

## AMORTIZED ANALYSIS

- dynamic table demo: insert
- dynamic table demo: insert and delete


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## Amortized Analysis

- dynamic table demo: insert
, dynamic table demo: insert and delete

Chapter 17

## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert A
```

capacity $=1$

## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert B
```

capacity $=1$

## A

destroy extra credit
(not needed)
capacity $=2$

## A B

## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert C
```

capacity $=2$
A B
capacity $=4$
A B C

## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert D
```

capacity $=4$
A B C D

## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert E
```

capacity $=4$
A B C D
capacity $=8$
A B C D E

## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert F
```

capacity $=8$
A B C D E F

## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert G
```

capacity $=8$

```
A B C D E F G
```


## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert H
```

capacity $=8$

```
A B C D E F G H
```


## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert I
```

capacity $=8$

capacity $=16$
A B C D

## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert J
```

capacity $=16$
A B C D E F G H I J

## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert K
```

capacity $=16$
A B C D E F G H I J K


## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert L
```

capacity $=16$
A B
C
D
E
F
G
H
1
J



## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert M
```

capacity $=16$
A B C D E F G H I J K L M


## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert N
```

capacity $=16$
A B C D E F G H I J K L M N


## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert O
```

capacity $=16$
A B C D E F G H I J K L M N O


## Dynamic table demo: insert only (accounting method)

Insert. Charge 3 credits (use 1 credit to insert; save 2 with new item). Invariant. 2 credits with each item in right half of table; none in left half.

```
insert P
```

capacity $=16$
A B
C D E
F
G
H
1



## Amortized Analysis

- dynamic table demo: insert
- dynamic table demo: insert and delete

Chapter 17

## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.

```
delete M
```

capacity $=16$
A B C D E F G H I J K L M


## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
delete L
capacity $=16$


## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
delete K
capacity $=16$
A B C C D E F G $\quad$ H $\quad$ I $\quad$ J $\quad$ K

## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
insert $N$
capacity $=16$
A B C D E F G H I J N


## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
delete N
capacity $=16$
A B C D E F G H I J N

## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
delete J
capacity $=16$
A B C D E F G H I J

## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
delete I
capacity $=16$
A B C D E F G H I

## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
delete H
capacity $=\mathbf{1 6}$
A B C D E F G H

## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
delete G
capacity $=\mathbf{1 6}$
A B C D E F G

## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
delete F
capacity $=\mathbf{1 6}$
A B C D E F

## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
insert 0


## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
delete $\mathbf{O}$
capacity $=\mathbf{1 6}$

```
A B C D E O
```


## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
delete E
capacity $=16$

```
A B C D E
```


## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table. Invariant 2. 1 credit with each empty slot in left half of table.
delete D
capacity $=16$
A B C D
capacity $=8$

## Dynamic table demo: insert and delete (accounting method)

Insert. Charge 3 credits ( 1 to insert; save 2 with item if in right half).
Delete. Charge 2 credits ( 1 to delete; save 1 in empty slot if in left half).

Invariant 1. 2 credits with each item in right half of table.
Invariant 2. 1 credit with each empty slot in left half of table.
capacity $=8$
A B C

