A Probabilistic Model Revealing Shortcomings in Lua's Hybrid Tables

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Joint work with Conrado Martínez (UPC), Cyril Nicaud (LIGM)

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Introduction

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 - Scripting language widely used in the gaming industry,
 - Efficient, lightweight (few Kb of C code!), embeddable.
- ⇒ Lua 5.0 introduced several innovations, among them a new Table structure.

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 we introduce a reasonable probabilistic model.
- present also an analysis of the hybrid table-array.

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- ► The example requires an unlikely cycle of delete-insert.
- Trouble for more realistic examples ?

Introduction: probabilistic model for the hash-table

Simple Probabilistic model

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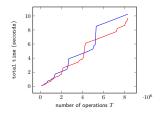
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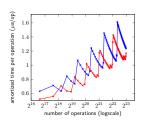
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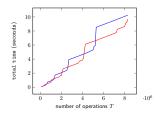
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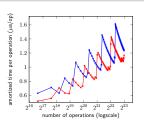
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Plan of the talk

1. The Lua hashmap

2. The probabilistic model

3. Conclusions and further work

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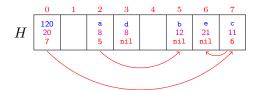
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• if position h(x) free \Rightarrow insert

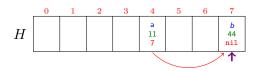
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 - if $h(y) \neq h(x) \Rightarrow$ we migrate y into a free position, updating its chain and put x at position h(x).

	0	1	2	3	4	5	6	7
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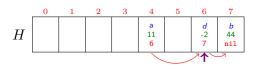
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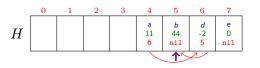
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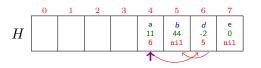
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 \dots at least $\log M$ rehashes to increase M

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Under these conditions, between two rehashes, the number of deleted cells satisfies the recurrence (starting from $\delta_{t_0} = 0$)

$$\delta_{t+1} = \begin{cases} \delta_t - 1 & \text{with probability } \frac{p\delta_t}{M} & [\textit{insertion at deleted key}], \\ \delta_t & \text{with probability } p\left(1 - \frac{\delta_t}{M}\right) & [\textit{insertion at free cell}], \\ \delta_t + 1 & \text{with probability } 1 - p & [\textit{deletion}]. \end{cases}$$

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- Tools: concentration inequalities.

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Problem arises when considering effects of deletions.

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Example: inserting $-(2^k-1), -(2^k-2), \ldots, -1, 0, 1, \ldots, 2^k$

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Recap and conclusions

- Lua's hybrid data-structure is an interesting idea.
- We have presented a simple and natural probabilistic model revealing shortcomings in Lua's hashtables.
- ® Issue can be fixed by ensuring more room when rehashing.
- This would also fix the hybrid part.

Conclusions

- Will Lua conceptors take this into account?
- Important to model and study algorithms implemented in practice.

Thank you!