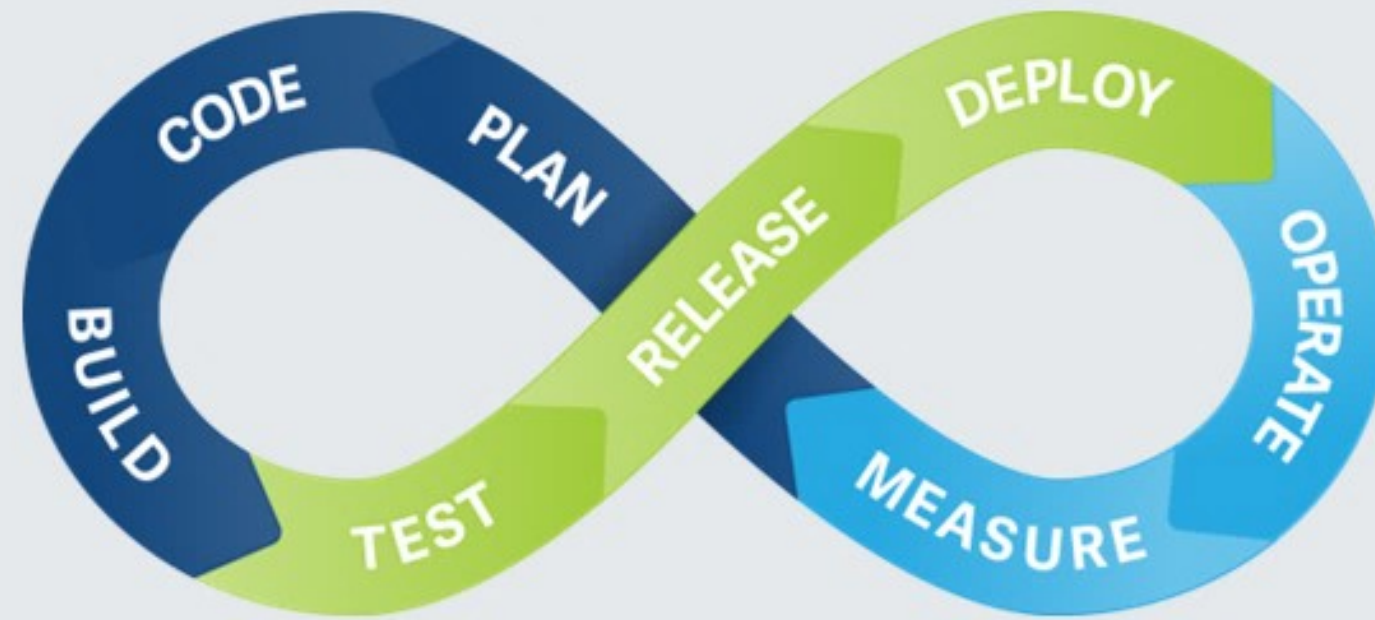


# Towards Predicting the Impact of Software Changes on Building Activities

M. Tufano, H. Sajnani, K. Herzig



# Continuous Integration



//build

# Continuous Integration



**Developers build daily.**

//build



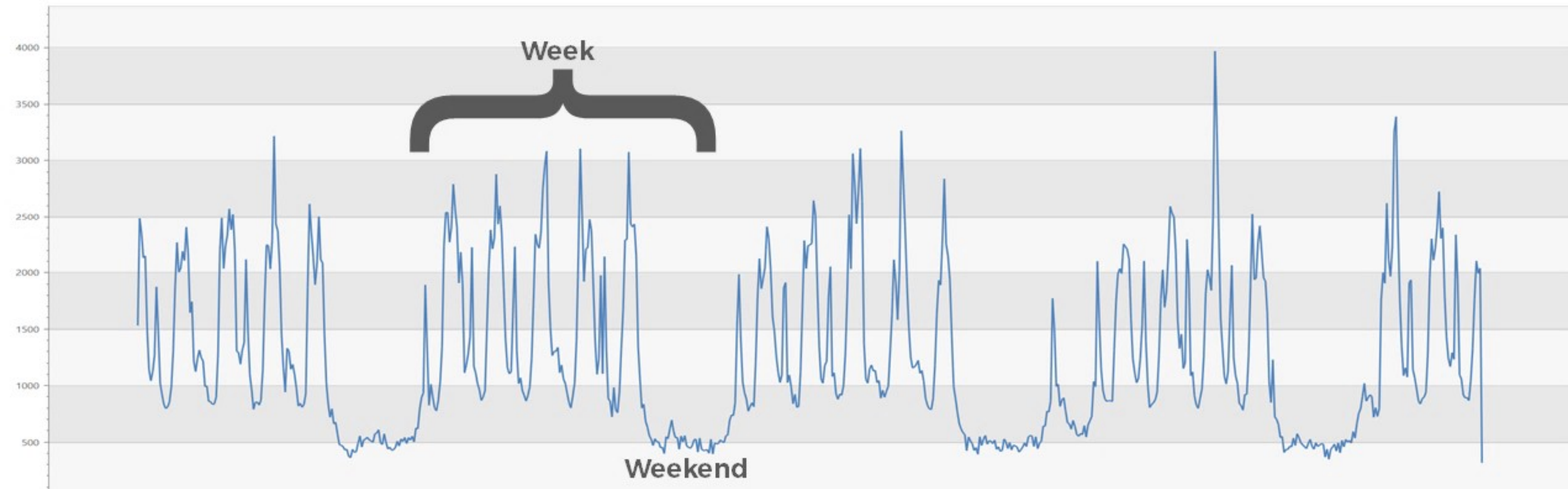
# Continuous Integration



**Developers build daily.  
Many times a day.**

//build

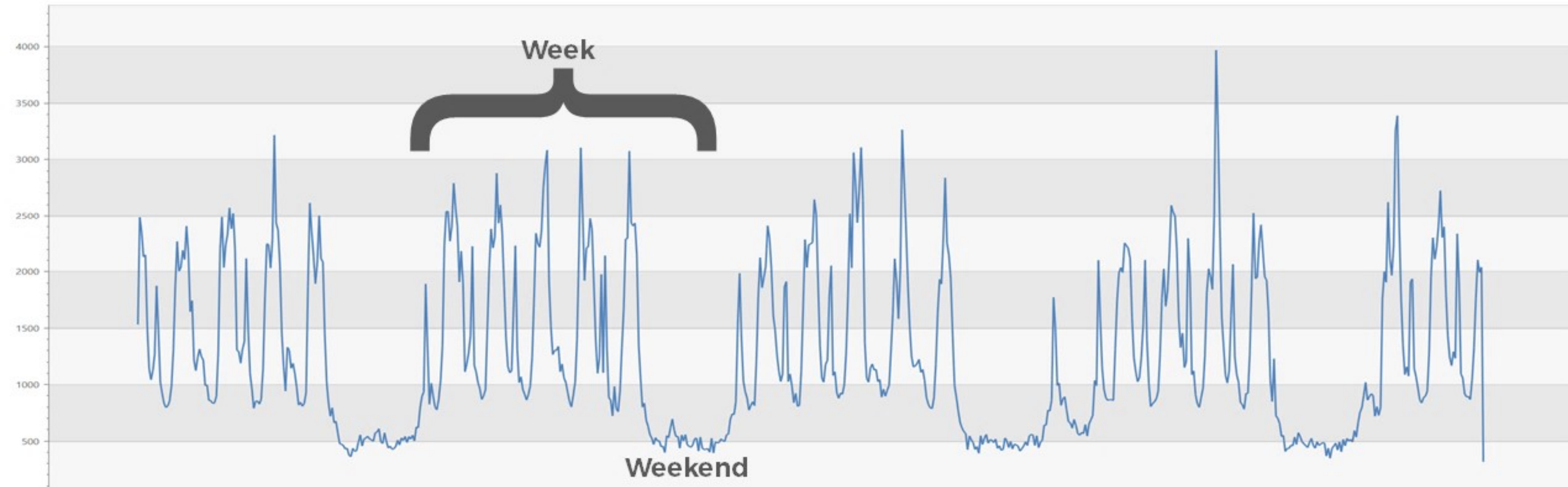
# (some) Microsoft Builds





# (some) Microsoft Builds

**2,000 builds per hour.**



# Builds in the Cloud

Distributed and parallel builds on remote cloud infrastructures



**CloudBuild**



**Bazel**

**facebook**

**Buck**

# CloudBuild

**Distributed** builds on many machines in the cloud

**Parallelized** build tasks

Content-based **cache** to accelerate builds

**Builds, test, code analysis, drops, package, and storage.**



# Faster Builds

Build time is the bottleneck for shipping faster.

Not only improvements on the **infrastructure** side.

Attention to **developers'** changes.

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Not only improvements on the **infrastructure** side.

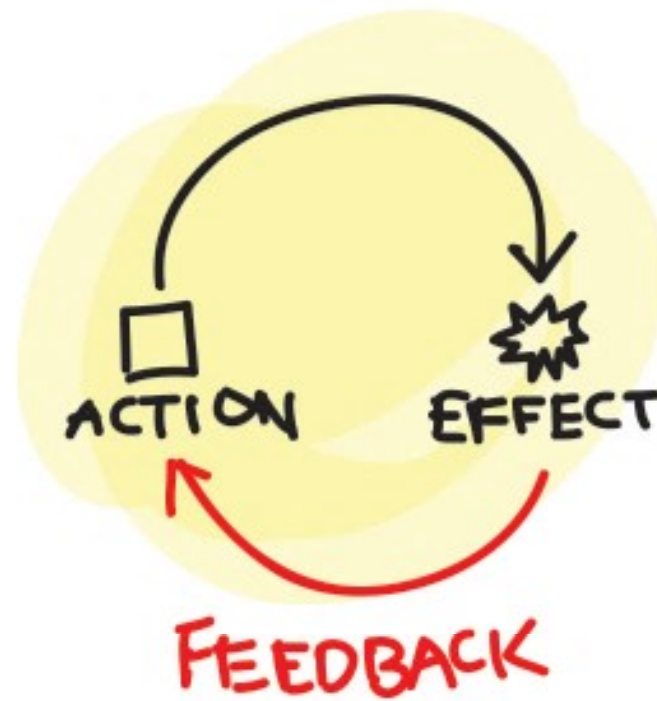
Attention to **developers'** changes.

 Focus of this paper!

# Faster Builds

## Developer Changes

- Dependencies
- Architectural

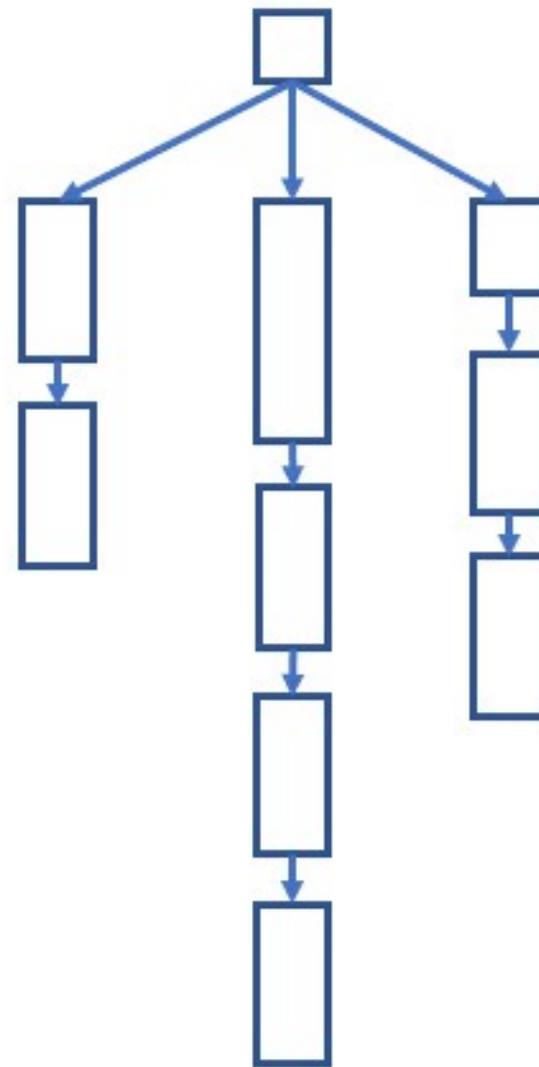
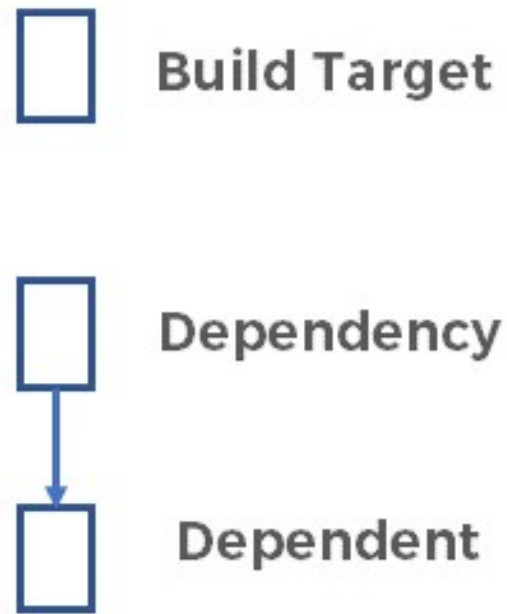


## Early Feedback

- Awareness of impact
- Early restructuring
- Avoid build time regression

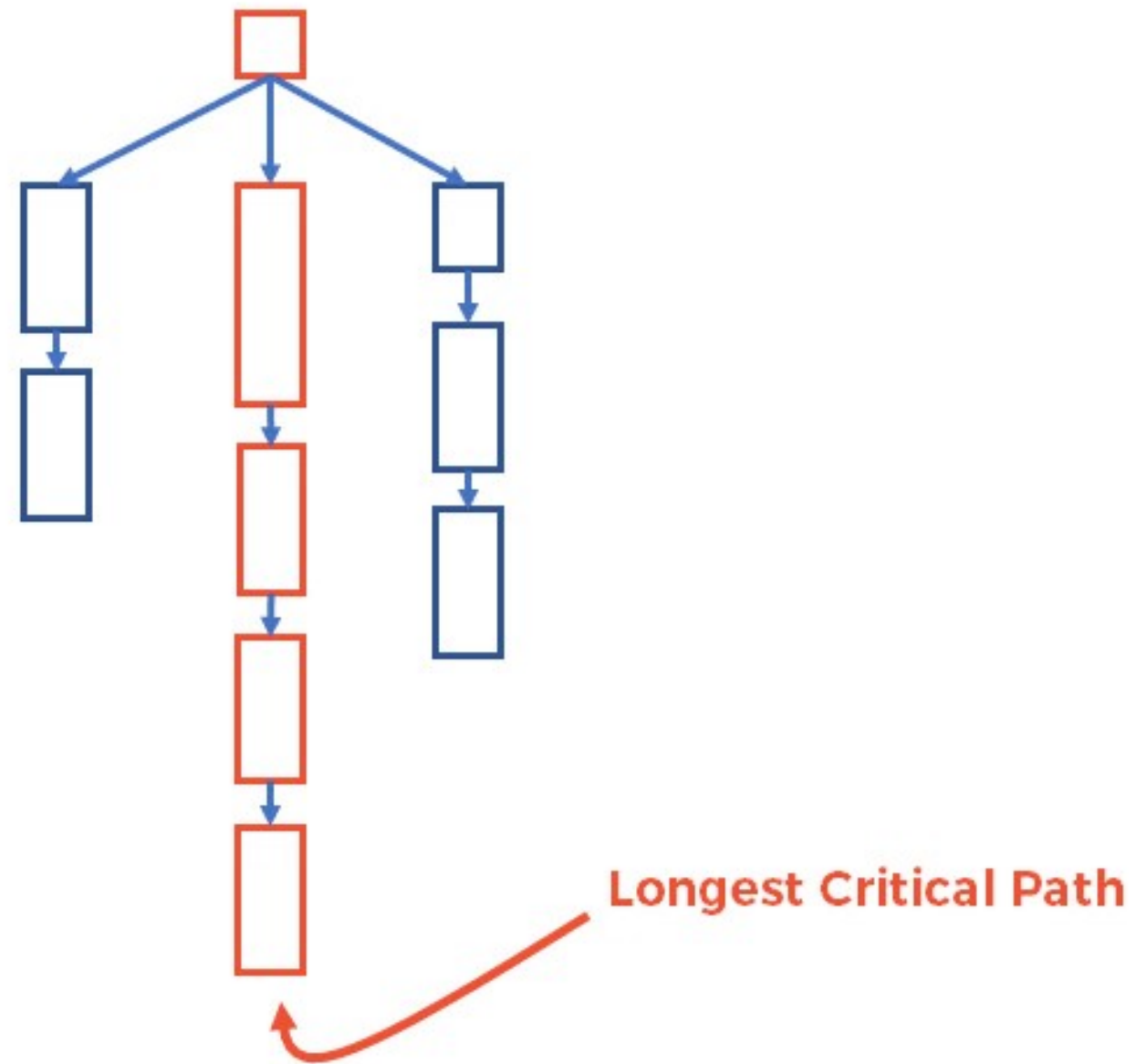
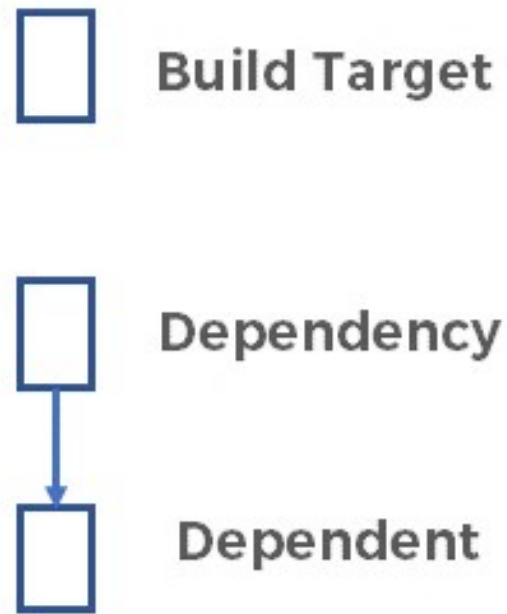
Predicting the **impact** is challenging with modern **cached** build systems.

# Build Dependency Graph



# Build Dependency Graph

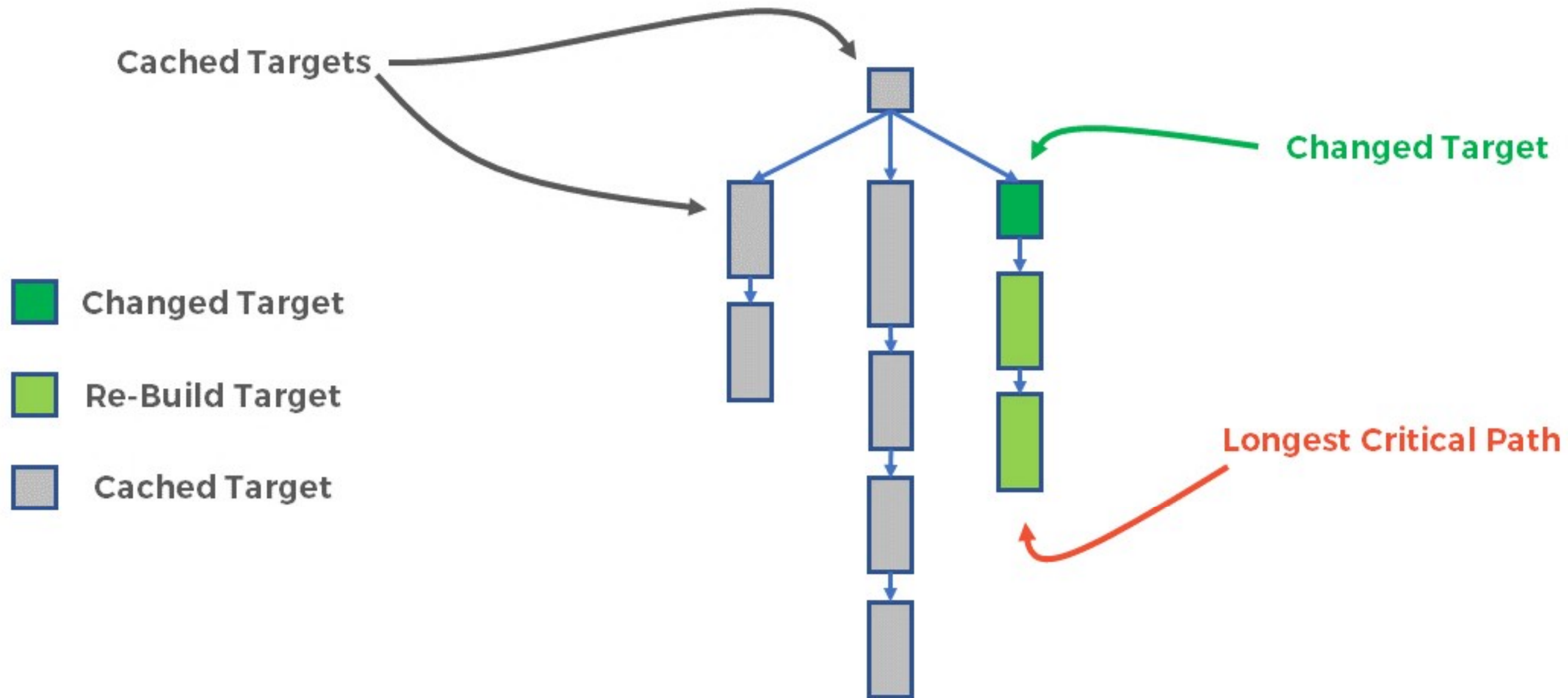
Static Full Build



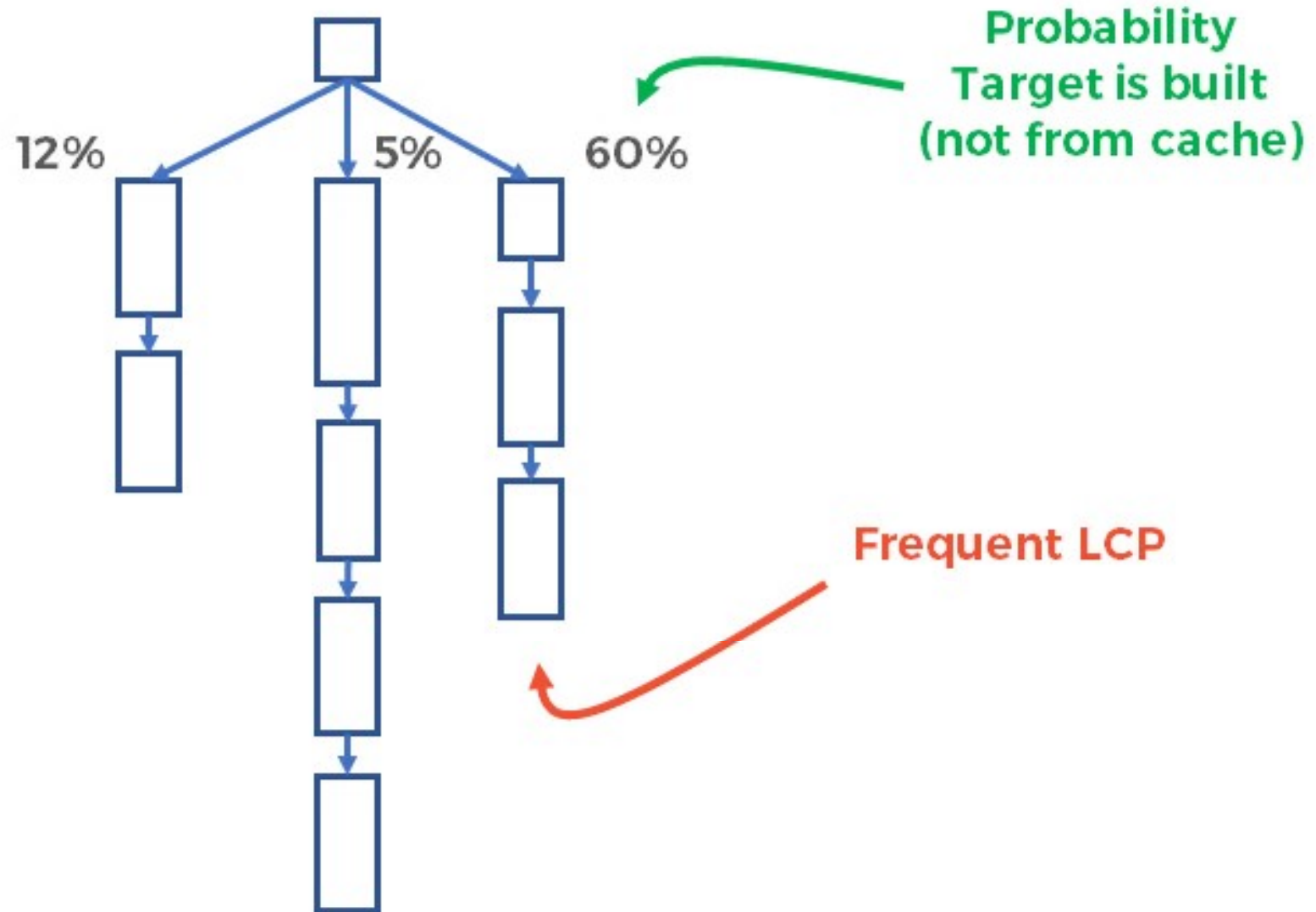


# Cached Build System

## Incremental Build

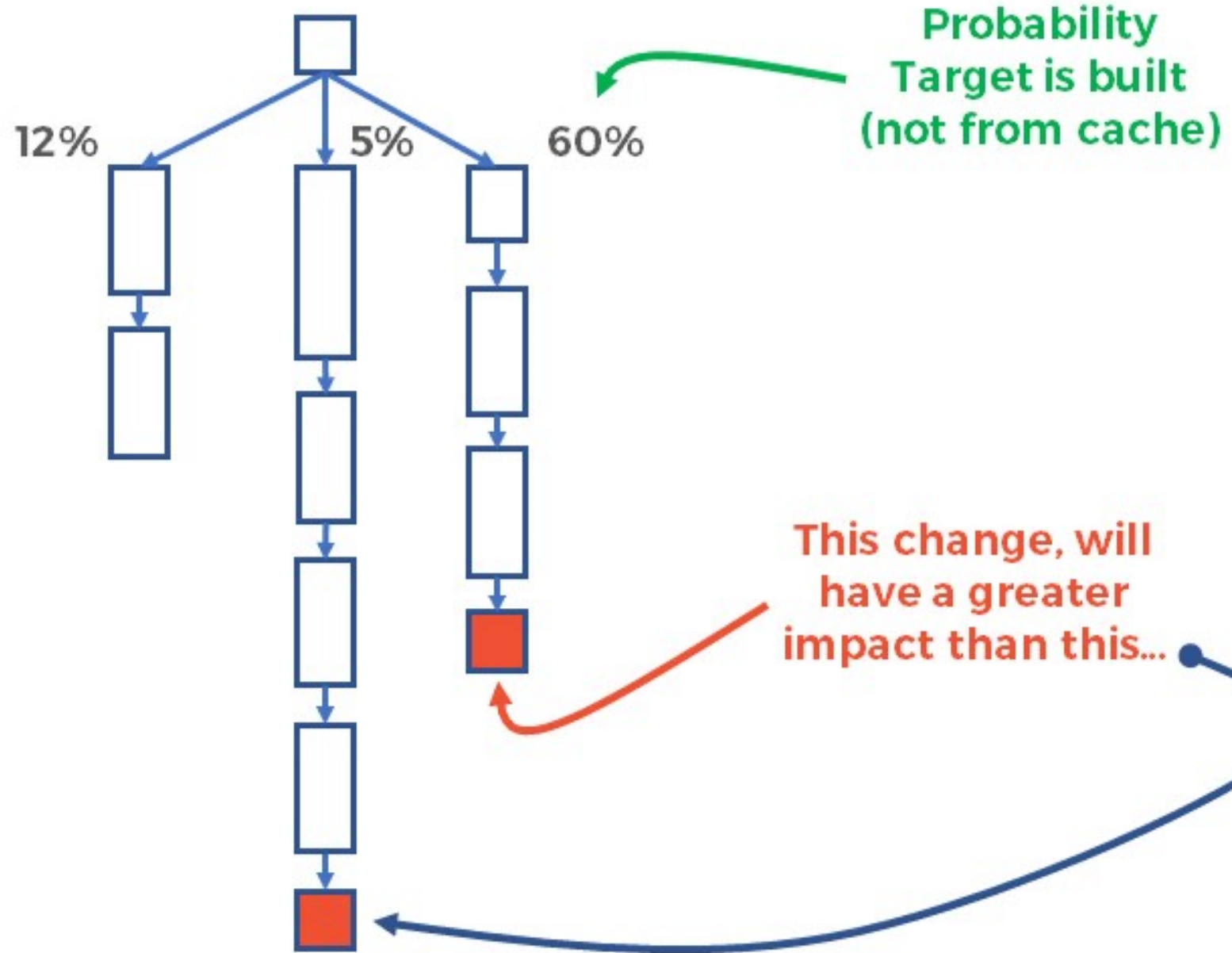


# Cached Build System



# Cached Build System

■ Added Target



# Impact of Software Changes on Building Activities



## Predict Impact

- Build Time increase
- Percentage of future builds affected

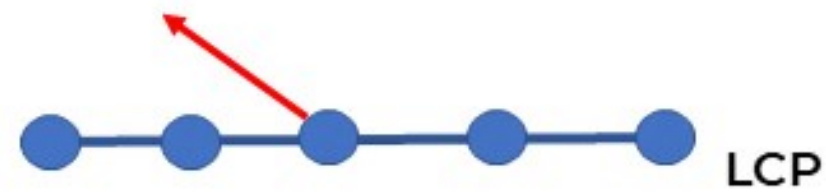


## Approximation using Telemetry data

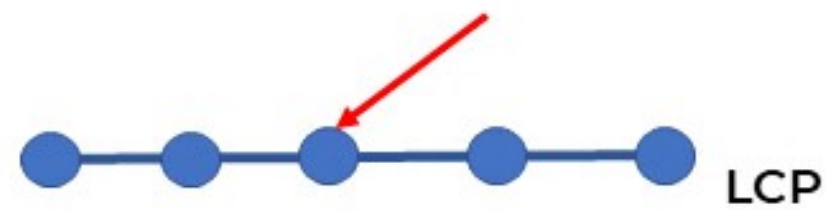
- Probabilities
- Target Execution Time

# Software Changes introducing **dependencies**

- New Outward dependency from LCP

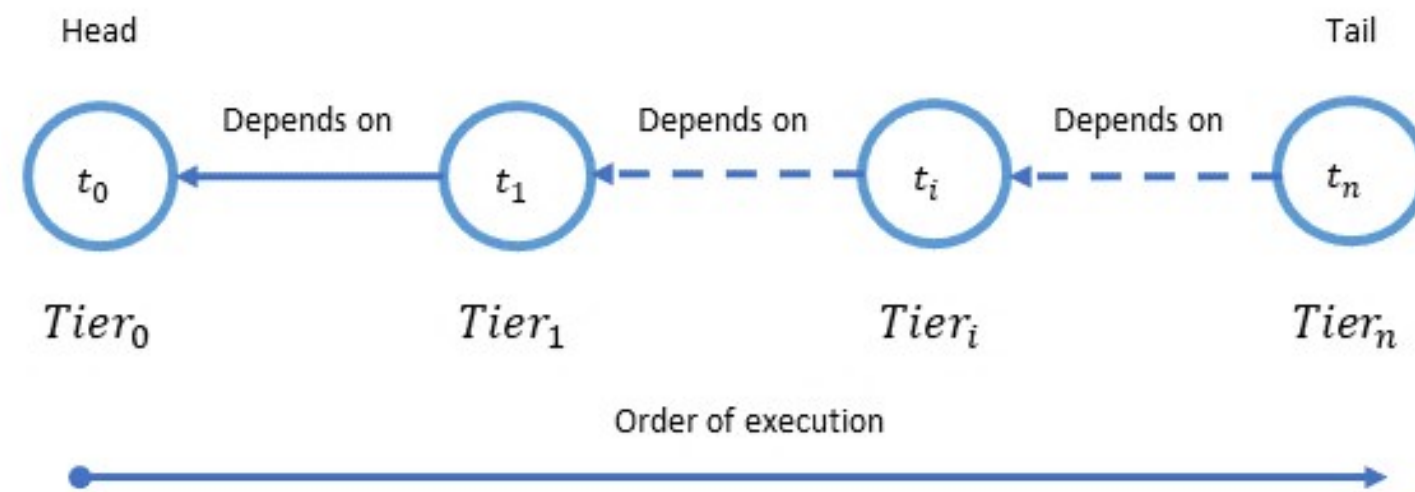


- New Inward dependency to LCP



**Frequent LCPs**  
from recent build  
activities

# Standards



## Functions

$ExecTime(t_0, \dots, t_i)$

Estimation of execution time of a sequence of targets

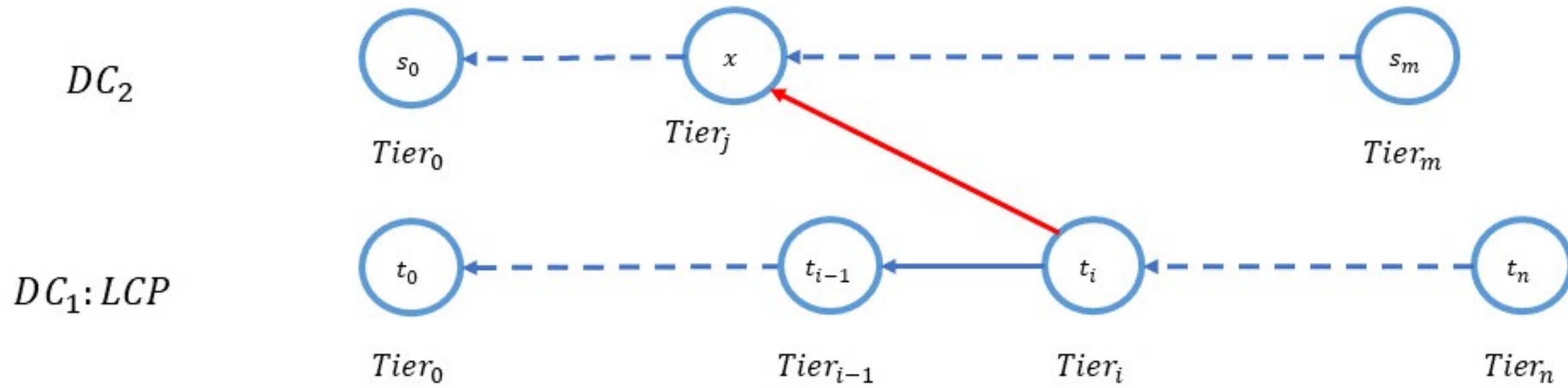
$BuildCoverage(t_i)$

Estimation of percentage of builds building the target (not from cache)



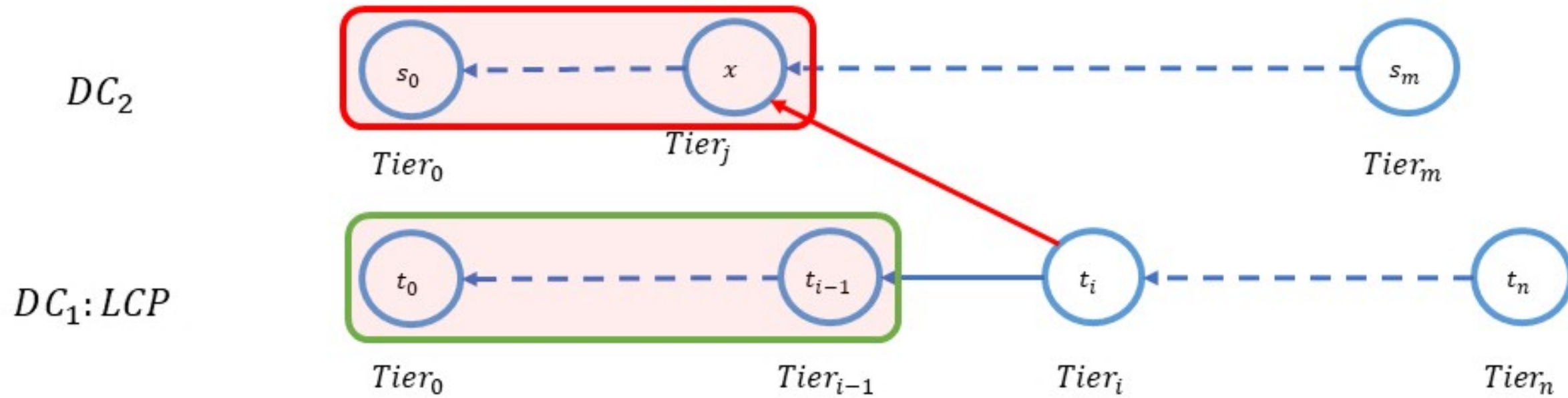
# Outward Dependency

New dependency added ( $t_i \rightarrow x$ ) from a LCP node



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New dependency added ( $t_i \rightarrow x$ ) from a LCP node



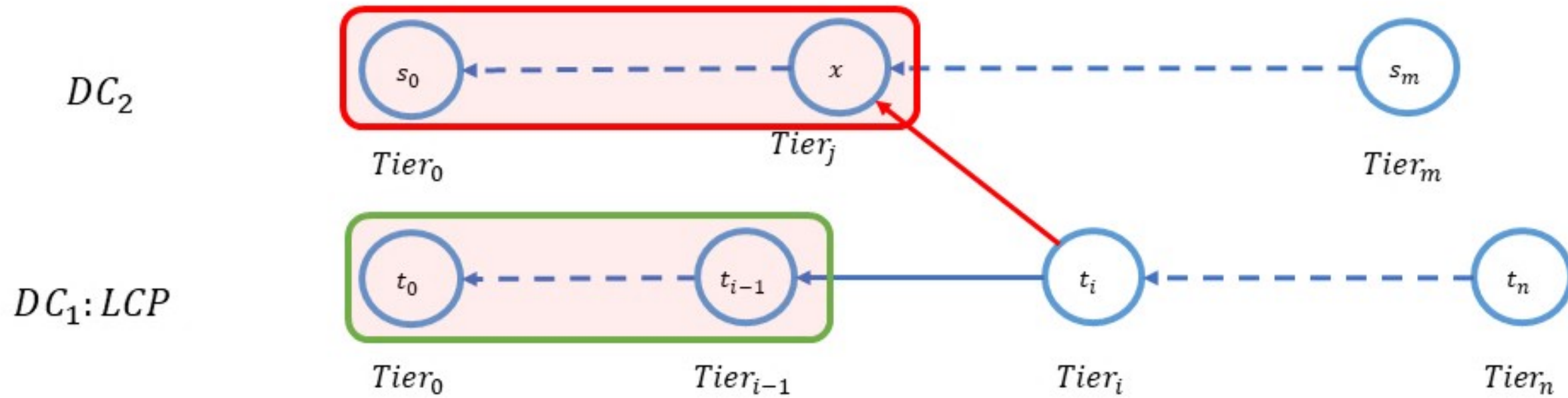
After the change:

IF  $ExecTime(s_0, \dots, x) \leq ExecTime(t_0, \dots, t_{i-1})$

LCP:  $DC_1$  (unchanged)

# Outward Dependency

New dependency added ( $t_i \rightarrow x$ ) from a LCP node



After the change:

**IF**  $ExecTime(s_0, \dots, x) \leq ExecTime(t_0, \dots, t_{i-1})$

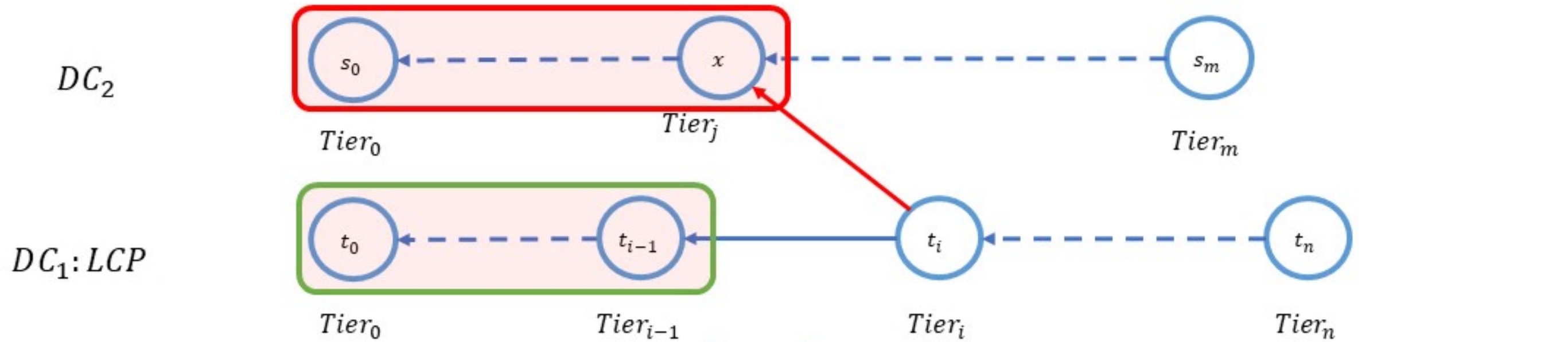
$LCP: DC_1$  (unchanged)

**ELSE IF**  $ExecTime(s_0, \dots, x) > ExecTime(t_0, \dots, t_{i-1})$

$LCP: DC_3: (s_0, \dots, x, t_i, \dots, t_n)$

# Outward Dependency

New dependency added ( $t_i \rightarrow x$ ) from a LCP node



After the change:

**IF**  $ExecTime(s_0, \dots, x) \leq ExecTime(t_0, \dots, t_{i-1})$

LCP: DC<sub>1</sub> (unchanged)

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LCP: DC<sub>3</sub>: ( $s_0, \dots, x, t_i, \dots, t_n$ )

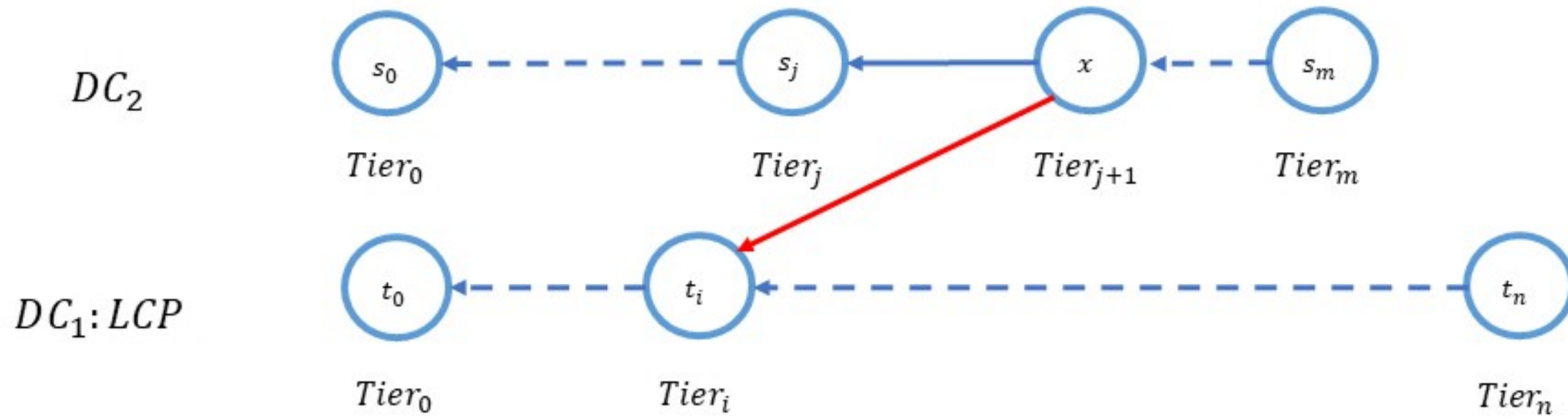
Change Impact:

**Time increase:**  $ExecTime(s_0, \dots, x) - ExecTime(t_0, \dots, t_{i-1})$

**Percentage of affected builds:**  $BuildCoverage(x)$

# Inward Dependency

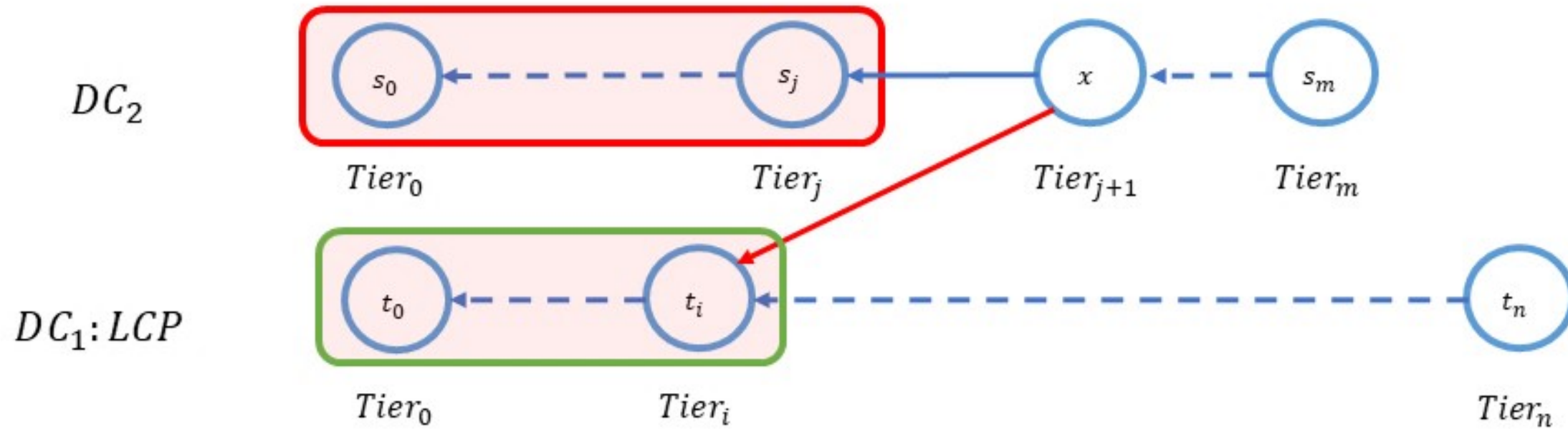
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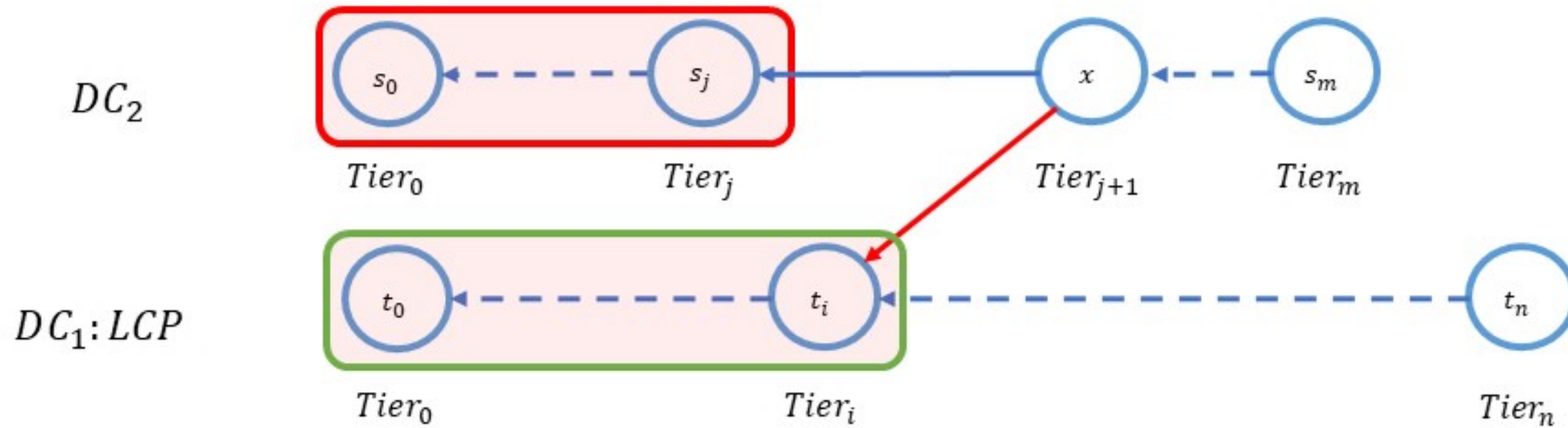
IF  $ExecTime(s_0, \dots, s_j) \geq ExecTime(t_0, \dots, t_i)$

LCP:  $DC_1$  (unchanged)



# Inward Dependency

New dependency added ( $x \rightarrow t_i$ ) to a LCP node



After the change:

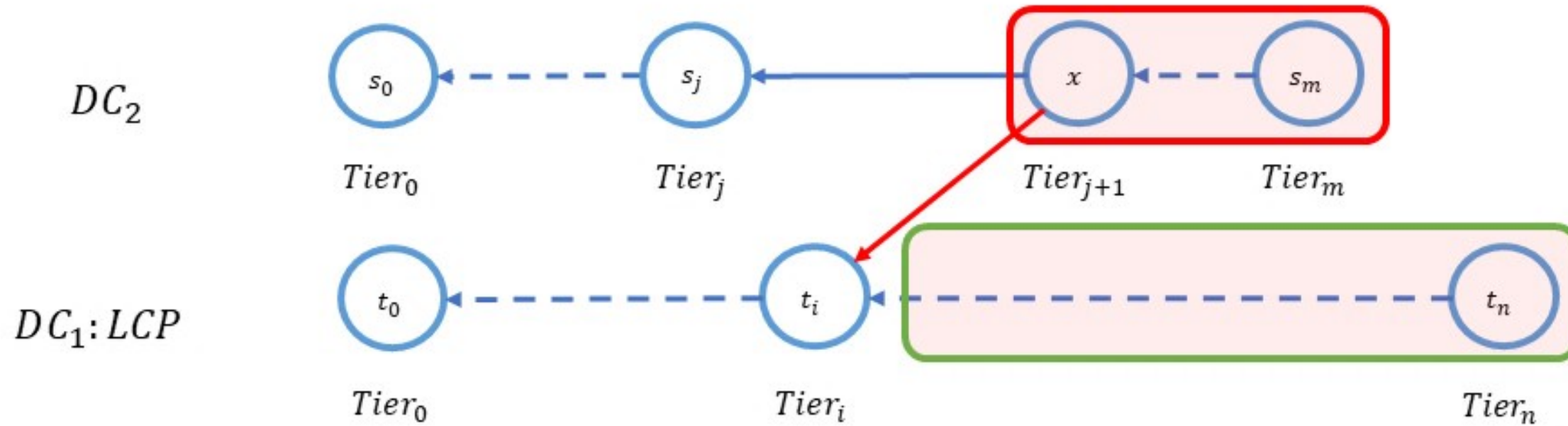
**IF**  $ExecTime(s_0, \dots, s_j) \geq ExecTime(t_0, \dots, t_i)$

*LCP:  $DC_1$  (unchanged)*

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# Inward Dependency

New dependency added ( $x \rightarrow t_i$ ) to a LCP node



After the change:

**IF**  $ExecTime(s_0, \dots, s_j) \geq ExecTime(t_0, \dots, t_i)$

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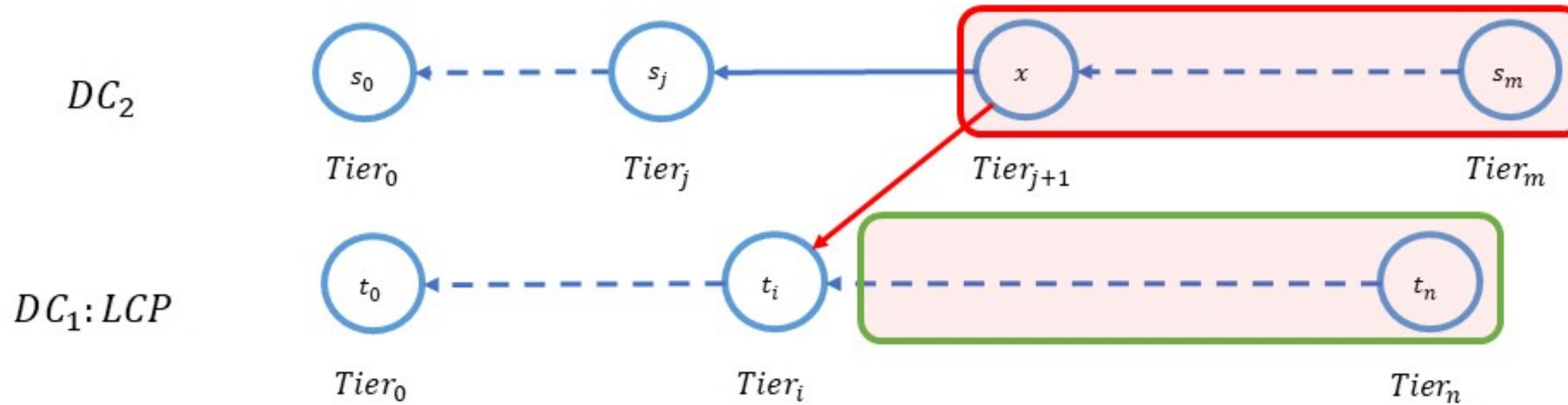
**ELSE IF**  $ExecTime(s_0, \dots, s_j) < ExecTime(t_0, \dots, t_i)$

**IF**  $ExecTime(x, \dots, s_m) \leq ExecTime(t_{i+1}, \dots, t_n)$

*LCP:  $DC_1$  (unchanged)*

# Inward Dependency

New dependency added ( $x \rightarrow t_i$ ) to a LCP node



After the change:

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*LCP:  $DC_1$  (unchanged)*

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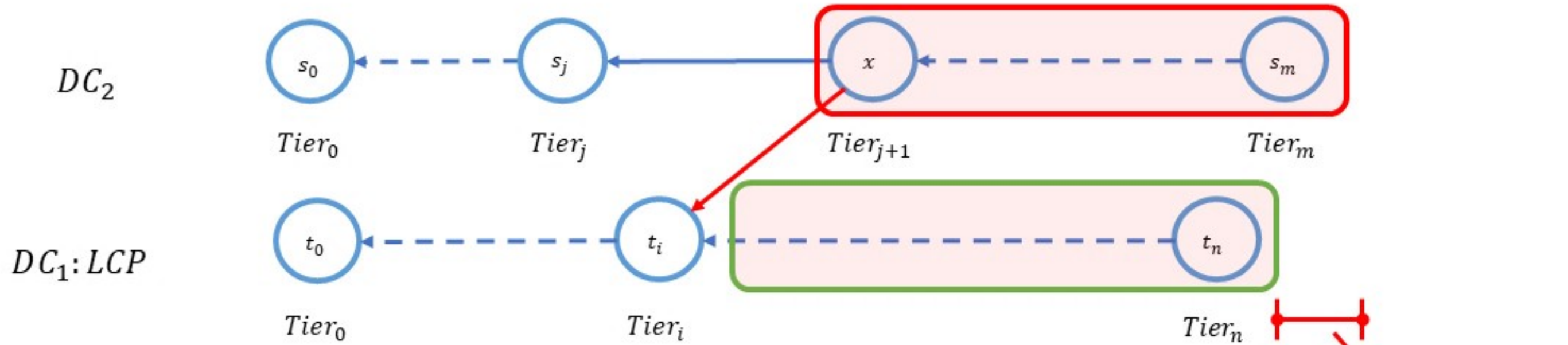
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# Inward Dependency

New dependency added ( $x \rightarrow t_i$ ) to a LCP node



After the change:

**IF**  $ExecTime(s_0, \dots, s_j) \geq ExecTime(t_0, \dots, t_i)$

*LCP: DC<sub>1</sub>* (unchanged)

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*LCP: DC<sub>1</sub>* (unchanged)

**ELSE IF**  $ExecTime(x, \dots, s_m) > ExecTime(t_{i+1}, \dots, t_n)$

*LCP: DC<sub>3</sub>: (t<sub>0</sub>, ..., t<sub>i</sub>, x, ..., s<sub>m</sub>)*

Change Impact:

**Time increase:**  $ExecTime(x, \dots, s_m) - ExecTime(t_{i+1}, \dots, t_n)$

**Percentage of affected builds:**  $BuildCoverage(t_i)$

# Conclusions



## Build Time Regression

- Threat for fast software delivery
- Difficult to diagnose and correct



## Predict Build Impact

- Provide contextual info during the Pull Request process
- Allow early corrective operations



# Future Work



## Evaluation

- Run in shadow mode and estimate impact
- Evaluate prediction accuracy



## Positive Feedback

- Positive impact on build activities
- Estimate reduction in build time



# Questions?

## Towards Predicting the Impact of Software Changes on Building Activities

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//build

