

Adapting MapReduce for Efficient Watermarking of Large Relational Dataset

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TrustCom, 2017

Outline

- 1 Introduction
- 2 Related Works
- 3 Motivations and Contributions
- 4 Preliminaries
- 5 Proposed Approach
- 6 A Case Study: Transforming Sequential to MapReduce
- 7 Experimental Results
- 8 Conclusions and Future Works
- 9 References

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- **U.S. health care data** - 150 exabytes (10^{18}) in 2011 [Raghupathi and Raghupathi, 2014].
- **Large volume of data** [Russom, 2013]:
 - $> 20\% = \text{structured}$
 - stored in relational databases.
- **Vulnerabilities** [Halder et al., 2010]:
 - copyright infringement
 - data tampering
 - integrity violations
 - illegal redistribution
 - ownership claiming
 - piracy, etc.

Introduction

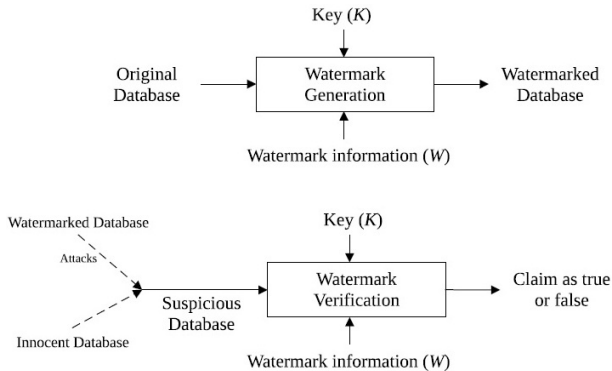
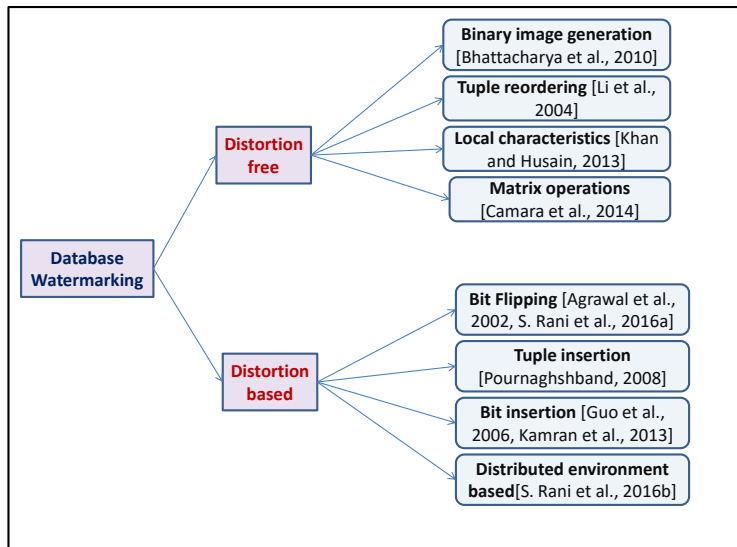


Figure: Database Watermarking

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Distortion based schemes

Proposed schemes	Watermark information	Cover type	Verifiability	Intent
AHK algorithm [Agrawal et al., 2002]	Meaningless bit pattern	Numeric	Blind, private	Ownership proof
Fake tuple-based [Pour-naghshband, 2008]	Fake info obtained from db content	Database table	Blind, private	Ownership proof
Fake attribute-based [Prasanakumari, 2009]	Database content	Database table	Blind, private	Tamper detection

Distortion free schemes

Proposed schemes	Watermark information	Cover type	Verifiability	Intent
Permutation based [Li et al., 2004] [Bhattacharya et al., 2009]	A part of group level hash value	Tuples positions	Blind, private	Tamper detection
Binary form relation [Li and Deng, 2006] [Halder and Cortesi, 2010]	Relation in binary form	Nil	Blind, public or private	Tamper detection and ownership proof
Characteristic based [Khan and Husain., 2013]	Frequency distribution of digit count,length and range of data values	Numeric	Blind, private	Tamper detection and nature of tampering
Database Content [Camara et al., 2014]	Determinant and minor of group matrix	Numeric	Blind, private	Tamper detection

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- Sequential watermark processing for large scale dataset $\Rightarrow$ Inefficient.
- Periodic rewatermarking $\Rightarrow$ Impractical
- Distributed embedding and detection is important.

- Adapted Mapreduce for processing large dataset.
- Presented a case study for transforming sequential to MapReduce based watermarking.
- The experimental results $\Rightarrow$ improvements in performance.

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MapReduce

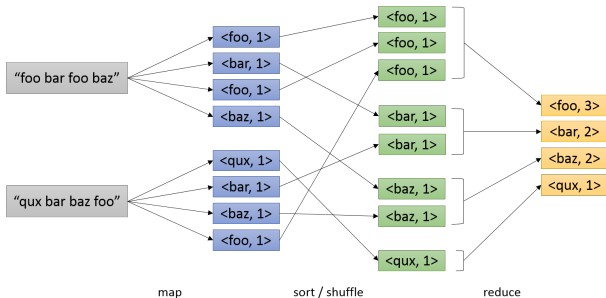


Figure: Word frequency computation [Dean and Ghemawat, 2008]

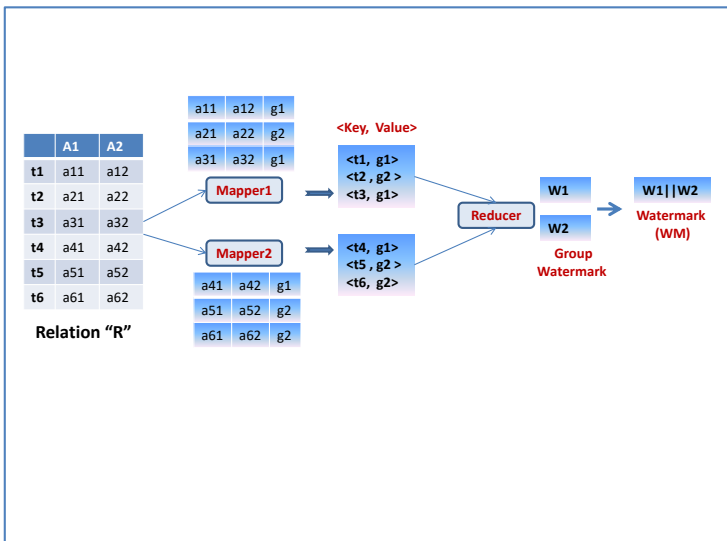
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Watermark Generation using MapReduce

- We consider distortion-free watermarking
- **Primary phases:**
 - 1 Partitioning of tuples into groups
 - 2 Watermark generation from each group
 - 3 Final watermark - generated by combining the group watermarks.

Watermark Generation using MapReduce



Watermark Generation using MapReduce

Algorithm 1 Watermark Generation: MAPPER

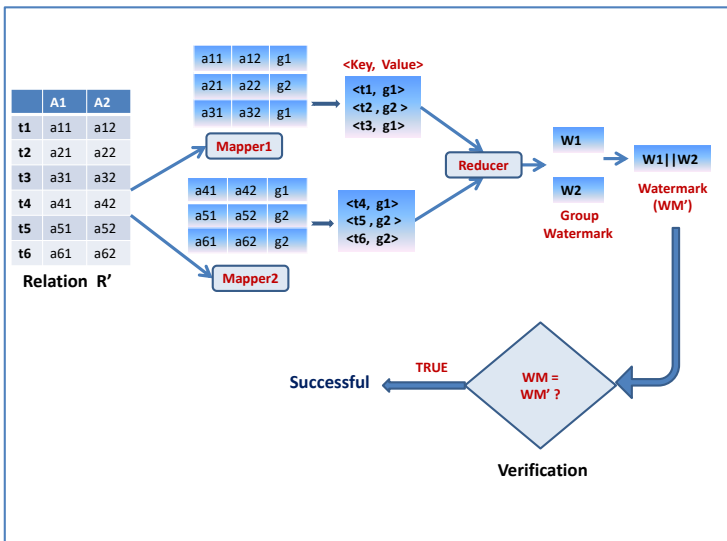
```
1: procedure MAP ( $R$ )  
2:   for each tuple  $t \in R$  do  
3:     Compute  $g_{id} = f(t)$   
4:     emit ( $g_{id}, t$ )  
5:   end for  
6: end procedure
```

Algorithm 2 Watermark Generation: REDUCER

```
1: procedure REDUCE ( $g_{id}, list := [t_1, t_2, \dots]$ )  
2:   Compute watermark  $W_g$  for  $g_{id}$  using  $list$   
3:   emit ( $g_{id}, W_g$ )  
4: end procedure  
5: Compute  $W = ||W_g$ 
```

Figure: Watermark Generation algorithm using MapReduce

Watermark Detection using MapReduce



Watermark Detection using MapReduce

Algorithm 3 Watermark Detection: MAPPER

```
1: procedure MAP ( $R'$ )
2:   for each tuple  $t \in R'$  do
3:     Compute  $g_{id} = f(t)$ 
4:     emit ( $g_{id}, t$ )
5:   end for
6: end procedure
```

Algorithm 4 Watermark Detection: REDUCER

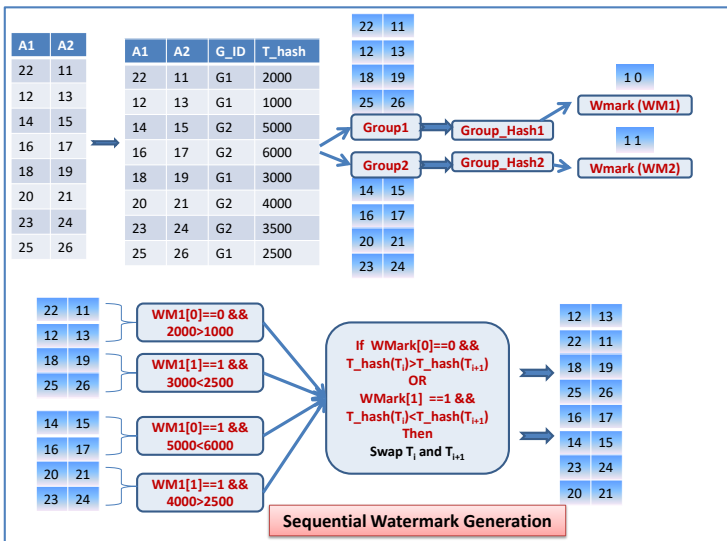
```
1: procedure REDUCE ( $g_{id}, list := [t_1, t_2, \dots]$ )
2:   Compute  $W'_g$  for  $g_{id}$  using list
3:   emit ( $g_{id}, W'_g$ )
4: end procedure
5: Compute  $W' = ||W'_g$ 
6: if ( $W' == W$ ) then Verification = TRUE
7: else Verification = FALSE
8: end if
```

Figure: Watermark Detection algorithm using MapReduce

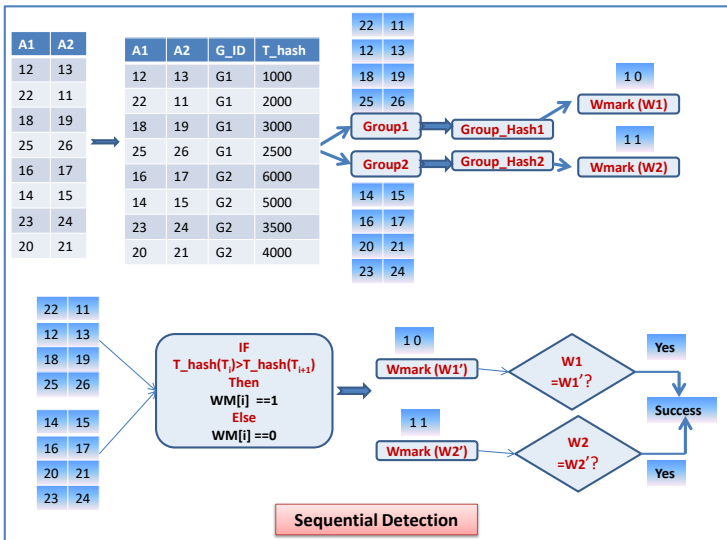
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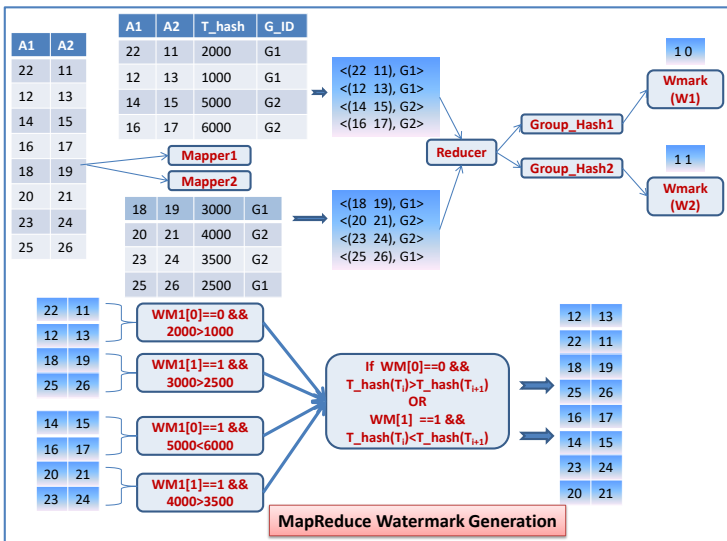
Transforming Sequential to MapReduce [Li et al., 2004]



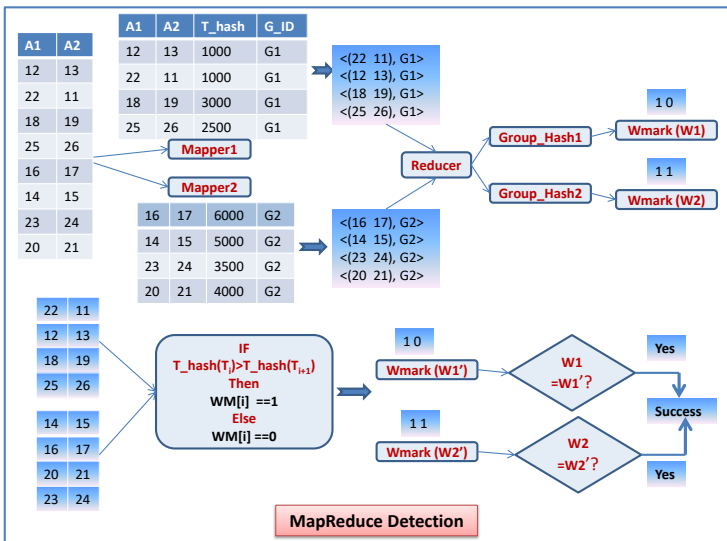
Transforming Sequential to MapReduce [Li et al., 2004]



Transforming Sequential to MapReduce [Li et al., 2004]



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Experimental Results

- Identified following distortion-free techniques:

- [Li et al., 2004]
- [Bhattacharya and Cortesi, 2009]
- [Bhattacharya and Cortesi, 2010]
- [Khan and Husain, 2013]
- [Camara et al., 2014]

- **Notations:**

T_g : Watermark generation time in minute

T_d : Watermark detection time in minute

M : Number of Mappers

G : Number of groups formed from the database tuples

Experimental Results: [Li et al., 2004]:

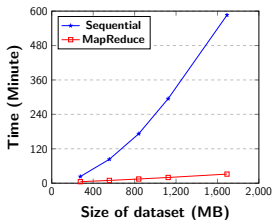
No. of Tuples	Size in MB	Sequential		MapReduce		
		T_g	T_d	M	T_g	T_d
5810120	276	23.19	24.43	2	5.26	5.23
11620240	556	83.36	75.62	5	9.70	9.18
17430360	840	172.44	169.66	7	14.64	13.44
23240480	1124	294.74	291.60	9	19.96	18.28
34860720	1692	586.00	566.83	13	31.72	28.61

(a) Watermarking results for $G = 10000$

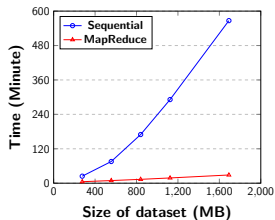
No. of Tuples	Size in MB	Sequential		MapReduce		
		T_g	T_d	M	T_g	T_d
5810120	276	7.16	6.87	2	5.11	4.89
11620240	556	22.99	19.22	5	9.26	8.52
17430360	840	41.75	39.08	7	13.55	12.25
23240480	1124	69.19	66.60	9	18.26	16.23
34860720	1692	124.02	120.25	13	25.64	23.83

(b) Watermarking results for $G = 50000$

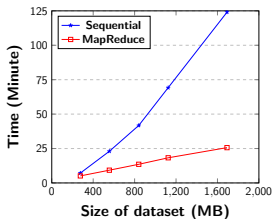
Experimental Results: [Li et al., 2004]:



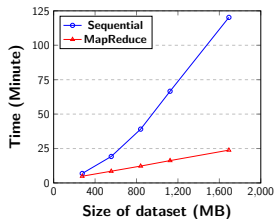
(a) Watermark Generation Time for G=10000



(b) Watermark Detection Time for G=10000

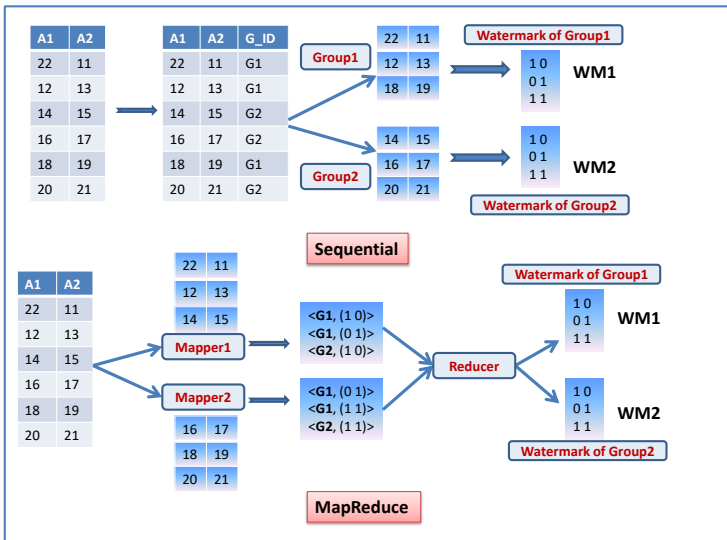


(c) Watermark Generation Time for G=50000



(d) Watermark Detection Time for G=50000

Experimental Results: [Bhattacharya and Cortesi, 2009]

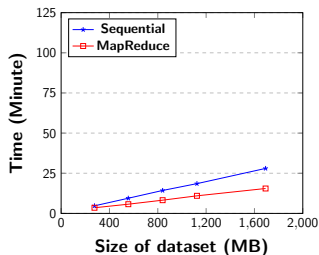


Experimental Results: [Bhattacharya and Cortesi, 2009]

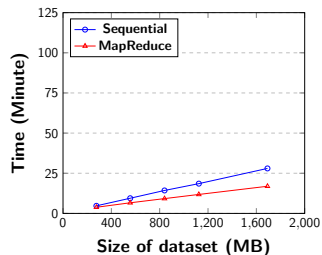
No. of Tuples	Size in MB	Sequential		MapReduce		
		T_g	T_d	M	T_g	T_d
5810120	276	3.89	4.72	2	3.52	3.83
11620240	556	7.77	9.45	5	5.74	6.61
17430360	840	11.13	14.29	7	8.24	9.22
23240480	1124	15.28	18.54	9	10.95	11.81
34860720	1692	22.38	28.01	13	15.51	16.90

Table: Results of sequential and MapReduce version for $G = 50000$

Experimental Results: [Bhattacharya and Cortesi, 2009]



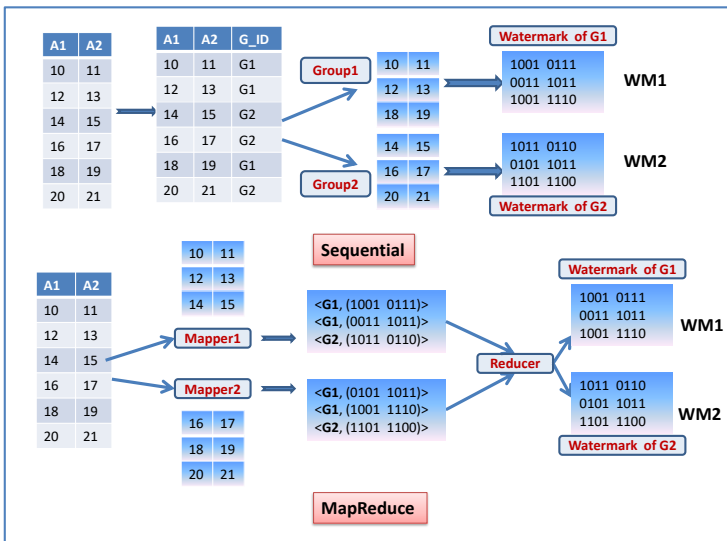
(a) Watermark Generation Time



(b) Watermark Detection Time

Figure: Performance comparison of sequential and MapReduce for $G = 50000$

Experimental Results: [Bhattacharya and Cortesi, 2010]

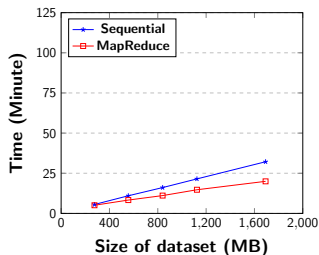


Experimental Results: [Bhattacharya and Cortesi, 2010]

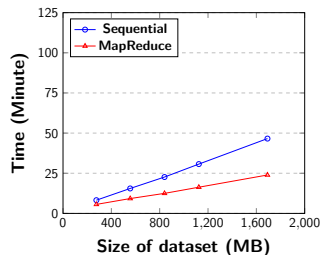
No. of Tuples	Size in MB	Sequential		MapReduce		
		T_g	T_d	M	T_g	T_d
5810120	276	5.56	8.23	2	5.08	5.61
11620240	556	10.98	15.54	5	8.31	9.25
17430360	840	16.09	22.65	7	11.10	12.48
23240480	1124	21.49	30.71	9	14.73	16.31
34860720	1692	32.16	46.59	13	19.99	23.92

Table: Results of sequential and MapReduce version for $G = 50000$

Experimental Results: [Bhattacharya and Cortesi, 2010]



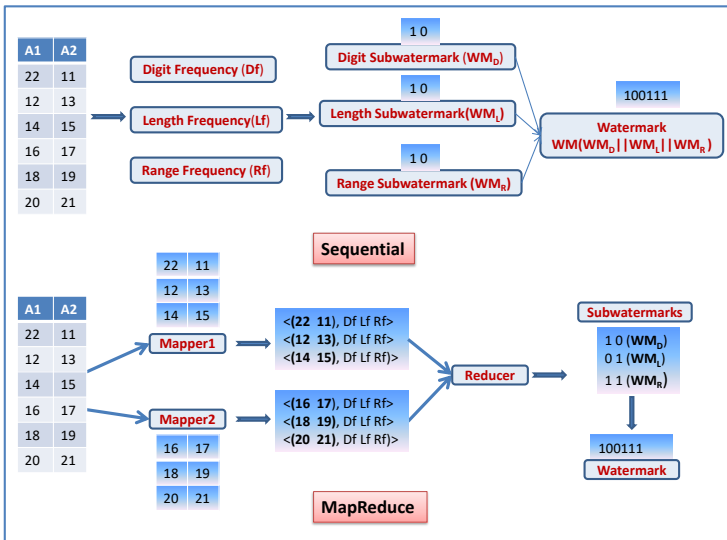
(a) Watermark generation time



(b) Watermark detection time

Figure: Performance comparison of sequential and MapReduce for $G = 50000$

Experimental Results: [Khan and Husain, 2013]

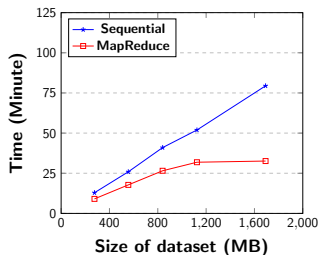


Experimental Results: [Khan and Husain, 2013]

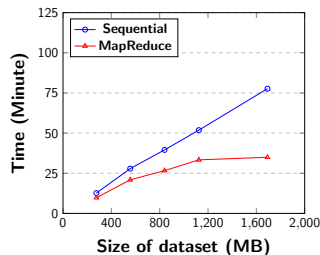
No. of Tuples	Size in MB	Sequential		MapReduce		
		T_g	T_d	M	T_g	T_d
5810120	276	12.88	12.67	2	9.05	9.75
11620240	556	25.91	27.88	5	17.76	20.91
17430360	840	40.98	39.54	7	26.55	26.63
23240480	1124	51.93	51.84	9	31.87	33.34
34860720	1692	79.43	77.65	13	32.60	34.97

Table: Results of sequential and MapReduce version for $G = 50000$

Experimental Results: [Khan and Husain, 2013]



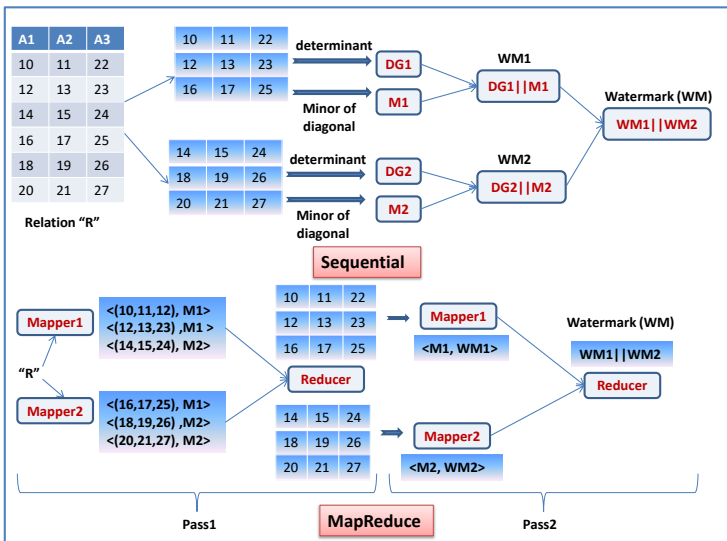
(a) Watermark generation time



(b) Watermark detection time

Figure: Performance comparison of sequential and MapReduce for $G = 50000$

Experimental Results: [Camara et al., 2014]

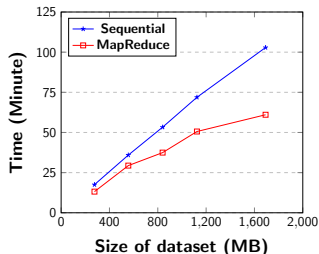


Experimental Results: [Camara et al., 2014]

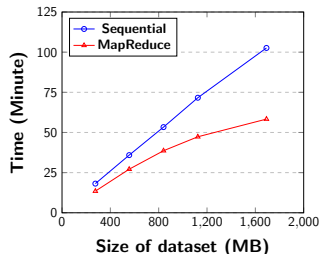
No. of Tuples	Size in MB	Sequential		MapReduce		
		T_g	T_d	M	T_g	T_d
115	276	17.52	18.16	2	14.40	13.47
230	556	35.92	35.90	5	29.37	27.14
345	840	53.30	53.34	7	37.46	38.63
460	1124	71.90	71.63	9	50.60	47.32
690	1692	102.89	102.63	13	61.03	58.33

Table: Results of sequential and MapReduce Version for $G = 50000$

Experimental Results: [Camara et al., 2014]



(a) Watermark generation time



(b) Watermark detection time

Figure: Performance comparison of sequential MapReduce for $G = 50000$

Experimental Results: Percentage of time-reduction

- t_s = time required in Sequential
- t_m = time required in MapReduce-based approach.
- % of time-reduction = $\frac{t_s - t_m}{t_s} \times 100$.

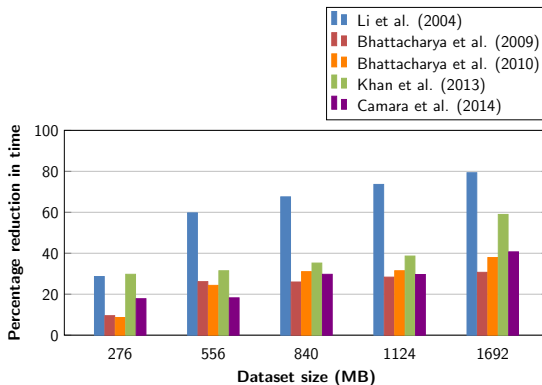


Figure: Watermark generation

Experimental Results: Percentage of time-reduction

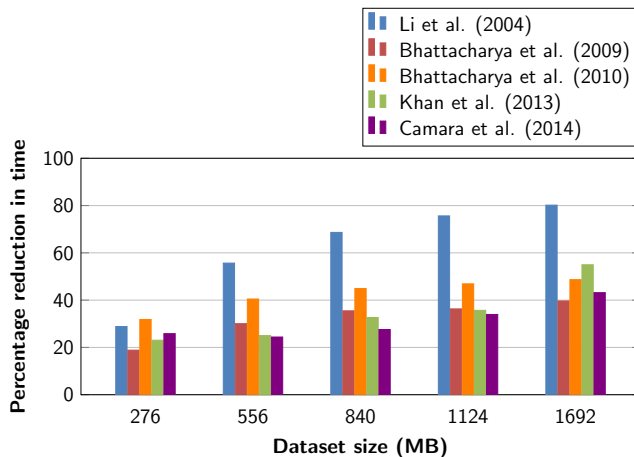


Figure: Watermark detection

Common observations

- The watermark generation and detection time reduce significantly in MapReduce as compared to their sequential executions.
- Performance improves as the number of mappers increases.
- % of time-reduction in watermark generation and detection increases as we increase the size of the dataset.

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Conclusions and Future Works

- We have focused on distortion-free watermarking
- Significant reduction in watermark generation as well as detection time in MapReduce.
- Percentage reduction of time from sequential to MapReduce increases with the increase of dataset size.
- To the best of our knowledge, this is the first work towards MapReduce-based big relational database watermarking.
- **Future Work** - Big Data watermarking.

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Thank You
For Your Kind Attention

Any suggestions please...