# Parallelize FP-growth Algorithm

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#### Frequent Pattern Growth Algorithm

- This algorithm is an improvement to the Apriori method.
- FP-Growth is an frequent pattern mining algorithm that does not require candidate generation.

#### Two part of FP-growth

- 1. Build FP-Tree
- 2. Find Frequent Pattern



#### **Build FP-Tree**

TI D	Items
1	Milk, Bread, Beer
2	Bread, Coffee
3	Bread, Egg
4	Milk, Bread, Coffee
5	Milk, Egg
6	Bread, Egg
7	Milk, Egg
8	Milk, Bread, Egg, Beer
9	Milk, Bread, Egg

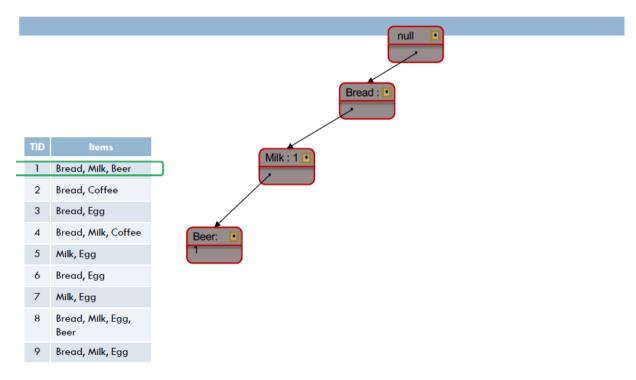
Find each item with its corresponding frequency

Sort the list in decreasing order!



minsup = 2

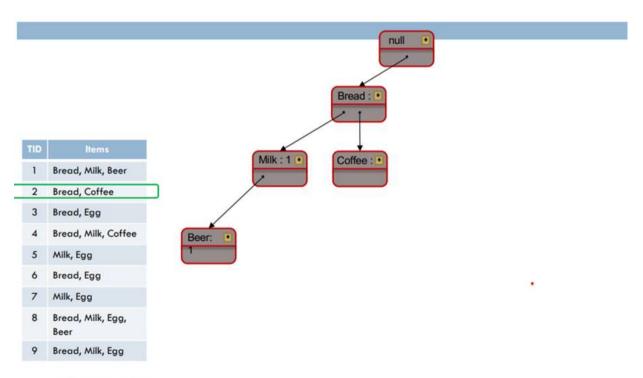
#### **Build FP-Tree**



minsup = 2

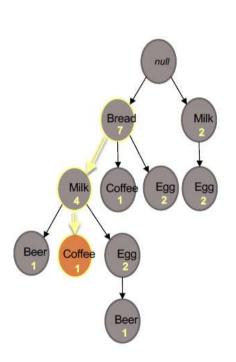


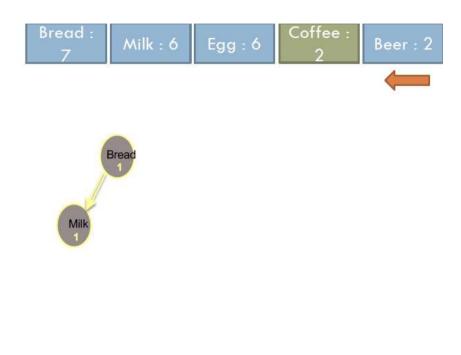
#### **Build FP-Tree**



minsup = 2

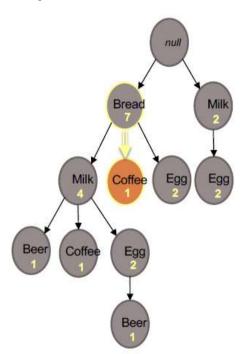
#### **Find Frequent Pattern**

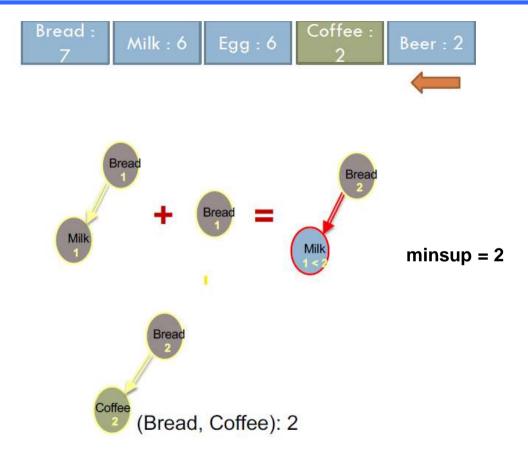






#### **Find Frequent Pattern**





### Method

#### Parallelization

Q: How to parallelize tree construction?

A: Every header constructs their own tree recursively.

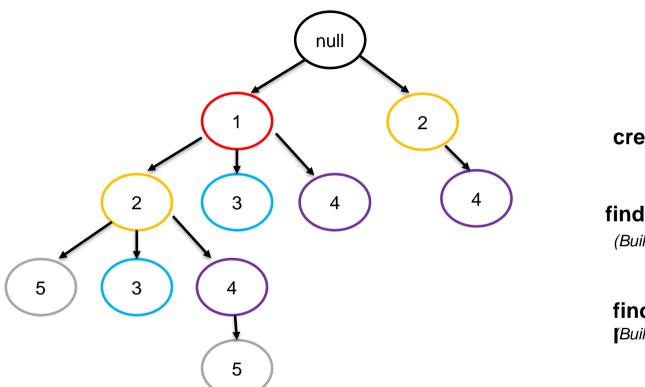
### Load balancing

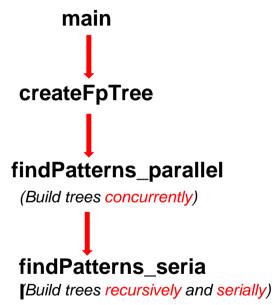
Q: It's impossible to determine tree size statically, how to balance the load among threads?

A: Generate tasks dynamically and assign to idle threads. (OpenMP)



## Method (cont'd)

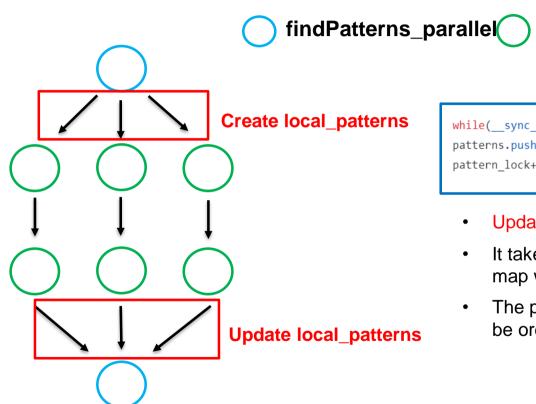






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## Method (cont'd)



```
while(__sync_val_compare_and_swap(&pattern_lock, 1, 0) == 0);
patterns.push_back(local_patterns_ptr);
pattern_lock++;
```

findPatterns serial

- Update pointers only.
- It takes lots of time to merge map with many elements.
- The patterns are not required to be ordered.

#### Hardware

- CPU: intel i5-11400, 6 core 12 hardware thread, 2.6Ghz.
- Memory: DDR4, 32GB, 3200Mhz.

#### Software

- Ubuntu
- Compilation: g++ -std=c++17 -O3 -m64 -fopenmp



#### Correctness

- Serial: We find a python version, and we compare our serial result to this version by using diff the output.
- **Parallel**: We merge the result each thread create and compare it to serial version by using diff the output.

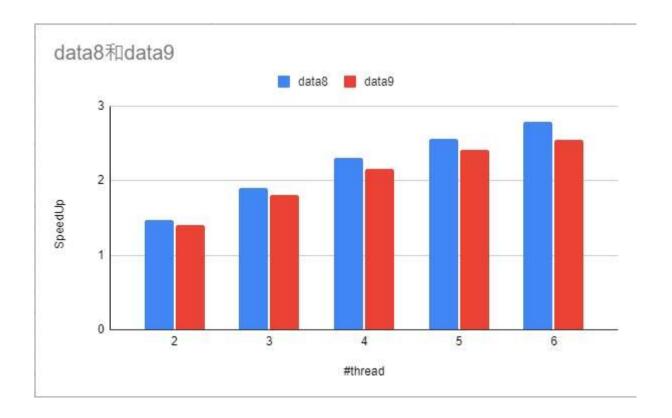


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#### **Performance**

- **Serial**: createFpTree + findPatterns
- Parallel: createFpTree + findPatterns
- SpeedUp :  $\frac{Serial}{Parallel}$

• Efficiency: 
$$\frac{\left(\frac{T_{\text{serial}}}{T_{\text{parallel}}}\right)}{p} = \frac{T_{\text{serial}}}{p \cdot T_{\text{parallel}}}$$

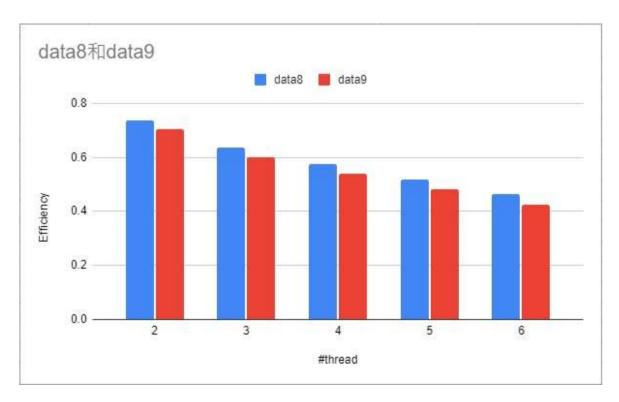


Serial Parallel SpeedUp:

Data8 size: 5000

Data9 size: 50000

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Efficiency: 
$$\frac{\left(\frac{T_{\text{serial}}}{T_{\text{parallel}}}\right)}{p} = \frac{T_{\text{serial}}}{p \cdot T_{\text{parallel}}}$$

Data8 size: 5000

**Data9 size: 50000** 



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# Thank you



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