# **Inverting Permutations In Place**

#### Matthew Robertson

Cheriton School of Computer Science University of Waterloo

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### The Problem

Given the standard representation of a permutation  $\pi$  in the array pi as input, replace the input with the representation of  $\pi^{-1}$ , the inverse of the permutation, quickly and in place.

### What is a Permutation?

#### Definition

A **permutation**  $\pi$  is a one-to-one correspondence between [n] and itself, where  $[n] = \{0, 1, \dots, n-1\}$ .







### What is the Inverse of a Permutation?

#### Definition

The **inverse** of the permutation  $\pi$ ,  $\pi^{-1}$ , is the permutation such that, for all  $i, \pi^{-1} \circ \pi(i) = i$ .







### More Definitions

#### Definition

An **in place** algorithm is an algorithm that executes by rearranging elements of the input without the use of significant extra space.

#### Definition

The **standard** representation of the permutation  $\pi$  is an array pi in which  $\text{pi}[i] = \pi(i)$ , where each element of pi is of size  $\lceil \lg n \rceil$  bits.

### Applications

- Application in data warehousing:
  - Under specific indexing schemes, the permutation corresponding to the rows of a relation sorted by any given key is explicitly stored.
  - To perform certain joins, the inverse of a segment of the permutation is precisely what is needed.
- Application in other fields, such as bioinformatics.

### Main Contribution

- A technique that leads to an algorithm to invert the standard representation of a permutation using only:
  - $\mathcal{O}(\log^2 n)$  extra bits of space
  - lacksquare  $\mathcal{O}(n \log n)$  time

in the worst case<sup>1</sup>.

Previously known algorithms used either quadratic time or a linear number of extra bits of space.

<sup>&</sup>lt;sup>1</sup>Assume the standard word RAM model for all results.

### Structure of Presentation

- Introduction
- 2 Background
- A Naive Solution
- 4 Breaking the Cycle
- 5 Conclusion

# Background – Outline

- 1 Introduction
- 2 Background
  - Representations of Permutations
  - Permuting In Place
  - Cycle Leader Algorithms
- 3 A Naive Solution
- 4 Breaking the Cycle
- 5 Conclusion

### The Standard Representation

- Array pi of positions 0 to n-1 in which  $pi[i] = \pi(i)$ .
- Uses  $n \lceil \lg n \rceil$  bits of space in total.
- Computes  $\pi(i)$  in  $\mathcal{O}(1)$  time.
- A very natural representation.
- Not trivial to invert in place.
- About  $n \lg e$  bits more than optimal.

$$pi[] = \{4,2,1,0,5,3,8,6,7,9\}$$







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$$pi[] = \{3, 2, 1, 5, 0, 4, 7, 8, 6, 9\}$$







## Cycle Form of a Permutation

- Explicitly store each cycle of the permutation.
- **C**an be represented in  $n \lceil \lg n \rceil$  bits of space.
- Trivial to invert by reversing all cycles.
- Cannot compute  $\pi(i)$  quickly.

$$\pi = (0 \ 4 \ 5 \ 3)(1 \ 2)(6 \ 8 \ 7)(9)$$
perm[] = {9,6,8,7,1,2,0,4,5,3}







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## Improve the Standard Representation

- The standard representation of a permutation uses  $n \lceil \lg n \rceil$  bits.
- Encode n objects of size  $\lceil \lg n \rceil$  bits, totalling up to  $n \lg n + n$  bits.
- Between about  $n \lg e$  and  $n(1 + \lg e)$  bits more than optimal.
  - Optimal is  $\lceil \lg n! \rceil = n \lg n n \lg e + \mathcal{O}(\log n)$  bits.
- Consequence of there being no repeated values.
- Reduce space by encoding k consecutive elements into a single object.
- Essentially the k digit, base n number pi[i]pi[i+1]...pi[i+k-1].
- Encode  $\frac{n}{k}$  objects of size  $\lceil k \lg n \rceil$  bits, totalling up to  $n \lg n + \frac{n}{k}$  bits.
- Decode with a constant number of  $\lceil k \lg n \rceil$  bit precision operations.

## Permuting In Place – Outline

- A related problem is to permute in place.
- Apply a permutation to an array, without much extra space.
- Exploit the cycle structure of a permutation.
- The main inspiration for this research.
- Studied in [Fich et al., 1995].

## Permuting – Applying a Permutation

#### Definition

An array A[0, n-1] is **permuted** according to the permutation  $\pi$  when element A[i] is moved to the position  $\pi(i)$  for each  $i \in [n]$ .

- Not sufficient to simply assign  $A[\pi(i)] \leftarrow A(i)$  for each  $i \in [n]$ .
- lacktriangle Elements in A may have been mutated before being accessed.
- Some very simple ways to deal with this:
  - The use of an auxiliary copy of  $A \longrightarrow \mathcal{O}(n \log n)$  bits.
  - Use of an n-bit vector to mark moved elements  $\mathcal{O}(n)$  bits.
  - Destroy the permutation by assigning  $pi[i] \leftarrow i$  as it is traversed.
- Not in place, or slow and destroy information.

- The cycle structure of a permutation can still be exploited while using the standard representation.
- Cycles are traversed by repeatedly evaluating  $i \leftarrow \pi(i)$ .

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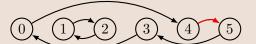






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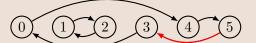






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- The cycle structure of a permutation can still be exploited while using the standard representation.
- Cycles are traversed by repeatedly evaluating  $i \leftarrow \pi(i)$ .
- No obvious way to find the "next" cycle.

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# Rotating a Cycle

- A basic operation in permuting.
- Can be thought of as applying a cycle.
- Cycles are rotated starting from some position, leader, within the cycle.
- Takes  $\mathcal{O}(\log n)$  bits for pointers and  $\mathcal{O}(\ell)$  time, where  $\ell$  is the length of the cycle.
  - Takes  $\mathcal{O}(n)$  time to rotate each cycle exactly once.

#### Algorithm

```
method rotate (A, leader)
    i \leftarrow \pi(leader)
    while i \neq leader do
        swap (A[i], A[leader])
        i \leftarrow \pi(i)
```

## Cycle Leader Algorithms – Outline

- Have been studied in the context of permuting.
- Identify cycles while using the standard representation.
- Cycle leader methods:
  - The minimum leader.
  - The Fich et al. leader.
- Known results.

### A Cycle Leader

#### Definition

A **cycle leader** is a protocol by which precisely one position in each cycle is so designated.

- Not trivial because the standard representation of a permutation does not naturally distinguish cycles.
- **EXAMPLE 1** Cycles are identified by testing each position i in  $\pi$  for cycle leadership.
- An array is permuted by rotating each cycle once from its cycle leader.
- The minimum position of each cycle is an example of a cycle leader.

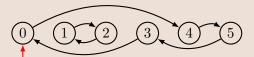
### Algorithm

method permute (A)for  $i \leftarrow 0$  to n-1 do if isLeader (i) then

rotate(A, i)

- Permute A according to  $\pi$ .
- For each cycle, rotate the cycle.
- Could use any leader method.
- This e.x. uses minimum leader.

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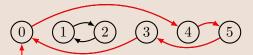


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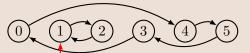


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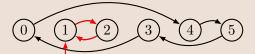
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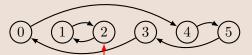


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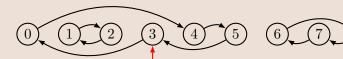
 $\begin{aligned} & \textbf{method} \ \text{permute} \ (A) \\ & \textbf{for} \ i \leftarrow 0 \ \textbf{to} \ n-1 \ \textbf{do} \\ & \textbf{if} \ \text{isLeader} \ (i) \ \textbf{then} \end{aligned}$ 

rotate(A, i)

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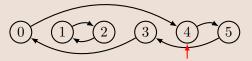


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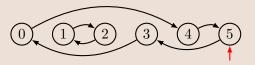
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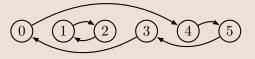


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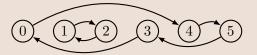
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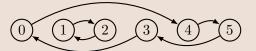
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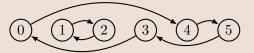
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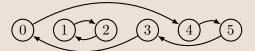
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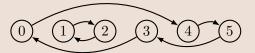
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### The Minimum Leader Method

- Determine the minimum position in each cycle.
- Traversing only forward along the cycle.
- Permuting using the minimum leader:
  - lacksquare Takes as few as 2n value inspections in the best case.
  - lacksquare Takes as many as  $n^2$  value inspections in the worst case.
  - Takes about  $n \lg n$  for a random cycle of length n.

### Algorithm

```
 \begin{array}{c} \textbf{method} \ \texttt{isLeader} \ (\textit{leader}) \\ i \leftarrow \pi(\textit{leader}) \\ \textbf{while} \ i > \textit{leader} \ \textbf{do} \\ i \leftarrow \pi(i) \\ \textbf{return} \ i \stackrel{?}{=} \textit{leader} \end{array}
```

### The Minimum Leader – Theorem

### Theorem [Fich et al., 1995]

In the worst case, permuting an array of length n, given the permutation, can be done in  $\mathcal{O}(n^2)$  time and  $\mathcal{O}(\log n)$  additional bits of storage.

- The leader method presented in [Fich et al., 1995].
- Designate as leader the position from which the "local minima" phenomenon can be observed.
  - lacksquare  $\alpha_0$  is a cycle in  $\pi$  and  $x_0$  is the cycle leader.
  - $\bullet$   $\alpha_r$  is the cycle of the local minima of  $\alpha_{r-1}$ .
  - $\blacksquare x_r = \alpha_{r-1}(x_{r-1})$  is the leader at depth r.
  - Recurse until an  $\alpha_d$  is found such that  $\alpha_d(x_d) = x_d$ .

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$$\alpha_1 = (0\ 1\ \vec{3}\ 2\ 5)$$

$$\alpha_2 = (0\ \vec{2})$$

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$$\pi = [6, 8, 9, 4, 2, 7, 1, 0, 3, 5].$$

- The leader is  $x_0 = 8$  because...
- $\alpha_0(8) = 3,$
- $\alpha_1(3) = 2,$
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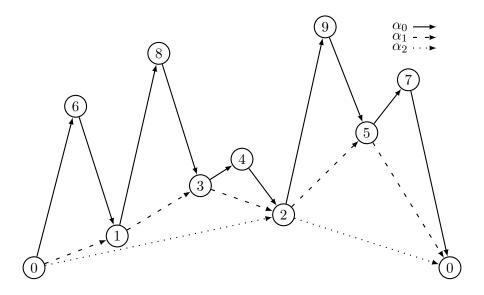
$$\alpha_3 = (\vec{0})$$

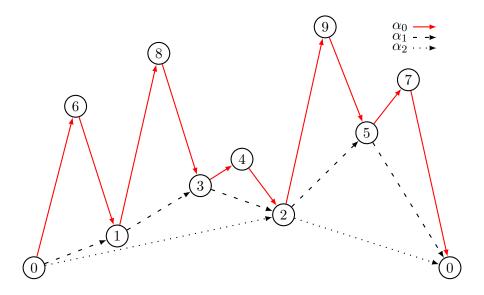
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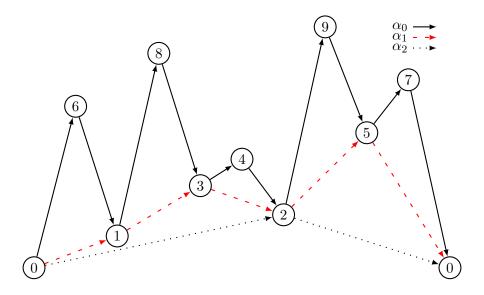
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- $\alpha_2(2) = 0$ , and
- $\bullet$   $\alpha_3(0) = 0$  points to itself.

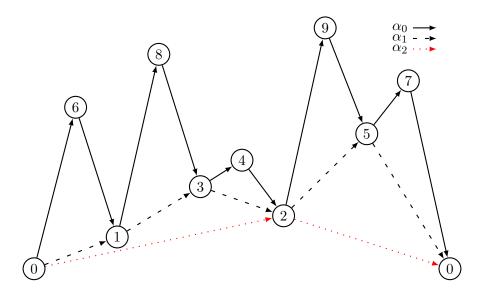
### The Fich et al. Leader – Local Minima

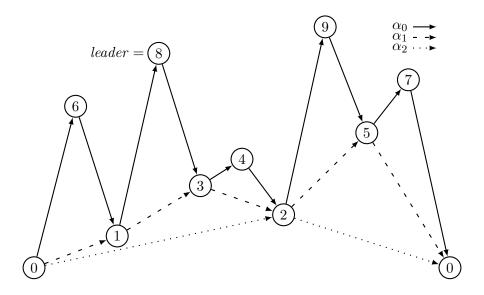
- The position i is a local minimum when  $\pi^{-1}(i) > i < \pi(i)$ .
- Testing from position *i*:
  - Easy to compute  $\pi(i)$  but hard to compute  $\pi^{-1}(i)$ .
  - Test if  $\pi(i)$  is a local minimum, i.e.,  $i > \pi(i) < \pi \circ \pi(i)$ .
- Testing in depth *r*:
  - A position  $x_r$  is in  $\alpha_r$  if it is a local minimum of  $\alpha_{r-1}$ .
  - At least half of the positions are excluded at each level.
- The maximum depth is  $d \leq \lceil \lg \ell \rceil$ .
- The leader is the position which leads to the maximum depth.
- In general, the leader is i if  $\alpha_d \circ \alpha_{d-1} \circ \ldots \circ \alpha_0(i) = x_d$ .
- Graphic example on the following slide.

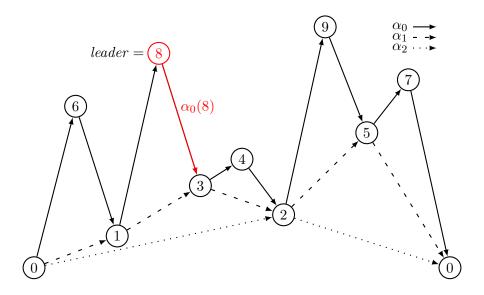


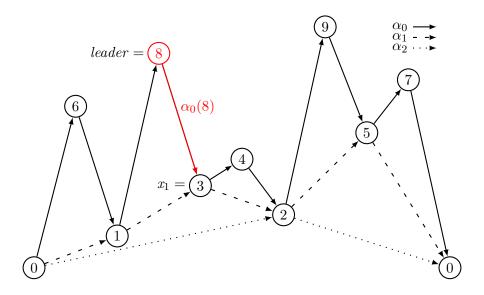


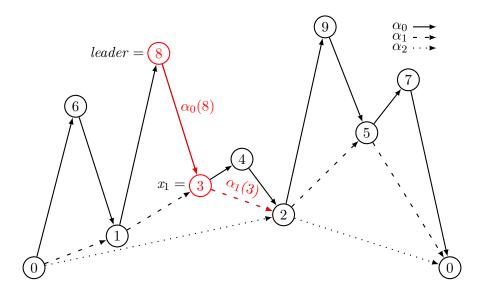


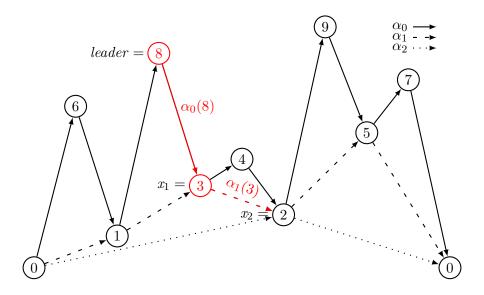


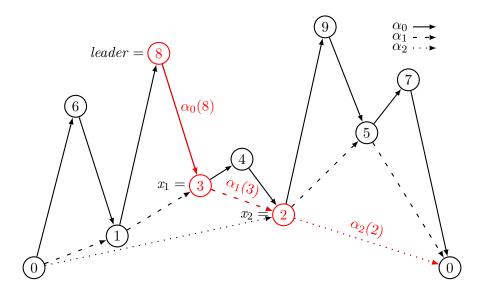


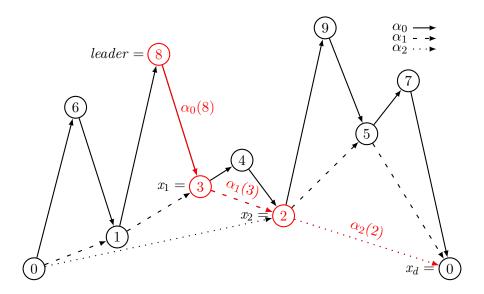


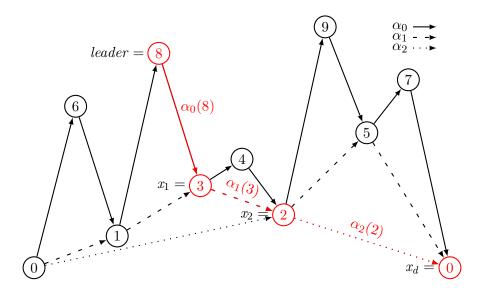












## The Fich et al. Leader – Algorithm

### Algorithm

```
method next()
   elbow[0] \leftarrow \pi(elbow[1])
method next (r)
   if r=1 then
      next()
   else
      while elbow[r-1] < elbow[r-2] do
          elbow[r-1] \leftarrow \pi(elbow[r-2])
          next(r-1)
      while elbow[r-1] > elbow[r-2] do
          elbow[r-1] \leftarrow \pi(elbow[r-2])
          next (r-1)
```

## The Fich et al. Leader – Algorithm

### Algorithm

```
method isLeader (leader)
    elbow[1] \leftarrow leader
    for i \leftarrow 1 to \lceil \lg n \rceil do
        next(r)
        if elbow[r] > elbow[r-1] then
            elbow[r] \leftarrow elbow[r-1]
            next(r)
            if elbow[r] > elbow[r-1] then
                return false
            elbow[r+1] \leftarrow elbow[r]
        else
            return elbow[r] \stackrel{?}{=} elbow[r-1]
```

### The Fich et al. Leader – Theorem

### Theorem [Fich et al., 1995]

In the worst case, permuting an array of length n, given the permutation, can be done in  $\mathcal{O}(n \log n)$  time and  $\mathcal{O}(\log^2 n)$  additional bits of storage.

### A Naive Solution - Outline

- 1 Introduction
- 2 Background
- A Naive Solution
  - Inverting In Place
  - Minimum Leader
  - Bit Vector
- 4 Breaking the Cycle
- 5 Conclusion

## A Naive Approach to Inverting Permutations

- Same structure as the permute algorithm.
- Reverse cycles instead of rotating them.
- Same time and space complexity as permuting.
- Reversing a cycle mutates pi instead of an array.

#### Algorithm

```
method invert()

for i \leftarrow 0 to n-1 do

if isLeader(i) then

reverse(i)
```

- Invert the permutation in place.
- May change the cycle leader.
  - Can use the minimum leader.
  - Cannot use Fich et al. leader.

## Reversing a Cycle

- A basic operation in inverting permutations.
- Can be thought of as inverting a cycle.
- Takes  $\mathcal{O}(\log n)$  bits for pointers and  $\mathcal{O}(\ell)$  time.
  - $\blacksquare$  Takes  $\mathcal{O}(n)$  time to reverse each cycle exactly once.

### Algorithm

```
method reverse (leader)
curr \leftarrow \texttt{pi}[leader]
prev \leftarrow leader
while curr \neq leader do
next \leftarrow \texttt{pi}[curr]
\texttt{pi}[curr] \leftarrow prev
prev \leftarrow curr
curr \leftarrow next
\texttt{pi}[leader] \leftarrow prev
```

### The Minimum Leader

- Same time and space complexity as permuting using minimum leader.
- Safe, but too slow.

### The Minimum Leader – Result

#### **Theorem**

In the worst case, the standard representation of a permutation of length n can be replaced with its own inverse in  $\mathcal{O}(n^2)$  time using  $\mathcal{O}(\log n)$  extra bits of space.

### Bit Vector – Outline

- Alternative method to invert a permutation.
- Improve the speed of minimum leader.
- The bit vector can be shrunk.
- A natural compromise between the space and time.

### Using an n-bit Vector

- lacktriangle Easy to invert using an n-bit vector to mark moved positions.
- Discover the "next" cycle by finding the next unset bit.
- Invert in  $\mathcal{O}(n)$  time using  $\mathcal{O}(n)$  bits. Not in place.
  - Takes  $n + \mathcal{O}(\log n)$  bits for the bit vector and pointers.
  - Traverses each cycle exactly one.
  - Traverses the bit vector exactly once.
- Leads to another algorithm using a sublinear number of extra bits.
- Equivalent to using the minimum leader.

### Using a smaller b-bit Vector

- Divide the permutation into n/b evenly spaced sections.
- Apply the *b*-bit vector to one section at a time.
- A trade-off between the extra space required and the worst case time.
- In invert, an outer pointer iterates through the permutation.
- As a cycle is being tested for minimum leader, any position found in the current section is marked by setting its bit.
- When a marked bit is found, that position is known to not be the minimum leader.
- When the outer pointer enters a new section, reset the bit vector.

## Using a b-bit Vector – Algorithm

## Algorithm

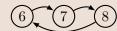
```
method isLeader (leader)
    if leader \mod b = 0 then
        clear(v)
    if v(leader \bmod b) = 1 then
        return false
    i \leftarrow pi[leader]
    while i > leader do
        if |i/b| = |leader/b| then
            v(i \bmod b) \leftarrow 1
        i \leftarrow \text{pi}[i]
    return i \stackrel{?}{=} leader
```

# Using a b-bit Vector – Analysis

- Takes  $b + \mathcal{O}(\log n)$  bits for the *b*-bit vector and pointers.
- Runs in  $\mathcal{O}(n^2/b)$  time in the worst case.
  - Tests each cycle no more than  $\lceil n/b \rceil$  times.
- In example, k=3.

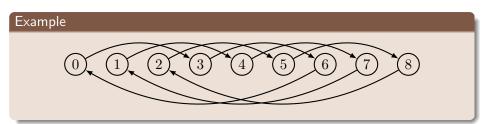






## Using a b-bit Vector — Analysis

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- In example, k = 3.



#### **Theorem**

In the worst case, the standard representation of a permutation of length n can be replaced with its own inverse in  $\mathcal{O}(n^2/b)$  time using  $b + \mathcal{O}(\log n)$  extra bits of space.

## A Natural Compromise

■ A very natural compromise between the space and time is achieved by setting  $b = \sqrt{n}$ .

## A Natural Compromise – Result

#### **Theorem**

In the worst case, the standard representation of a permutation of length n can be replaced with its own inverse in  $\mathcal{O}(n\sqrt{n})$  time using  $\mathcal{O}(\sqrt{n})$  extra bits of space.

# Breaking the Cycle – Outline

- 1 Introduction
- 2 Background
- 3 A Naive Solution
- 4 Breaking the Cycle
  - The Strategy
  - Bad Cycles
  - Sentinel Value
  - Unique Cycle Lengths
  - The "¬" Structure
- 5 Conclusion

## The Strategy

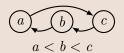
- The strategy allows using Fich et al. leader to invert a permutation.
- When the leader of a cycle is detected, reverse it normally.
- If the reversed cycle will be detected again, mark it "do not reverse."
- Mark these badly behaved cycles by breaking them in a way that can be detected and recovered easily.
- When the leader of a broken cycle is detected, restore the cycle.

## What is a Bad Cycle?

#### Definition

A **bad cycle** is a cycle with the property that if reversed, has a new cycle leader not yet processed, i.e., larger than the original leader.

- Position *b* is the Fich et al. leader of the cycle.
- lacksquare If reversed, c is the leader of the new cycle.
- Since c > b, the naive invert would reverse the cycle twice.
- A permutation can contain up to  $\lfloor n/3 \rfloor$  bad cycles.



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# Detecting Bad Cycles

- Fich et al. leader naturally reveals the leader of the reversed cycle.
- Avoid re-testing each position of the reversed cycle for leadership.
- $x_d = \alpha_d \circ \alpha_{d-1} \circ \ldots \circ \alpha_0(i)$ , because i is the leader of  $\alpha$ .
- $j = \alpha_0 \circ \alpha_1 \circ \ldots \circ \alpha_d(x_d)$  is the leader of  $\alpha^{-1}$ , because...
- $\bullet$   $\alpha_d^{-1} \circ \alpha_d^{-1} \circ \ldots \circ \alpha_0^{-1}(j) = x_d$
- If position j > i, then  $\alpha$  is a bad cycle.

$$\alpha_0 = (0\ 6\ 1\ \vec{8}\ 3\ 4\ 2\ 9\ 5\ \vec{7})$$

$$\alpha_1 = (0\ 1\ \vec{3}\ 2\ \vec{5})$$

$$\alpha_2 = (0\ \vec{2})$$

$$\alpha_3 = (\vec{0})$$

# Breaking Bad Cycles at the Tail

#### Definition

The **tail** of a cycle is the predecessor of the leader, the position i such that  $\pi(i)$  is determined to be the leader of the cycle.

- The choice of where to break the cycle is important.
- Breaking a cycle at the tail allows easy recovery.
- Find the tail by computing  $\pi(i)$  before reversing  $\alpha$ .
- Simulate that the tail points to the potential leader.
- When the leader of a broken cycle is detected, point the tail to it.

# Using a Sentinel Value

- Set the tail of a bad cycle to the sentinel value ∅.
- When  $pi[i] = \emptyset$  is encountered, return leader.
- The alphabet needs to be increased by 1.
- In the worst case, the word size needs to be increased by 1.
- Just as bad as using an *n*-bit vector to mark positions.

### Snippet

```
method get (i)
   if pi[i] = \emptyset then
       return leader
   return pi[i]
```

## Simulating a Sentinel Value

Instead of storing the sentinel value  $\emptyset$ , simulate it by:

- 1. Using 0 and storing the true position of the 0 pointer.
  - When pi[i] = 0, check against zeroPointer.
  - If the sentinel value and zero pointer are the same, lazy delete it.
- 2. Setting  $pi[i] \leftarrow i$ .
  - Finding  $i \neq pi[i]$  but pi[i] = pi[pi[i]].

#### ${\sf A.Problem...}$

- This strategy does not always work.
- The left shows a cycle being restored correctly.
- The right shows a cycle being restored incorrectly.
  - Position 2 is determined to be a leader before 3 is tested.

# Example

A more intelligent breaking technique is required.

## Unique Cycle Lengths – Outline

- The limited number of unique cycle lengths, c, can be exploited in a technique for breaking bad cycles.
- Break bad cycles by pointing their tail to the rank of their length.
- Store the true positions of the first c pointers.
- Detect a broken cycle by encountering a cycle length rank.
- Supports invert in  $\mathcal{O}(n \log n)$  time using  $\mathcal{O}(\sqrt{n} \log n)$  extra bits.

# Number of Unique Cycle Lengths

#### **Theorem**

A permutation of length n contains  $c \leq \left| \sqrt{2n} \right|$  unique cycle lengths.

#### Proof

Consider a permutation of length n with  $c \geq \left\lceil \sqrt{2n} \right\rceil$  unique cycle lengths. The total length of the permutation must be at least

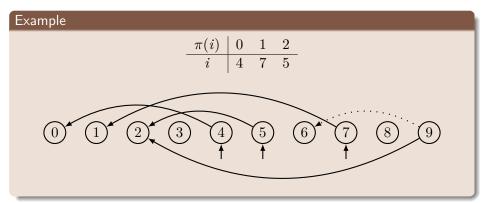
$$\sum_{i=1}^{\left\lceil \sqrt{2n}\right\rceil} i \ge \frac{2n + \sqrt{2n}}{2} > n ,$$

a contradiction.



# Break Cycles with the Rank of Their Length

- Break a reversed cycle by pointing the tail to the rank of the cycles' length, instead of back to the leader.
- Store the true positions of the first c pointers.



#### Table of True Positions

- Keep a table of the true positions, T, of the first c pointers.
- The table can be stored in  $\mathcal{O}(\sqrt{n} \log n)$  bits.
- Initialize the table before reversing any cycles in  $\mathcal{O}(n)$  time.
- Update the table when a cycle is reversed in  $\mathcal{O}(\ell)$  time.
  - Support update in  $\mathcal{O}(n)$  time in total.
- If the rank and pointer happen to be equal, lazy delete it.
  - Support lazy deletion from the table in exactly c bits.
- The table can be accessed in  $\mathcal{O}(1)$  time.

## Tree of Cycle Length Ranks

- Keep a balanced search tree of the unique cycle lengths.
- The tree can be stored in  $\mathcal{O}(\sqrt{n}\log n)$  bits.
- Build the tree in  $\mathcal{O}(n \log n)$  time by inserting lengths when discovered.
- The tree can be searched in  $O(\log n)$  time.
  - No more than one search per position, totalling  $O(n \log n)$  time.
- The rank of a cycle length is its rank in this tree.

- A cycle is determined to be broken when a position that points to the rank of a cycle length is encountered.
- A real pointer and a rank can be distinguished in  $\mathcal{O}(1)$  time.
  - If pi[i] < c and  $T[pi[i]] \neq i$ , then i must point to a rank.
  - $\blacksquare$  Otherwise, position i is a real pointer.
- When a broken cycle is detected, abort the leader method.
- Broken cycles need to be restored.

## Restore Broken Cycles

- When a broken cycle is detected, it needs to be restored.
- It is possible to encounter a broken tail having not started at the leader.
- Search the tree for the length so far,  $\ell$ , in  $\mathcal{O}(\log n)$  time.
  - If  $rank(\ell) = pi[i]$ , then point pi[i] to the leader.
  - Otherwise, do nothing and the real leader will be found later.
- Avoids the problem observed with using a sentinel value.
- Every broken cycle is restored exactly once and correctly.
- When pi has been completely iterated, every cycle has been restored.

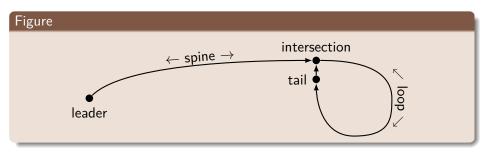
## Unique Cycle Lengths – Result

#### **Theorem**

In the worst case, the standard representation of a permutation of length ncan be replaced with its own inverse in  $\mathcal{O}(n \log n)$  time using  $\mathcal{O}(\sqrt{n} \log n)$ extra bits of space.

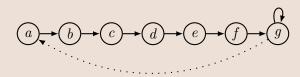
## The " $\overline{\nu}$ " Structure – Outline

- Break a bad cycle by pointing the tail to itself.
- This turns the cycle into a structure with a spine and loop at the end.
- Updates to this  $\sigma$  structure will subsequently be performed.
- Detect a broken cycle by detecting a "cycle loop."
- The tail always points to some intersection within the structure.



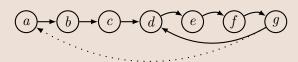
# Break Cycles by Creating Trivial Loops

- When a bad cycle is detected, break it by setting  $pi[tail] \leftarrow tail$ .
- This creates a trivial cycle loop at the end of the  $\sigma$  structure.
- A broken cycle can be detected and "restored" easily:
  - Detect i where  $i \neq pi[i]$  but pi[i] = pi[pi[i]].
  - "Restore" by setting  $pi[pi[i]] \leftarrow leader$ .
- Position *a* is the leader of the complete cycle.
- Position g is the tail and the intersection.



# Break Cycles by Creating Trivial Loops

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- This creates a trivial cycle loop at the end of the  $\sigma$  structure.
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  - Detect i where  $i \neq pi[i]$  but pi[i] = pi[pi[i]].
  - "Restore" by setting  $pi[pi[i]] \leftarrow leader$ .
- Position *a* is the leader of the complete cycle.
- Position q is the tail, both to the leader a and intersection d.
- lacksquare Position d is the erroneous leader of the cycle.



# **Detecting Nontrivial Cycle Loops**

- A cycle loop is a subcycle of the cycle, excluding the original cycle.
- Cycle loops can be detected using the classic "the tortoise and the hare" [Knuth, 1969] algorithm.
  - The tortoise traverses the cycle at 1 step per call.
  - The hare traverses the cycle at 2 steps per call.
  - If the cycle contains a loop, the tortoise and hare will rendezvous.
  - The intersection where the cycle loops back on itself can be found.
- Run the Fich et al. leader method and loop detection simultaneously.
- The loop detection method needs to find the intersection before the Fich et al. leader method encounters it.
  - So the leader method can simulate that the tail points to the leader.

## Interleaving the Scans

These processes can be run simultaneously by interleaving the scans:

- F. The Fich et al. leader scan.
  - This scan proceeds the slowest at 1 step per call.
- T. The "tortoise" scan.
  - This scan proceeds at 4 steps per call.
- H. The "hare" scan.
  - This scan proceeds at 2 steps per call.

#### The F Scan

The  $\mathcal{F}$  scan will terminate on one of the following 3 cases:

- 1.  $\mathcal{F}$  determines the position is not a leader. Then the entire process of all three scans is aborted.
- 2.  $\mathcal{F}$  determines the position is the leader of a complete cycle. Then the reverse, and perhaps broken, cycle replaces the current cycle.
- 3.  $\mathcal F$  determines the position is the leader of a cycle whose tail is a position already determined by  $\mathcal T$  and  $\mathcal H$ . Then mutate the tail to point to the current position, enlarging the loop of the  $\mathfrak V$  and potentially eliminating the spine.

## The T and H Scans

#### The $\mathcal T$ and $\mathcal H$ scans have two phases:

- 1. The first phase is to detect if the cycle is broken.
  - If  $\mathcal H$  returns to the starting position, the cycle is not broken.  $\mathcal T$  and  $\mathcal H$  are aborted and  $\mathcal F$  continues until one of its first 2 cases happen.
  - Otherwise,  $\mathcal{T}$  and  $\mathcal{H}$  meet at some position, i.e. there is a position in common in the 4:2 (or possibly 2:1) steps taken in the current call. If this happens, the cycle is broken so advance to phase 2.
- 2. The second phase is to find the tail of the cycle.
  - lacksquare Reset  ${\mathfrak T}$  to the start and decrease the speed of  ${\mathfrak H}$  to 2 steps per call.
  - $\blacksquare$  When  ${\mathfrak T}$  and  ${\mathfrak H}$  meet for a second time, the tail can be identified.
  - $\mathcal{F}$  is left to continue, either to abort from a position that is determined not to be a cycle leader or to increase the size of the loop of the  $\sigma$ .

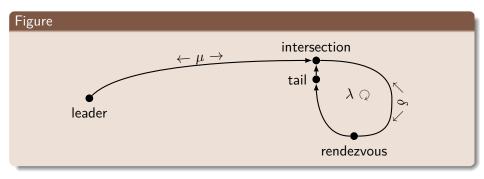
#### Tail Detection

#### **Theorem**

The tail of the broken cycle  $\alpha$  can be identified in less than  $2\ell$  iterations, where  $\ell$  is the cycle length of  $\alpha$ .

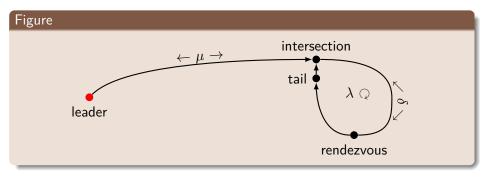
- The first phase will take less than  $\ell$  iterations.
  - The tortoise will either rendezvous with the hare, or return to the start.
- lacksquare The second phase will take less than  $\ell$  iterations.
  - The length of the spine cannot be longer than the cycle.

## Tail Detection – Figure



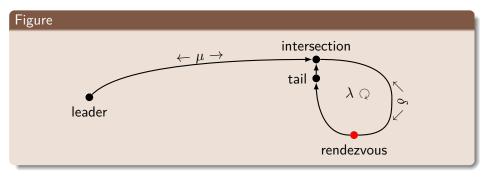
$$d_t = \frac{1}{2}d_h$$
$$2(\mu + \delta) = \mu + k\lambda + \delta$$
$$\mu = k\lambda - \delta$$

## <u>Tail Detection</u> – Figure



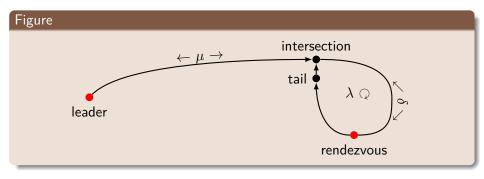
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## Tail Detection – Figure



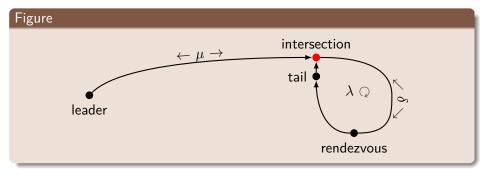
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## Tail Detection - Figure



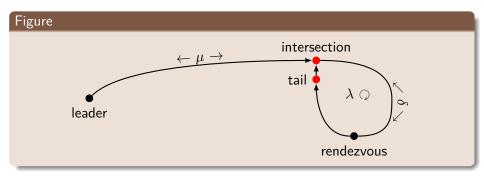
$$d_t = \frac{1}{2}d_h$$
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## <u>Tail Detection</u> – Figure



$$d_t = \frac{1}{2}d_h$$
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## Tail Detection – Figure



$$d_t = \frac{1}{2}d_h$$
$$2(\mu + \delta) = \mu + k\lambda + \delta$$
$$\mu = k\lambda - \delta$$

## Implementation – Loop and Tail Detection

## Algorithm

```
method detectCycleLoop()
    switch state do
         case SEARCHING FOR LOOP
              t \leftarrow \text{pi}[t]
              h \leftarrow \text{pi}[\text{pi}[h]]
              if t = h then
                   state \leftarrow \mathsf{LOOP} \ \mathsf{DETECTED}
                   t \leftarrow \text{pi}[t]
              if h = leader then
                   state \leftarrow CYCLE\_NOT\_MARKED
         case LOOP_DETECTED
              if t = pi[h] then
                   tail \leftarrow h
                   state \leftarrow \mathsf{IDENTIFIED} \mathsf{TAIL}
              t \leftarrow \text{pi}[t]
              h \leftarrow \text{pi}[h]
```

## Implementation - Next Snippet

- Run two steps of cycle loop detection per one step of Fich et al. leader.
- Replace the next method from the original Fich et al. leader method.

#### Snippet

```
\label{eq:method} \begin{array}{l} \textbf{method} \ \texttt{next()} \\ \\ \ detectCycleLoop() \\ \\ \ elbow[0] \leftarrow \texttt{pi}[elbow[1]] \\ \\ \textbf{if} \ state = \texttt{IDENTIFIED\_TAIL} \ \textbf{and} \ elbow[1] = tail \ \textbf{then} \\ \\ \ elbow[0] \leftarrow leader \end{array}
```

# Implementation - Invert Algorithm

## Algorithm

```
method invert()
   for leader \leftarrow 0 to n-1 do
       state \leftarrow SEARCHING\_FOR\_LOOP
       t \leftarrow h \leftarrow leader
       if isLeader (leader) then
           newLeader = elbow[0]
           switch state do
               case IDENTIFIED TAIL
                  pi[tail] \leftarrow leader
               case CYCLE_NOT_MARKED
                  if newLeader > leader then
                      newTail \leftarrow pi[newLeader]
                      reverse (leader)
                      pi[newTail] \leftarrow newTail
                  else
                      reverse (leader)
```

## Main Result

#### **Theorem**

In the worst case, the standard representation of a permutation of length n can be replaced with its own inverse in  $\mathcal{O}(n\log n)$  time using  $\mathcal{O}(\log^2 n)$  extra bits of space.

### Conclusion - Results

In the worst case, the standard representation of a permutation of length  $\,n\,$  can be replaced with its own inverse in:

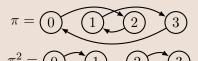
- $\mathcal{O}(n^2)$  time, using  $\mathcal{O}(\log n)$  extra bits.
- lacksquare  $\mathcal{O}(n\sqrt{n})$  time, using  $\mathcal{O}(\sqrt{n})$  extra bits.
- $\mathcal{O}(n \log n)$  time, using  $\mathcal{O}(\sqrt{n} \log n)$  extra bits.
- $\mathcal{O}(n \log n)$  time, using  $\mathcal{O}(\log^2 n)$  extra bits.

## Future Work on a Better Leader Method

- A better leader method will lead to a better invert algorithm.
- The  $\sigma$  technique can be independent of the leader method.
  - Bad cycles were detected by exploiting a property of Fich et al. leader.
  - Instead, traverse the reversed cycle testing for the new leader.
- Overhead added by the  $\sigma$  technique is  $\mathcal{O}(\log n)$  bits and  $\mathcal{O}(n)$  time.
- No leader method could use less resources and look at every position.

## Future Work on Other Transformations

- Apply an arbitrary power to a permutation in place.
- [Fich et al., 1995] can apply an arbitrary power of permutation.
- Rotate each cycle several steps, similar to transposing an array.
- A cycle may split into several smaller cycles.
- Could be done with maximum leader, but too slow.



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#### References

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- Knuth, D. E. (1969). The Art of Computer Programming, Volume II: Seminumerical Algorithms. Addison-Wesley.