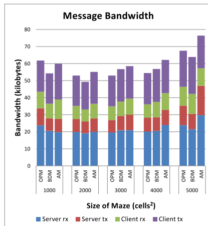

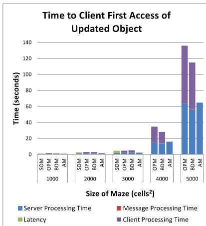

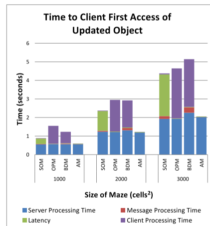

1) Sending Serialized Object Very high bandwidth (n^2 #cells)
2) Sending Operation Very low bandwidth, high execution time
3) Sending Binary Diff Very low bandwidth, high execution time
4) Sending Attributes <u>Very low bandwidth, low execution time</u>

Experiment 3 - Collaborative Spreadsheet Editing

- Cache: stores *spreadsheets*: list of cells with values or formulas.
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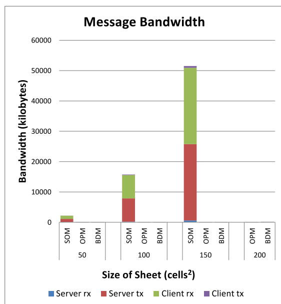

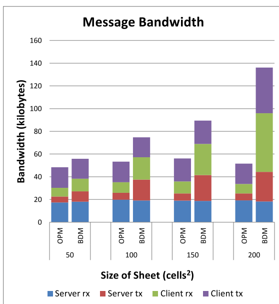

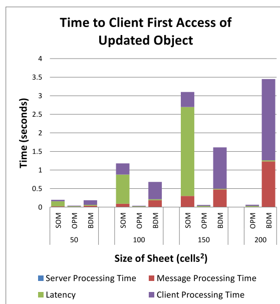

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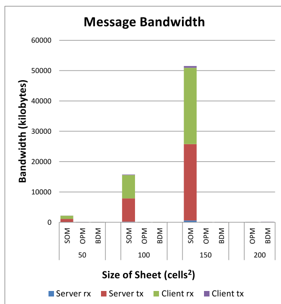

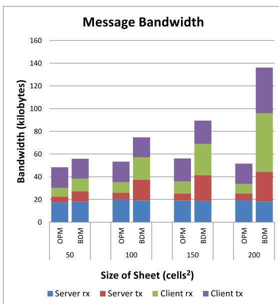

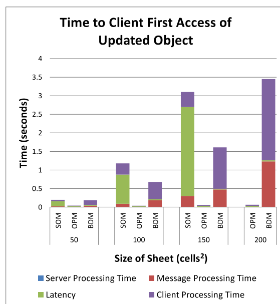

1) Sending Serialized Object Huge bandwidth (n^2) and time

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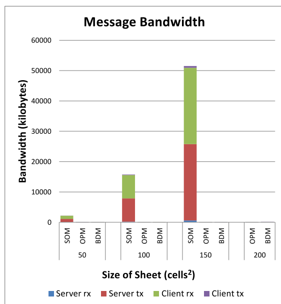

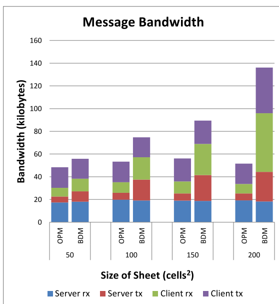

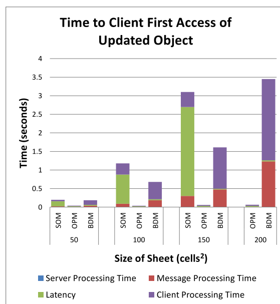

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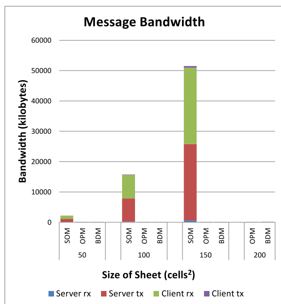

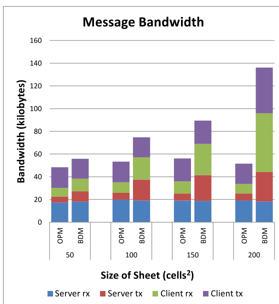

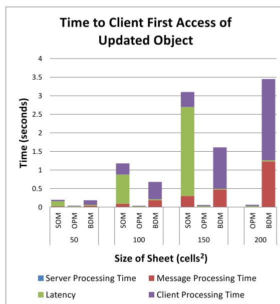

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3) Sending Binary Diff Low bandwidth, high execution time (small diff but long to compute)

Sources for images

- http://learningworksforkids.com/wp-content/uploads/WoW-screen-2.jpg
- https://lh4.googleusercontent.com/yUAOWyj2Gt_oVbLjJpPQnhX1C IrwBvPAmPx6pnaihOxg9VRHZt7p28g5qUUbO013b6If-Mw=s640-h400-e365