

Algorithmic Aspects of WQO (Well-Quasi-Ordering) Theory

Part III: Fast-growing complexity

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LSV, CNRS & ENS Cachan

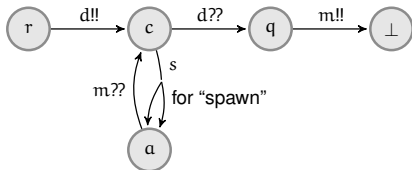
Chennai Mathematical Institute, Jan. 2017

Based on joint work with Sylvain Schmitz, Prateek Karandikar, K. Narayan Kumar, Alain Finkel, ..

Lecture notes & exercises available via www.lsv.ens-cachan.fr/~phs

EXAMPLE OF WSTS: BROADCAST PROTOCOLS

Broadcast protocols (Esparza et al.'99) are dynamic & distributed collections of finite-state processes communicating via broadcasts and rendez-vous.



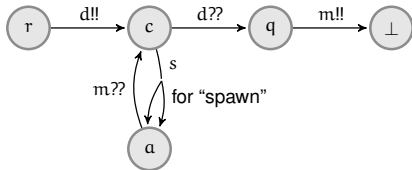
A **configuration** collects the local states of all processes. E.g., $s = \{c, r, c\}$, also denoted $\{c^2, r\}$.

Steps: $\{c^2, q, r\} \xrightarrow{s} \{a^2, c, q, r\} \xrightarrow{s} \{a^4, q, r\} \xrightarrow{m} \{c^4, r, \perp\} \xrightarrow{d} \{c, q^4, \perp\}$

We'll soon see: The above system does not have infinite runs

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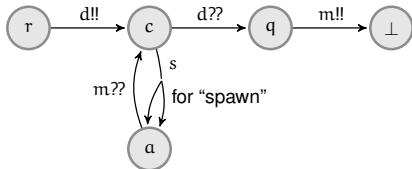
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BROADCAST PROTOCOLS ARE WSTS

Ordering of configurations is multiset inclusion, e.g., $\{c, q\} \subseteq \{c^2, r, q\}$

Fact. Configurations $(\mathbb{N}^{\{r,c,a,q,\perp\}}, \subseteq)$ is a **wqo**.

Proof: this is exactly (\mathbb{N}^5, \leq_x)

Fact. Broadcast protocols are **monotonic TS**

Proof Idea: assume $s_1 \subseteq t_1$ and consider all cases for a step $s_1 \rightarrow s_2$. In each case we have to find some $t_1 \rightarrow t_2$ with $s_2 \subseteq t_2$.

Coro. Broadcast protocols are **WSTS**

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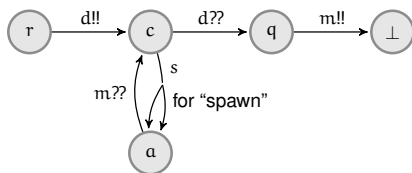
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BROADCAST PROTOCOLS AND TERMINATION



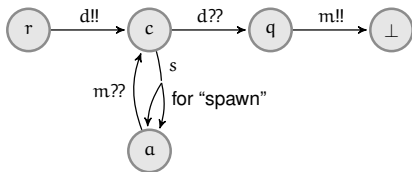
This broadcast protocol terminates: **all its runs are bad sequences**, hence are finite

Proof. Assume $s_0 \rightarrow s_1 \rightarrow \dots \rightarrow s_n$ and pick two positions $i < j$. Write $s_i = \{a^{n_a}, c^{n_c}, q^{n_q}, r^{n_r}, \perp^*\}$, and $s_j = \{a^{n'_a}, c^{n'_c}, q^{n'_q}, r^{n'_r}, \perp^*\}$.

- if a d has been broadcast during $s_i \xrightarrow{+} s_j$, then $n'_r < n_r$,
- if no d but a m have been broadcast, then $n'_q < n_q$,
- otherwise $s_i \xrightarrow{+} s_j$ uses only spawning steps, then $n'_c < n_c$.

In all cases, $s_i \not\subseteq s_j$. QED

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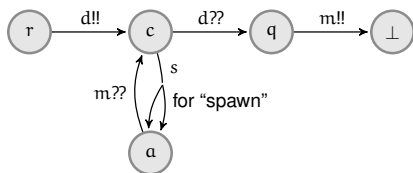
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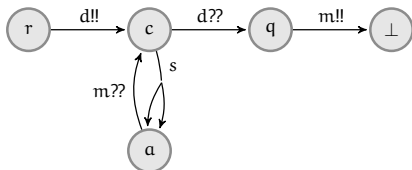
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BROADCAST PROTOCOLS TAKE THEIR TIME

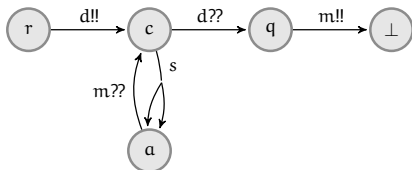


“Doubling” run: $\{c^n, q, \perp^*\} \xrightarrow{s^n} \{a^{2^n}, q, \perp^*\} \xrightarrow{m} \{c^{2^n}, \perp^+\}$

Building up: $\{c^{2^0}, q^n, r\} \xrightarrow{s^{2^0} m} \{c^{2^1}, q^{n-1}, r\} \xrightarrow{s^{2^1} m} \{c^{2^2}, q^{n-2}, r\} \rightarrow$
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Then: $\{c, q, r^n\} \xrightarrow{*} \{c, q^{2^n}, r^{n-1}\} \xrightarrow{*} \{c, q^{\text{tower}(n)}\}$

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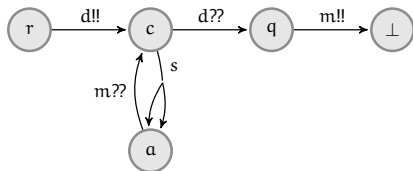


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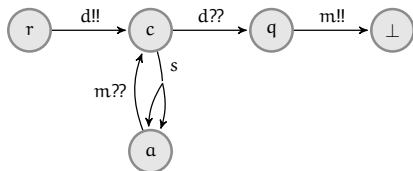
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where $\text{tower}(n) \stackrel{\text{def}}{=} 2^{2^{\cdot^{\cdot^{\cdot}}}}$ } n times

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⇒ Runs of terminating systems may have nonelementary lengths

⇒ Running time of termination verification algorithm is not elementary (for broadcast protocols)

ORDINAL INDEXES FOR COMPLEXITY CLASSES

The complexity analysis for WQO-based algorithms use new complexity classes: F_1, F_2, F_3, \dots

Continues with transfinite indexes: $F_4, \dots, F_\omega, F_{\omega+1}, F_{\omega+2}, \dots, F_{\omega \cdot 2}, F_{\omega \cdot 2 + 1}, \dots, F_{\omega \cdot 3}, \dots, F_{\omega \cdot 4}, \dots, F_{\omega^2}, F_{\omega^2 + 1}, \dots, F_{\omega^2 + \omega}, \dots, F_{\omega^2 + \omega \cdot 2}, \dots, F_{\omega^2 \cdot 2}, \dots, F_{\omega^3}, \dots, F_{\omega^\omega}, \dots, F_{\omega^{\omega^\omega}}, \dots,$

• We work with ordinals below ε_0 written in **Cantor normal form**:

$$\alpha = \omega^{\alpha_1} + \dots + \omega^{\alpha_m} \quad \text{where } \alpha > \alpha_1 \geq \dots \geq \alpha_m$$

NB: α is **zero** iff $m = 0$; it is a **successor** $\alpha = \beta + 1 = \beta + \omega^0$ iff $m > 0$ and $\alpha_m = 0$; otherwise it is a **limit** $\alpha = \lambda$

Alternative notation:

$$\alpha = \omega^{\alpha_1} \cdot c_1 + \dots + \omega^{\alpha_m} \cdot c_m \quad \text{now with } \alpha > \alpha_1 > \dots > \alpha_m \\ c_1, \dots, c_m \in \mathbb{N}$$

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FAST-GROWING FUNCTIONS

$(F_\alpha)_{\alpha \in \text{Ord}}$: an ordinal-indexed family of functions $F_\alpha : \mathbb{N} \rightarrow \mathbb{N}$

$$F_0(x) \stackrel{\text{def}}{=} x+1 \quad F_{\alpha+1}(x) \stackrel{\text{def}}{=} \overbrace{F_\alpha(F_\alpha(\dots F_\alpha(x)\dots))}^{x+1} \quad F_\omega(x) \stackrel{\text{def}}{=} F_{x+1}(x)$$

gives $F_1(x) = 2x + 1 \approx 2x$, $F_2(x) = 2^{x+1}(x+1) - 1 \approx 2^x$,
 $F_3(x) \approx \text{tower}(x)$ and $F_\omega(x) \approx \text{ACKERMANN}(x)$, the first F_α that is not primitive recursive.

Generally $F_\lambda(x) \stackrel{\text{def}}{=} F_{\lambda_x}(x)$ with $\lambda_0 < \lambda_1 < \lambda_2 < \dots < \lambda$ a fundamental sequence for λ , given by

$$(\gamma + \omega^{\beta+1})_x \stackrel{\text{def}}{=} \gamma + \omega^\beta \cdot (x+1) \quad (\gamma + \omega^\lambda)_x \stackrel{\text{def}}{=} \gamma + \omega^{\lambda_x}$$

$$\text{E.g. } F_{\omega^2}(7) = F_{\omega \cdot 8}(7) = F_{\omega \cdot 7+8}(7) = \overbrace{F_{\omega \cdot 7+7}(F_{\omega \cdot 7+7}(\dots (F_{\omega \cdot 7+7}(7))\dots))}^8$$

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THE FAST-GROWING HIERARCHY

By Schmitz (2013), after Wainer & Löb (1970), Grzegorzczuk (1953)

$\mathbb{F}_\alpha \stackrel{\text{def}}{=} \bigcup_{p \in \mathcal{F}_{<\alpha}} \text{FDTIME}(F_\alpha(p(n)))$, ie all functions in time $F_\alpha(\textit{negligible}(n))$

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1. These classes admit many other characterizations and capture some well-known cases:

$$\mathbb{F}_2 = E = \text{DTIME}(2^{O(n)}), \mathcal{F}_{<3} = \text{FELEM}, \mathcal{F}_{<\omega} = \text{PR}, \mathcal{F}_{<\omega^\omega} = \text{MPR}$$

2. A strict hierarchy: $\mathbb{F}_\beta \subsetneq \mathbb{F}_\beta^{c+1} \subsetneq \mathbb{F}_\alpha$ for all $\beta < \alpha$ and $c > 0$.

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COMPLEXITY ANALYSIS?

When analyzing the termination algorithm, the main question is “**how long can a bad sequence be?**”

WQO-theory only says that a bad sequence is **finite**

Over (\mathbb{N}^k, \leq_x) , one can find arbitrarily long bad sequences:

— 999, 998, ..., 1, 0

— (2,2), (2,1), (2,0), (1,999), ..., (1,0), (0,999999999), ...

Same over $(A^*, \leq_{\text{subword}})$ for $A = \{a, b, c\}$:

— aa, bbabb, bbbab, bbbbbbbba,

cc, ...

Two tricks: **unbounded start** element, or **unbounded increase** in a step

The runs of a broadcast protocol don't play these tricks!

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Same over $(A^*, \leq_{\text{subword}})$ for $A = \{a, b, c\}$:

— aa, bbabb, bbbab, bbbbbbbba,

ccccbcccbccccccccbcccccccccbcccccccccbcccccccccbcccccacccc, ...

Two tricks: **unbounded start** element, or **unbounded increase** in a step

The runs of a broadcast protocol don't play these tricks!

CONTROLLED BAD SEQUENCES

Def. A sequence x_0, x_1, \dots is **controlled** $\stackrel{\text{def}}{\Leftrightarrow} |x_i| \leq g^i(n_0)$ for all $i = 0, 1, \dots$

Here the **control** is the pair (n_0, g) of $n_0 \in \mathbb{N}$ and $g: \mathbb{N} \rightarrow \mathbb{N}$.

Fact. For a fixed wqo $(A, \leq, |\cdot|)$ and control (n_0, g) , there is max length on controlled bad sequences (König's Lemma again)

Write $L_{g,A}(n_0)$ for this maximum length.

Satisfies well-founded recurrence:

$$L_{g,A}(n) = \max_{|x| \leq n} 1 + L_{g,A \setminus \uparrow x}(g(n))$$

Length Function Theorems for (\mathbb{N}^k, \leq_x) :

- If g is in \mathcal{F}_γ for $\gamma > 0$ then L_{g, \mathbb{N}^k} is in $\mathcal{F}_{\gamma+k}$
- If g is in $g \in \mathcal{F}_1$ then $L_{g, \mathbb{Q} \times \mathbb{N}^k}$ is in $\mathbb{F}_k^{|\mathbb{Q}|}$

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APPLYING TO BROADCAST PROTOCOLS

Fact. The runs explored by the Termination algorithm are **controlled** with $|s_{init}|$ and $Succ : \mathbb{N} \rightarrow \mathbb{N}$.

\Rightarrow Time/space bound in \mathbb{F}_k for broadcast protocols with k states, and in \mathbb{F}_ω when k is not fixed.

Fact. The minimal pseudo-runs explored by the backward-chaining Coverability algorithm are **controlled** by $|s_{target}|$ and $Succ$.

$\Rightarrow \dots$ *same upper bounds* \dots

This is a general situation:

- WSTS model (or WQO-based algorithm) provides g
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MORE LENGTH FUNCTION THEOREMS

For finite words with \leq_{subword} , $L_{\mathcal{A}^*}$ is in $\mathbb{F}_{\omega^{|\mathcal{A}|-1}}$, and in $\mathbb{F}_{\omega^\omega}$ when alphabet is not fixed. Applies e.g. to lossy channel systems.

For sequences over \mathbb{N}^k with embedding, $L_{(\mathbb{N}^k)^*}$ is in $\mathbb{F}_{\omega^{\omega^k}}$, and in $\mathbb{F}_{\omega^{\omega^\omega}}$ when k is not fixed. Applies e.g. to timed-arc Petri nets.

For finite words with priority ordering, $L_{\mathcal{A}^*}$ is in $\mathbb{F}_{\varepsilon_0}$. Applies e.g. to priority channel systems and higher-order LCS.

Bottom line: we have definite complexity upper bounds for WQO-based algorithms

Next course: are these tight upper bounds? how does one prove fast-growing lower bounds?

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