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# Parallel Verification of Natural Deduction Proof Graphs

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# Problem Statement

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1. How do we efficiently verify large natural deduction proofs?
2. To this end, is there a way that we can make use of parallelism?

## Related Work

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[Färber, 2022] breaks up a command for proof checking inside the lambda-Pi calculus modulo rewriting into four tasks: parsing, sharing, type inference, type checking.

*Similarly in this work, we'll be splitting verification of a natural deduction step into two tasks: **syntax verification** and **assumption checks**.*



# Natural Deduction

A logic calculus independently proposed by [Gentzen, 1935, Jaśkowski, 1934] in an effort to emulate human-level reasoning through assumptions and chains of inference.

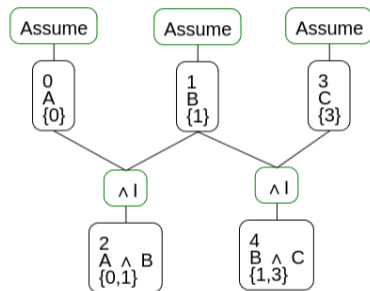
$$\begin{array}{c}
 \frac{}{\{\phi\} \vdash \phi} \text{A} \\
 \frac{\Gamma \cup \{\phi\} \vdash \psi}{\Gamma \vdash \phi \rightarrow \psi} \rightarrow I \\
 \frac{\Delta \vdash \psi \vee \phi \quad \Gamma \cup \{\psi\} \vdash \chi \quad \Sigma \cup \{\phi\} \vdash \chi}{\Delta \cup \Gamma \cup \Sigma \vdash \chi} \vee E \\
 \frac{\Gamma \vdash \phi \quad \Sigma \vdash \phi \rightarrow \psi}{\Gamma \cup \Sigma \vdash \psi} \rightarrow E \\
 \frac{\Gamma \cup \{\phi\} \vdash \psi \quad \Sigma \vdash \neg \psi}{\Gamma \cup \Sigma \vdash \neg \phi} \neg I
 \end{array}$$

Figure: Partial Collection of Inference Schemas for Natural Deduction

# Compact Representation

Within a hypergraphical representation of a natural deduction proof:

- ▶ Formula and assumptions are stored on the node.
- ▶ Justification is stored on its incoming hyperedge.

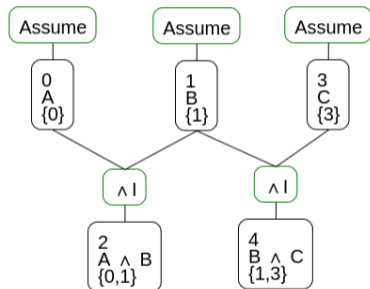


This representation allows us to compactly represent **multiple proofs** and easily **reuse subproofs**.

# Graphical Interactive Theorem Provers

When building an interactive theorem prover, we want to alleviate as much burden as possible.

Both [Bringsjord et al., 2022, Oswald and Rozek, 2022] have the user not specify the assumptions used within each step.



# Multiprocessing

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This work uses the *shared memory model* for multiprocessing. We'll instantiate a fixed number of threads and have them operate over the same memory space.

We need a way to systematically assign nodes in our hypergraphical representation to each thread to verify.



## Approach



# Layering

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- ▶ To make use of parallelism, we want to find groups of nodes that we can verify at the same time.
- ▶ A node's assumptions are dependent on its ancestors.

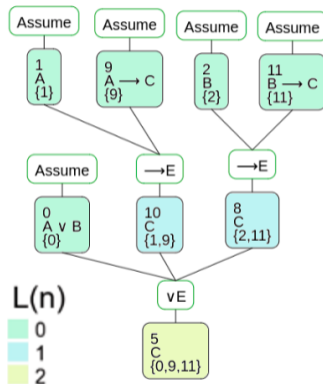
We define a node  $n$  to be on layer

$$L(n) = \begin{cases} 0 & \text{if } n \text{ is an assumption} \\ 1 + \max_{m \in P(n)} (L(m)), & \text{otherwise} \end{cases} \quad (1)$$

where  $P(n)$  maps a node to its parents.



# Layering Example



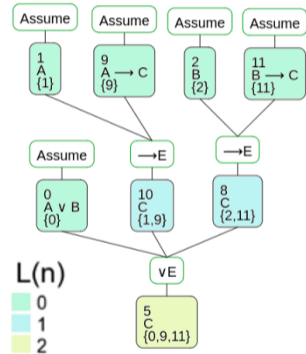
Layer	Nodes
0	0 1 9 2 11
1	10 8
2	5

# Serial Example

On Layer 0, we have the following nodes:

$$\{A, A \rightarrow C, B, B \rightarrow C, A \vee B\}$$

- ▶ These trivially verify as they're assumptions
- ▶ Each node's assumption multiset will consist of its own formula.

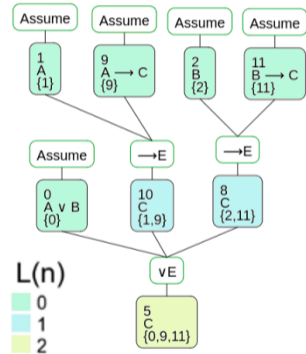


# Serial Example

On Layer 1, we have the following nodes:

$$\{C_{10}, C_8\}$$

- ▶ They're both justified by conditional elimination so there's no special assumption constraint.
- ▶ Each node's assumption multiset is the union of their two parent's assumptions.

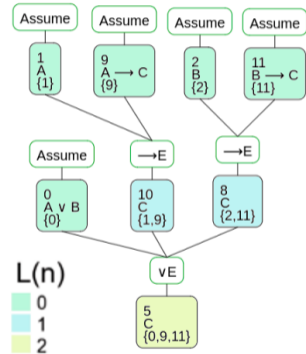


# Serial Example

On Layer 2, we have the following node:

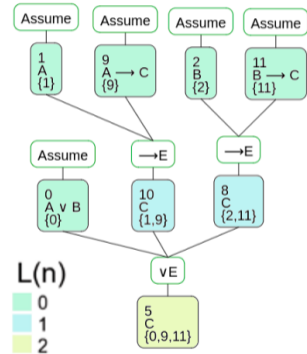
$$\{C_5\}$$

- ▶ It's justified by disjunction elimination, so it requires that each disjunct is used as an assumption.
- ▶ The resulting assumption on  $C$  is the union of the three parent multisets minus the disjunct assumptions.



# Serial Example

Since we got through the entire proof without any verification failures, the entire proof graph has been verified.



# Serial Version of the Algorithm

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```
1: procedure VERIFY(ProofGraph p)
2:   Create set of nodes on each layer using Equation 1 and store in layerMap.
3:   for layerNodes in layerMap do
4:     for n in layerNodes do
5:       ruleInfo = (m, assumptions(m))  $\forall m \in \text{parents}(n)$ 
6:       if not is_valid(n, justification, ruleInfo) then
7:         return false
8:       Update assumptions(n) using the justification and ruleInfo.
9:   return true
```

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## Parallel Algorithms



# Parallel Algorithms

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We consider a base parallel algorithm implementation and two optimizations:

- ▶ Static Load Balancing
- ▶ Syntax First

## Simple Parallel

# Simple Parallel

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We iterate over each layer as with serial but verify each node in a given layer in *parallel*.

- ▶ We'll also include some additional data structures to address issues with *thread safety*.

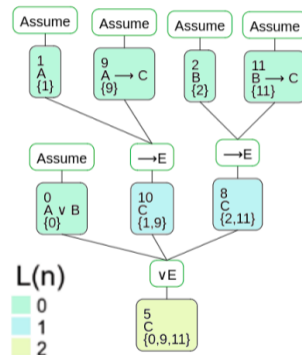
# Simple Parallel Example

Recall on Layer 0, we have the following nodes:

$$\{A, A \rightarrow C, B, B \rightarrow C, A \vee B\}$$

Assuming we have three threads:

- ▶ Thread 0 will be assigned  $A, A \rightarrow C$
- ▶ Thread 1 will be assigned  $B, B \rightarrow C$
- ▶ Thread 2 will be assigned  $A \vee B$

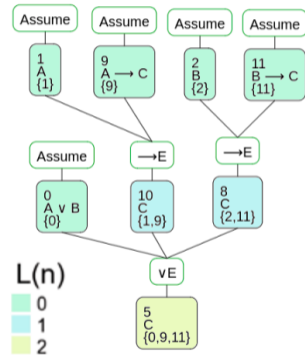


# Simple Parallel Example

From the perspective of thread 0, we need to verify

$$\{A, A \rightarrow C\}$$

- ▶ After verification, calculate the assumptions for each of the nodes and update its appropriate entry in the shared memory vector.
- ▶ Repeat for the remaining nodes
- ▶ Wait for all other threads to finish
- ▶ Move to the next layer



## Optimization: Static Load Balancing

# Static Load Balancing

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Recall the assignment from the last algorithm:

- ▶ Thread 0 will be assigned  $A, A \rightarrow C$
- ▶ Thread 1 will be assigned  $B, B \rightarrow C$
- ▶ Thread 2 will be assigned  $A \vee B$

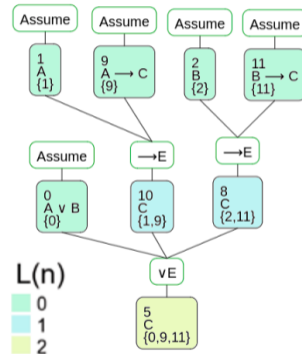
Notice how thread 2 has one less item to verify. This version of the algorithm attempts to balance this out by *syntax verifying* a node on the next layer.

# Static Load Balancing

The new assignment looks like:

- ▶ Thread 0 will be assigned  $\neg A, \neg B$
- ▶ Thread 1 will be assigned  $A, A \vee B$
- ▶ Thread 2 will be assigned  $B, (C_{10})_s$

where  $_s$  denotes a syntax only check.





## Syntax First Approach

# Syntax First Approach

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We mentioned that syntax checks can happen outside the layering structure, so why don't we perform syntax verification over all nodes in parallel first?

Algorithm Sketch:

- ▶ For every node in parallel, check syntax.
- ▶ If none fail, follow the simple parallel algorithm except instead of a full verification, we're only checking the assumption constraint.

## Analysis

# Dataset

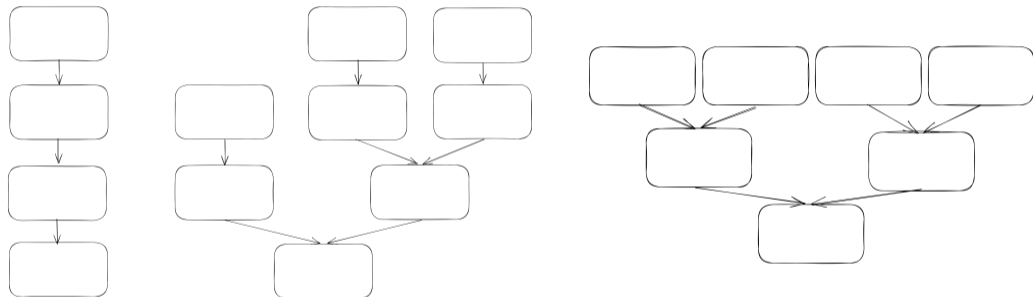
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We're not aware of any large repository of hypergraphical natural deduction proofs to evaluate our approaches over.

Therefore, we designed a synthetic dataset. Taking inspiration from network design, we call this dataset *Directed Acyclic Network Topologies* or (DANTs).

# Three Case Studies

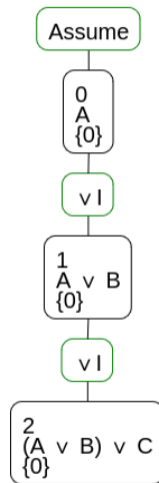
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Straight, Branch, and Tree Topologies

# Straight Topology ( $n$ )

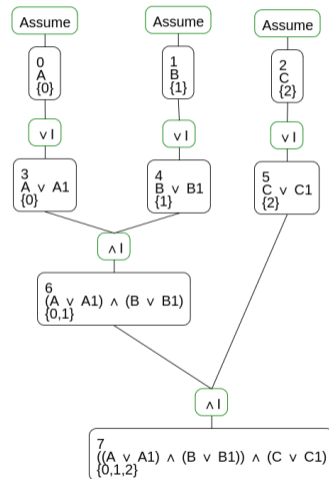
For the straight topology, we apply  $n$  disjunction introductions.



# Parallel Branches ( $b, n$ )

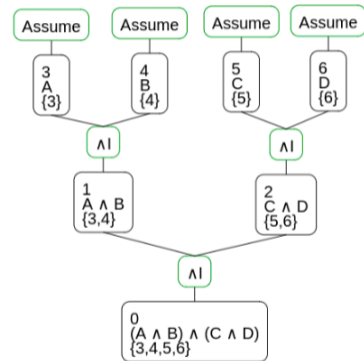
This topology emulates multiple lines of independent reasoning before combining towards the end.

- ▶ It starts off with  $b$  separate assumptions
- ▶ performs a disjunctive introduction on each assumption  $n$  times
- ▶ then iteratively applying conjunctive introduction to each branch until there's one remaining.



# Tree ( $h$ )

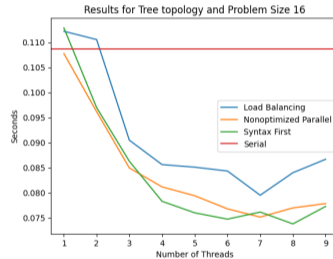
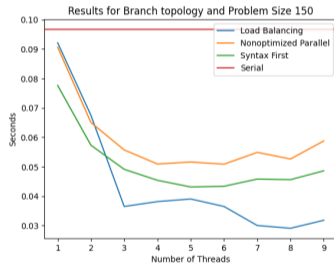
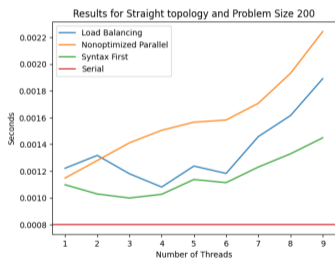
- ▶ In this topology we generate  $2^h$  assumptions and iteratively apply conjunction introduction  $h$  times until we reach a single node.
- ▶ This creates a balanced binary tree.





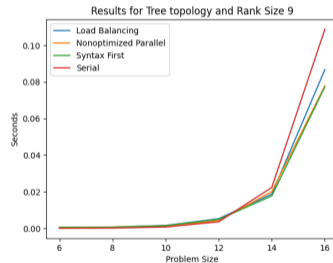
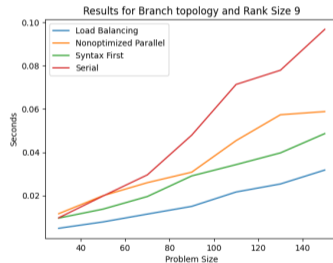
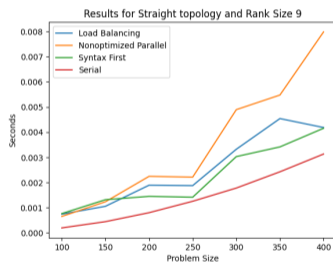
# Strong Scaling Study

Performance analysis varying the number of threads over a constant problem size.



# Weak Scaling Study

Performance analysis varying problem size over a constant number of threads.



# Future Work





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1. Perform an Amdahl's Law analysis to calculate the overall speedup factor compared to the serial version.
2. Test on randomized proof topologies.
3. Extend the logics support to first-order and modal.
4. Scale beyond a single computer with message-based parallelism.

**Thanks for attending! Any Questions?**

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