

Amortized Analysis

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Use-case

We have a sequence of operations (usually on a data structure):

$$op_1, op_2, op_3, op_4, \dots, op_n$$

- the sequence can contain *different* operations
- the *complexity* of the operations may differ
- “worst-case analysis” might be too pessimistic

Incrementing a k -bit binary counter

0	0	1	1	1	1	1	1	1	1	1	1	1	1	1
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Worst-case analysis:

- Resource analyzed: *number of flips*
- each increment takes $O(k)$ flips
- n increment operations will take $O(nk)$ flips

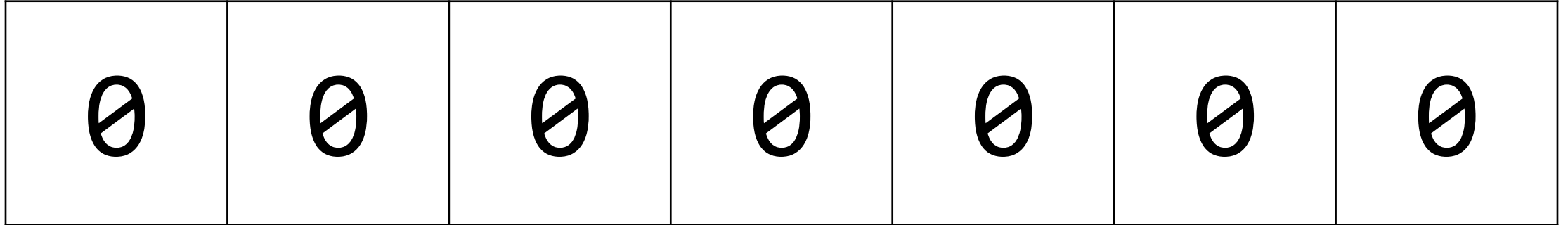
k -bit binary counter revised analysis

- Most of the time, very few bits are affected
- **“Expensive operations”** are *rare*
- *Rare expensive operations* and *frequent cheap operations* even out

The Aggregate Method

- Compute the worst-case complexity of the entire sequence
- If the sequence cost is $T(n)$ and there are n operations:
 - each operation has an *amortized cost* of $\frac{T(n)}{n}$

The Accounting Method



The Accounting Method

0	0	0	0	0	0	0
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The Accounting Method

0	0	0	0	0	0	1
---	---	---	---	---	---	---



The Accounting Method

0	0	0	0	0	0	1
---	---	---	---	---	---	---



The Accounting Method

0	0	0	0	0	1	0
---	---	---	---	---	---	---



The Accounting Method

0	0	0	0	0	1	0
---	---	---	---	---	---	---



The Accounting Method

0	0	0	0	0	1	1
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The Accounting Method

0	0	0	0	0	1	1
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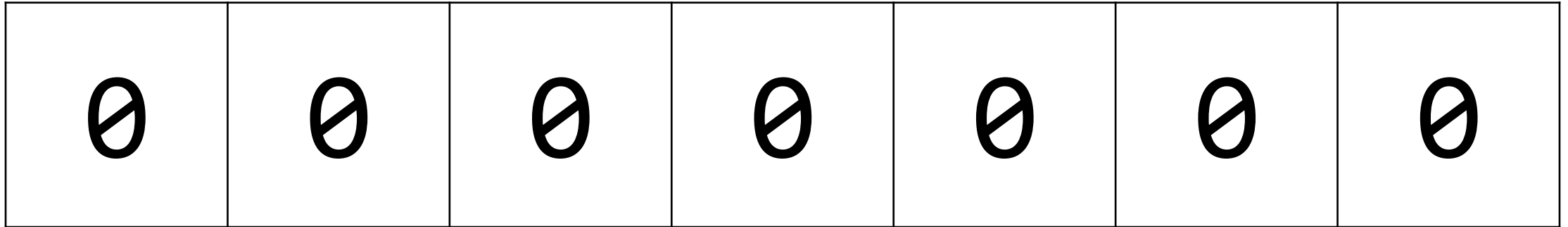


The Accounting Method

0	0	0	0	1	0	0
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The Potential Method



The potential of the counter is the number of “1” bits

Potential: 0

The Potential Method

0	0	0	0	0	0	1
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The potential of the counter is the number of “1” bits

Potential: 1

The Potential Method

0	0	0	0	0	1	0
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The potential of the counter is the number of “1” bits

Potential: 1

The Potential Method

0	0	0	0	0	1	1
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The potential of the counter is the number of “1” bits

Potential: 2

The Potential Method

0	0	0	0	1	0	0
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The potential of the counter is the number of “1” bits

Potential: 1

Summary

- *Frequent cheap operations* can amortize the cost of *rare expensive operations*
- Three methods of performing amortized analysis:
 1. **The Aggregate Method:**
 - Determine the cost of the entire sequence and divide by number of operations
 2. **The Accounting Method:**
 - Associate “credits” to each operations; credits pay for elementary operations
 3. **The Potential Method:**
 - Define a potential function on each state of the structure; the amortized cost is the real one plus the difference in potential