

# Equilibrium Points of an AND-OR Tree: under Constraints on Probability

Toshio Suzuki<sup>1</sup>   Yoshinao Niida<sup>2</sup>

Department of Math. and Information Sciences, Tokyo Metropolitan University,

<sup>1</sup>The speaker,   <sup>2</sup>Current affiliation: Patent Result

Workshop on Mathematical Logic on the Occasion of

Sakaé Fuchino's 60th Birthday, Kobe Univ.

November 17, 2014

# Abstract

Let  $d$  be a prob. distribution on a uniform binary AND-OR tree.

Liu and Tanaka (2007)

If  $d$  achieves the equilibrium among ID then  $d$  is an IID.

## Our result

Given a real number  $r$  ( $0 < r < 1$ ), we consider a constraint  $p$  ( $:= \text{prob}[\text{the root has the value } 0]$ )  $= r$ .

When we restrict ourselves to IDs satisfying this constraint, the above result still holds.

**Keys to the solution.** (In an IID on an OR-AND tree)

- (1)  $\text{cost} / p$  is a decreasing func. of the probability  $x$  of the leaf.
- (2)  $\text{cost}' / p'$  is a decreasing function of  $x$ , too.

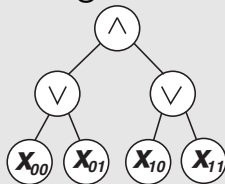
# Outline

- 1 Abstract
- 2 Our settings
- 3 Preceding study
- 4 Method
- 5 Our result
- 6 Graphs
- 7 References

# Our setting (1)

Fix a uniform binary AND-OR tree

Example:  
height = 2



- $\wedge = \text{AND} = \text{Min.}$
- $\vee = \text{OR} = \text{Max.}$
- Find: root = 1 (TRUE) or 0 (FALSE)?
- Each leaf is hidden.
- **Cost** := How many leaves probed?
- Allowed to skip a leaf ( $\alpha$ - $\beta$  pruning).

# Our setting (1)

## Definition. Alpha-Beta Pruning Algorithm

- Depth-first.
- A child of an AND-gate has the value 0



Recognize that the AND-gate has the value 0  
**without probing the other child** (an alpha-cut).

- Similar rule applies to an OR-gate (a beta-cut).

Knuth, D.E. and Moore, R.W.: An analysis of alpha-beta pruning.  
*Artif. Intell.*, **6** pp. 293–326 (1975).

## Our setting (2)

An algorithm is not randomized. Terminal values are randomized.

- An algorithm is assumed to be a deterministic alpha-beta pruning algorithm. It does not toss a coin.
- A (biased) coin is assigned to each leaf. We investigate an ID (independent distrib.) on the terminal values.

# Preceding study

## Theorem A (Liu and Tanaka, 2007)

If  $d$  achieves the equilibrium among IDs then  $d$  is an IID.

Their proof: “It is not hard.”

Here, ID denotes an independent distribution.

IID denotes an independent **identical** distribution.

Liu, C.-G. and Tanaka, K.:

Eigen-distribution on random assignments for game trees.

*Inform. Process. Lett.*, **104** pp.73–77 (2007).

# Preceding study

## Equilibrium

“ $d$  achieves the equilibrium among  $\blacktriangle\blacktriangle\blacktriangle$ ”

$\Leftrightarrow d$  has the property  $\blacktriangle\blacktriangle\blacktriangle$  and

$$\min_{A_D} \text{cost}(A_D, d) = \max_{\delta} \min_{A_D} \text{cost}(A_D, \delta)$$

Here,

$A_D$  runs over all deterministic alpha-beta pruning algorithms.

$\delta$  runs over all prob. distributions s.t.  $\blacktriangle\blacktriangle\blacktriangle$ .

$\blacktriangle\blacktriangle\blacktriangle$  is e.g., ID.



# Preceding study

Theorem A (Liu and Tanaka, 2007)

If  $d$  achieves the equilibrium among IDs then  $d$  is an IID.

Their proof: "It is not hard."

Is it (↑) really easy to prove?

No. A brutal induction does not work.

We show a stronger form of Theorem A with clever tricks of induction.

# Keys to the solution

## Lemma 1 (of ours)

Consider an IID on an OR-AND tree.

$x :=$  prob. of a leaf (having the value 0).

$p(x) :=$  prob. of the root (having the value 0).

$c(x) :=$  expected cost of the root.

Then, both of the followings are decreasing functions of  $x$  ( $0 < x < 1$ ).

$$\frac{c(x)}{p(x)}, \quad \frac{c'(x)}{p'(x)}$$

# Keys to the solution

## Lemma 2 (of ours)

A certain constraint extremum problem has a unique solution.

The proof highlight: By means of Lemma 1, the objective function is decreasing in a certain open interval.  $\square$

Remark:

At the maximizer, the objective function is NOT differentiable.

# Keys to the solution

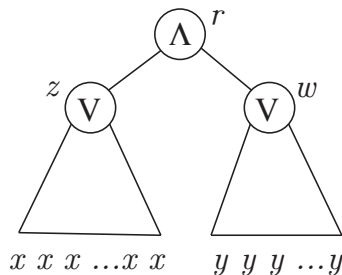
Our constraint extremum problem:

Letters denote probabilities of having the value 0 at nodes.

$z$  is the master variable. The objective function is the cost of the tree (the associated algorithm: left to right).

Side conditions:  $r$  is a probability constraint (fixed,  $0 < r < 1$ ).

$1 - \sqrt{1 - r} < z < r$ ,  $(1 - z)(1 - w) = 1 - r$ .



# Our result

## Theorem B (Our main result)

Fix an  $r$  ( $0 < r < 1$ ). Let  $r$ ID denote an ID s.t. prob. of the root (having the value 0) is  $r$ .

If  $d$  achieves the equilibrium among  $r$ IDs then  $d$  is an IID.



As a corollary

## Theorem A (Liu and Tanaka, 2007)

If  $d$  achieves the equilibrium among IDs then  $d$  is an IID.

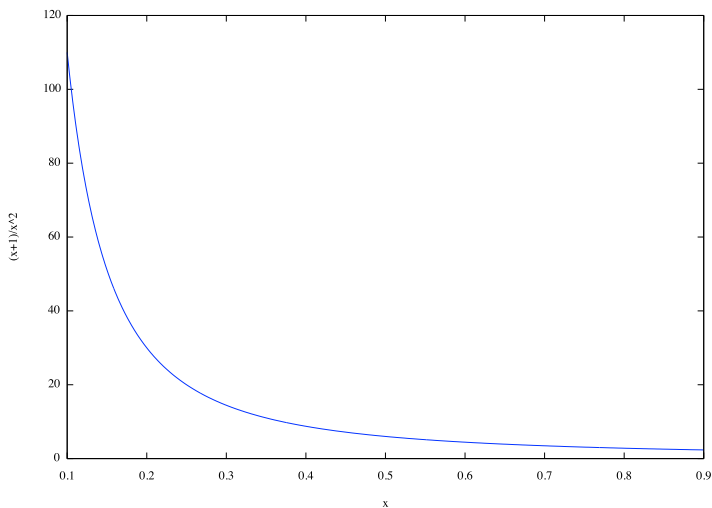


Figure 1:  $c_{V,1}(x)/p_{V,1}(x)$  ( $0.1 < x < 0.9$ )

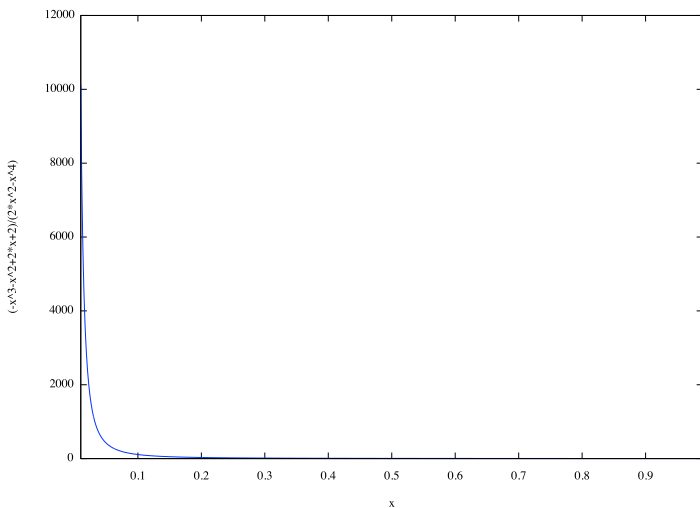


Figure 2:  $c_{V,2}(x)/p_{V,2}(x)$  ( $0 < x < 1$ )

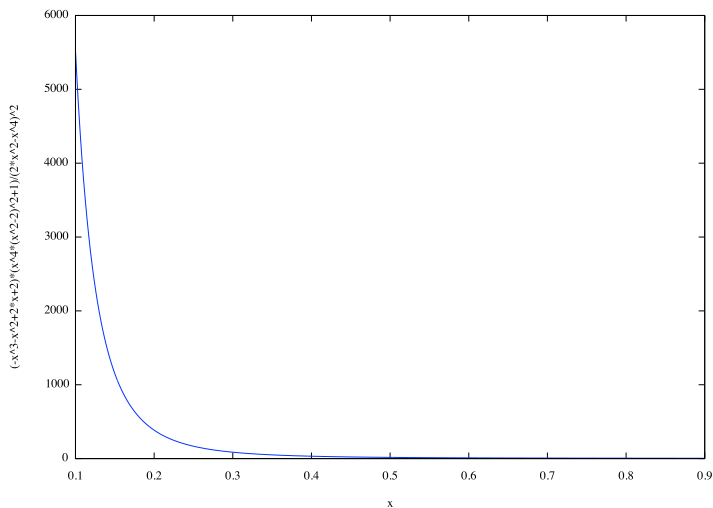


Figure 3:  $c_{V,3}(x)/p_{V,3}(x)$  ( $0.1 < x < 0.9$ )



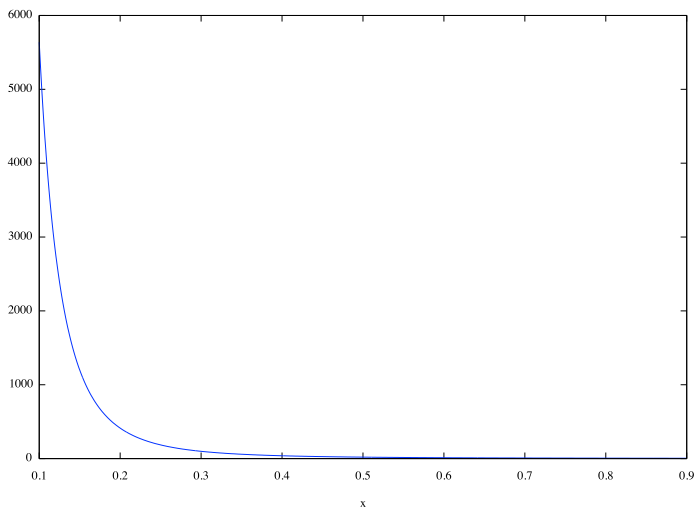


Figure 4:  $c_{V,4}(x)/p_{V,4}(x)$  ( $0.1 < x < 0.9$ )

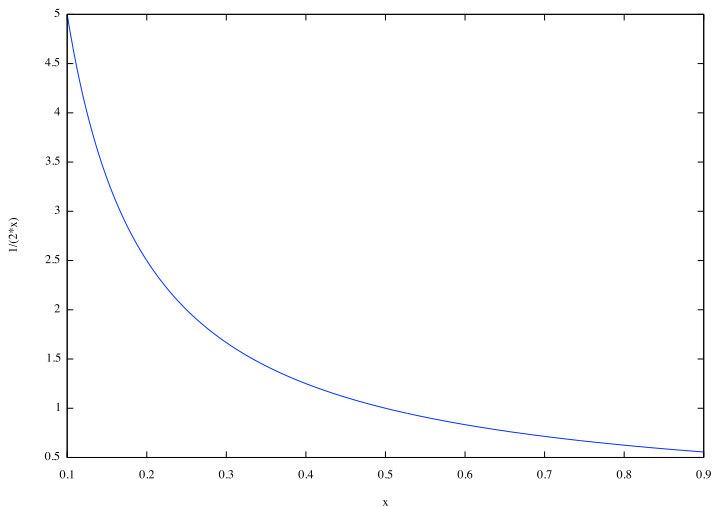


Figure 5:  $c'_{\vee,1}(x)/p'_{\vee,1}(x)$  ( $0.1 < x < 0.9$ )

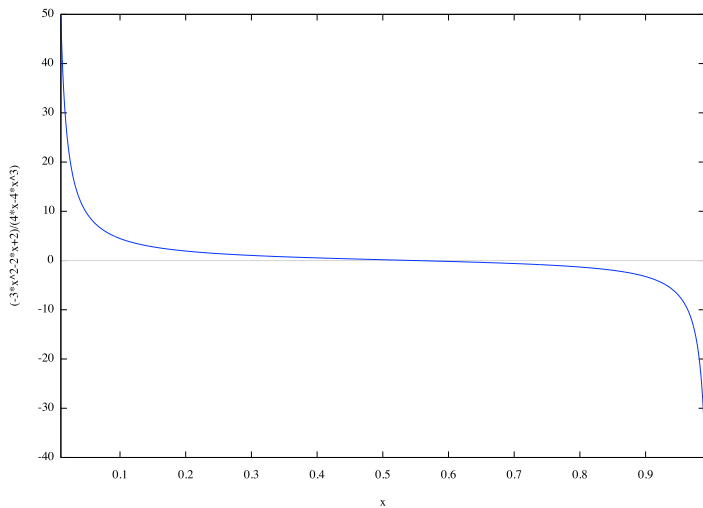


Figure 6:  $c'_{\vee,2}(x)/p'_{\vee,2}(x)$  ( $0 < x < 1$ )

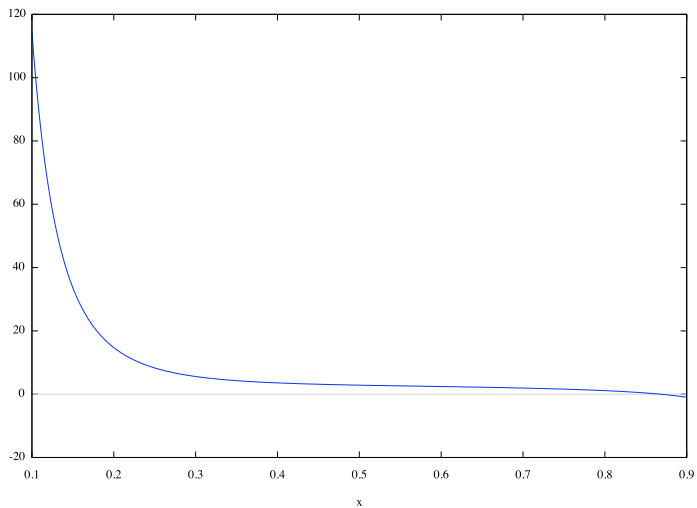


Figure 7:  $c'_{v,3}(x)/p'_{v,3}(x)$  ( $0.1 < x < 0.9$ )

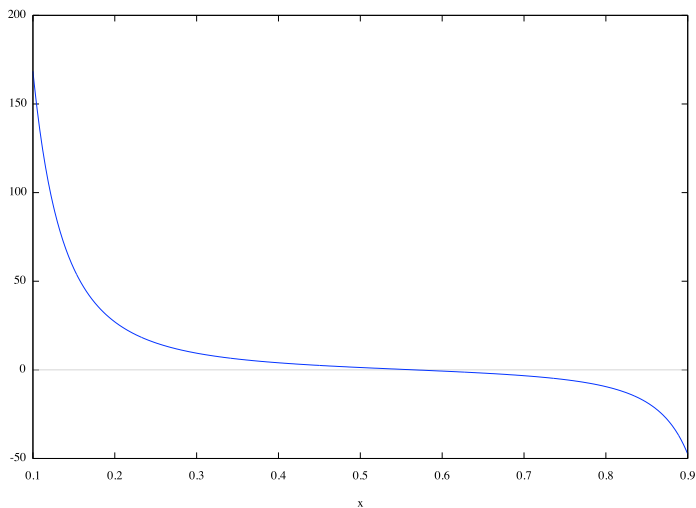






Figure 8:  $c'_{v,4}(x)/p'_{v,4}(x)$  ( $0.1 < x < 0.9$ )

Thank you for your attention.

Happy 60th birthday.

arXiv:1401.8175

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-  Saks, M. and Wigderson, A.: Probabilistic Boolean decision threes and the complexity of evaluating game trees. In: *Proc. 27th FOCS*, pp.29–38 (1986).
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