

SELFSTARTER

Finding Network Misconfigurations by Automatic Template Inference

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Network Misconfigurations Are Common

TRAVEL • AMERICAN AIRLINES

American Airlines Network Outage Delays Flights Nationwide

By David Z. Morris July 29, 2018

Internet Goes Down for Parts of the US Due to a Misconfiguration

By CircleID Reporter

Nov 06, 2017 8:58 PM PDT | Comments: 0 | Views: 5,914

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Another massive outage takes down many of the internet's biggest sites and service


BGR Jacob Siegal, BGR News • July 2, 2019

THE ACCIDENTAL LEAK —

Google goes down after major BGP mishap routes traffic through China

How four rotten packets broke CenturyLink's network for 37 hours, knocking 911 calls, VoIP, broadband


FCC delivers postmortem after blunder cripples US fiber links

By Shaun Nichols in San Francisco 20 Aug 2019 at 20:12 53  SHARE ▼

Microsoft Azure recovering from major networking-related outage that took out Office 365, Xbox Live, and other services

BY TOM KRAZIT on May 2, 2019 at 2:48 pm

Google Cloud outage takes down Snapchat, YouTube, and Gmail in parts of the United States

Megan Hernbroth Jun. 2, 2019, 4:29 PM  

"This outage was caused by an equipment failure catastrophically exacerbated by a network configuration error," America's communications regulator said in its summary of its inquiry, published yesterday.

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How can we detect misconfigurations?

Comment |

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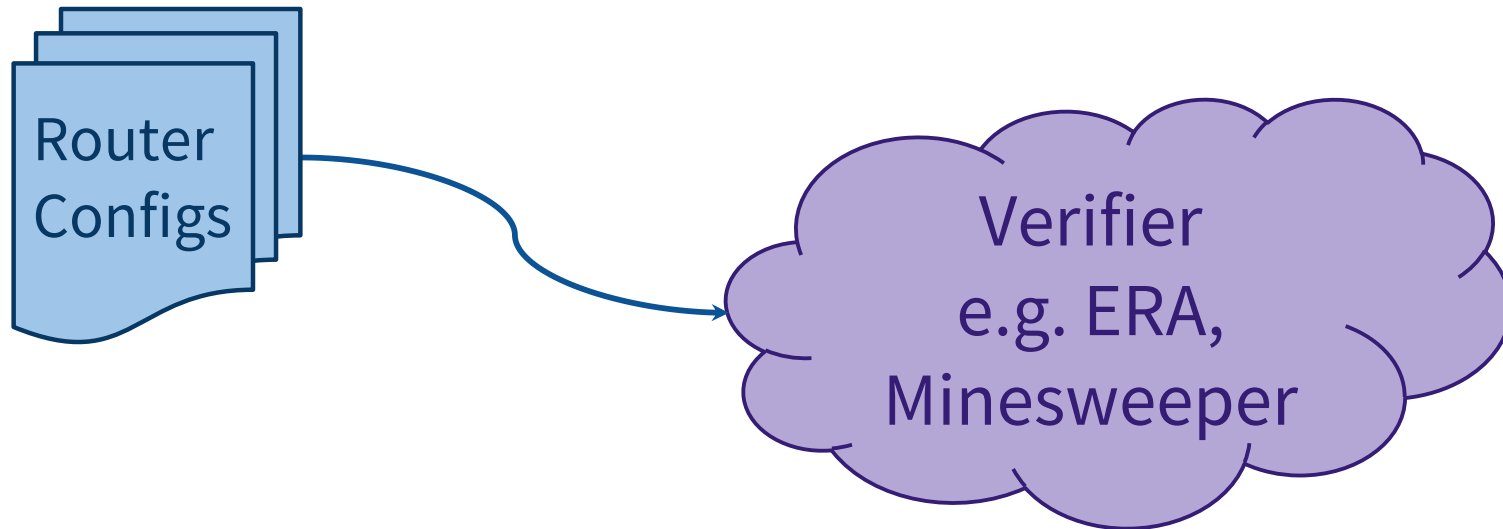
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Network Verification

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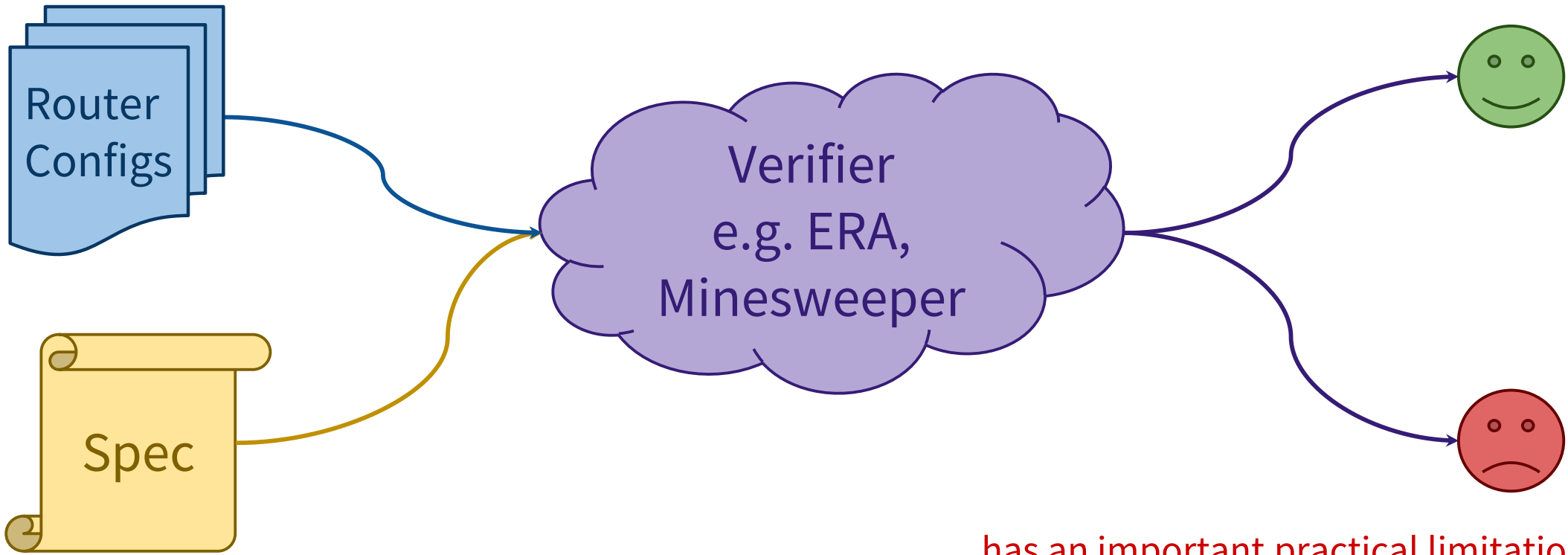
Network Verification



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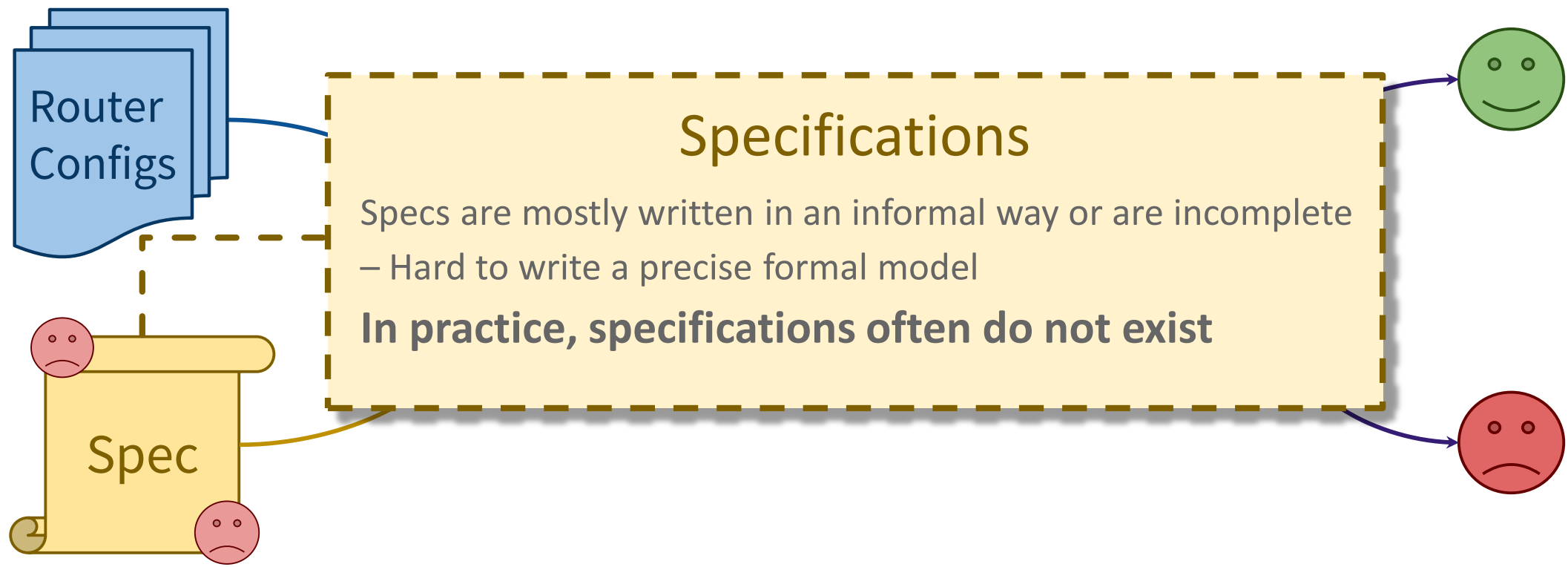


Network Verification



... has an important practical limitation.

Limitation: Lack of Specifications



PROBLEM:

How to find misconfigurations
without an explicit specification?

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GENERAL APPROACH:

Bugs as deviant behavior!

“If thousands of people all do the same action, we know the majority is probably right, and any contradictory action is probably wrong without knowing the correct behavior.”[†]

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OUR INSIGHT:

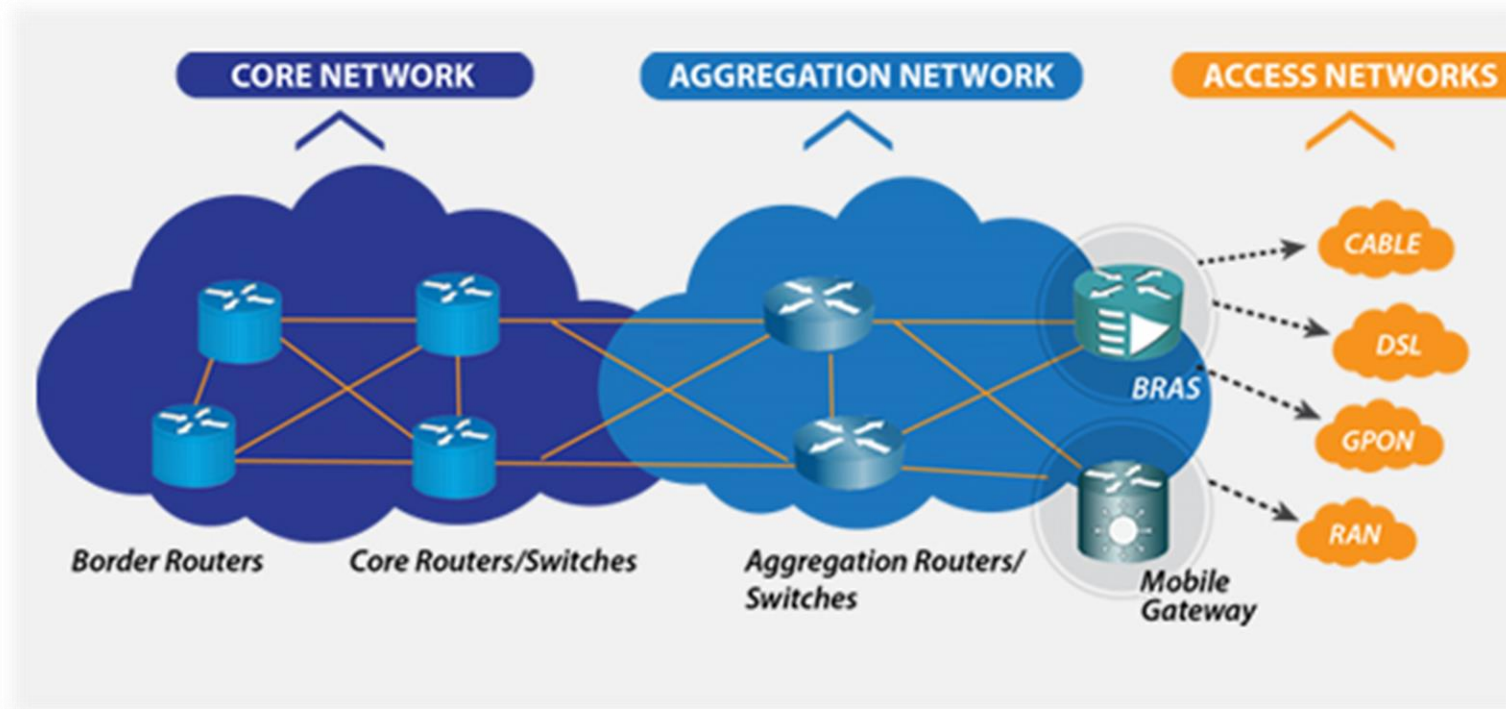
Exploit network device roles

Network Device Roles

- ◎ Routers in a network are generally assigned certain “roles” based on their use

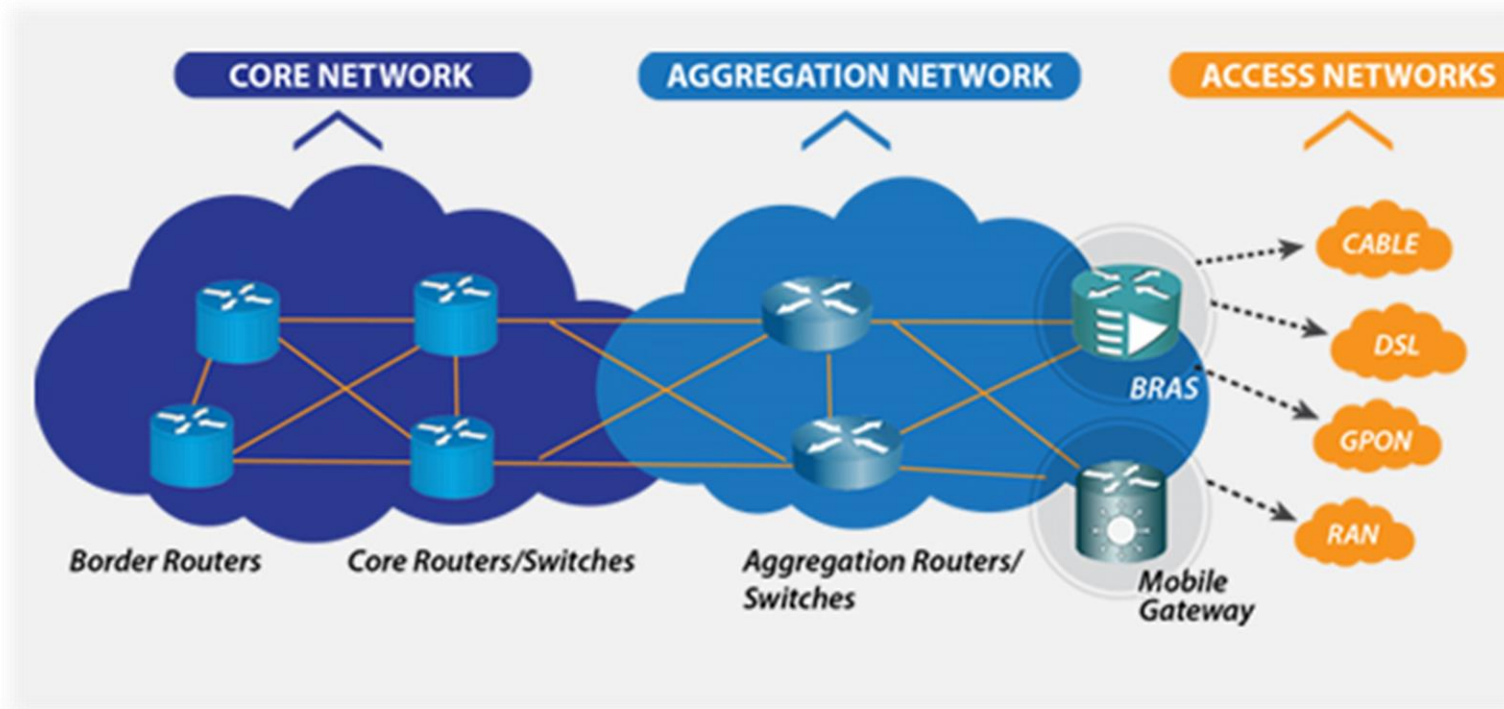
Network Device Roles

- ◎ Routers in a network are generally assigned certain “roles” based on their use



Network Device Roles

- ⦿ Routers in a network are generally assigned certain “roles” based on their use
- ⦿ Routers in the same role of a network are typically configured “similarly”



PROBLEM:

How to model config “similarity” and define “deviance” ?

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NAÏVE APPROACH:

Exact configuration equivalence

Too strong an assumption! Router configurations in a role have many intentional differences (e.g., local IPs)

PROBLEM:

How to model config “similarity” and define “deviance” ?

NAÏVE APPROACH:

Exact configuration equivalence

Too strong an assumption! Router configurations in a role have many intentional differences (e.g., local IPs)

OUR APPROACH:

Infer parameterized *templates* to distinguish intentional differences from likely bugs

Contributions

- ⦿ First automatic template inference algorithm for *any* configuration segment, e.g. ACLs, policy maps and so on

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- ⦿ Concrete instantiations of our generic algorithm for three widely used segments – ACLs, prefix lists and route policies

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- ⦿ SelfStarter – Tool for finding potential bugs in router configurations with actionable feedback for operators using automatic template inference

Contributions

- ⦿ First automatic template inference algorithm for *any* configuration segment, e.g. ACLs, policy maps and so on
- ⦿ Concrete instantiations of our generic algorithm for three widely used segments – ACLs, prefix lists and route policies
- ⦿ SelfStarter – Tool for finding potential bugs in router configurations with actionable feedback for operators using automatic template inference
- ⦿ SelfStarter found 43 previously unknown bugs in total in Microsoft networks and a large campus network.

End-to-End Design



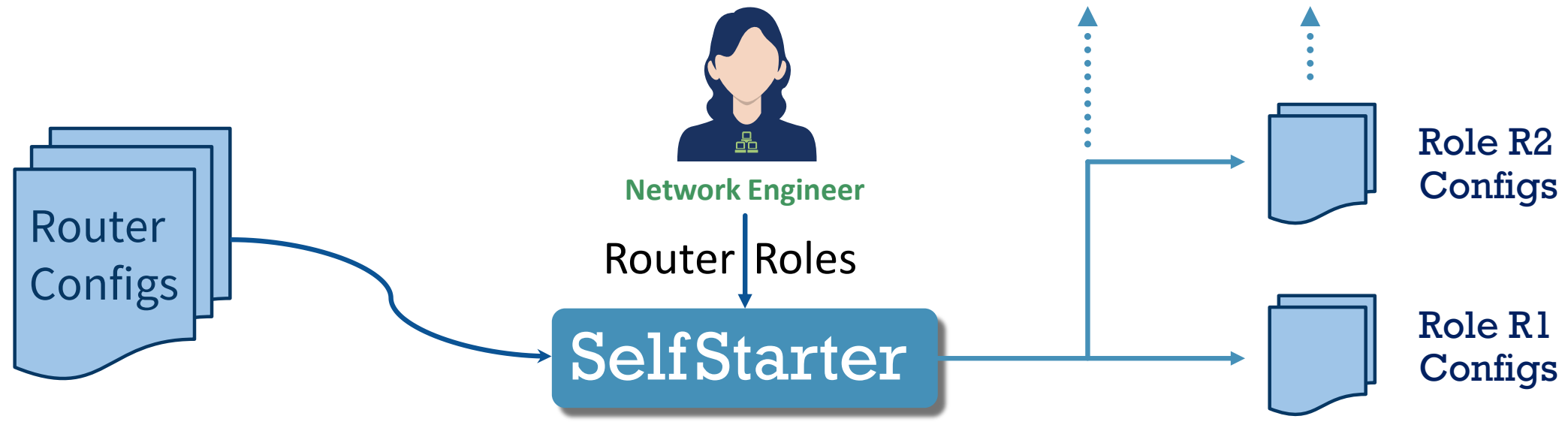
End-to-End Design



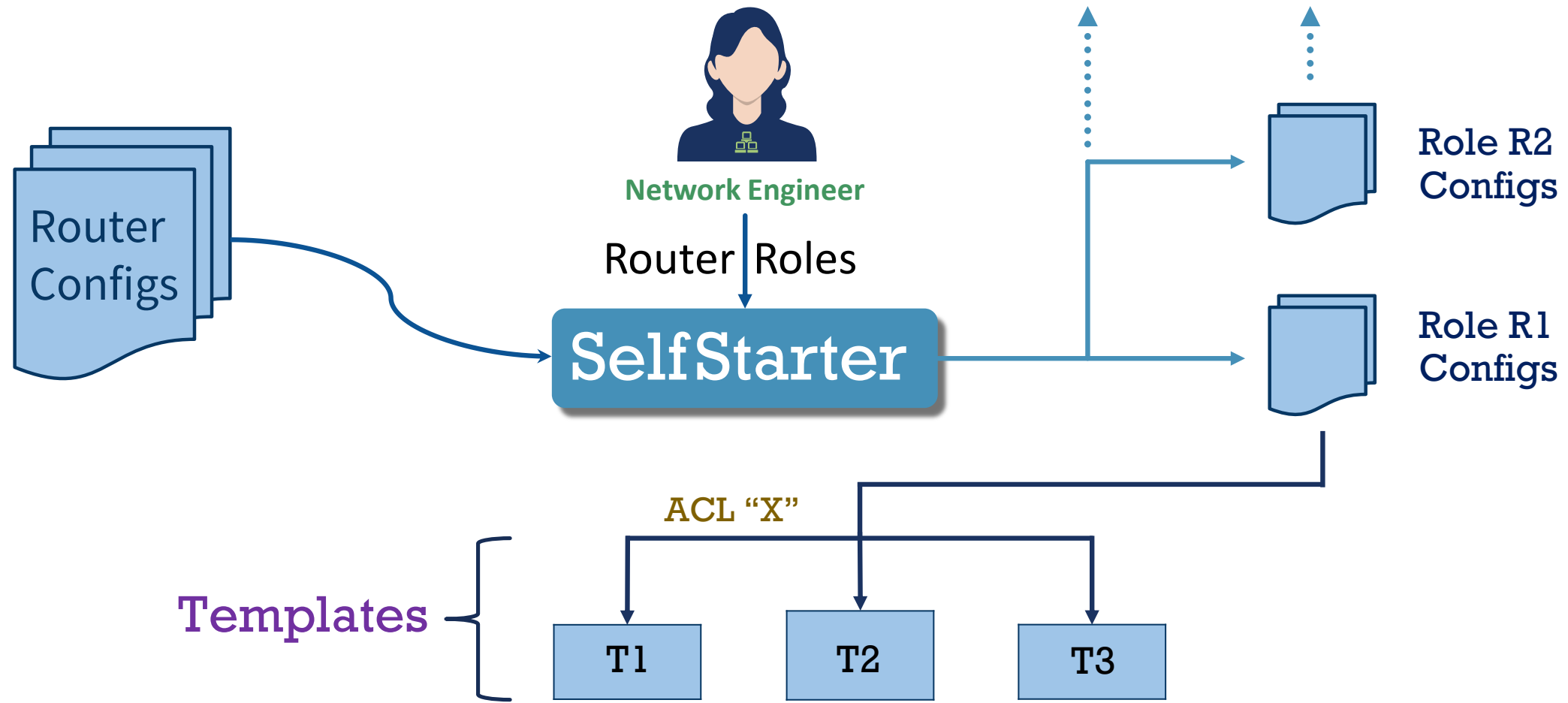
End-to-End Design



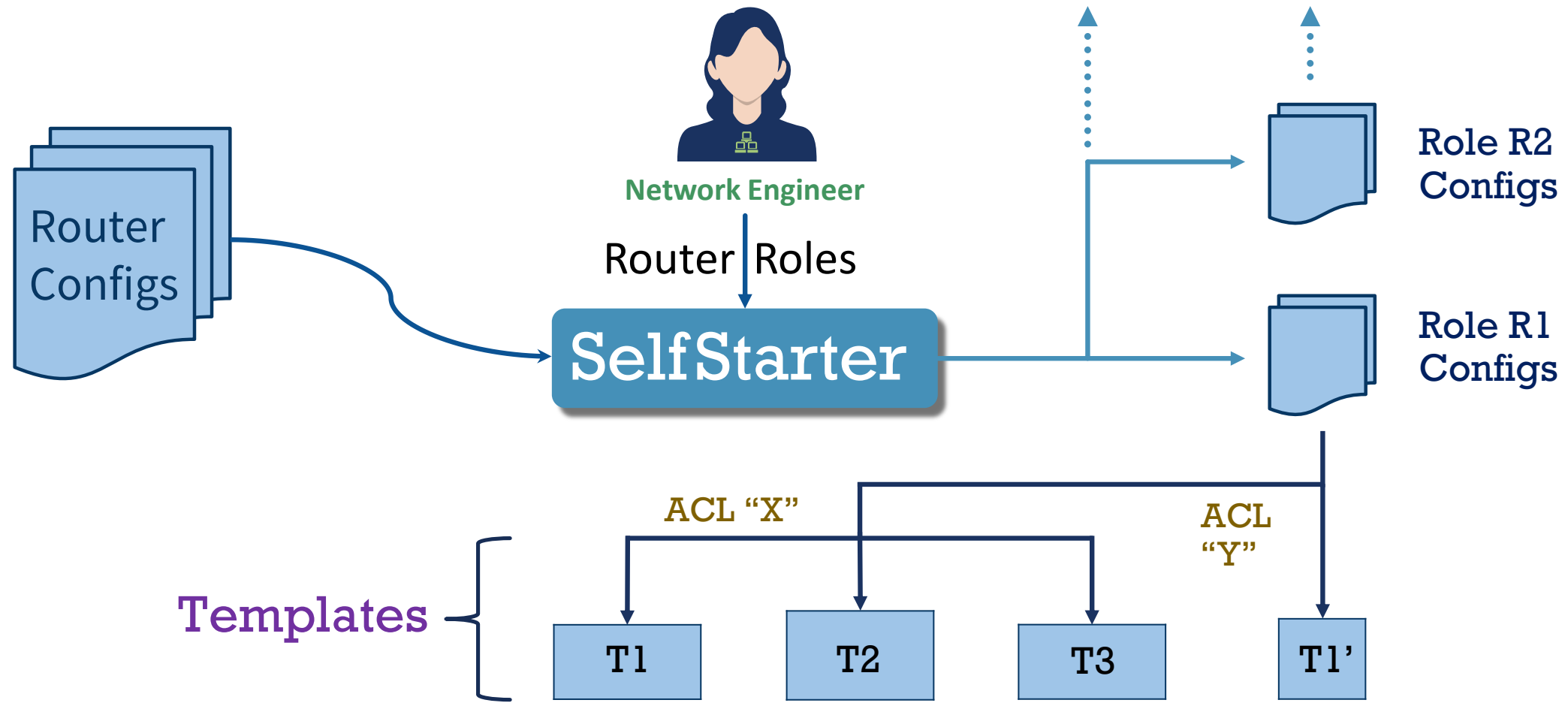
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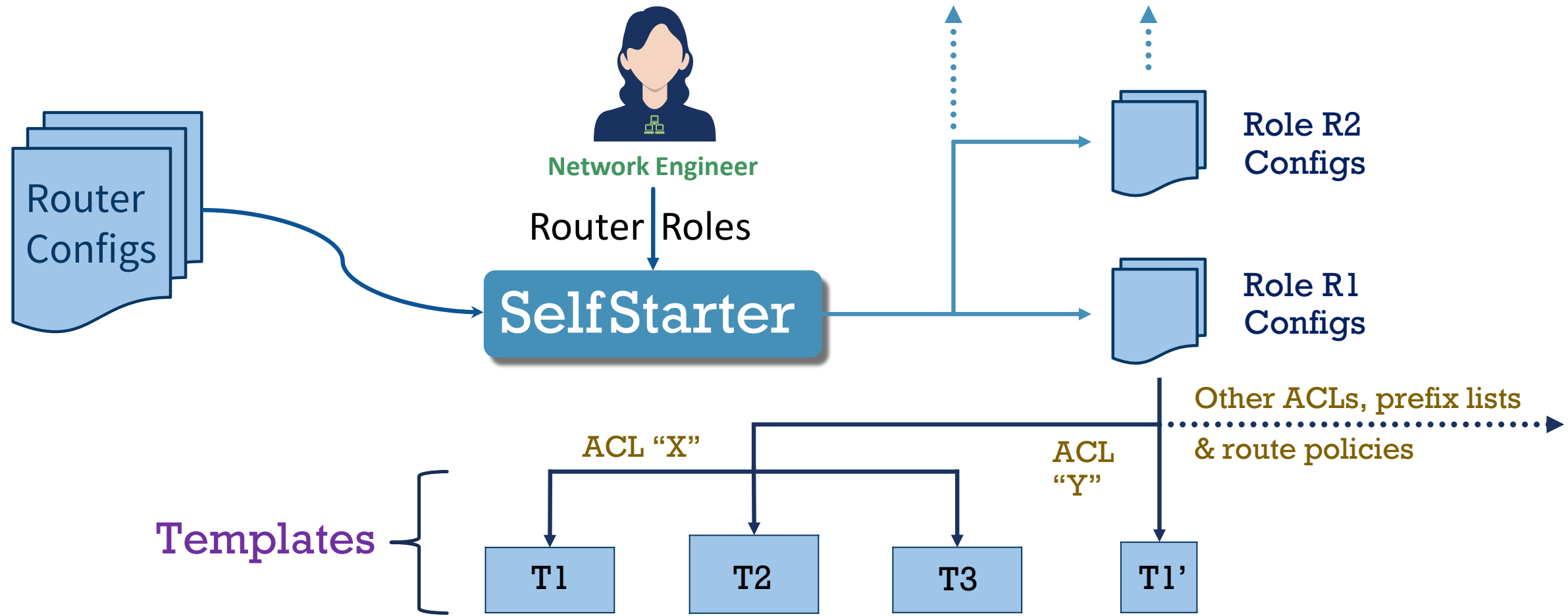
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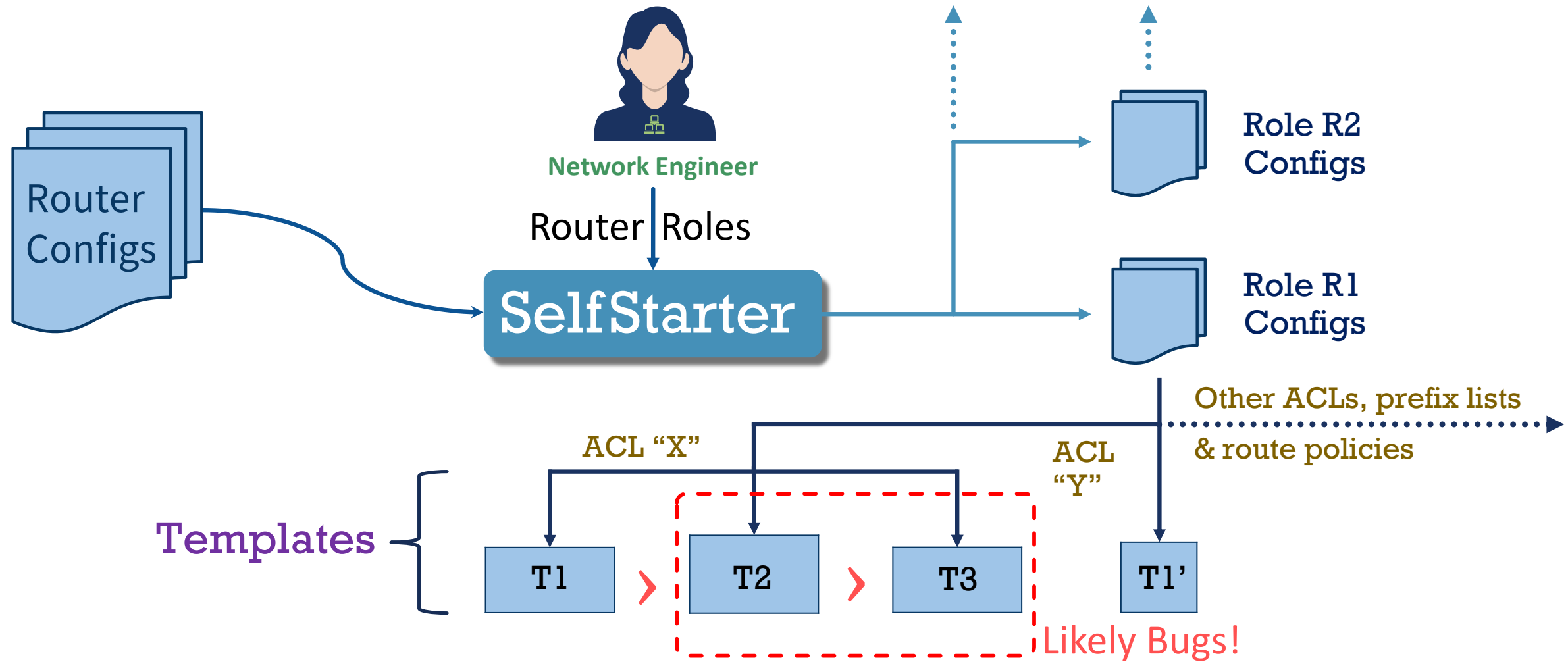
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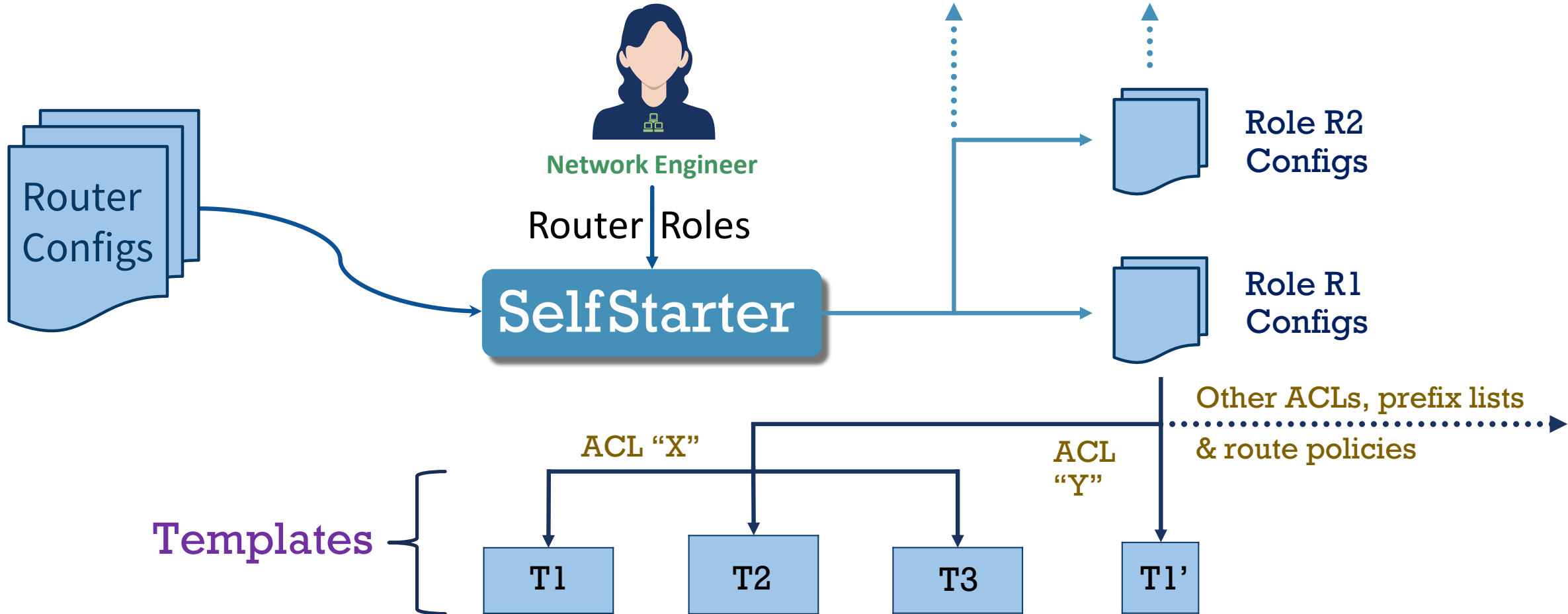
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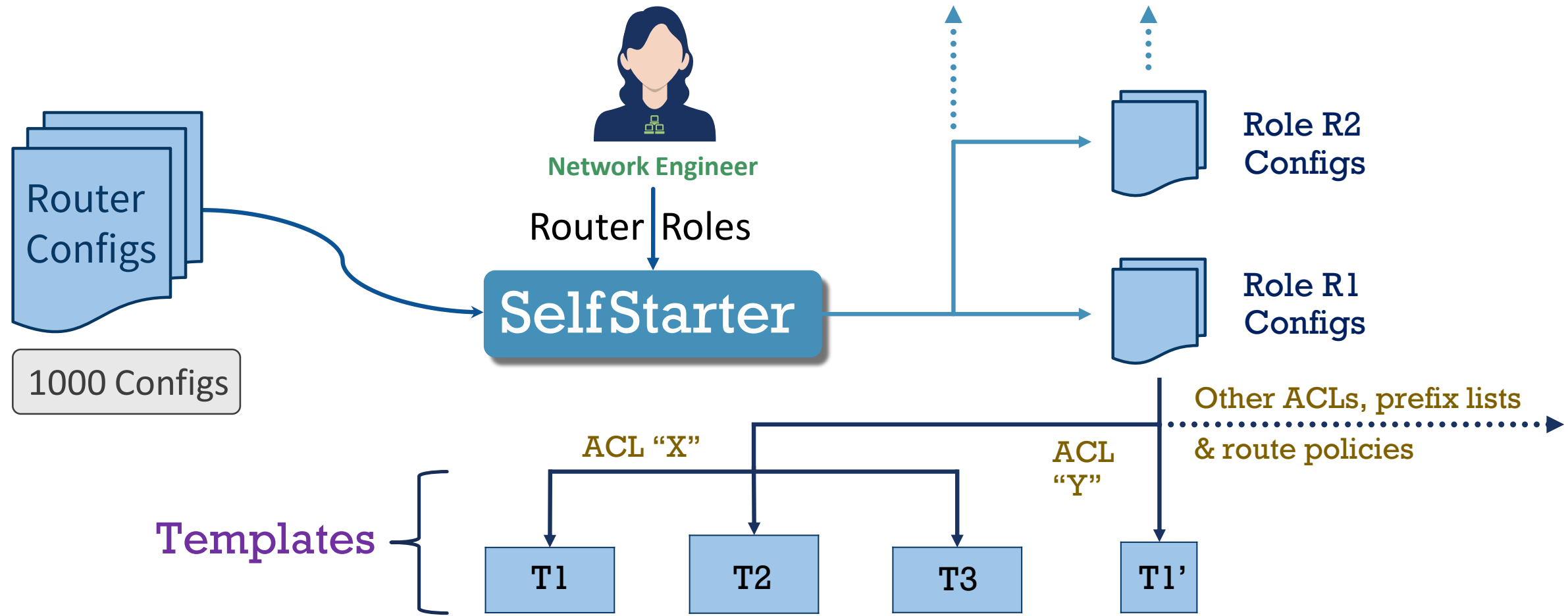
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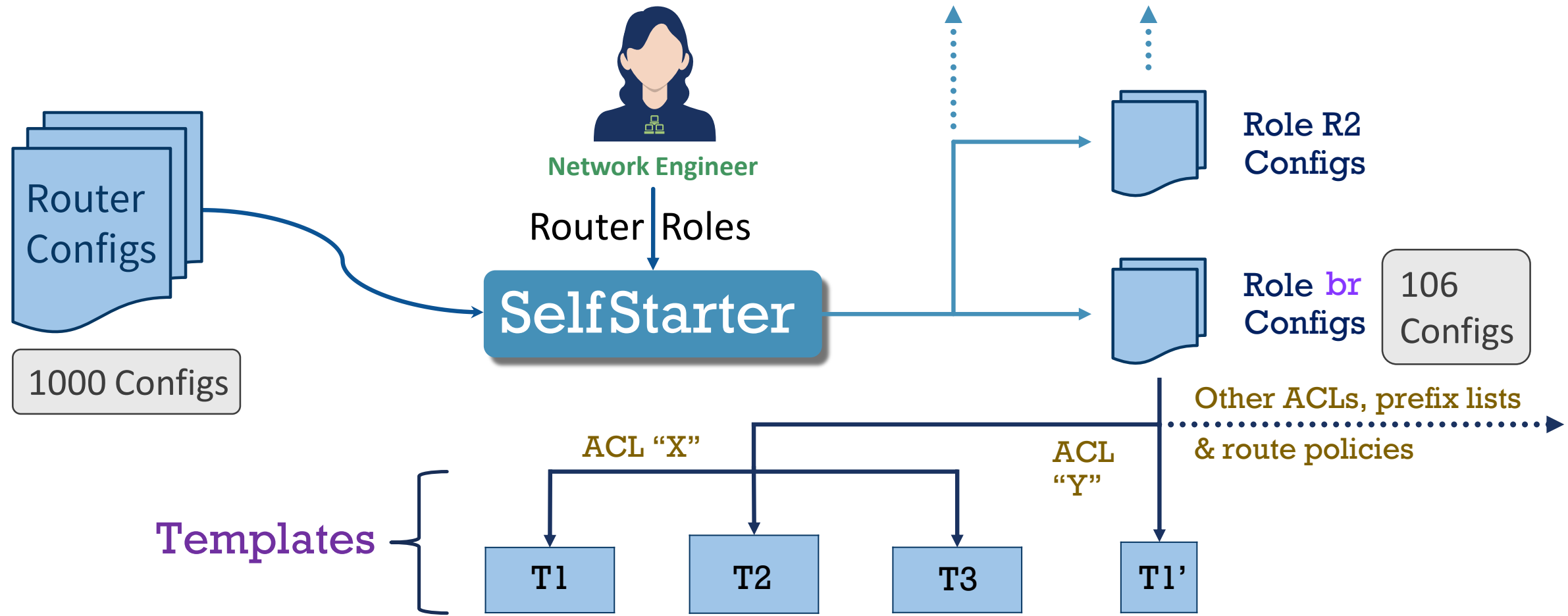
An Example: Campus Network



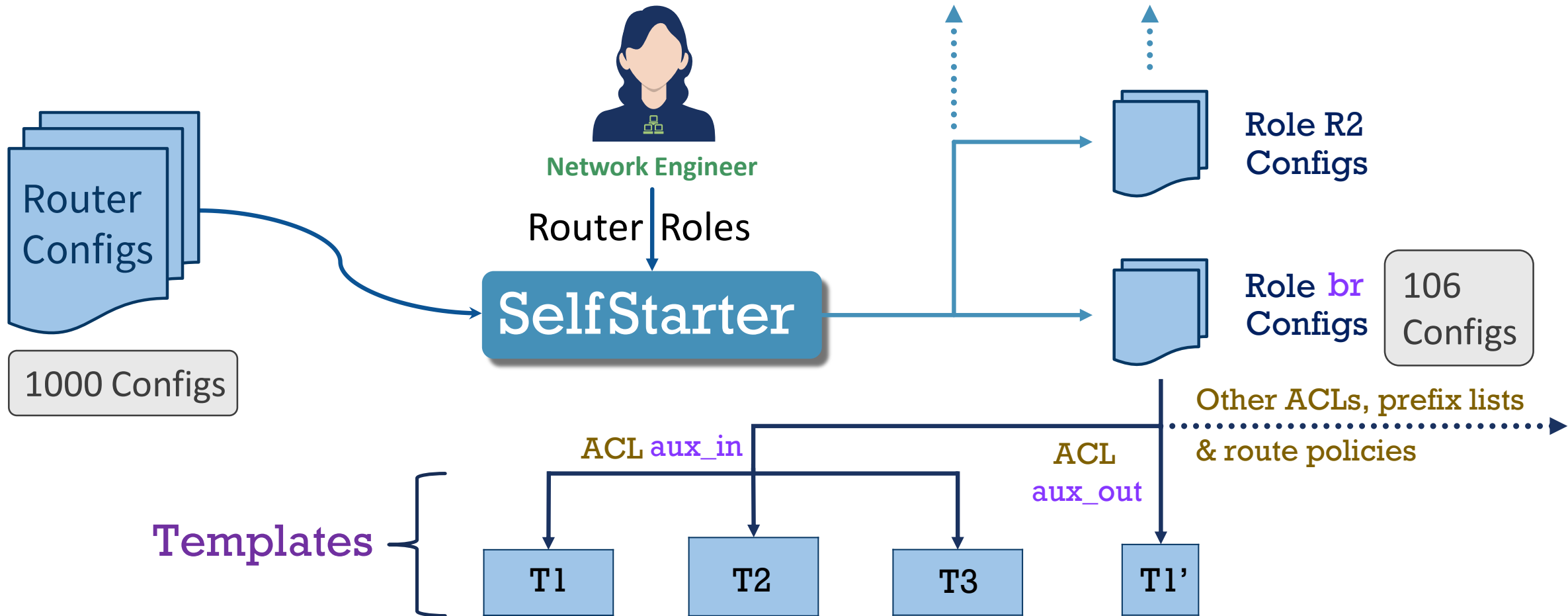
An Example: Campus Network



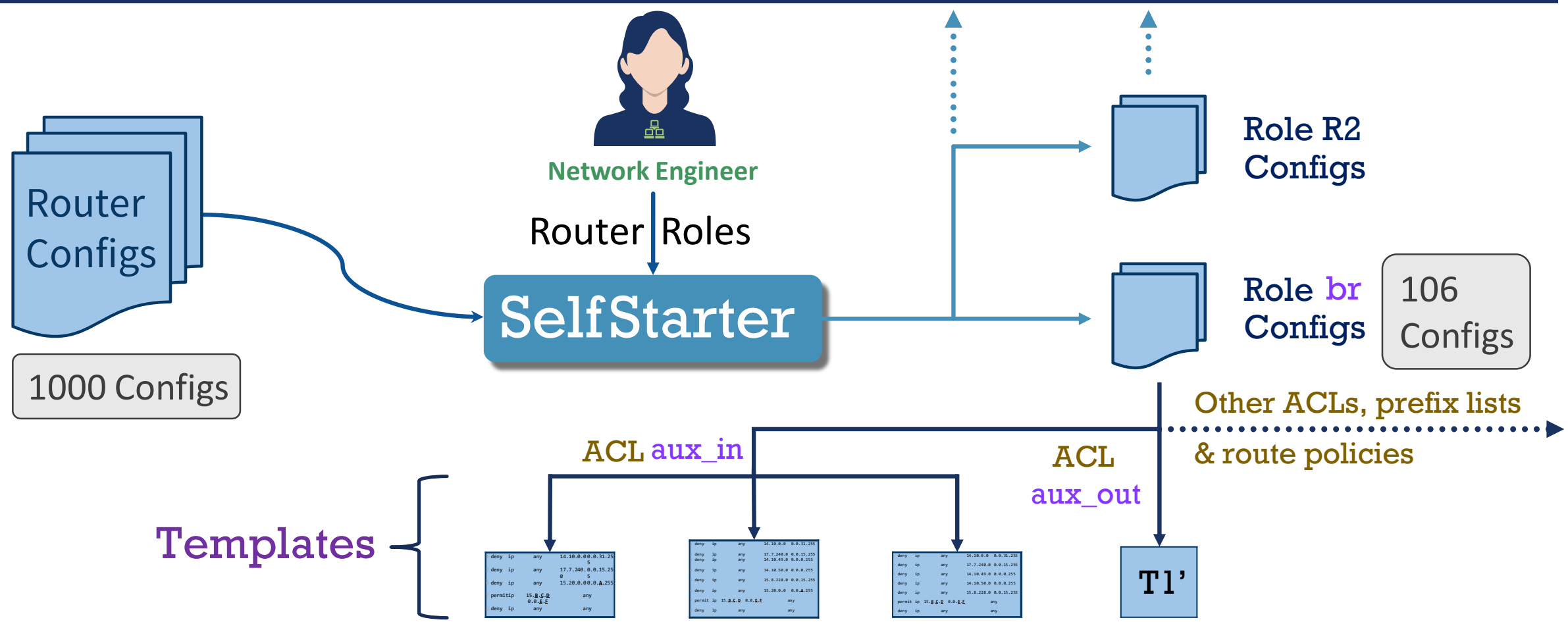
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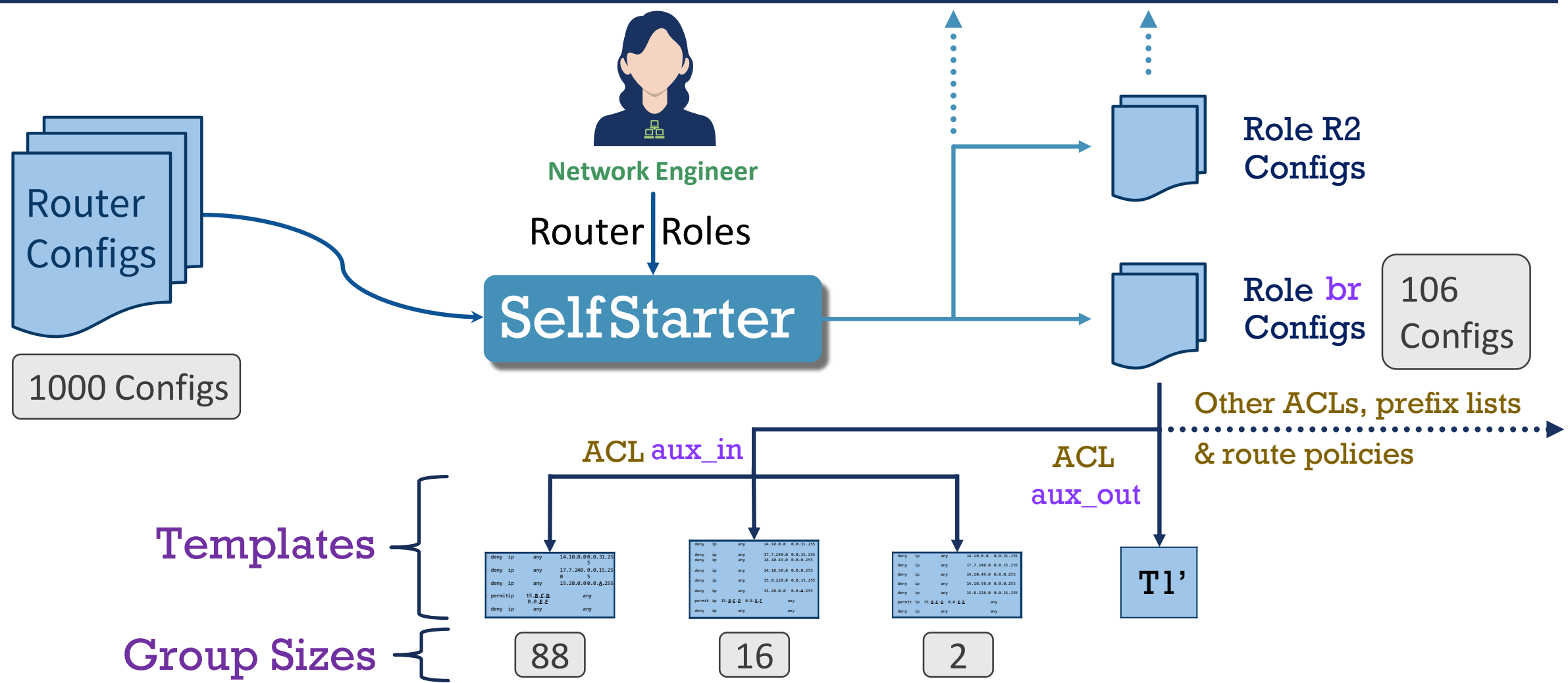
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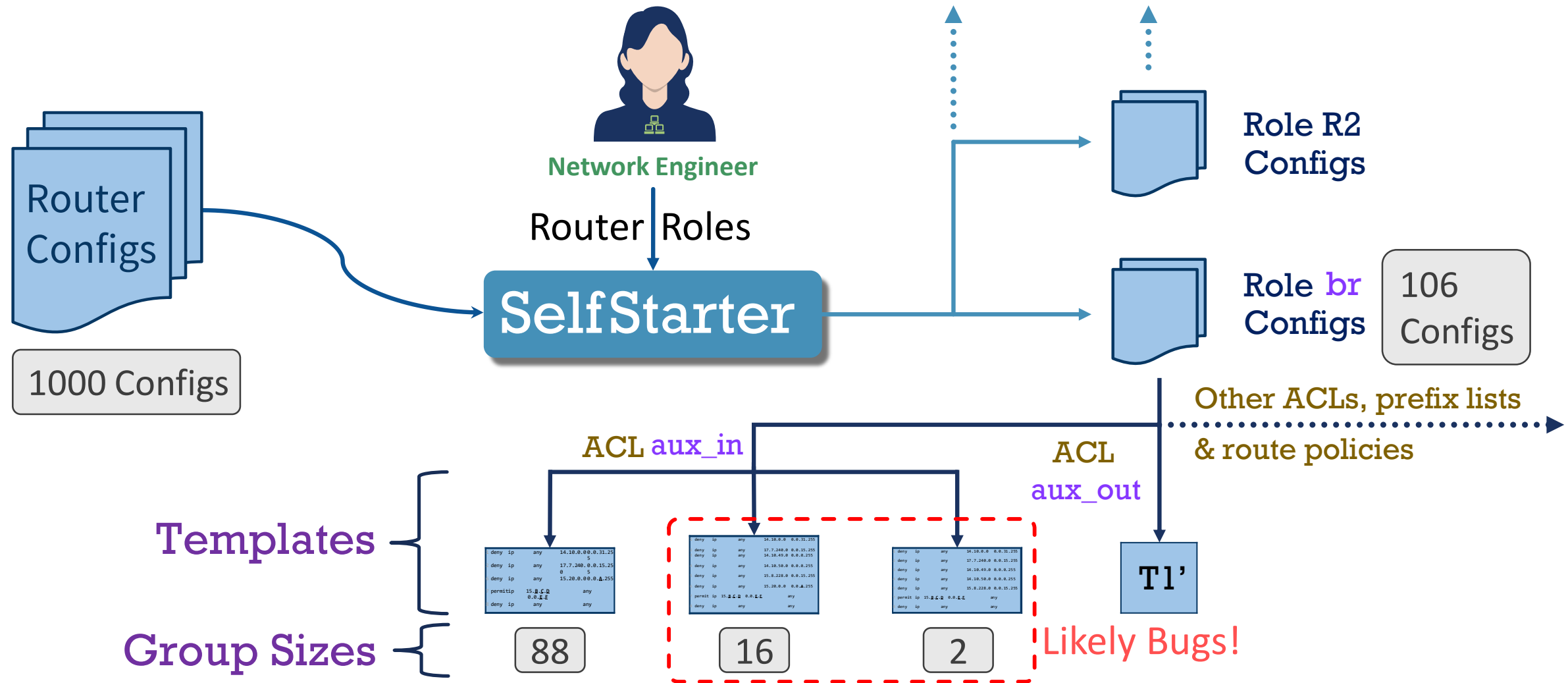


```
deny ip any 14.10.0.0 0.31.255.5
deny ip any 17.7.240.0 0.15.255.0
deny ip any 15.20.0.0 0.0.255.0
permit ip 15.8.0.0 0.0.0.0 any
deny ip any any
```

```
deny ip any 14.10.0.0 0.31.255.5
deny ip any 17.7.240.0 0.15.255.0
deny ip any 14.10.40.0 0.0.0.255
deny ip any 15.8.228.0 0.0.15.255
deny ip any 15.20.0.0 0.0.0.255
permit ip 15.8.0.0 0.0.0.0 any
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deny ip any 15.20.0.0 0.0.0.255
permit ip 15.8.0.0 0.0.0.0 any
deny ip any any
```

An Example: Campus Network



SelfStarter

1000 Configs

106 Configs

```
deny ip any 14.10.0.0 0.0.31.255 5
deny ip any 17.7.240.0 0.0.15.255 0
deny ip any 15.20.0.0 0.0.255
permit ip 15.8.0.0 0.0.0.0 any
deny ip any any
```

88

```
deny ip any 14.10.0.0 0.0.31.255 5
deny ip any 17.7.240.0 0.0.15.255 0
deny ip any 14.10.50.0 0.0.0.255
deny ip any 15.8.228.0 0.0.15.255
deny ip any 15.20.0.0 0.0.0.255
permit ip 15.8.0.0 0.0.0.0 any
deny ip any any
```

16

```
deny ip any 14.10.0.0 0.0.31.255 5
deny ip any 17.7.240.0 0.0.15.255 0
deny ip any 14.10.50.0 0.0.0.255
deny ip any 15.8.228.0 0.0.15.255
deny ip any 15.20.0.0 0.0.0.255
permit ip 15.8.0.0 0.0.0.0 any
deny ip any any
```

2

Likely Bugs!

SelfStarter Example Output

- ⦿ Input – 106 ACL configurations from a role in the campus network

SelfStarter Example Output

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Metatemplate

| | | | | | |
|---|--------|----|------------------------------------|--------------------------|--------------------|
| 1 | deny | ip | any | 14.10.0.0 | 0.0.31.255 |
| 2 | deny | ip | any | 17.7.240.0 | 0.0.15.255 |
| 3 | deny | ip | any | 14.10.49.0 | 0.0.0.255 |
| 4 | deny | ip | any | 14.10.50.0 | 0.0.0.255 |
| 5 | deny | ip | any | 15.8.228.0 | 0.0.15.255 |
| 6 | deny | ip | any | 15.20.0.0 | 0.0. <u>A</u> .255 |
| 7 | permit | ip | 15. <u>B</u> . <u>C</u> . <u>D</u> | 0.0. <u>E</u> . <u>F</u> | any |
| 8 | deny | ip | any | | any |

| Group 1 (88 ACLs) | Group 2 (16 ACLs) | Group 3 (2 ACLs) |
|----------------------|----------------------|---------------------|
| | | |
| | | |
| | | |

SelfStarter Example Output

⦿ Input – 106 ACL configurations from a role in the campus network

Metatemplate

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| 4 | deny | ip | any | 14.10.50.0 | 0.0.0.255 |
| 5 | deny | ip | any | 15.8.228.0 | 0.0.15.255 |
| 6 | deny | ip | any | 15.20.0.0 | 0.0. <u>A</u> .255 |
| 7 | permit | ip | 15. <u>B.C.D</u> | 0.0. <u>E.F</u> | any |
| 8 | deny | ip | any | any | any |

| Group 1 (88 ACLs) | Group 2 (16 ACLs) | Group 3 (2 ACLs) |
|----------------------|----------------------|---------------------|
| | | |
| | | |
| | | |

Group 1 Template

| | | | | | |
|---|--------|----|------------------------------------|--------------------------|--------------------|
| 1 | deny | ip | any | 14.10.0.0 | 0.0.31.255 |
| 2 | deny | ip | any | 17.7.240.0 | 0.0.15.255 |
| 3 | deny | ip | any | 14.10.49.0 | 0.0.0.255 |
| 4 | deny | ip | any | 14.10.50.0 | 0.0.0.255 |
| 5 | deny | ip | any | 15.8.228.0 | 0.0.15.255 |
| 6 | deny | ip | any | 15.20.0.0 | 0.0. <u>A</u> .255 |
| 7 | permit | ip | 15. <u>B</u> . <u>C</u> . <u>D</u> | 0.0. <u>E</u> . <u>F</u> | any |
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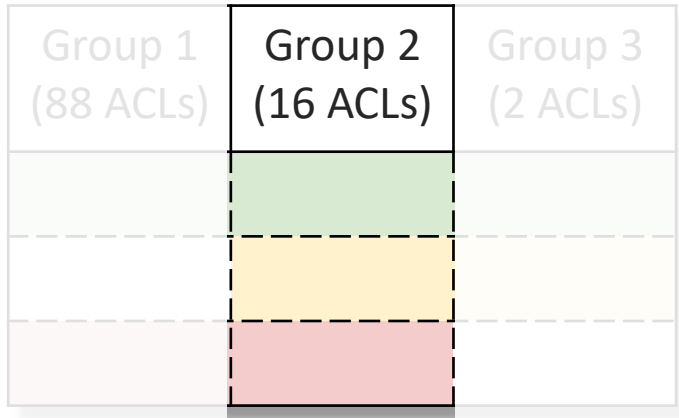
Group 1 Template

| | | | | | |
|---|--------|----|------------------------------------|--------------------------|--------------------|
| 1 | deny | ip | any | 14.10.0.0 | 0.0.31.255 |
| 2 | deny | ip | any | 17.7.240.0 | 0.0.15.255 |
| 3 | deny | ip | any | 14.10.49.0 | 0.0.0.255 |
| 4 | deny | ip | any | 14.10.50.0 | 0.0.0.255 |
| 5 | deny | ip | any | 15.8.228.0 | 0.0.15.255 |
| 6 | deny | ip | any | 15.20.0.0 | 0.0. <u>A</u> .255 |
| 7 | permit | ip | 15. <u>B</u> . <u>C</u> . <u>D</u> | 0.0. <u>E</u> . <u>F</u> | any |
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|----------------------|----------------------|---------------------|
| | | |
| | | |
| | | |

Group 2 Template

| | | | | | |
|---|--------|----|------------------------------------|--------------------------|--------------------|
| 1 | deny | ip | any | 14.10.0.0 | 0.0.31.255 |
| 2 | deny | ip | any | 17.7.240.0 | 0.0.15.255 |
| 3 | deny | ip | any | 14.10.49.0 | 0.0.0.255 |
| 4 | deny | ip | any | 14.10.50.0 | 0.0.0.255 |
| 5 | deny | ip | any | 15.8.228.0 | 0.0.15.255 |
| 6 | deny | ip | any | 15.20.0.0 | 0.0. <u>A</u> .255 |
| 7 | permit | ip | 15. <u>B</u> . <u>C</u> . <u>D</u> | 0.0. <u>E</u> . <u>F</u> | any |
| 8 | deny | ip | any | | any |



Group 3 Template

| | | | | | |
|---|--------|----|------------------------------------|--------------------------|--------------------|
| 1 | deny | ip | any | 14.10.0.0 | 0.0.31.255 |
| 2 | deny | ip | any | 17.7.240.0 | 0.0.15.255 |
| 3 | deny | ip | any | 14.10.49.0 | 0.0.0.255 |
| 4 | deny | ip | any | 14.10.50.0 | 0.0.0.255 |
| 5 | deny | ip | any | 15.8.228.0 | 0.0.15.255 |
| 6 | deny | ip | any | 15.20.0.0 | 0.0. <u>A</u> .255 |
| 7 | permit | ip | 15. <u>B</u> . <u>C</u> . <u>D</u> | 0.0. <u>E</u> . <u>F</u> | any |
| 8 | deny | ip | any | | any |

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|----------------------|----------------------|---------------------|
| | | |
| | | |
| | | |

Group 3 Template

| | | | | | |
|---|--------|----|------------------------------------|--------------------------|--------------------|
| 1 | deny | ip | any | 14.10.0.0 | 0.0.31.255 |
| 2 | deny | ip | any | 17.7.240.0 | 0.0.15.255 |
| 3 | deny | ip | any | 14.10.49.0 | 0.0.0.255 |
| 4 | deny | ip | any | 14.10.50.0 | 0.0.0.255 |
| 5 | deny | ip | any | 15.8.228.0 | 0.0.15.255 |
| 6 | deny | ip | any | 15.20.0.0 | 0.0. <u>A</u> .255 |
| 7 | permit | ip | 15. <u>B</u> . <u>C</u> . <u>D</u> | 0.0. <u>E</u> . <u>F</u> | any |
| 8 | deny | ip | any | | any |

| Group 1 (88 ACLs) | Group 2 (16 ACLs) | Group 3 (2 ACLs) |
|----------------------|----------------------|---------------------|
| | | |
| | | |
| | | |

Deviance Identification

⦿ |Groups 2 and 3| << |Group 1| → Groups 2 and 3 ACLs are potentially misconfigured

| | | | | | |
|---|--------|----|------------------------------------|--------------------------|--------------------|
| 1 | deny | ip | any | 14.10.0.0 | 0.0.31.255 |
| 2 | deny | ip | any | 17.7.240.0 | 0.0.15.255 |
| 3 | deny | ip | any | 14.10.49.0 | 0.0.0.255 |
| 4 | deny | ip | any | 14.10.50.0 | 0.0.0.255 |
| 5 | deny | ip | any | 15.8.228.0 | 0.0.15.255 |
| 6 | deny | ip | any | 15.20.0.0 | 0.0. <u>A</u> .255 |
| 7 | permit | ip | 15. <u>B</u> . <u>C</u> . <u>D</u> | 0.0. <u>E</u> . <u>F</u> | any |
| 8 | deny | ip | any | | any |

Group Outliers

| | | |
|----------------------|----------------------|---------------------|
| Group 1 (88 ACLs) | Group 2 (16 ACLs) | Group 3 (2 ACLs) |
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Deviance Identification

- ⦿ |Groups 2 and 3| << |Group 1| → Groups 2 and 3 ACLs are potentially misconfigured
- ⦿ Metatemplate → Actionable feedback to the network engineers

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| 4 | deny | ip | any | 14.10.50.0 | 0.0.0.255 |
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| 6 | deny | ip | any | 15.20.0.0 | 0.0. <u>A</u> .255 |
| 7 | permit | ip | 15. <u>B</u> . <u>C</u> . <u>D</u> | 0.0. <u>E</u> . <u>F</u> | any |
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Group Outliers

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|----------------------|----------------------|---------------------|
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Deviance Identification

- ⦿ |Groups 2 and 3| ≪ |Group 1| → Groups 2 and 3 ACLs are potentially misconfigured
- ⦿ Metatemplate → Actionable feedback to the network engineers
- ⦿ |Group 1|_{A=127} ≪ |Group 1|_{A=255} → 10 ACLs are potentially permitting more traffic than intended

| | | | | | |
|---|--------|----|----------|------------|------------|
| 1 | deny | ip | any | 14.10.0.0 | 0.0.31.255 |
| 2 | deny | ip | any | 17.7.240.0 | 0.0.15.255 |
| 3 | deny | ip | any | 14.10.49.0 | 0.0.0.255 |
| 4 | deny | ip | any | 14.10.50.0 | 0.0.0.255 |
| 5 | deny | ip | any | 15.8.228.0 | 0.0.15.255 |
| 6 | deny | ip | any | 15.20.0.0 | 0.0.A.255 |
| 7 | permit | ip | 15.B.C.D | 0.0.E.F | any |
| 8 | deny | ip | any | | any |

Group Outliers

| | | |
|----------------------|----------------------|---------------------|
| Group 1 (88 ACLs) | Group 2 (16 ACLs) | Group 3 (2 ACLs) |
| | | |
| | | |
| | | |

Parameter Outliers

| A | # of ACLs in Group 1 |
|-----|----------------------|
| 255 | 78 |
| 127 | 10 |

Deviance Identification

- Groups 2 and 3 << Group 1 → Groups 2 and 3 ACLs are potentially misconfigured
- Metatemplate → Actionable feedback to the network engineers
- Group 1_{A=127} << Group 1_{A=255} → 10 ACLs are potentially permitting more traffic than intended

| | | | | | |
|---|--------|----|----------|------------|------------|
| 1 | deny | ip | any | 14.10.0.0 | 0.0.31.255 |
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| 3 | deny | ip | any | 14.10.49.0 | 0.0.0.255 |
| 4 | deny | ip | any | 14.10.50.0 | 0.0.0.255 |
| 5 | deny | ip | any | 15.8.228.0 | 0.0.15.255 |
| 6 | deny | ip | any | 15.20.0.0 | 0.0.A.255 |
| 7 | permit | ip | 15.B.C.D | 0.0.E.F | any |
| 8 | deny | ip | any | | any |

Group Outliers

| | | |
|----------------------|----------------------|---------------------|
| Group 1 (88 ACLs) | Group 2 (16 ACLs) | Group 3 (2 ACLs) |
| | | |
| | | |
| | | |

| A | # of ACLs in Group 1 |
|-----|----------------------|
| 255 | 78 |
| 127 | 10 |

Parameter Outliers

Template Inference: Key Ideas

| ip access-list extended ACL1 | | | | | | |
|------------------------------|--------|------|------------|------------|-----|--|
| 1 | deny | udp | host | 0.0.0.0 | any | |
| 2 | permit | tcp | 17.12.11.0 | 0.0.0.255 | any | |
| 3 | deny | icmp | 17.12.11.0 | 0.0.0.255 | any | |
| 4 | permit | ip | 16.21.0.0 | 0.0.63.255 | any | |
| 5 | permit | ip | 17.12.11.0 | 0.0.0.255 | any | |



| ip access-list extended ACL2 | | | | | | |
|------------------------------|--------|------|------------|------------|-----|--|
| 1 | deny | udp | host | 0.0.0.0 | any | |
| 2 | permit | tcp | 17.12.13.0 | 0.0.0.255 | any | |
| 3 | deny | icmp | 17.12.13.0 | 0.0.0.255 | any | |
| 4 | permit | ip | 17.12.13.0 | 0.0.0.255 | any | |
| 5 | permit | ip | 16.23.0.0 | 0.0.63.255 | any | |

Template Inference: Key Ideas

| ip access-list extended ACL1 | | | | | | ip access-list extended ACL2 | | | | | |
|------------------------------|--------|------|------------|------------|-----|------------------------------|--------|------|------------|------------|-----|
| 1 | deny | udp | host | 0.0.0.0 | any | 1 | deny | udp | host | 0.0.0.0 | any |
| 2 | permit | tcp | 17.12.11.0 | 0.0.0.255 | any | 2 | permit | tcp | 17.12.13.0 | 0.0.0.255 | any |
| 3 | deny | icmp | 17.12.11.0 | 0.0.0.255 | any | 3 | deny | icmp | 17.12.13.0 | 0.0.0.255 | any |
| 4 | permit | ip | 16.21.0.0 | 0.0.63.255 | any | 4 | permit | ip | 17.12.13.0 | 0.0.0.255 | any |
| 5 | permit | ip | 17.12.11.0 | 0.0.0.255 | any | 5 | permit | ip | 16.23.0.0 | 0.0.63.255 | any |

Challenge: Non-identical lines

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| 2 | permit | tcp | 17.12.11.0 | 0.0.0.255 | any | 2 | permit | tcp | 17.12.13.0 | 0.0.0.255 | any |
| 3 | deny | icmp | 17.12.11.0 | 0.0.0.255 | any | 3 | deny | icmp | 17.12.13.0 | 0.0.0.255 | any |
| 4 | permit | ip | 16.21.0.0 | 0.0.63.255 | any | 4 | permit | ip | 17.12.13.0 | 0.0.0.255 | any |
| 5 | permit | ip | 17.12.11.0 | 0.0.0.255 | any | 5 | permit | ip | 16.23.0.0 | 0.0.63.255 | any |

Challenge: Non-identical lines

Solution: Parameterization

Template Inference: Key Ideas

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Challenge: Non-identical lines

Solution: Parameterization

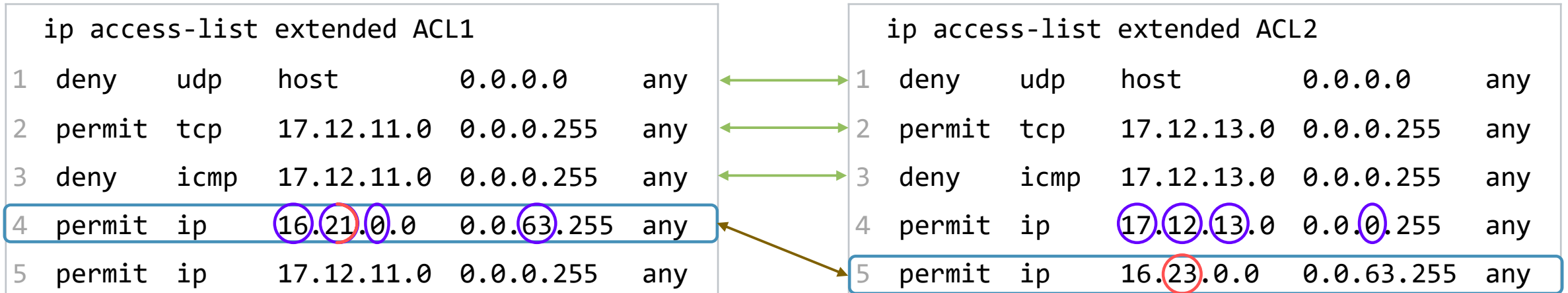
Template Inference: Key Ideas

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| 3 | deny | icmp | 17.12.11.0 | 0.0.0.255 | any | 3 | deny | icmp | 17.12.13.0 | 0.0.0.255 | any |
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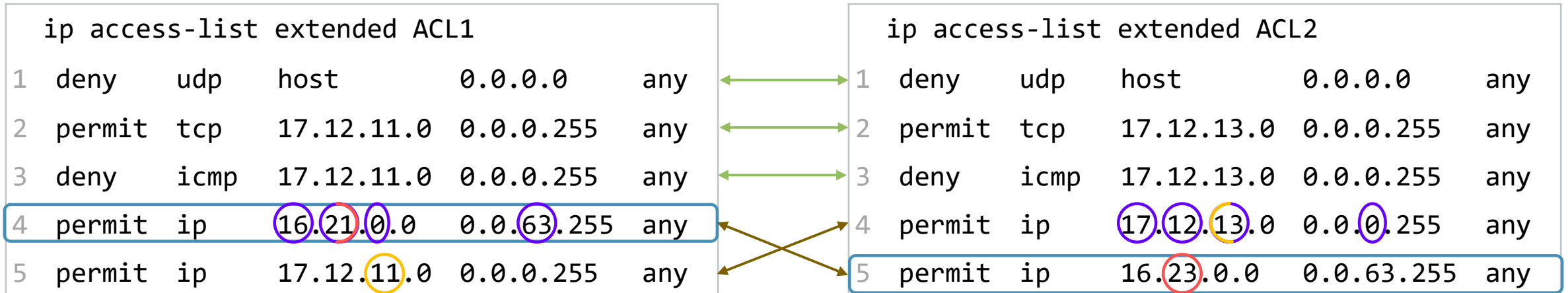
Template Inference: Key Ideas

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| 5 | permit | ip | 17.12.11.0 | 0.0.0.255 | any | 5 | permit | ip | 16.23.0.0 | 0.0.63.255 | any |

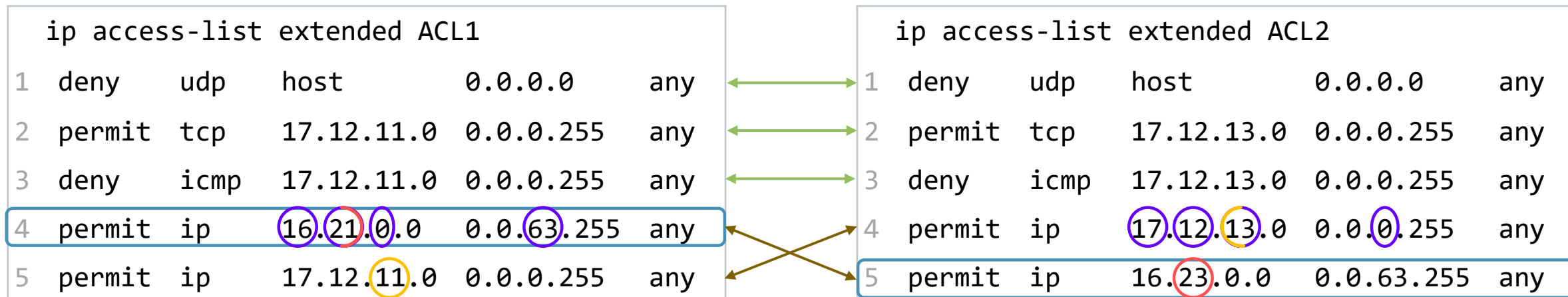
Template Inference: Key Ideas



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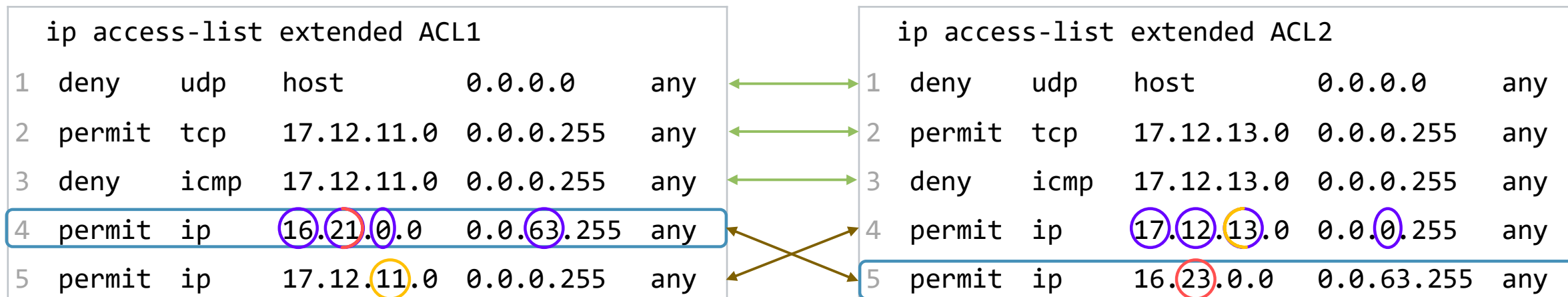


Template Inference: Key Ideas



Challenge: Allow certain reorderings but not arbitrary reorderings

Template Inference: Key Ideas

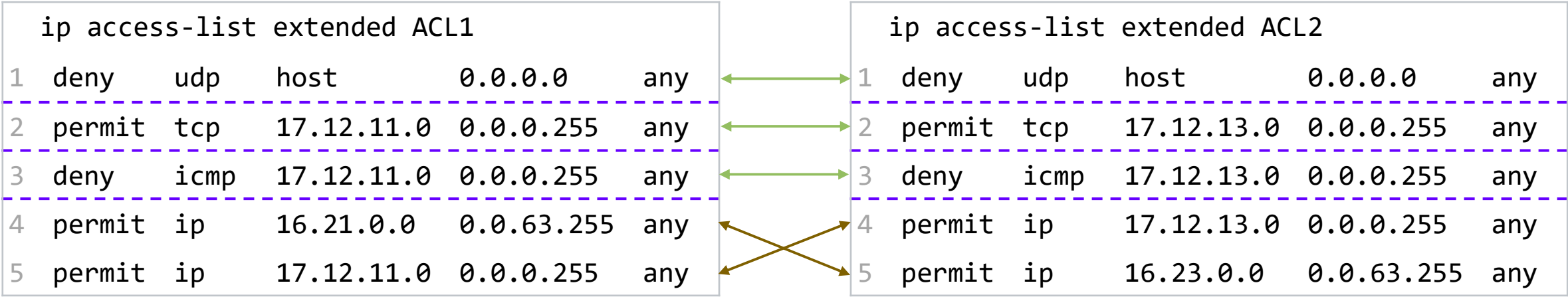


Challenge: Allow certain reorderings
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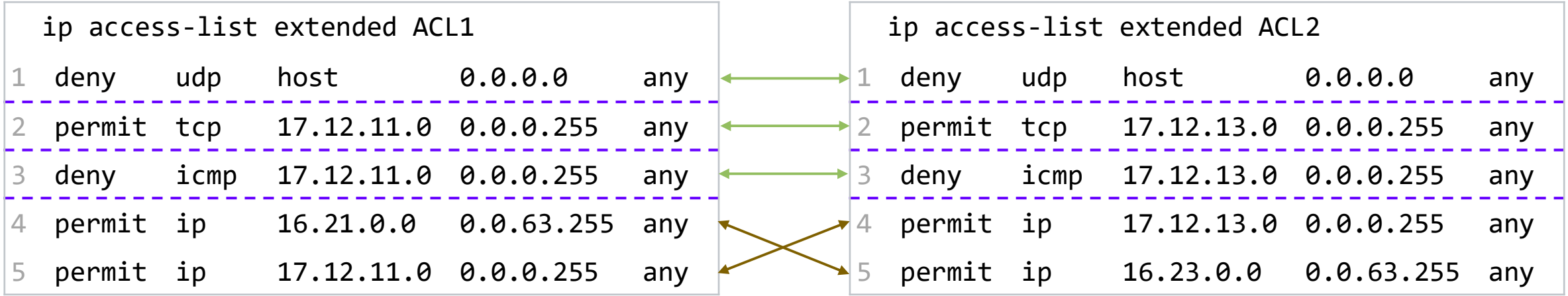
Solution: Two-level
abstraction using blocks

A block is a contiguous sequence of lines that can be arbitrarily reordered but the order of blocks is important.

Template Inference: Key Ideas



Template Inference: Key Ideas



Block Alignment



Sequence alignment to prevent cross-block reordering

(see our paper for details)

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Block Alignment



Sequence alignment to prevent cross-block reordering

Line Reorderings



Minimum-weight bipartite matching to allow within-block line reorderings

(see our paper for details)

Template of ACL1 and ACL2

ip access-list extended ACL1

```

1 deny    udp    host    0.0.0.0    any
2 permit  tcp    17.12.11.0  0.0.0.255  any
3 deny    icmp   17.12.11.0  0.0.0.255  any
4 permit  ip     16.21.0.0   0.0.63.255 any
5 permit  ip     17.12.11.0  0.0.0.255  any
  
```

ip access-list extended ACL2

```

1 deny    udp    host    0.0.0.0    any
2 permit  tcp    17.12.13.0  0.0.0.255  any
3 deny    icmp   17.12.13.0  0.0.0.255  any
4 permit  ip     17.12.13.0  0.0.0.255  any
5 permit  ip     16.23.0.0   0.0.63.255 any
  
```

ip access-list extended ACL*

```

1 deny    udp    host    0.0.0.0    any
2 permit  tcp    17.12.A.0   0.0.0.255  any
3 deny    icmp   17.12.B.0   0.0.0.255  any
4 permit  ip     17.12.C.0   0.0.0.255  any
5 permit  ip     16.D.0.0   0.0.63.255 any
  
```

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| | | | Identified | Investigated | True Positives (% of investigated) |
| Campus | ACLs | 0 | 6 | 3 | 3 (100%) |
| Microsoft WAN | Prefix lists | 10042 | 166 | 138 | 7 (5%) |
| | Route policies | 10969 | 56 | 33 | 33 (100%) |
| Microsoft Data center | ACLs | 9700 | 938 | 400* | 400 (100%)* |
| | Prefix lists | 2954 | 0 | - | - |
| | Route policies | 11653 | 230 | 230* | 230 (100%)* |

* These were known inconsistencies

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| | Route policies | | 56 | 33 | 33 (100%) |
| Microsoft Data center | ACLs | 9700 | 938 | 400* | 400 (100%)* |
| | Prefix lists | 90 min 2954 | 0 | - | - |
| | Route policies | 11653 | 230 | 230* | 230 (100%)* |

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[#]These prefix lists dynamically expand to multiple lines

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 - Reference templates for operators to follow

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- Automated update service
- Explicit templates for each role

- × Delayed updates during automation

Prior Work

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Key Limitations

- ✗ Exact equivalence-based similarity
- ✗ Do not apply to complex configuration segments like ACLs and Prefix lists
- ✗ Allow arbitrary reordering of lines

Conclusion

- ◎ First general template inference algorithm for configuration segments
- ◎ SelfStarter – Our tool for finding potential network misconfigurations without a specification, using automatic template inference
- ◎ Provides actionable feedback to the operators
- ◎ Found 43 unknown bugs in Microsoft networks and campus network
- ◎ Source Code : <https://github.com/SivaKesava1/SelfStarter>
- ◎ Reach me at: sivakesava@cs.ucla.edu

