## New Approximation Results for Resource Replication Problems

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## Resource Replication Problem



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## Min Sum Objective

## MIN SUM COST: 95



## Min Max Objective

## MIN MAX COST: 20



## Objectives

- Min Sum
- An LP based I0 approximation by Baev, Rajaraman and Swamy[SODA 200I, SIAM J. Compt. 2008].
- Not covered in this talk
- Min Max distance
- Studied by Ko and Rubenstein[2003,2004].
- This is the subject of current talk.


## Motivation: Resource Replication

- Need of data replication arises in many contexts
- File replica distribution
- Reduce retrieval time: improves data locality
- Fault tolerance
- Distributed computation
- Distribution of loads: improves latency
- Channel allocation in wireless networks
- Channel capacity can improve if nodes assigned to the same channel are far apart: reduce interference


## Resource Replication

- Basic Problem:
- Given K resources, N servers to host resources. Each client needs every resource.


Edge denotes distance I. Shortest Path Metric.

- Goal: minimize the maximum distance each client needs to travel to get all the required resources.


## Resource Replication Problem

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## Basic Resource Replication Problem

- Studied by Ko and Rubenstein[ICNP 2003]
- Distributed 3 approximation using local search
- Local search may not converge in polynomial time
- We give a very simple 3 approximation which can be implemented in a distributed scenario as well.
- Idea: Extending threshold graph technique for k center type algorithms


## Ko and Rubenstein Algorithm

- Local Search Step-



## Ko and Rubenstein Algorithm

- Local Search Step-

- Guaranteed to give a 3 approximation. Not polynomial time.


## our Results.

| Problem <br> Variant | Approx. Achieved | Hardness of Approximatio n | Description |
| :---: | :---: | :---: | :---: |
| Basic Resource Replication (BRR) Problem | 3 approx. | No 2- $\varepsilon$ approx. possible | Every node requires every resource. Each node can store exactly one resource type. |
| Subset Resource Replication (SRR) Problem | 3 approx. | No 3- $\varepsilon$ approx. possible | Nodes require arbitrary subset of resource types. Each node has designated capacity. |
| BRR with Outliers | 3 approx. | No 2- $\varepsilon$ approx. possible | Same as BRR. Need to satisfy at least M nodes. |

## Our Results (Contd.)

| Problem | Approx. <br> Achieved | Hardness of <br> Approximation | Description |
| :--- | :--- | :--- | :--- |
| SRR with Outliers | None | NP-Hard to <br> approximate within <br> any non-trivial <br> approx.. | Same as SRR. <br> Need to satisfy at <br> least M nodes. |
| BRR with Load <br> Balancing | 4 approx. with <br> a violation of <br> load capacity of <br> factor 2. | No 2- $\varepsilon$ arpprox. | Same as BRR. <br> Each server can <br> serve at most k <br> clients. |

## Our Algorithm

- Based on the threshold graph technique - Similar to the k-center.
- 3 approx. in polynomial time.
- Can be implemented in a distributed fashion.


## Graph $G$ and resources $\{R, G, B\}$



## Guess the optimal distance $\delta$ and Construct threshold graph.



- Keep picking nodes and delete nodes within two hops.

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- Place k resources in each vertex of MIS's delta neighborhood.



## Why does it work ?

- Every vertex is within 2 hops of MIS.
- Each vertex in MIS has degree at least k-I.
- Placing colors on MIS and neighbors makes sure that every vertex has every color within 3 hops.
- Hence, we obtain a 3 approximation.


## Subset Resource Replication Problem

- Want all SUBSET of colors.
- Can store one $s_{v}$ colors per server
- Same Min Max objective.
- Also studied by Ko and Rubenstein[2004]
- their heuristic does not provide any approximation guarantee.


## Given G and resources $\{\mathrm{R}, \mathrm{G}, \mathrm{B}\}$



## Guess $\delta \rightarrow$ threshold graph



## Decompose into sub-graphs.



## Compute MIS for each color graph



## Compute a matching



## Compute a matching



## Compute a matching



## Assigning the colors.



## Subset Resource Replication Problem

- Theorem 1: There exists a polynomial time 3approximation algorithm for the Subset Resource Replication problem.


## (3- $\varepsilon$ ) Hardness of Approximation

- Reduction from One Sided Domatic Number Problem (Feige, Halldorsson, Kortsarz and Srinivasan).
- Similar to the dominating set based reduction for the k-center problem.
- A similar reduction from Domatic Number Problem gives a (2- $\varepsilon$ ) hardness of approximation for Basic Resource Replication Problem.


## One Sided Domatic Number.



## One Sided Domatic Number.



## Reduction:



Blue Nodes:
Require all colors.
0 Capacity
Distance Metric:
Each edge - I
Anti edge - 3

Other Vertices:
Unit capacity.
No resource required

## Outlier Version

- Basic Resource Replication problem
- 3-approximation
- Basic Resource Replication problem with bounds on number of replicas of each resource
- 5-approximation
- Subset Resource Replication problem
- No nontrivial approximation factor unless $\mathrm{P}=\mathrm{NP}$


## Outlier Version: Robust Subset Resource Replication Problem (RSRR)

- Theorem : Assuming $P \neq N P$, there is no polynomial time algorithm which gives a positive approximation ratio for Robust Resource Replication Problem.
- A polynomial time reduction of the densest k-subgraph problem to the problem of deciding the "feasibility" of RSRR.


## Robust Subset Resource Replication Problem (RSRR)

- Decision version of densest k-sub-graph problem:
- Instance $\mathcal{I}=(G=(V, E), k, L),|V|=n,|E|=m$, decide if in $G$, there exists a sub-graph of size k containing $L$ edges.
- Construct an instance of RSRR as follows:

$V_{1}:$ for k vertices in densest k-subgraph $\quad V_{2}:$ for $m$ edges


## Robust Subset Resource Replication Problem (RSRR)

- Construct an instance of RSRR as follows:


Color set contains one color for each vertex of G.

## Future Direction

- Studying other objectives such as Min Sum with bound on number of replicas/ cost for replication
- Extending Load constraint to Subset Resource Replication problem/ Matching lower and upper bound for Basic Resource Replication Problem etc.

Questions ?

