

What, if anything,
can be done in linear time?

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Agenda

1. What linear time? Why linear time?
2. Propositional primal inforon logic
3. A linear time decision algorithm
4. Extensions with
 1. Disjunction
 2. Conjunctions as sets
 3. Transitivity

WHAT LINEAR TIME?

WHY LINEAR TIME?

Why

- Big data.
- Remark. In many cases, big-data algorithms are approximate and randomized, necessarily so.

What linear time?

- A short answer:
We use the standard computation model of the analysis of algorithms.
- A longer answer, with examples and all, follows.

Example 1: Sorting.

- A well-known lower bound is this:
Sorting n items requires $\Omega(n \cdot \log(n))$ comparisons and thus $\Omega(n \cdot \log(n))$ time.
- There is no way around the lower bound.
Or maybe there is?

An array A of length n

- Indices: $0, 1, \dots, n-1$
- Values $A[0], A[1], \dots, A[n-1]$

Distinct natural numbers $< n$
can be sorted in time $O(n)$.

We illustrate this with

$n = 7$ and $A = \langle A[0], A[1], A[2] \rangle = \langle 3, 6, 0 \rangle$.

1. Create an auxiliary array B and zero it:
 $B = \langle 0, 0, 0, 0, 0, 0, 0 \rangle$.
2. Traverse A ; for each value k , set $B[k] = 1$.
 B becomes $\langle 1, 0, 0, 1, 0, 0, 1 \rangle$.
3. Traverse B outputting indices with positive values: $\langle 0, 3, 6 \rangle$.

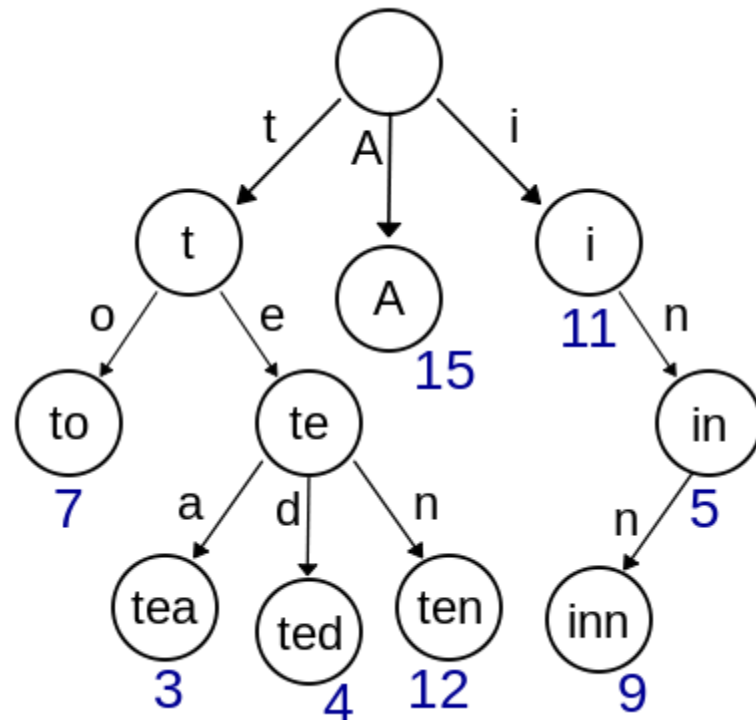
We forgo interesting generalizations.

The computation model

- Random Access Machine with registers of length $O(\log n)$.
 - Only the initial polynomial many registers are used, with address of length $O(\log n)$.
 - Relations $=, \geq, \leq$, and operations $+, -$ are constant time.
- The model reflects the standard computer architecture and the regular intuition of programmers.

Example 2: Tries

One application:
lexical analyzers



to, tea, ted, ten, A, inn

Example 3: Suffix arrays.

- Let $s = c_0 \dots c_{n-1}$. Each $i < n$ is the *key* for the suffix $c_i \dots c_{n-1}$.
- The *suffix array* for s is an array A of length n of s where each $A[j]$ is (the key of) the j -th suffix in the lexicographical order.
- An amazing algorithm constructs the suffix array in linear time.

Parsing logic formulas

- Using the tools above + a deterministic pushdown automaton, produce – in linear time – the parse tree of a given logic formula.
- The nodes and edges are decorated with useful labels and pointers.
- Two nodes may represent different occurrences of the same subformula; call them *homonyms*. All pointers $H(u)$ from any node u to its *homonymy original* can be constructed in $O(n)$.

PROPOSITIONAL PRIMAL INFON LOGIC

Motivation for primal logic

- Access control. DKAL

Why propositional?

- DKAL rules have the form

$v_1: T_1, v_2: T_2, \dots$

upon $\pi(w_1, \dots)$

if $\alpha(\dots)$

actions

Meaning: If an arriving message fits the pattern π and if the condition α follows from your knowledge assertions, perform the actions.

- Often, by the time you arrive to check α , it is ground. The assertion are typically not ground but only few particular ground instances are relevant.

Expository simplifications

- For expository reasons, we restrict attention to the “topless” (without T) fragment that is quote-free.

The derivation rules

$$\frac{x \wedge y}{x} \quad \frac{x \wedge y}{y} \quad \frac{x, y}{x \wedge y}$$

$$\frac{x, x \rightarrow y}{y} \quad \frac{y}{x \rightarrow y}$$

The subformula property

- Theorem. If

$$\alpha_1, \dots, \alpha_\ell$$

is a shortest derivation of φ from H
then every α_i is a subformula of H, φ .

- In the “quoteful” case, instead of subformulas of a formula α , we have formulas *local to* α . There are $< |\alpha|$ such local formulas.

An interpolation lemma of sorts

- Lemma. If $H \vdash \varphi$ then there is a set I of subformulas of H that are also subformulas of φ , such that
 1. Formulas I are derivable from H , and
 2. φ is derivable from I using only introduction rules.
- We will not use the interpolation lemma but it gives a useful optimization in the case where the hypotheses change rarely.

The multi-derivation problem

- Definition. Given sets H (hypotheses) and Q (queries) of formulas, decide which queries follow from the hypotheses.
- Theorem. The multi-derivation problem for propositional logic is solvable in linear time.
- We explain the main ideas.
- n is always the input size, essentially $|H| + |Q|$.

**A LINEAR TIME DECISION ALGORITHM
FOR THE MULTI-DERIVATION PROBLEM**

Approach: derive them all

Compute all subformulas of H, Q derivable from the hypotheses H .

High-level algorithm

- Initially all subformulas of H, Q are raw, only hypotheses are pending and there are no processed formulas.
- Pick the first pending formula α , apply all possible inference rules to α , then mark α processed.
 - In the process some raw formulas may become pending.
- Repeat until no formula is pending.

One easy case

- Apply the \wedge -elimination rule $\frac{x \wedge y}{x}$.
- In this case, α is a conjunction. If the first conjunct of α is raw, mark it pending.

One harder case

- Apply the \wedge -introduction rule $\frac{x,y}{x\wedge y}$ with α playing the role of x .
- All raw formulas of the form $\alpha \wedge y$ where y is pending or processed, should be marked pending.
- How do we find them? We don't have the time to walk through the raw formulas.

Local search

- Every homonymy original node u is endowed with four so-called *use sets* denoted

$$(\wedge, l), (\wedge, r), (\rightarrow, l), (\rightarrow, r)$$

computed as follows.

- Traverse the parse tree, in the depth-first way.
- If a homonymy original u is the left child of a conjunction node w , put $H(w)$ into the use set (\wedge, l) of u . If u is the right child of w , put $H(w)$ use (\wedge, r) instead.
- Similarly for \rightarrow .

Back to applying $\frac{x \wedge y}{x}$

- Recall: we are looking for raw formulas of the form $\alpha \wedge y$ where α is the first pending formula.
- Just walk through the use set (\wedge, l) of α .

EXTENSION 1: DISJUNCTIONS

Motivations

Recall the DKAL rule

$v_1: T_1, \dots, v_j: T_j$
upon $\pi(w_1, \dots)$
if $\alpha(\dots)$
actions

and suppose that $\alpha = \beta \vee \gamma$, e.g.

passport(traveller,UK) \vee passport(traveller,EU).

There may be many such disjunctions. They may be eliminated but they make rule much more succinct.

Add only introduction rules

$$\frac{x}{x \vee y} \quad \frac{y}{x \vee y}$$

The linear decision algorithm generalizes in a rather obvious way.

EXTENSION 2: CONJUNCTIONS (AND DISJUNCTIONS) AS SETS

Motivation

While $x \wedge y$ entails $y \wedge x$,

- $(x \wedge y) \rightarrow z$ doesn't entail $(y \wedge x) \rightarrow z$,
- $z \rightarrow (x \wedge y)$ doesn't entail $z \rightarrow (y \wedge x)$,
- $(x \wedge y) \wedge z \rightarrow w$ doesn't entail $x \wedge (y \wedge z) \rightarrow w$, etc.

The idea, a problem, and a solution

- View conjunctions as sets of conjuncts.
This repairs the missing entailments.
- But sets are not constructive objects.
- Represent sets as sequences by ordering the conjuncts lexicographically.

The decision algorithm

- The resulting multi-derivability problem is solvable in expected linear time.
- It is the algorithm that introduces randomization. No probability distribution on inputs is assumed.

EXTENSION 3: TRANSITIVE PRIMAL INFON LOGIC

Motivation

- In primal intuition logic,
 $(x \rightarrow y), (y \rightarrow z)$ don't entail $(x \rightarrow z)$.

New axiom and rule

- In the quoteless case, transitive primal infon logic is the extension of primal infon logic with an axiom $x \rightarrow x$ and the rule

$$\frac{x \rightarrow y, y \rightarrow z}{x \rightarrow z}$$

An alternative presentation of transitivity

$$\frac{x_1 \rightarrow x_2, x_2 \rightarrow x_3, \dots, x_{k-1} \rightarrow x_k}{x_1 \rightarrow x_k}$$

Logically the alternative presentation is equivalent to the original one but algorithmically it makes a lot of difference.

Multi-derivability

- Multi-derivability problem for the transitive primal infon logic is solvable in quadratic time.

THANK YOU

VAULT

High-level algorithm

Initially all local formulas are *raw*,
except that hypotheses are *pending*.
No formulas are *processed*.

1. Pick the first pending formula α ,
 2. apply all (applicable) inference rules R to α ;
if any of the conclusions are raw, make them pending.
 3. mark α processed.
 4. Repeat until no formula is pending.
- Pending and processed formulas have been derived.
 - Formulas move only from raw to pending to processed.

One easy case

- $\alpha = \beta \wedge \gamma$, R is $\frac{x \wedge y}{x}$.
- If β is raw, mark it pending.

One harder case

- Apply $R = \frac{x, y}{x \wedge y}$ to α , with α being the left premise.
 - It will be convenient to abbreviate this sentence thus: apply R_l to α .
- All raw formulas $\alpha \wedge y$, with y pending or processed, should be marked pending.
But how do we find them?

Succinct representation, 1

- Local formulas are too big objects to manipulate in linear time. So we work with the parse tree of H, Q . The subtree rooted at a node u of $\text{ParseTree}(H, Q)$ is the parse tree of some formula φ , the *formula* of u .
- Draft definition. If $\varphi = \text{Formula}(u)$ then u represents φ .
- But then φ may have many representations.
- Call nodes u, v *homonyms* if their formulas are isomorphic.

Succinct representation, 2

- *Lemma.* There is a linear-time algorithm that
 - chooses a *homonymy leader* in every homonymy class, and
 - sets pointers Hu from any node u to its homonymy leader.
- The algorithm uses suffix arrays.
- *Def.* If $\varphi = \text{Formula}(u)$ then Hu represents φ . Further, $Hu = \text{Node}(\varphi)$.

The use sets $US(R_l, u)$

- Traverse the parse tree in the depth-first manner. For every homonymy leader w with $\text{Formula}(w) = x \wedge y$,
put w into the use set $US(R_l, Hw_l)$.
 - Here w_l is the left child of w .
 - Notice that $Hw_l = \text{Node}(x)$.
 - Notice that every $\text{Node}(\alpha \wedge y)$ occurs in $US(R_l, \text{Node}(\alpha))$.

Applying R_l to α

- Walk through $US(R_l, \text{Node}(\alpha))$ and mark every row w there pending.
- How do you find $\text{Node}(\alpha)$?
That is how α is given in the first place.