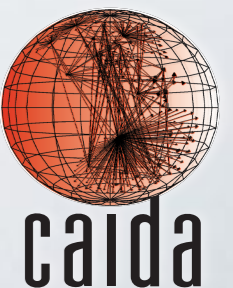


# bdrmap: Inference of Borders Between IP Networks

**Matthew Luckie**, Amogh Dhamdhere,  
Bradley Huffaker, David Clark, kc claffy

IMC 2016, November 15th 2016



Who operates a router we observe in a traceroute path?

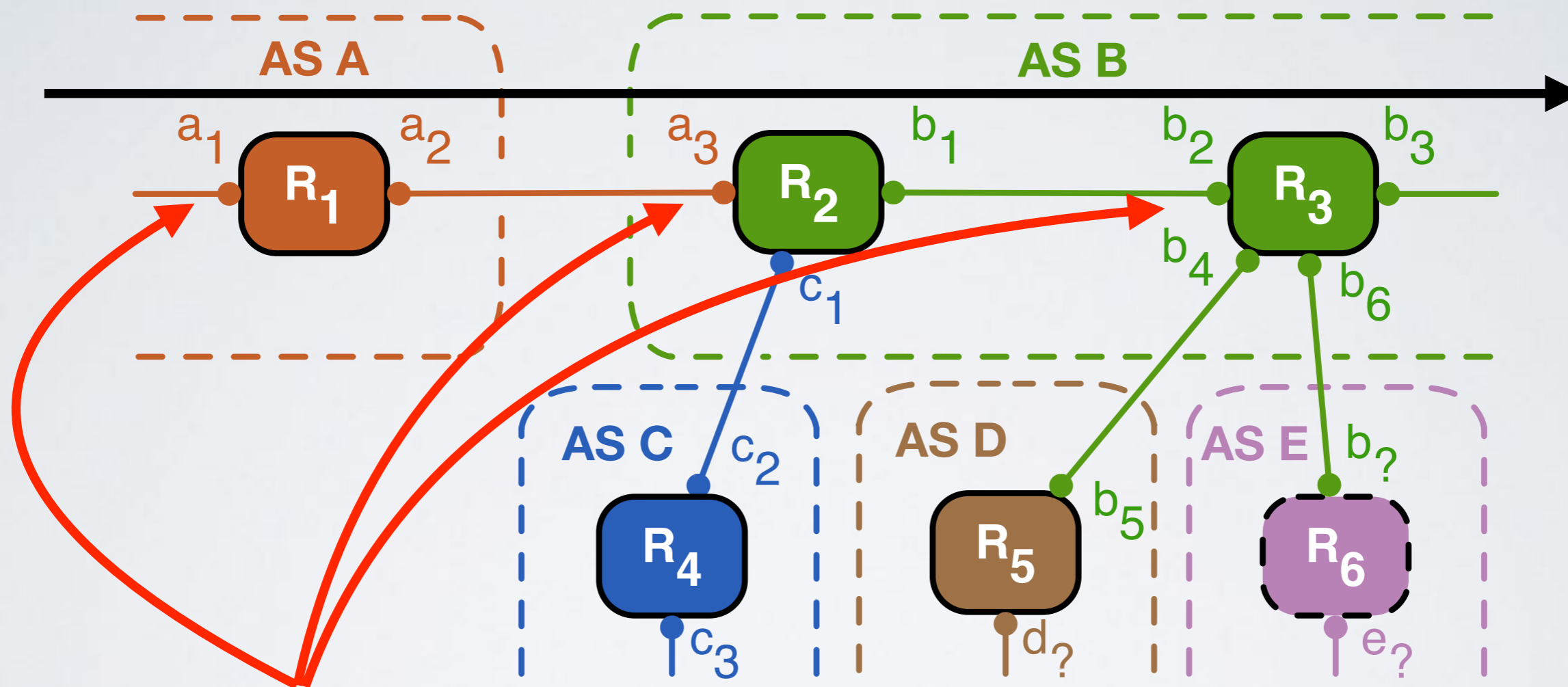
# The Problem

1. The Internet architecture has **no notion of interdomain boundaries** at the network layer
2. Traceroute is a **30-year old hack** with limitations
3. Using **longest-matching prefix** to infer ownership of routers is **known to be error prone**
4. Traceroute **samples topology close to Vantage Point (VP)**, reducing topological constraints for inferring ownership for distant routers
5. Concerns about revealing topology information can **align operator incentives away from transparency**

# Assumption

**IP path:**

**a<sub>1</sub> a<sub>3</sub> b<sub>2</sub>**



We assume that routers generally respond with an **on-path** interface facing the **VP**, and links between routers are **point-to-point** (IPv4 /30 or /31)

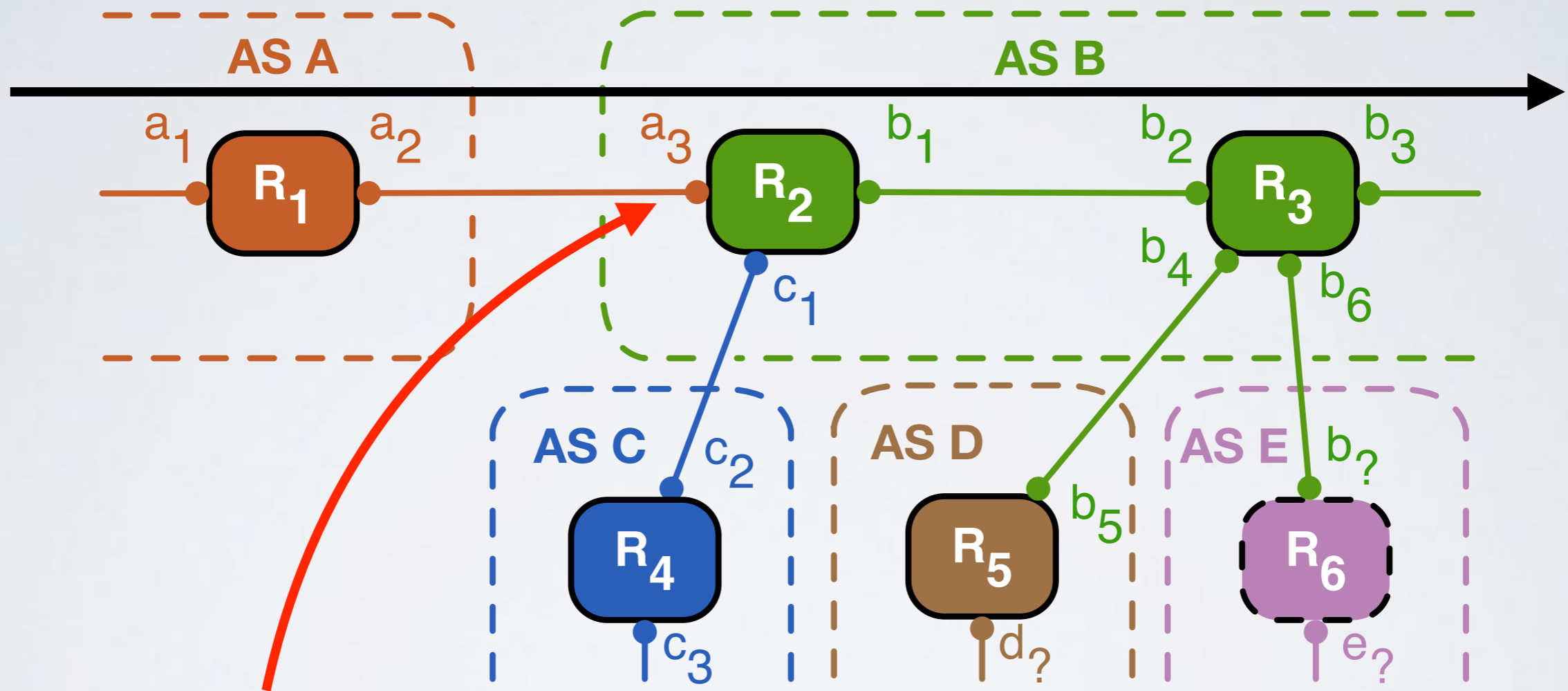
# Challenges

**IP path:**

**a<sub>1</sub>** **a<sub>3</sub>** **b<sub>2</sub>**

**Router path:**

**R<sub>1</sub>** **R<sub>2</sub>** **R<sub>3</sub>**



Neighbor router owned by **AS B** may respond with an IP address from **AS A** which the router uses to form the point to point link.

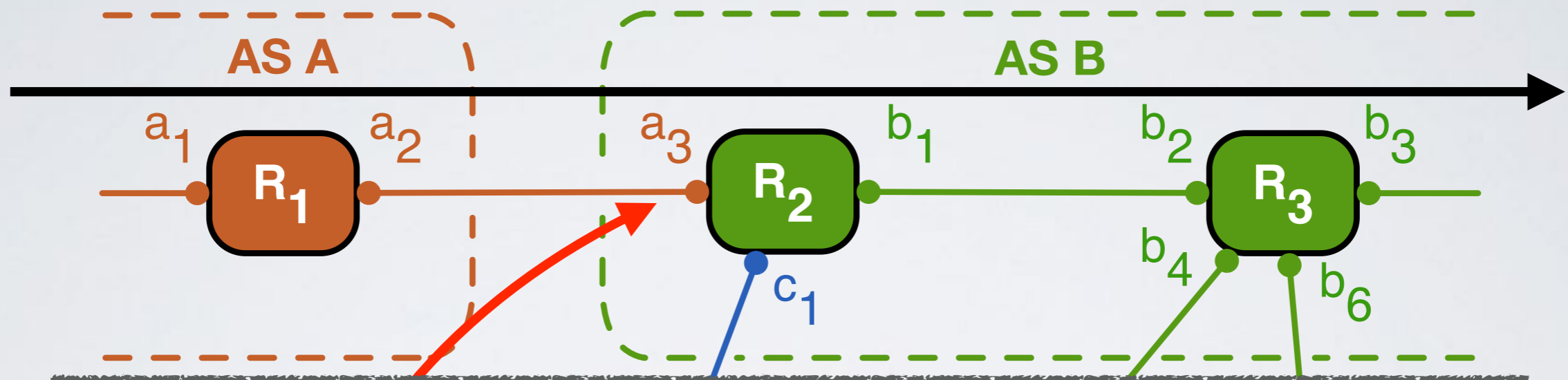
# Challenges

**IP path:**

**a<sub>1</sub>** **a<sub>3</sub>** **b<sub>2</sub>**

**Router path:**

**R<sub>1</sub>** **R<sub>2</sub>** **R<sub>3</sub>**



**Industry convention for provider to assign interconnect IP address, but no convention for peering**

Neighbor router owned by **AS B** may respond with an IP address from **AS A** which the router uses to form the point to point link.

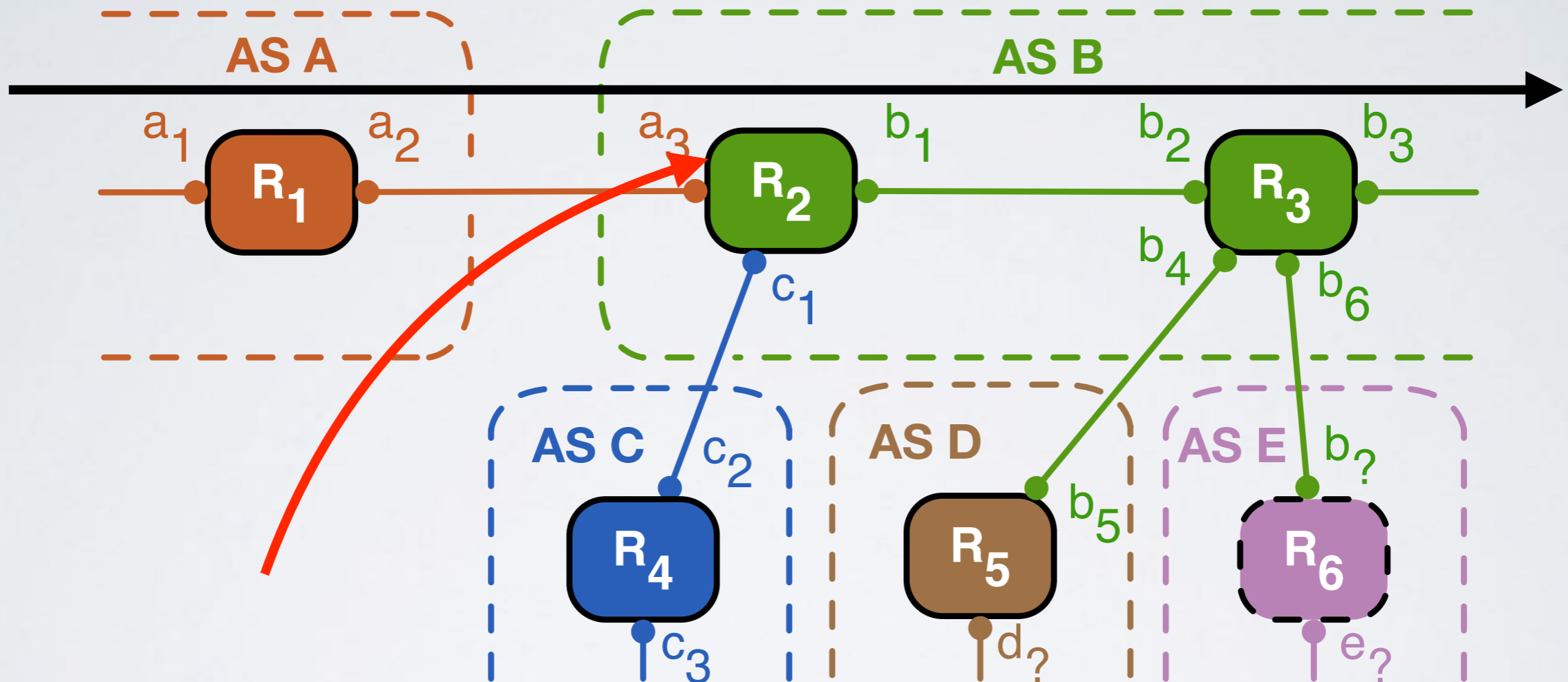
# Challenges

IP path:

$a_1$   $c_1$   $b_2$

Router path:

$R_1$   $R_2$   $R_3$



Neighbor router owned by **AS B** may respond with a third party IP address from **AS C**

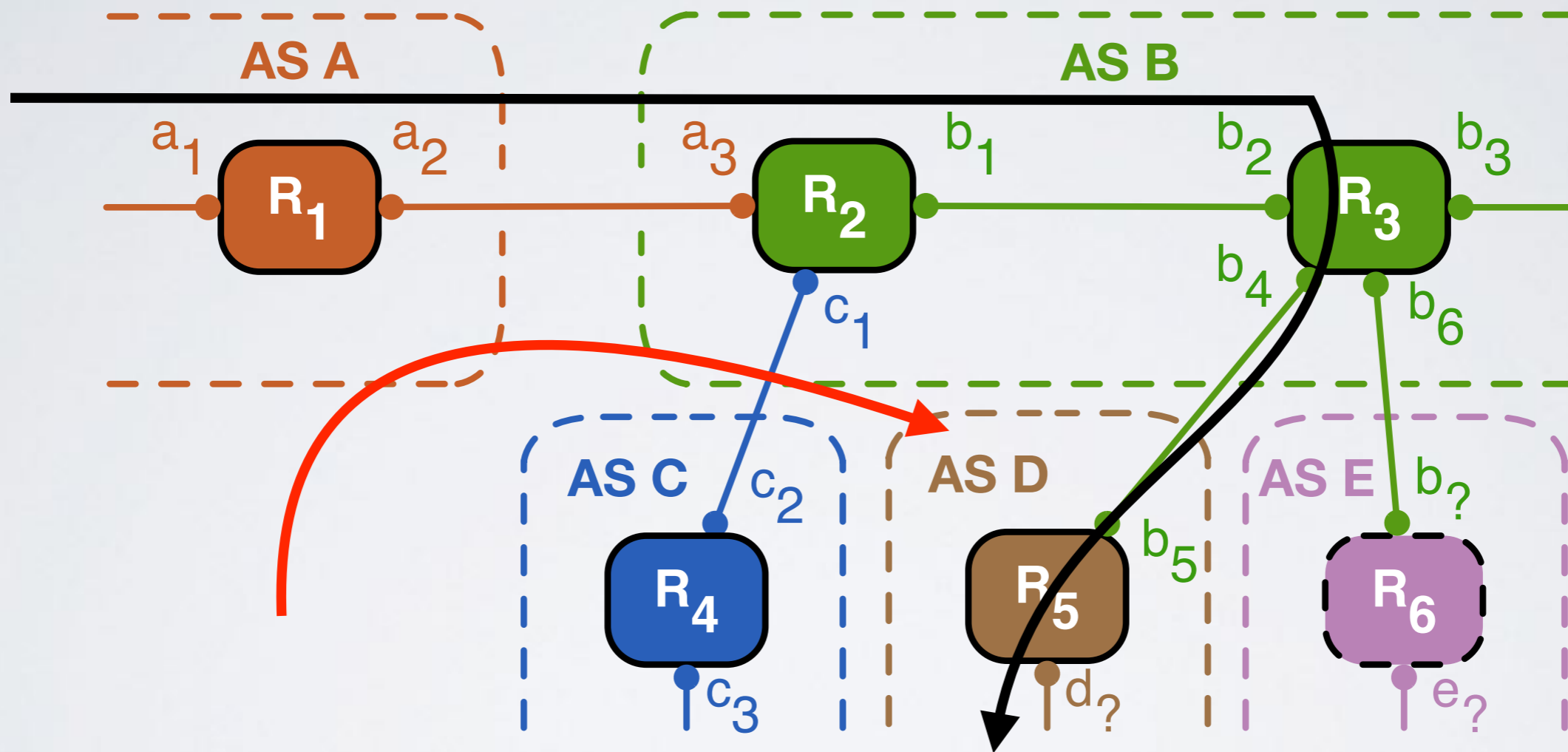
# Challenges

**IP path:**

**a<sub>1</sub> a<sub>3</sub> b<sub>2</sub> b<sub>5</sub> ?**

**Router path:**

**R<sub>1</sub> R<sub>2</sub> R<sub>3</sub> R<sub>5</sub> ?**



Border router operated by **AS D** may respond with an address from **AS B** used to form point-to-point link, but block probes from entering **AS D**



# Challenges

**IP paths:**

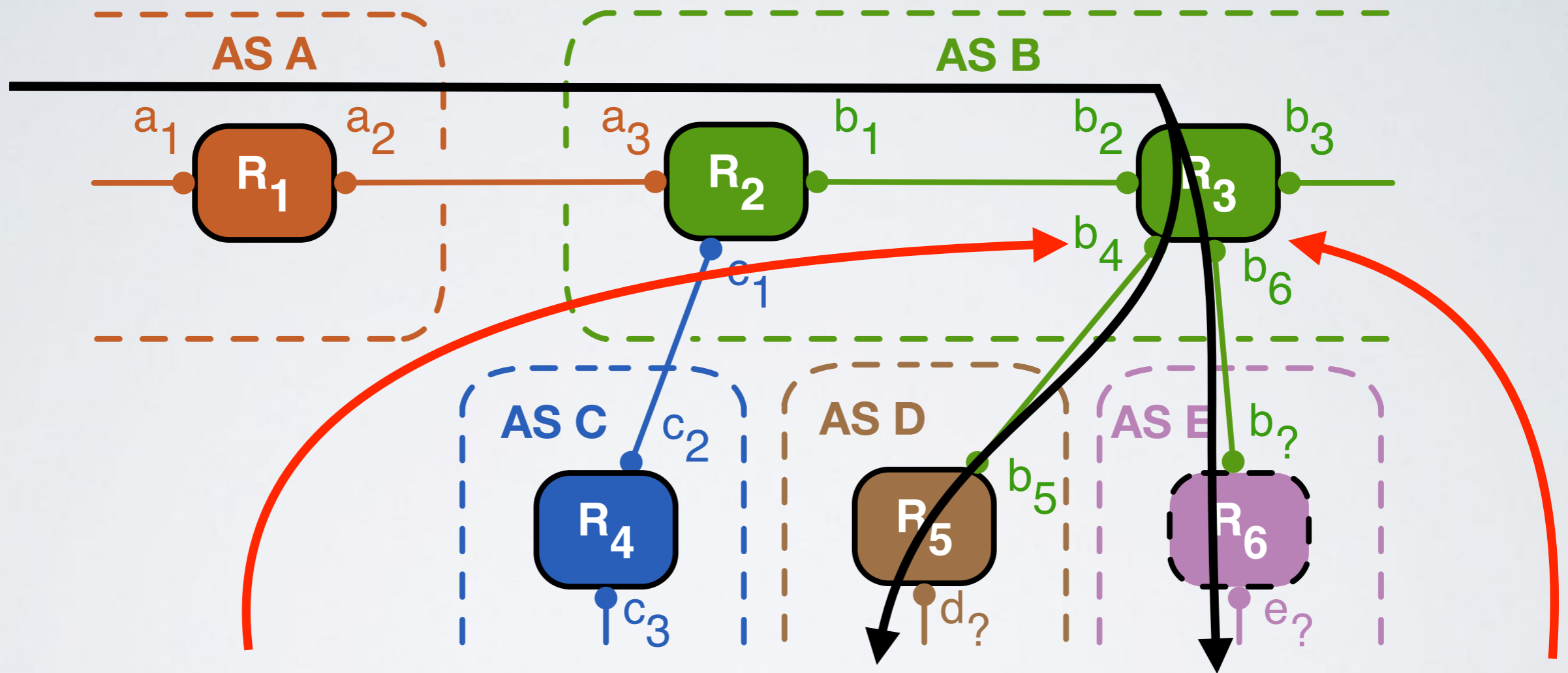
**a<sub>1</sub> a<sub>3</sub> b<sub>4</sub> b<sub>5</sub>**

**a<sub>1</sub> a<sub>3</sub> b<sub>6</sub> ?**

**Router paths:**

**R<sub>1</sub> R<sub>2</sub> R<sub>3</sub> R<sub>5</sub>**

**R<sub>1</sub> R<sub>2</sub> R<sub>3</sub> ?**



Border router owned by **AS B** may use virtual routing features; the router will respond with different IP addresses that form the point-to-point link with **AS D** and **AS E**

# Challenges

**IP paths:**

a<sub>1</sub>

a<sub>3</sub>

**b<sub>4</sub> b<sub>5</sub>**

a<sub>1</sub>

a<sub>3</sub>

**b<sub>6</sub> ?**

**Router paths:**

**R<sub>1</sub>**

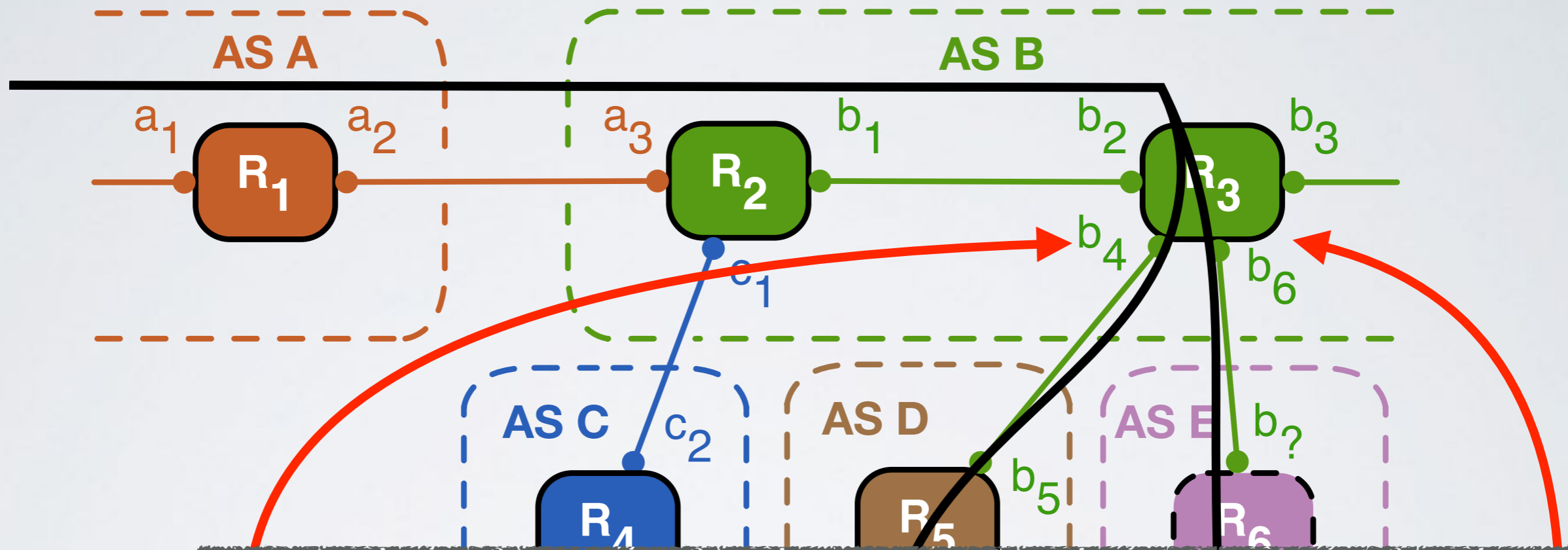
**R<sub>2</sub>**

**R<sub>3</sub> R<sub>5</sub>**

**R<sub>1</sub>**

**R<sub>2</sub>**

**R<sub>3</sub> ?**



**If b<sub>4</sub> and b<sub>6</sub> are not resolved for aliases, and E's router is silent, b<sub>6</sub> might be incorrectly inferred to be neighbor E's router**

Border r...  
features; th...  
that form

# Challenges

IP paths:

Router paths:

$a_3$

$b_1$   $b_4$   $b_2$

$R_2$

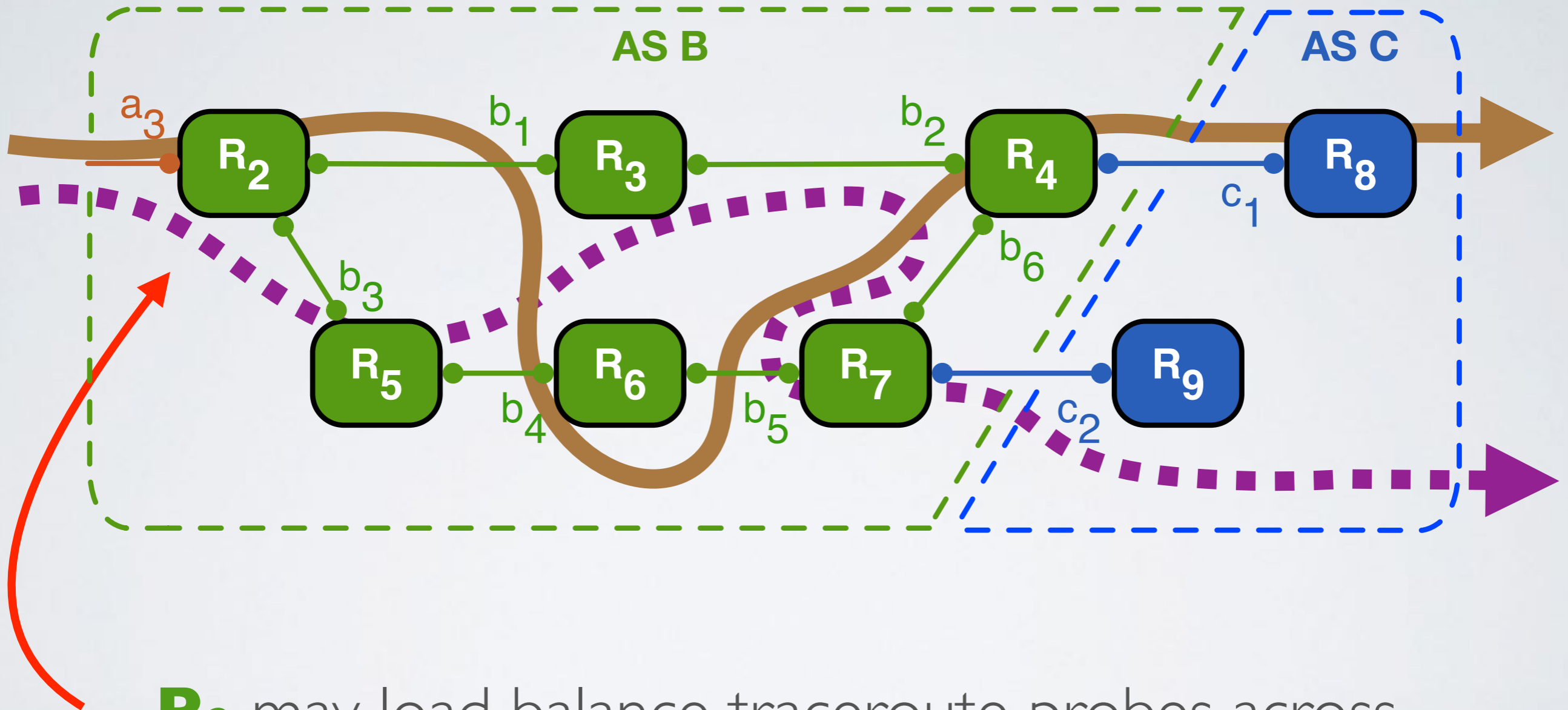
$R_3$   $R_6$   $R_7$

$a_3$

$b_3$   $b_2$   $b_5$

$R_2$

$R_5$   $R_4$   $R_8$



**R<sub>2</sub>** may load balance traceroute probes across topologically diverse paths, resulting in false links.

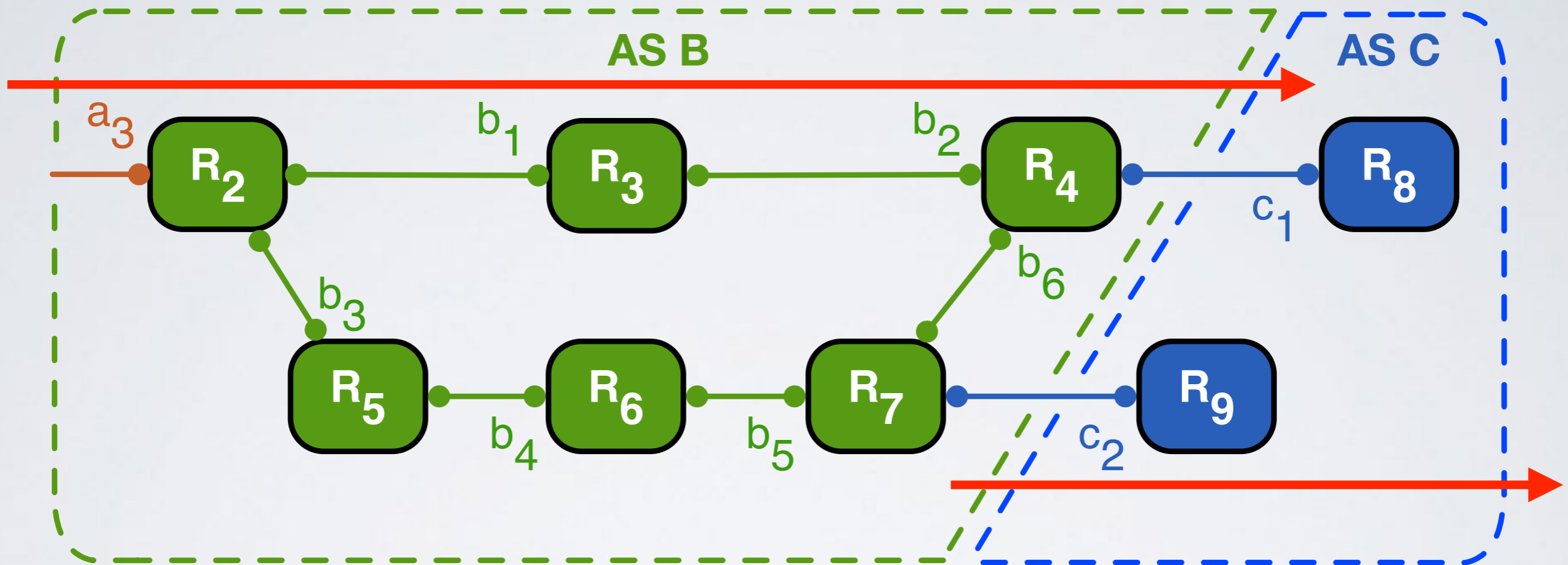
# Challenges

IP paths:

**a<sub>3</sub>** **b<sub>1</sub>** **b<sub>2</sub>** **c<sub>1</sub>** **c<sub>2</sub>**

Router paths:

**R<sub>2</sub>** **R<sub>3</sub>** **R<sub>4</sub>** **R<sub>8</sub>** **R<sub>9</sub>**



**R<sub>2</sub>** may choose a different next hop as a traceroute measurement proceeds

# Additional Challenges

1. **Sibling ASes** may confuse attempts to infer connectivity between organizations
  - sibling information has known false and missing inferences
2. **IXP addresses** may appear inconsistently in paths
  - an IXP and/or member(s) may originate prefix into BGP, or it might not be originated at all
3. **Multiple ASes** may originate a prefix into BGP
  - The more ASes, the more challenging to infer ownership

# Motivation for Border Router Ownership Inference

- **Network Modeling and Resilience**

- Early Internet models considered topology at AS-level, with a [single link between pairs of ASes](#)
- Our work enables the construction of a router-level Interdomain connectivity map

- **Interdomain Congestion**

- [Public policy community](#) has growing interest in identifying persistent congestion on interdomain links
- Greatest measurement challenge is [identifying interdomain links to probe](#), and associating observed evidence of congestion to specific interdomain links

# Related Work

- **Significant work on inferring router aliases:** e.g., Mercator, Ally, Pre-specified timestamps, mrinfo, Discarte, Radargun, MIDAR, APAR + kapar,
- **Significant work inferring AS-level connectivity**
  - [AS traceroute](#) (SIGCOMM 2002 and SIGMETRICS 2003); adjust IP-AS mappings with colocated traceroute and BGP
  - Where the [Sidewalk](#) ends (CoNEXT 2009): goal of accurately inferring AS-level connectivity
  - [Topology dualism](#) (PAM 2010): evaluation of heuristics

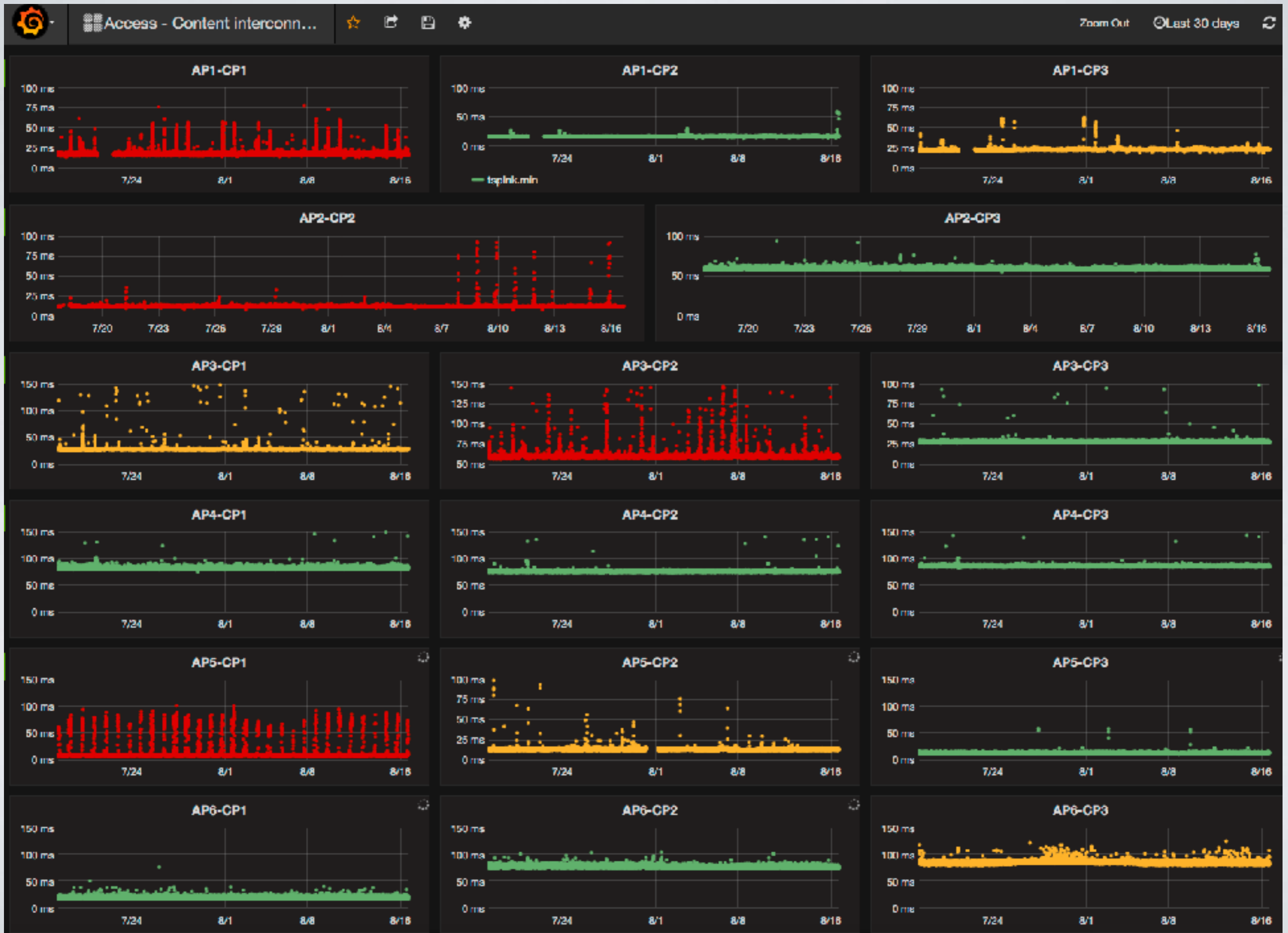
# Our Contributions

1. **Scalable, accurate method** for inferring interdomain boundaries for the network hosting the VP
2. **Efficient system** to allow deployment on resource-limited devices (e.g. SamKnows)
3. **Validation using ground truth** from four network operators and IXP databases
4. **Analysis of interdomain connectivity** of a large access ISP (Comcast): **45 links w/ Level3, Jan 2016**
5. **We release our data collection and analysis system** as part of scamper, with man pages

<https://www.caida.org/tools/measurement/scamper/>



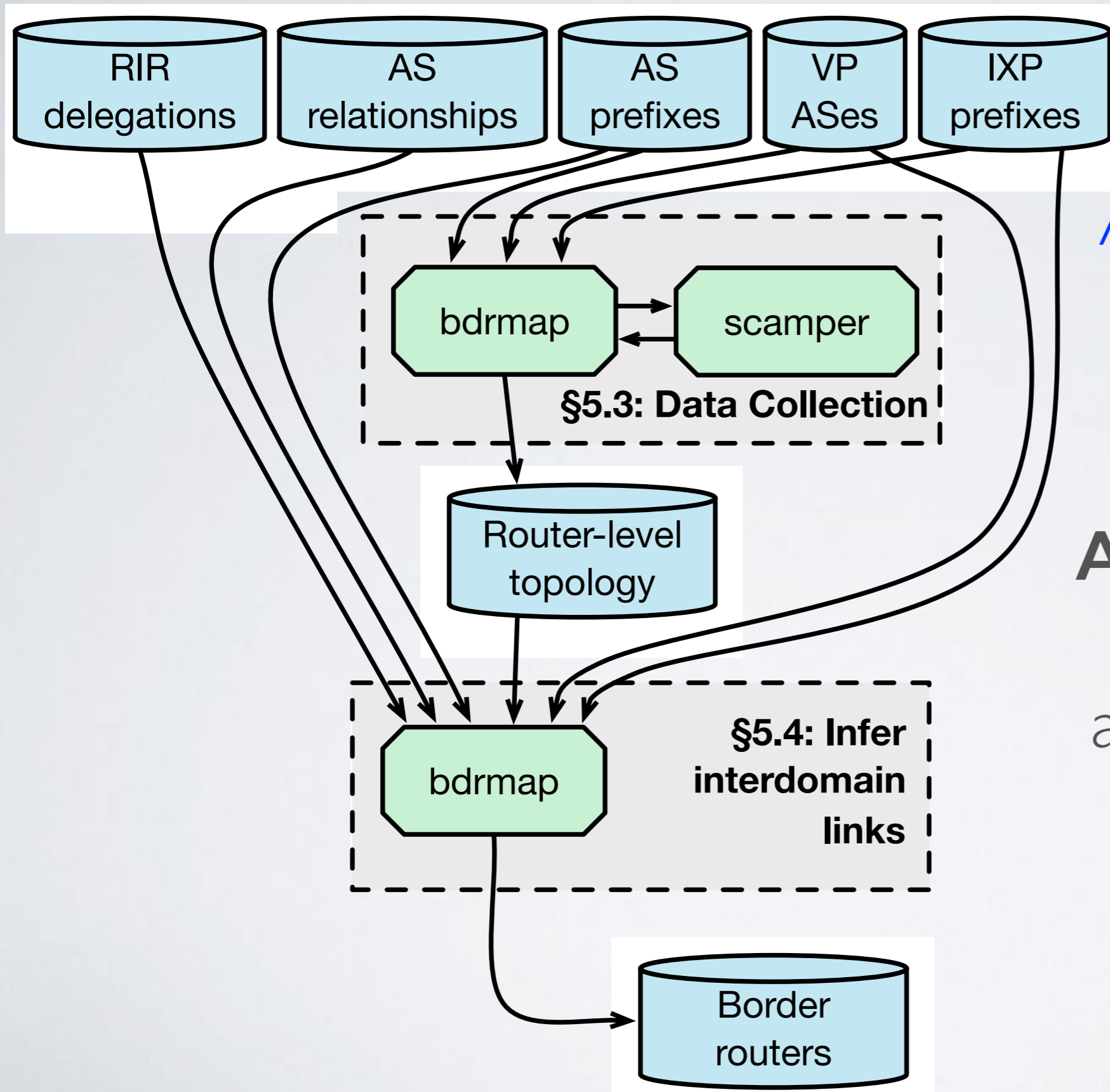
# Select Interconnections from Top 3 Content to Top 6 Access



# Roadmap

- bdrmap
  - Input data
  - Data collection
  - Analysis: overview of heuristics
- Validation, coverage of BGP-observed links
- Systems challenges and solutions
- Interconnection Insights

# Approach to Border Mapping (I)



Assemble Input Data

**RIR delegations:**

RIR statistics files

**AS relationships and**

**prefixes:** BGP data

and as-rank algorithm

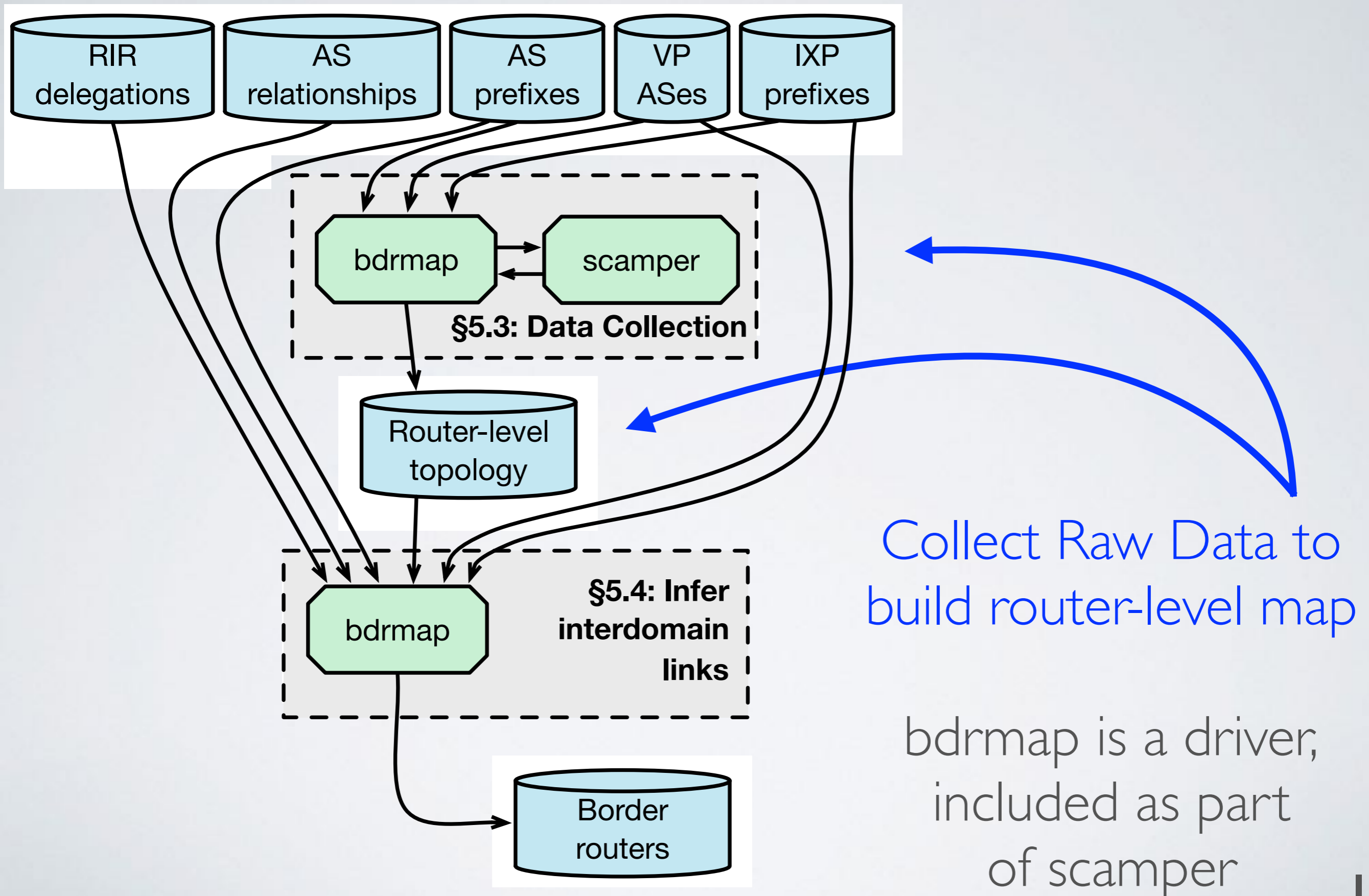
**IXP prefixes:**

PeeringDB and PCH

**VP ASes:**

manual oversight

# Approach to Border Mapping (2)



# Data Collection

- Parts of our data collection process are similar to [Rocketfuel](#)
  - [targeted traceroutes](#), informed by public BGP data
  - [alias resolution](#) to infer router-level topology
- **Rocketfuel** maps topologies of networks from the [outside](#)
- **bdrmap** maps interdomain topologies from the [inside](#)
- bdrmap data collection time depends on [diameter and complexity](#) of hosting network;
  - typically 12-48 hours at 100pps

# Data Collection

- **Generate list of address blocks from BGP data**
- **Gather traceroutes**
  - we focus on first-hop interdomain links, so use a **stop-set** (DoubleTree) to halt traceroutes from probing beyond hops in a neighbor network we have seen before
  - bdrmap tries up to five different addresses per block, to avoid interpreting third-party addresses as neighbors

# Data Collection

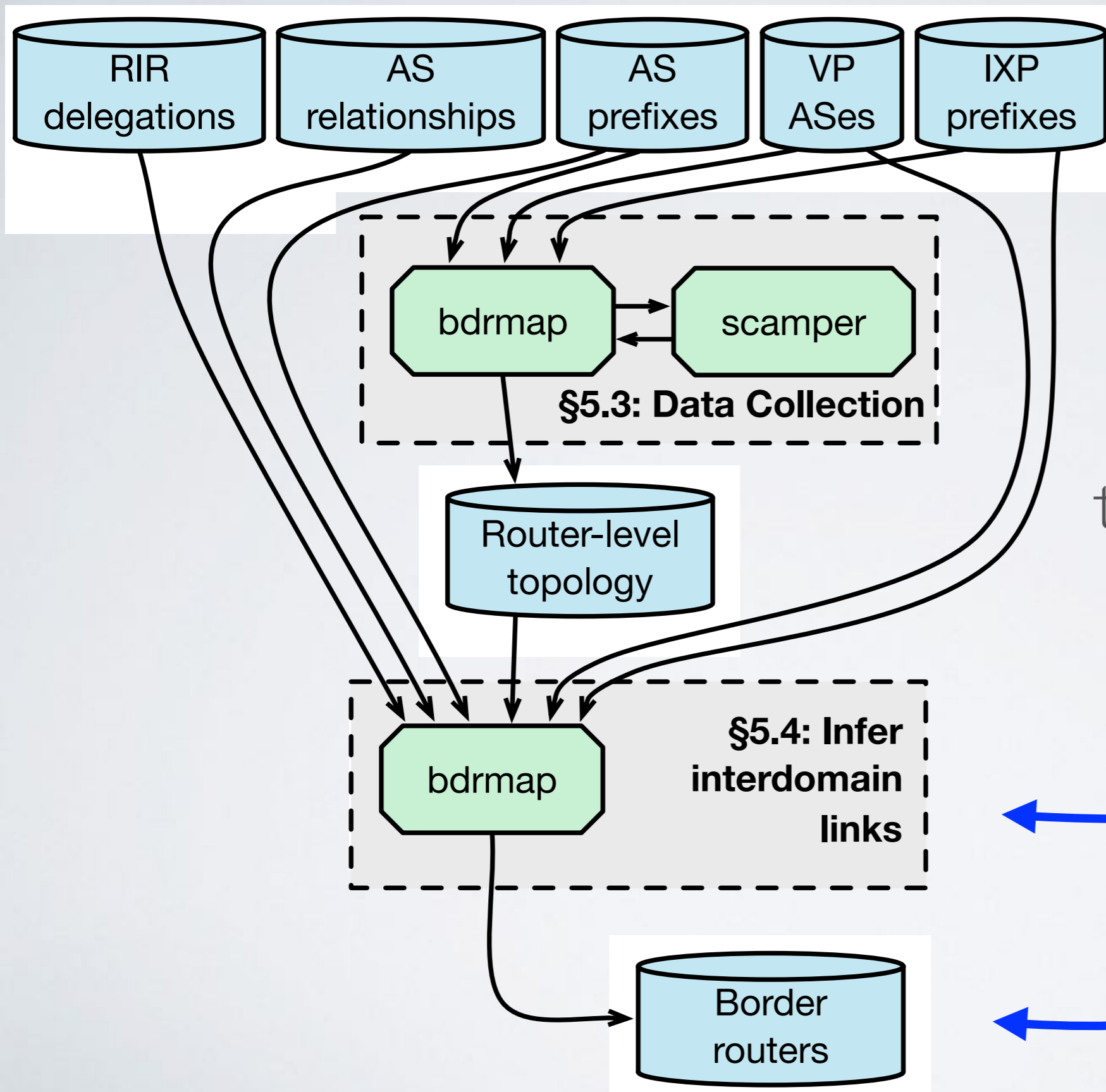
- **Perform Alias Resolution**

- We use the [Ally](#), [Mercator](#), and [Prefixscan](#) alias resolution techniques as we collect traceroutes to collect raw data to support building a router-level graph
- We use MIDAR's [Monotonic Bounds Test](#) where we use IP-ID based techniques, as well as repeated tests, to reduce the chance we infer false aliases

- **Build Router Level Graph**

- Focus on interfaces observed in ICMP TTL-expired messages; the source address on an ICMP echo response could be on any of the interfaces on the router

# Approach to Border Mapping (3)



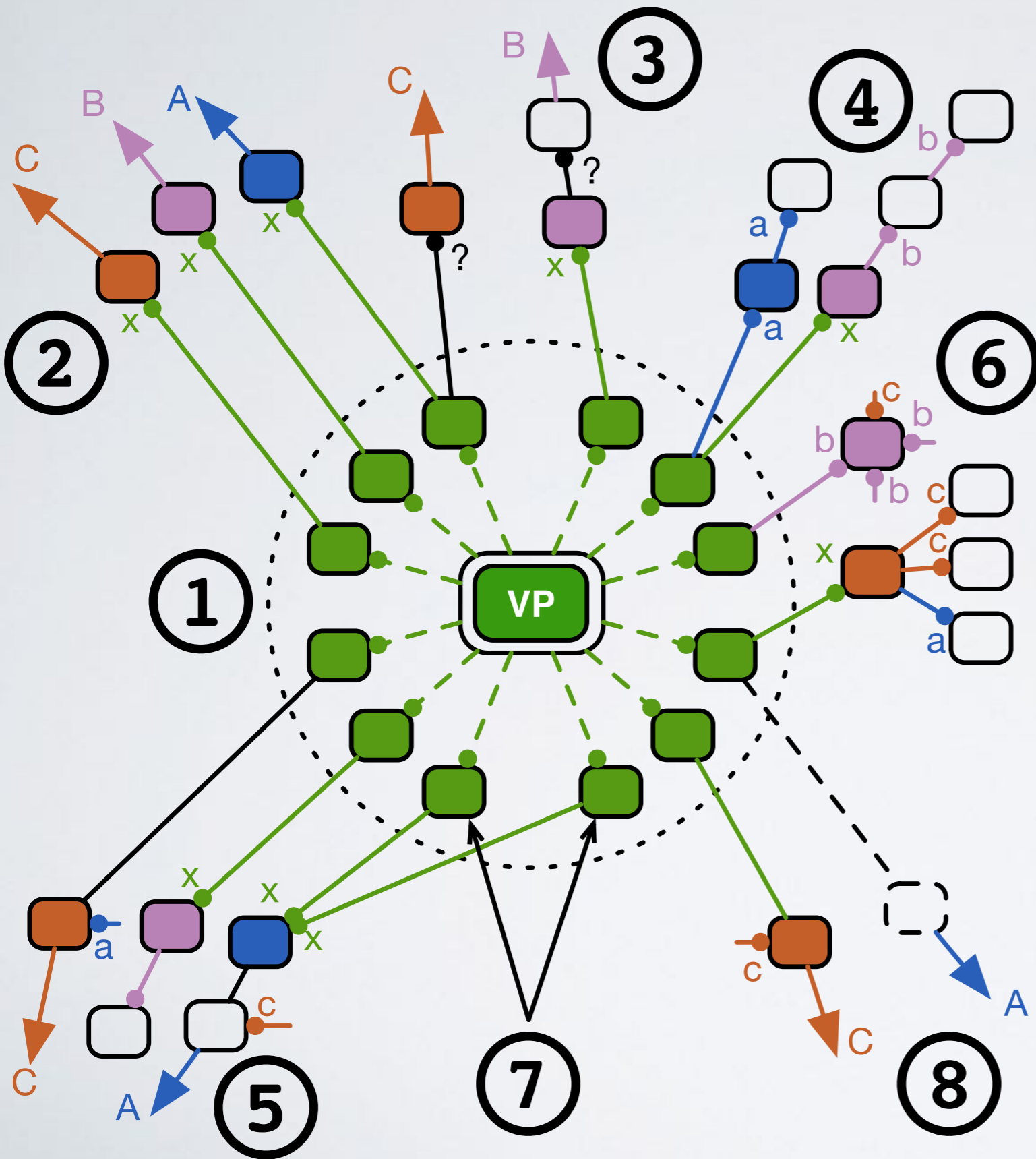
Infer Border Routers

bdrmap analyses raw topology data to infer border routers





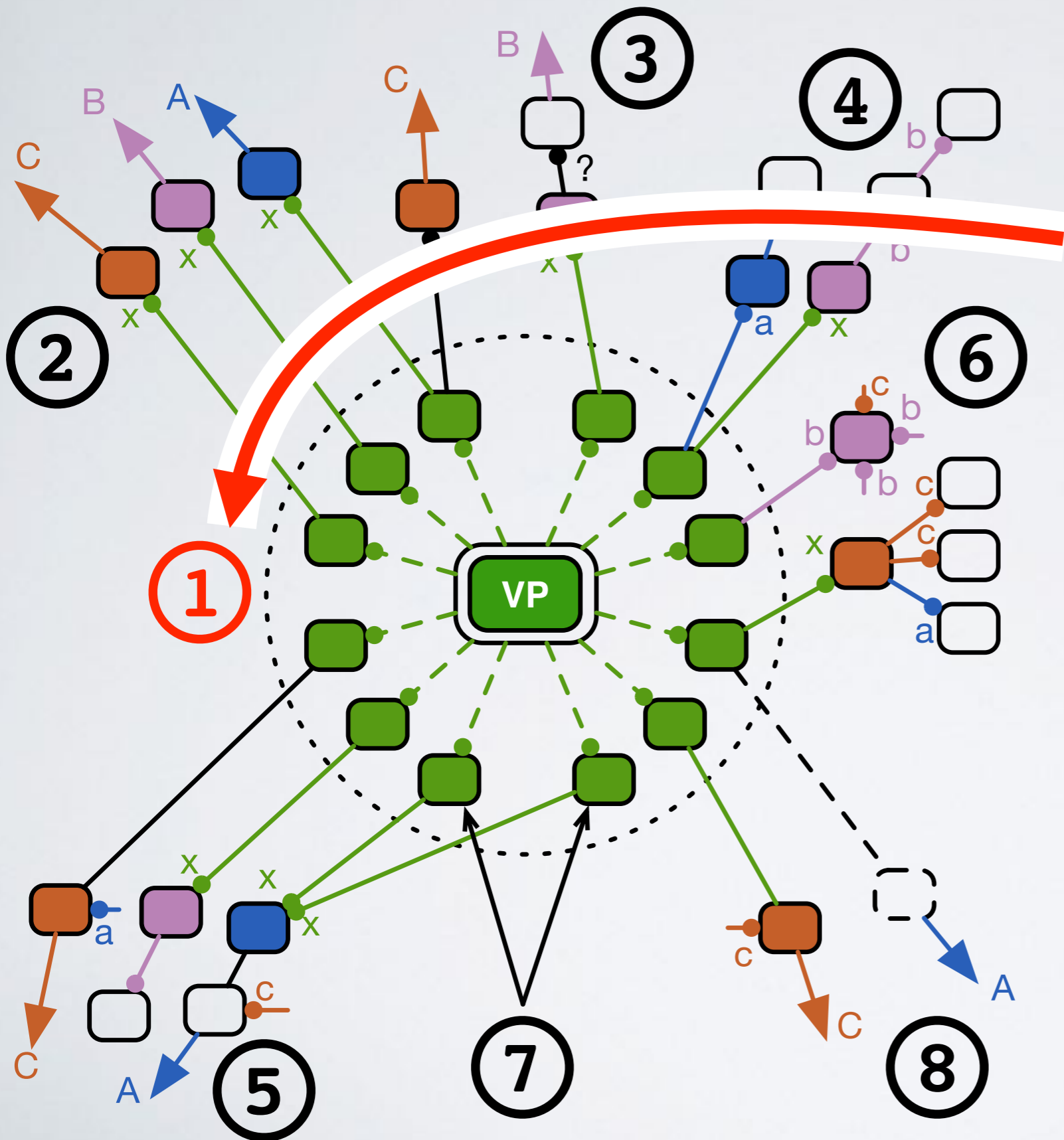
# Heuristic Overview



Set of heuristics that reverse-engineer operator and router behaviors

Applied in the order presented based on constraints available

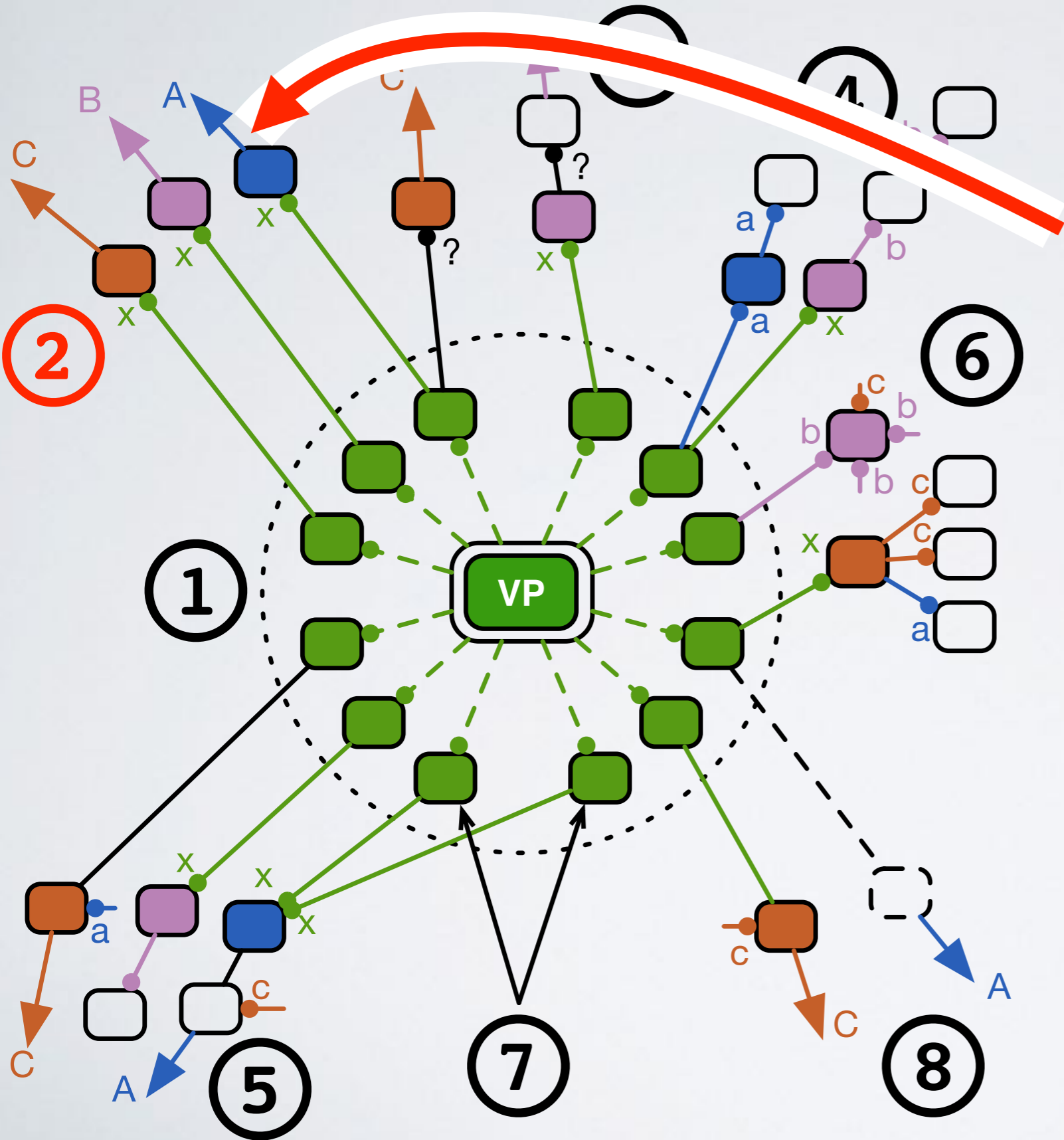
# Heuristic Overview



Infer if the router is operated by the **network hosting the VP.**

Other routers must be operated by a neighbor AS

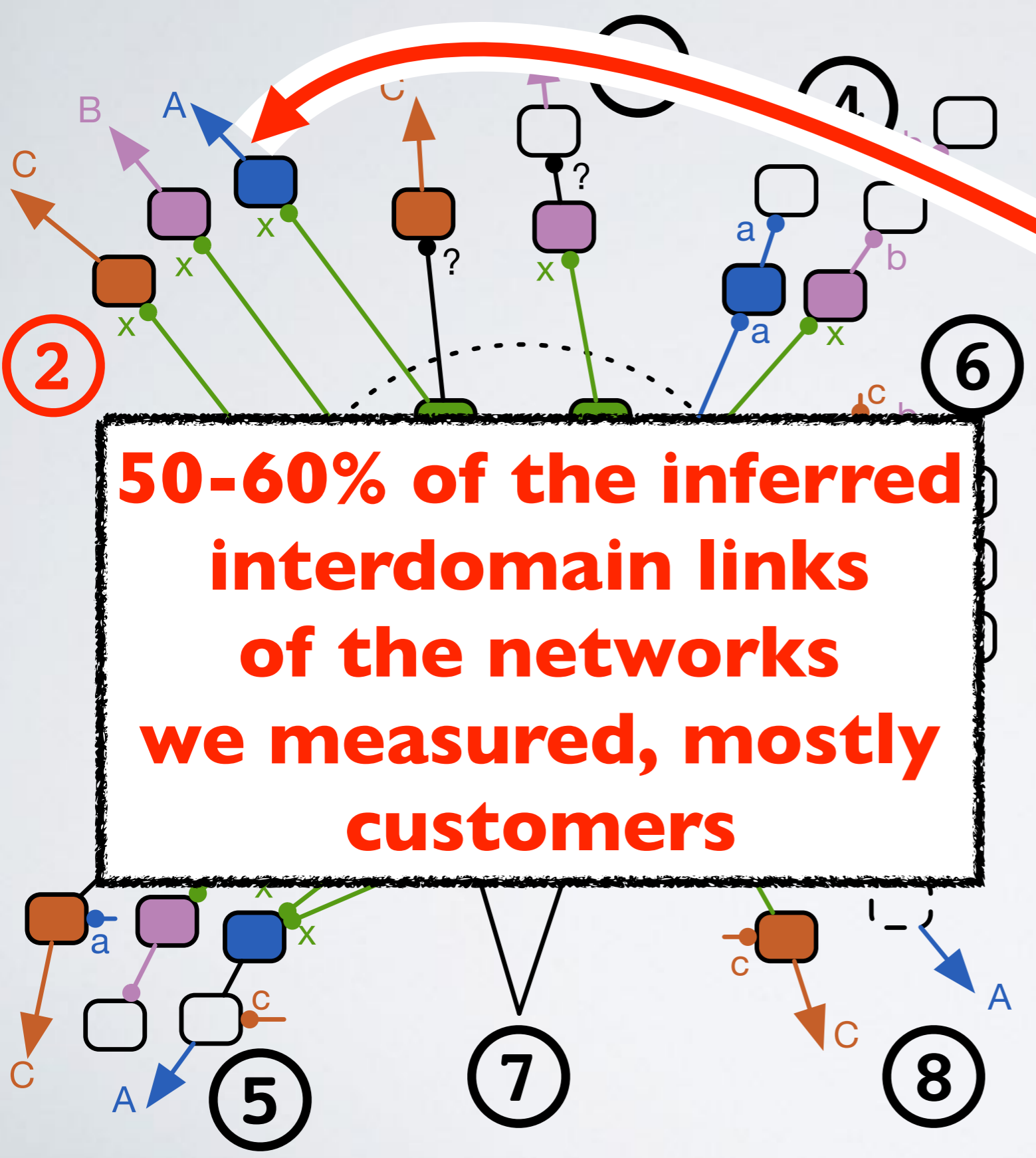
# Heuristic Overview



Sometimes we do not observe other topology after a neighbor router.

We can only reason about ownership using the **destination ASes probed** where we observed the router

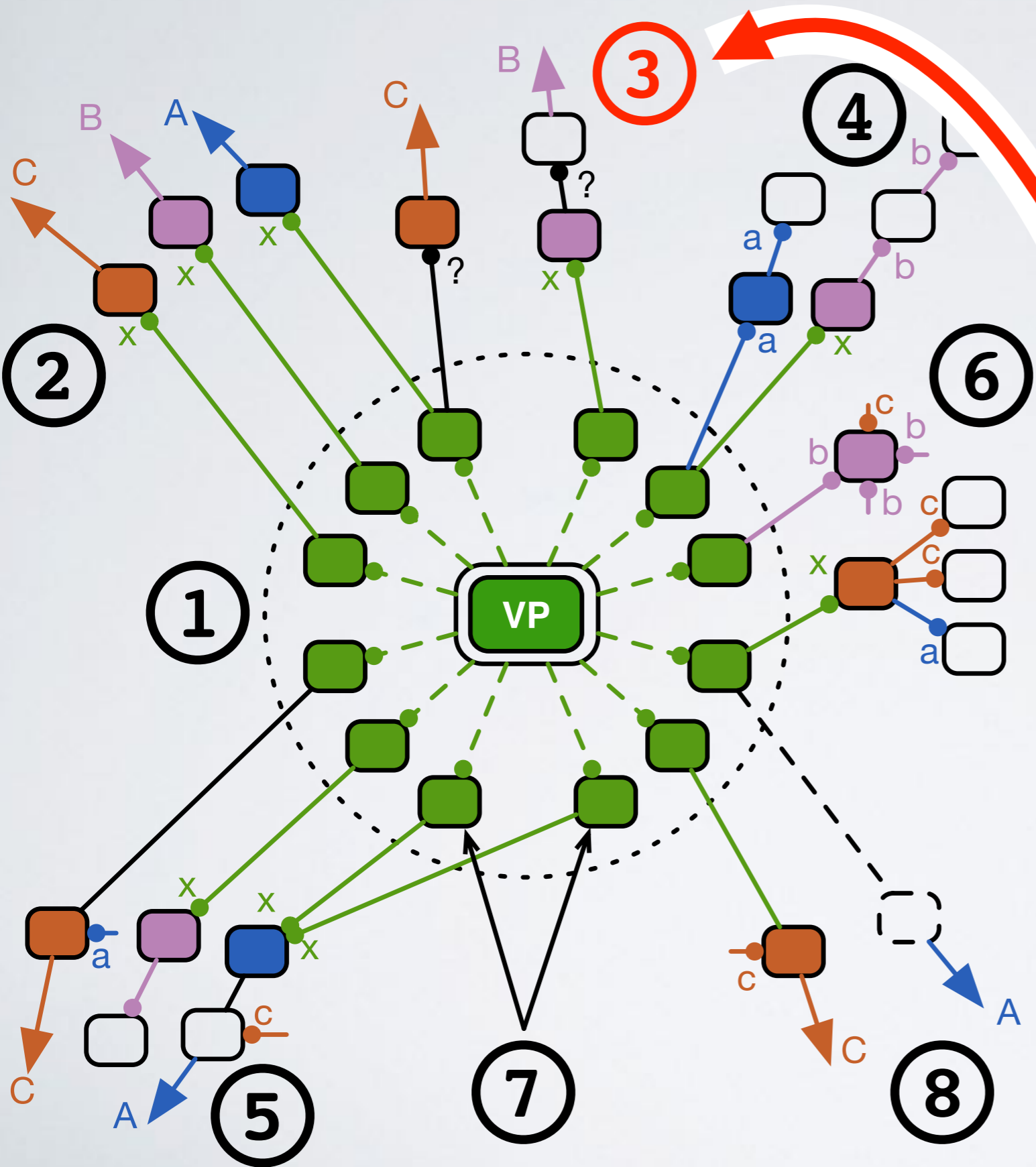
# Heuristic Overview



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# Heuristic Overview



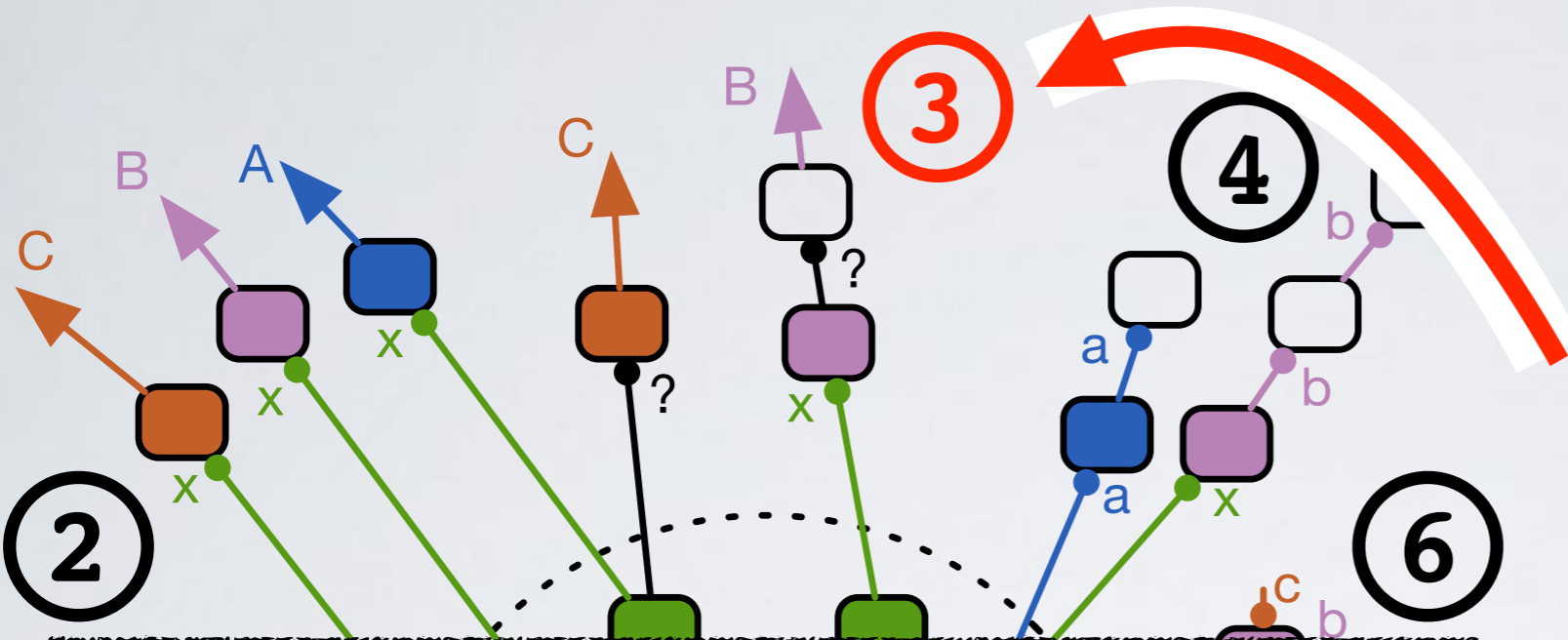
Some routers only respond with an IP address **not routed in BGP.**

We can only reason about ownership using subsequent IPs in the path that are routed, or the destination ASes probed for paths where we observed the router

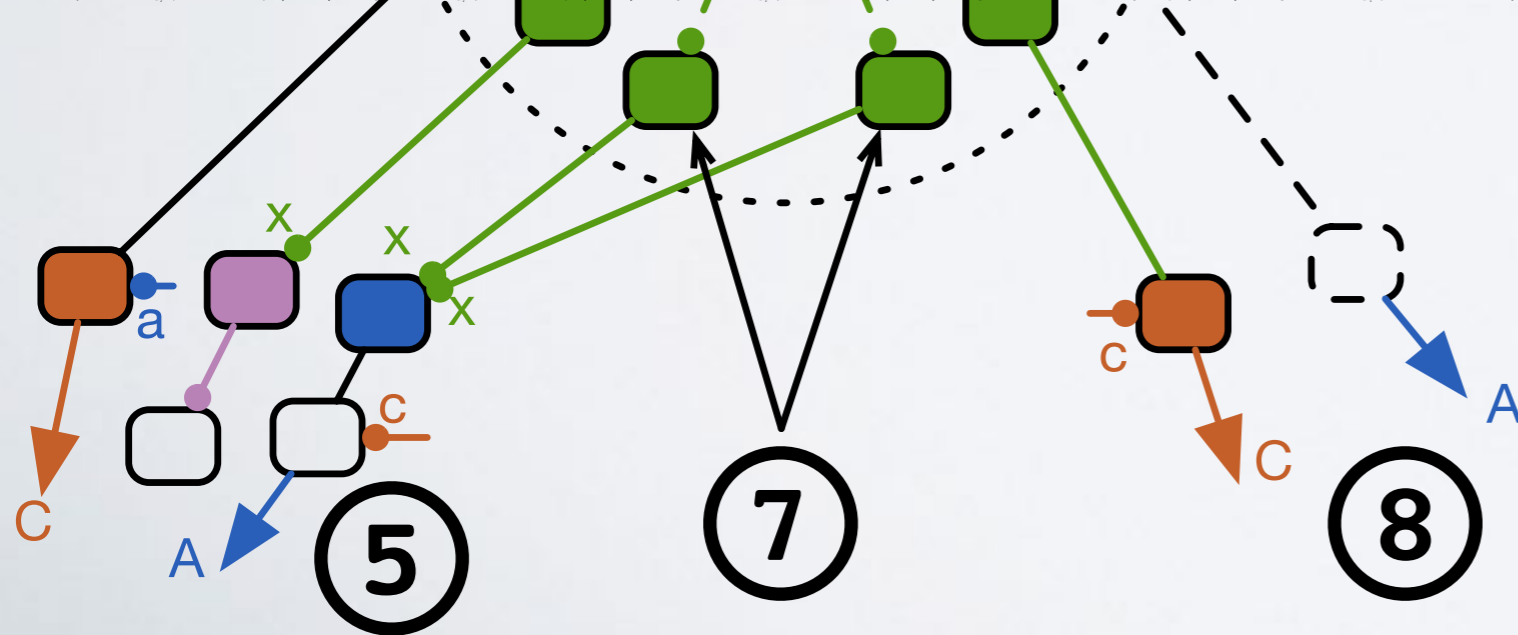
# Heuristic Overview

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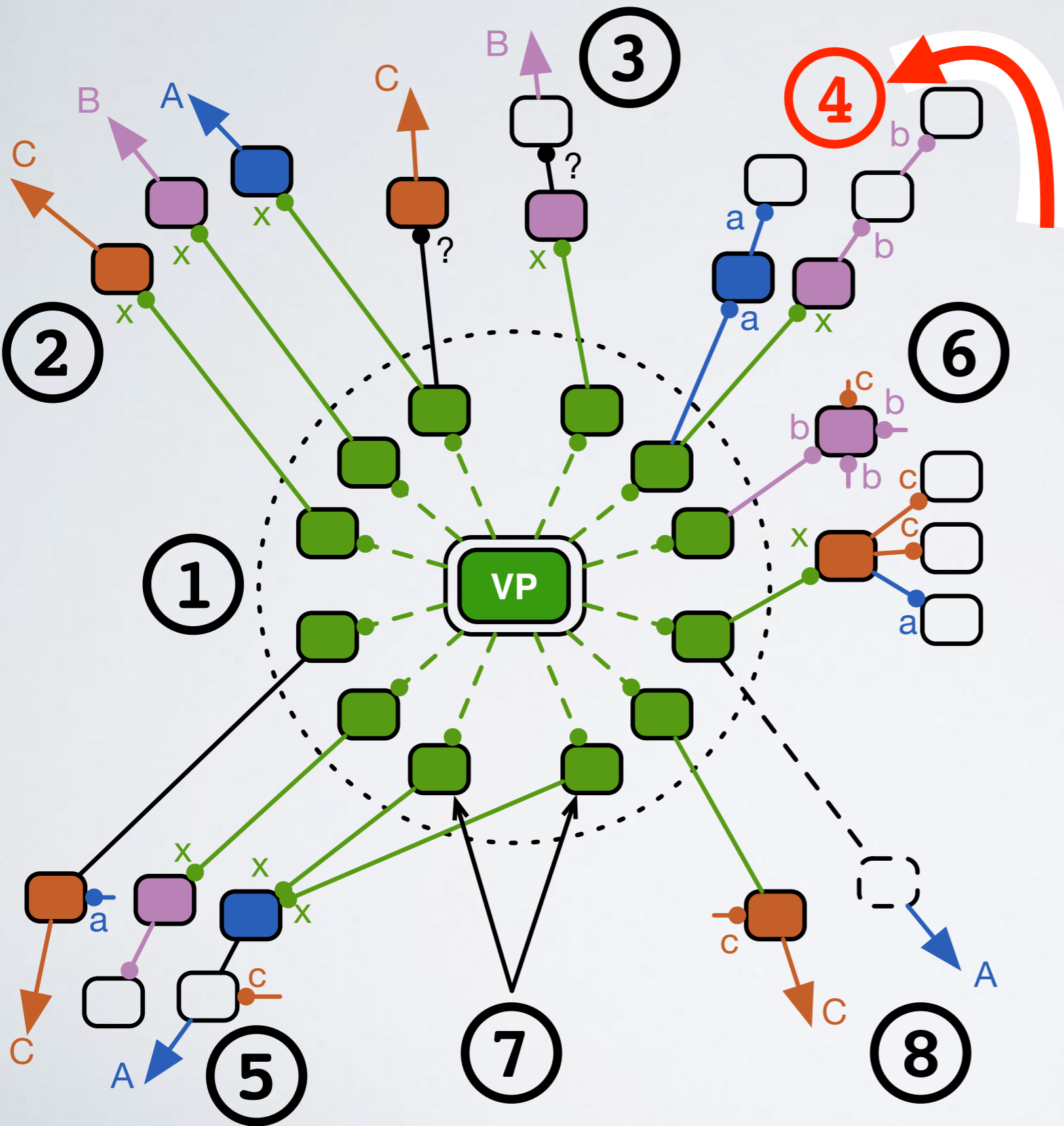
We can only reason about ownership using subsequent IPs in the path that are routed, or the destination ASes probed for paths where we observed the router



**1-5% of the interdomain links of the networks we measured**



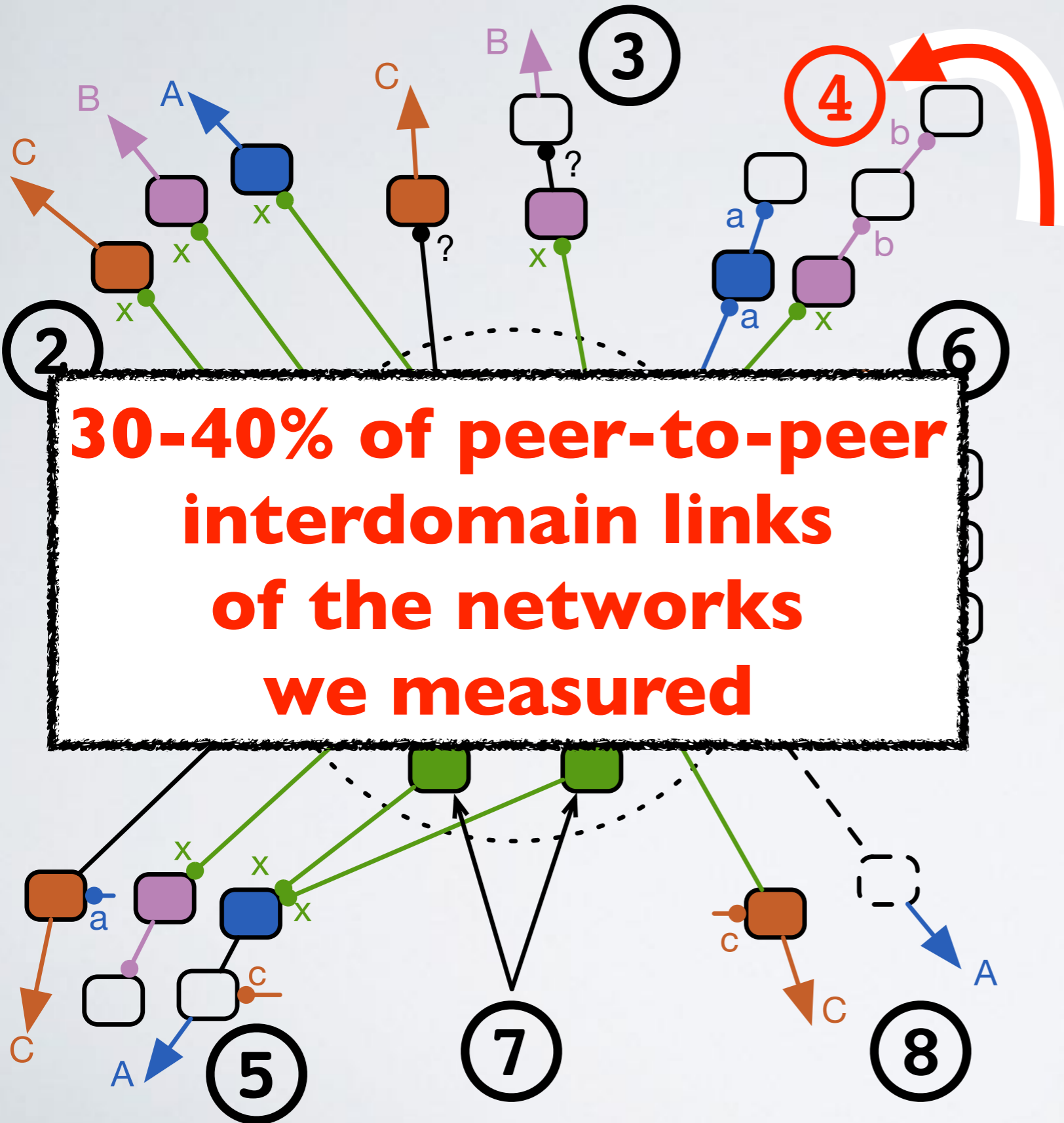
# Heuristic Overview



Reason about ownership using IP-AS mappings where the **same AS on two consecutive routers**

We are unlikely to observe two consecutive third-party IP addresses in a path

# Heuristic Overview

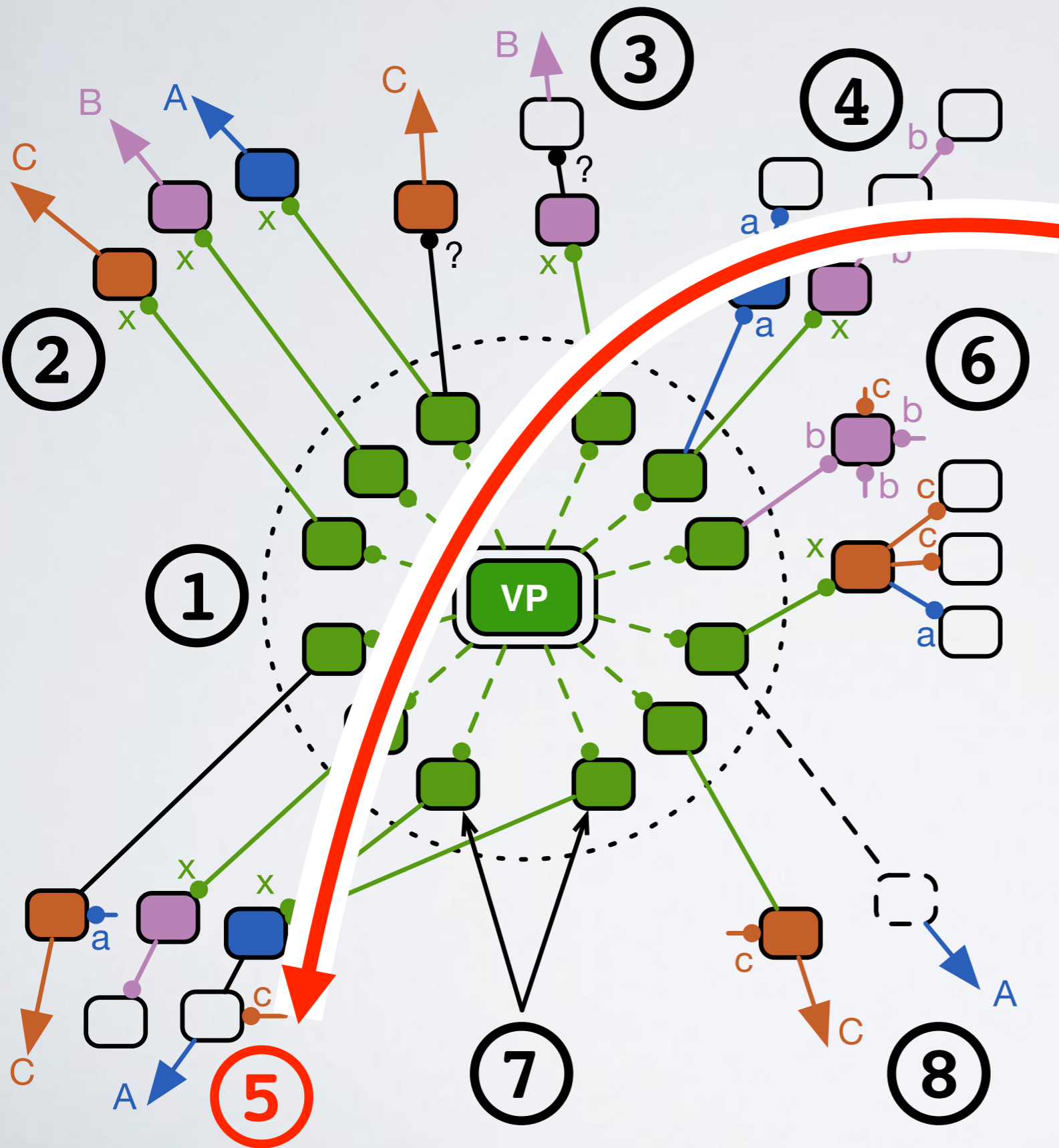


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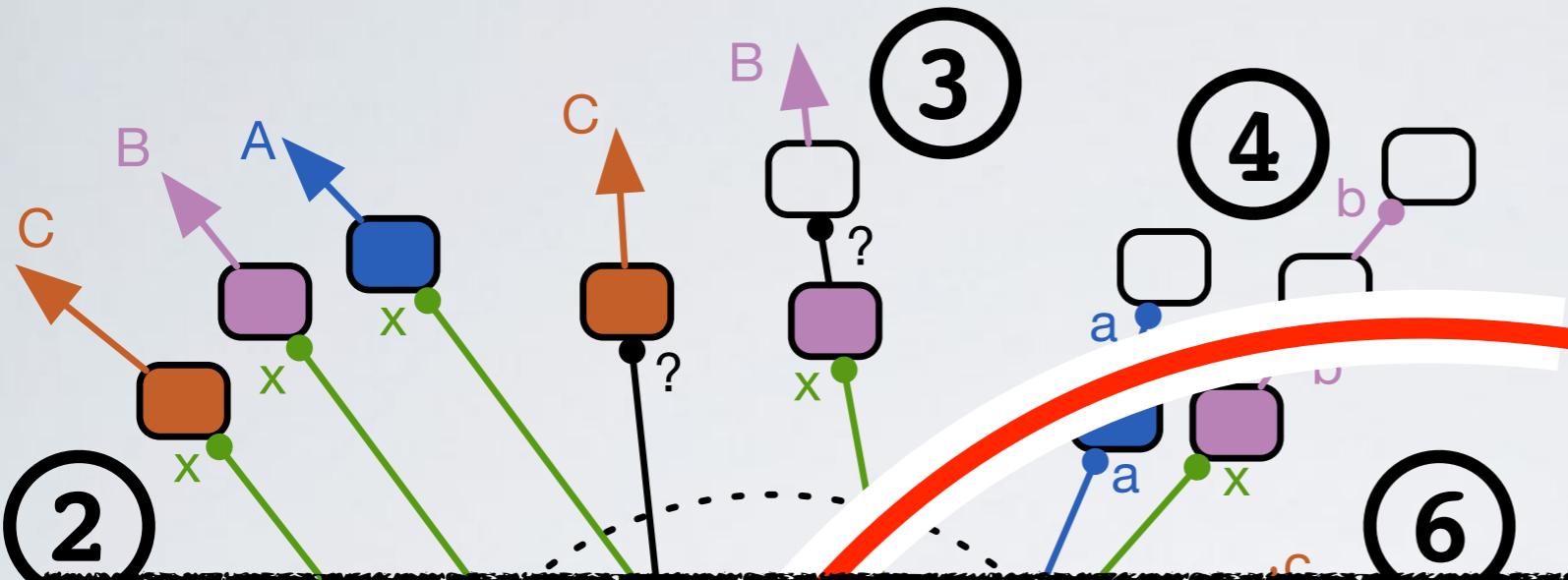
# Heuristic Overview



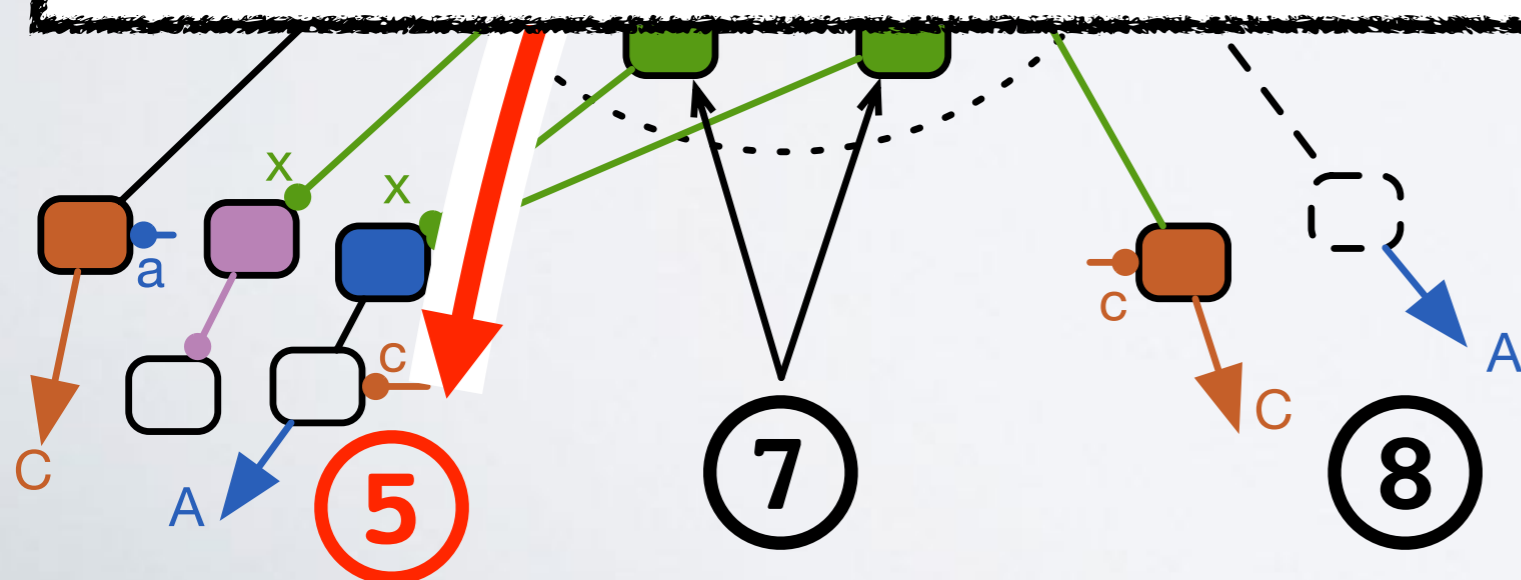
Reason about ownership **using AS relationships** and IP-AS mappings.

We infer owners of routers that responded using a third-party address, as well as known peers and customers

# Heuristic Overview



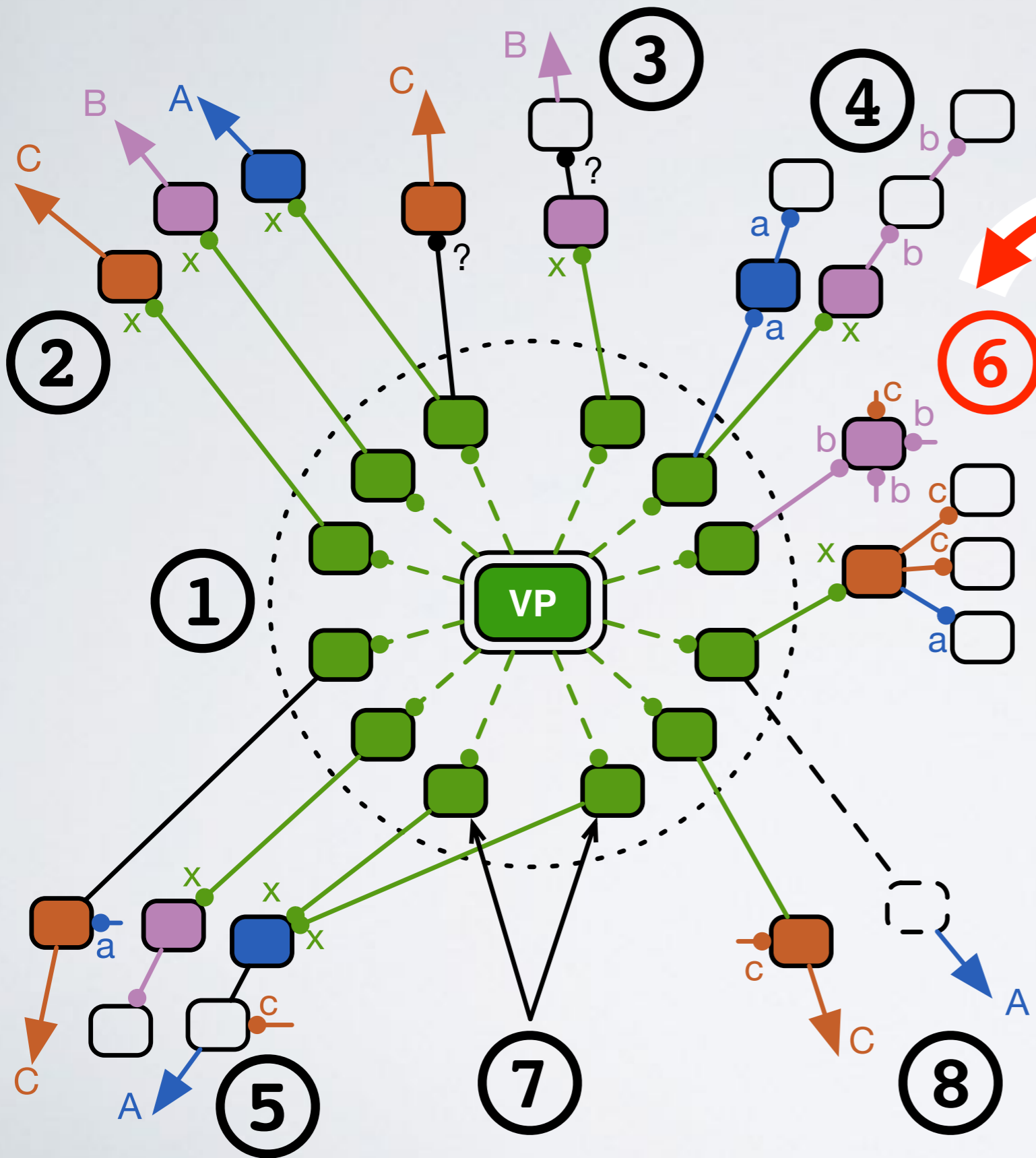
**For inferred interdomain links:  
2-3% third-party  
20-30% known relationship**



Reason about ownership **using AS relationships** and IP-AS mappings.

We infer owners of routers that responded using a third-party address, as well as known peers and customers

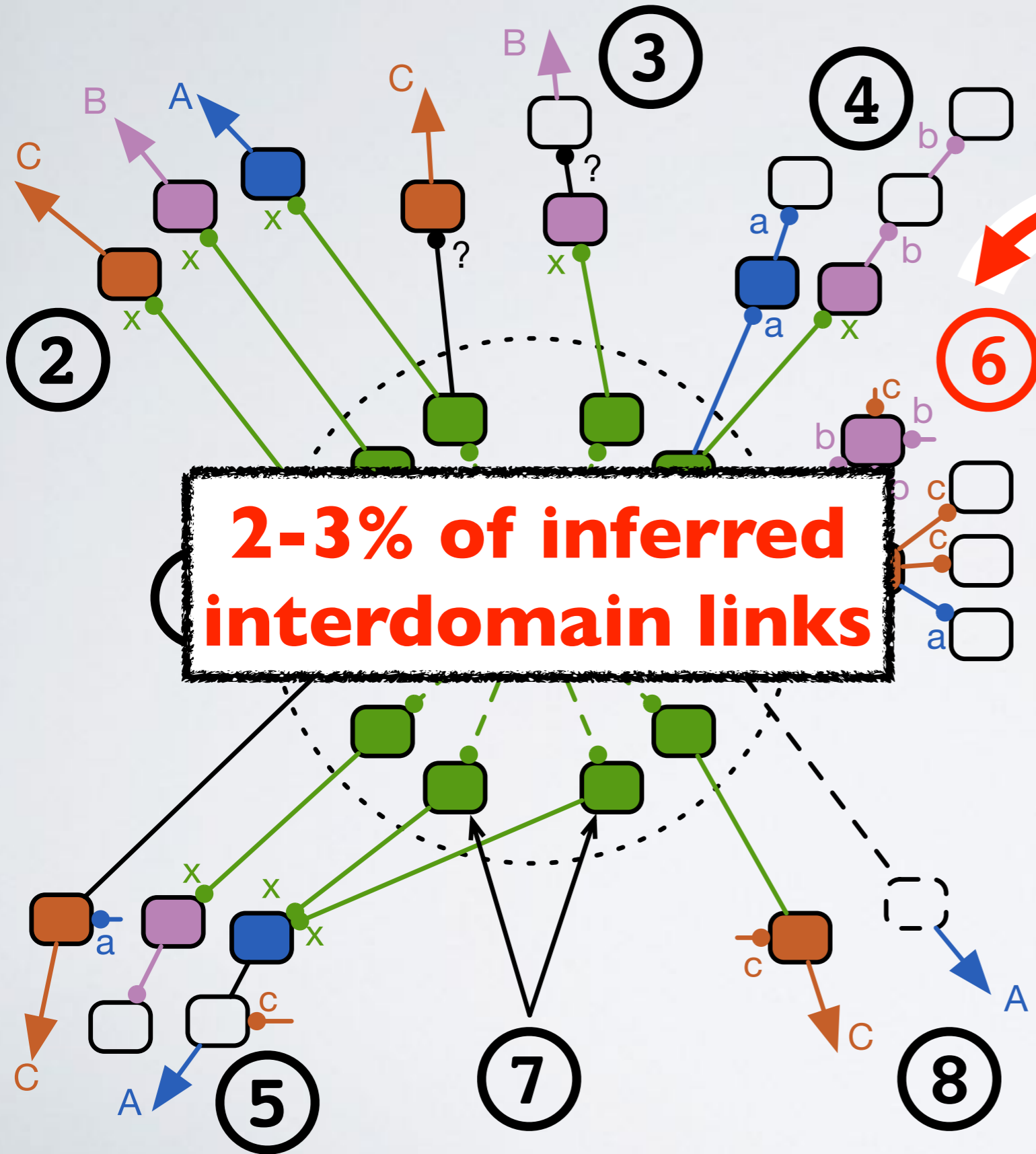
# Heuristic Overview



Reason about ownership using IP-AS mappings.

We have **exhausted better constraints**

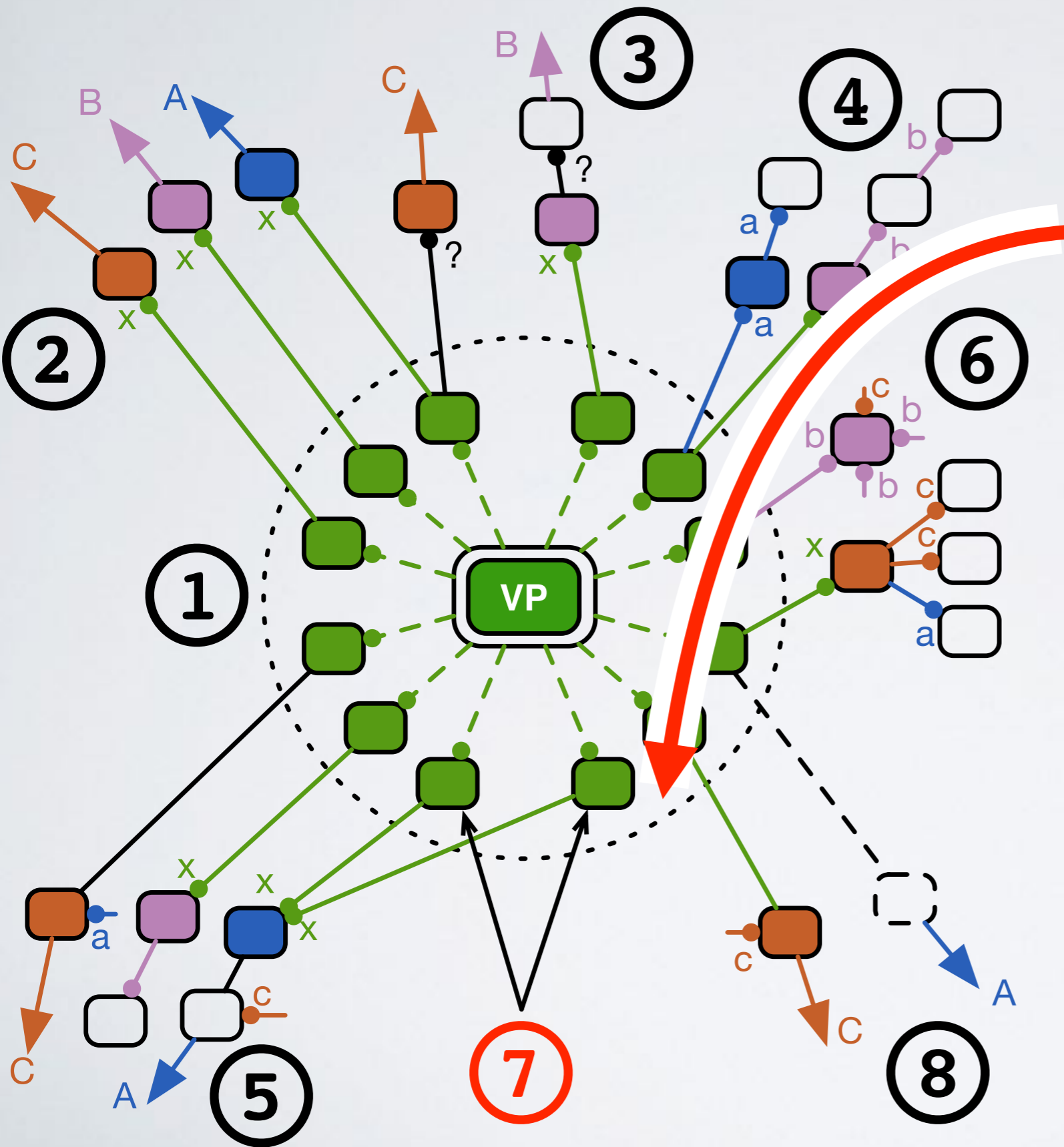
# Heuristic Overview



Reason about ownership using IP-AS mappings.

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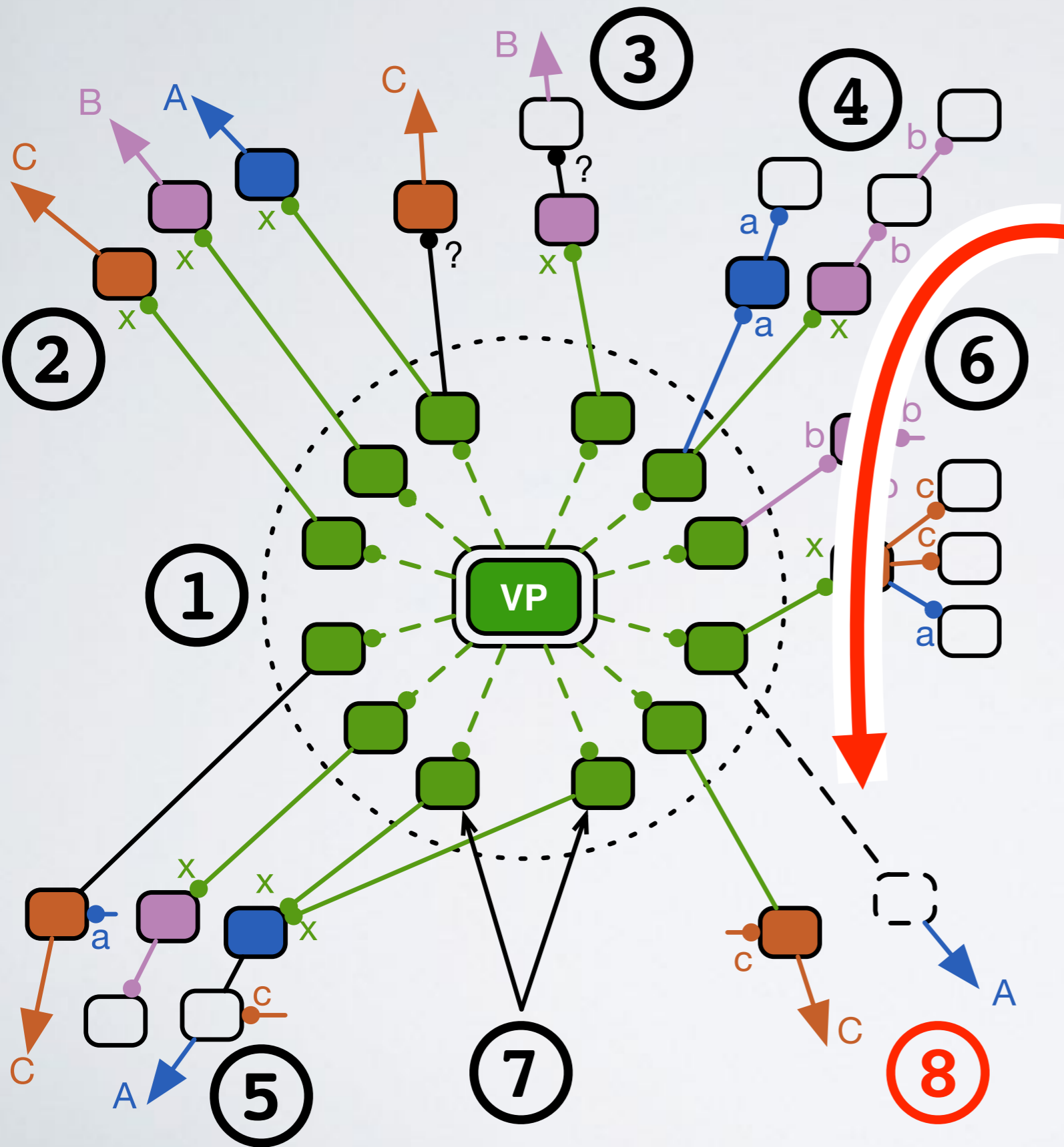
# Heuristic Overview



**Infer additional aliases** for routers operated by the network hosting the VP

A single neighbor router is likely connected to a single VP router with a point-to-point link

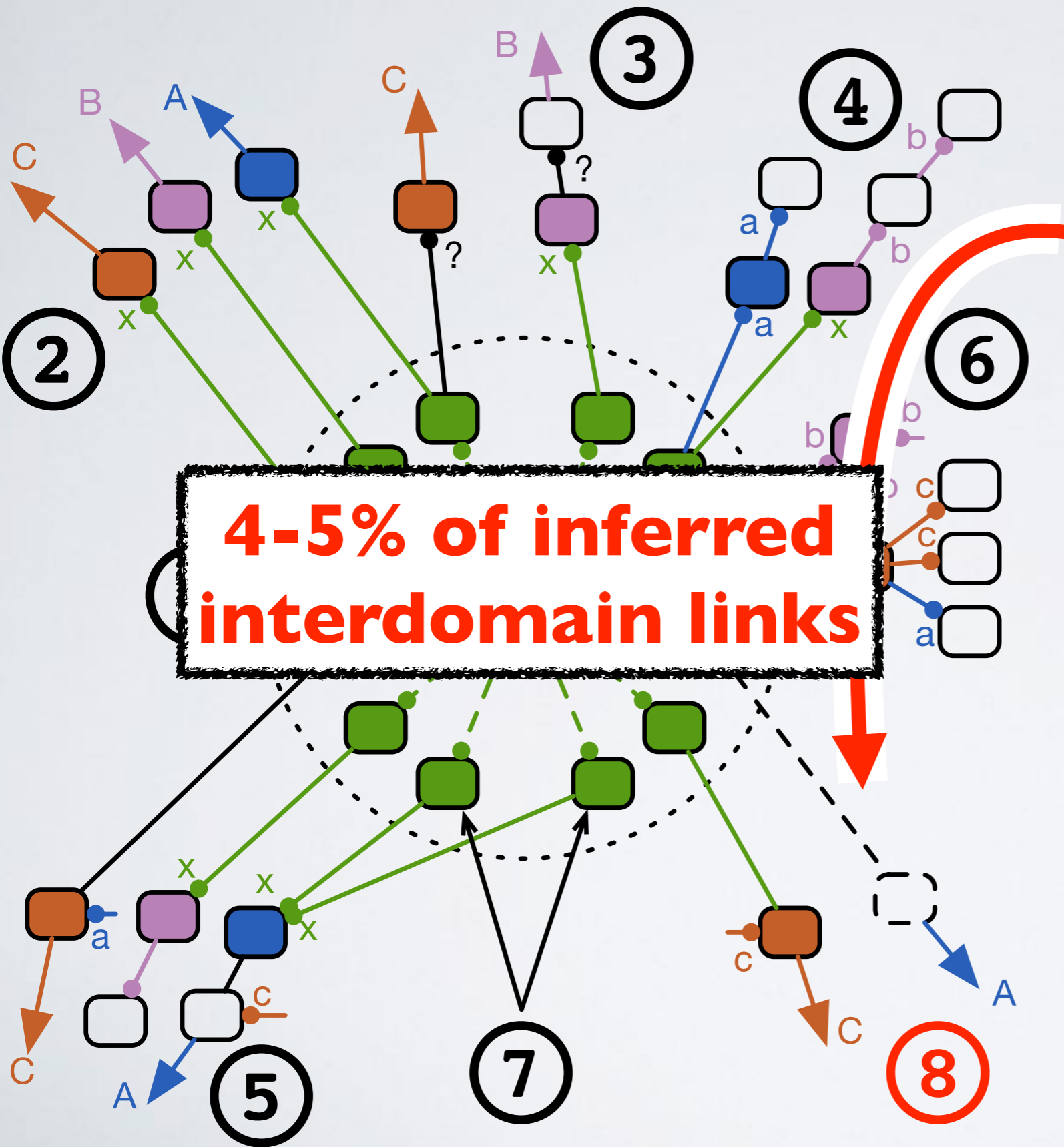
# Heuristic Overview



Infer presence of **silent neighbor routers**, and owners of routers that responded without ICMP time exceeded messages.

To avoid false link inferences, we only infer presence of a neighbor when we know link exists through BGP

# Heuristic Overview



Infer presence of **silent neighbor routers**, and owners of routers that responded without ICMP time exceeded messages.

To avoid false link inferences, we only infer presence of a neighbor when we know link exists through BGP

# Coverage + Validation

- Overall, 92-97% coverage of VP-network links in BGP
- We accurately find additional VP-network links not in BGP
- **Validation:** contacted 10 networks, received validation for 4
  - R&E network: 131 of 136 links correct (96.3%)
  - Large access network: 97.0% - 98.9% correct, depend on VP
  - Tier-1 network: 2584 of 2650 links correct (97.5%)
  - Small access network: 283 of 293 links (96.6%)

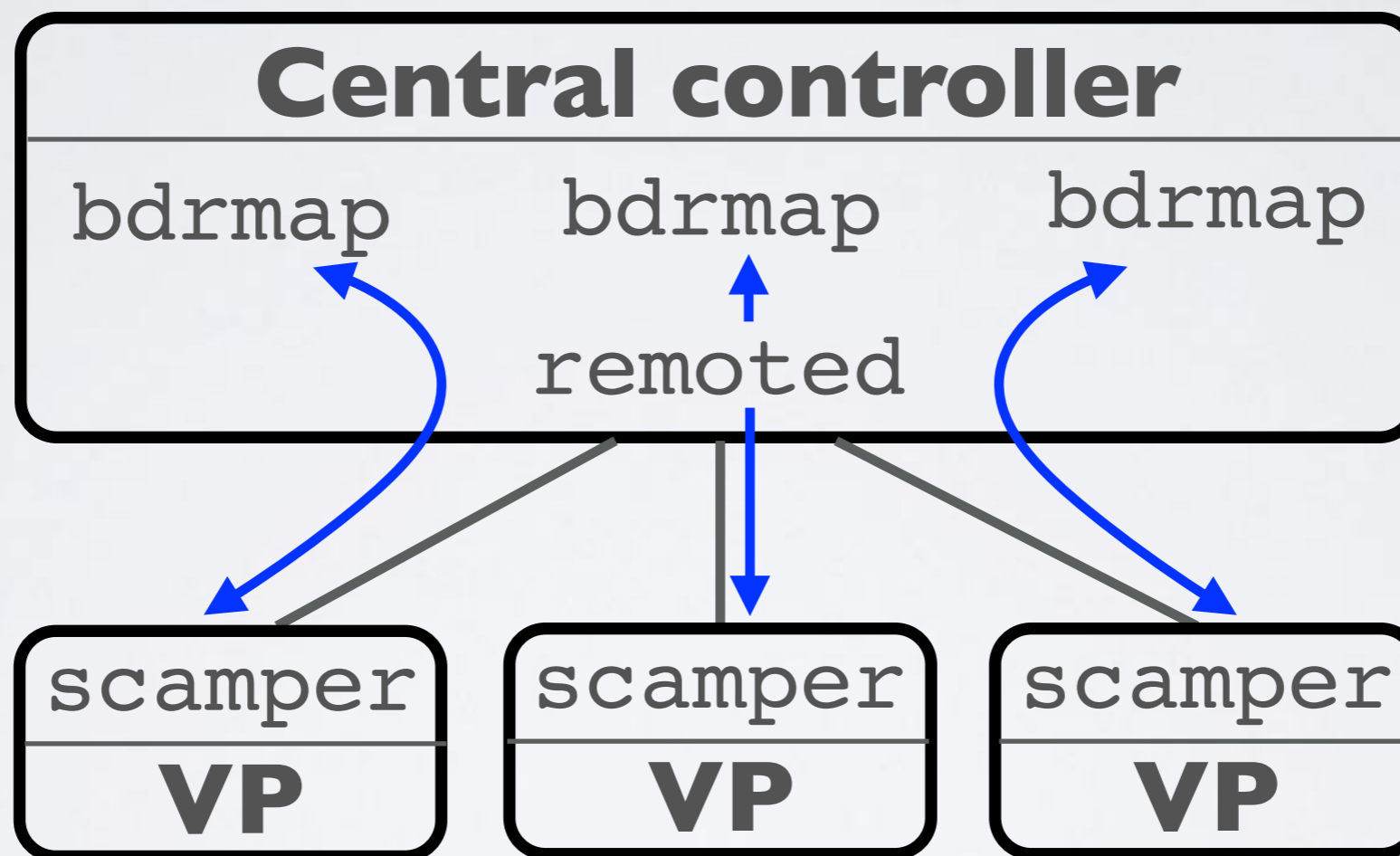


# Limitations

- bdrmap **depends on observing topology at interconnection** points to assemble useful constraints
  - not always possible as traceroute may observe other paths
- Still restricted by limitations of what is possible with traceroute
- Alias resolution techniques are not always able to map IP addresses to the same underlying router

# Using low-resource VPs

We extended scamper to be [remote controlled](#).  
Algorithm state and collected data can be kept off the device.



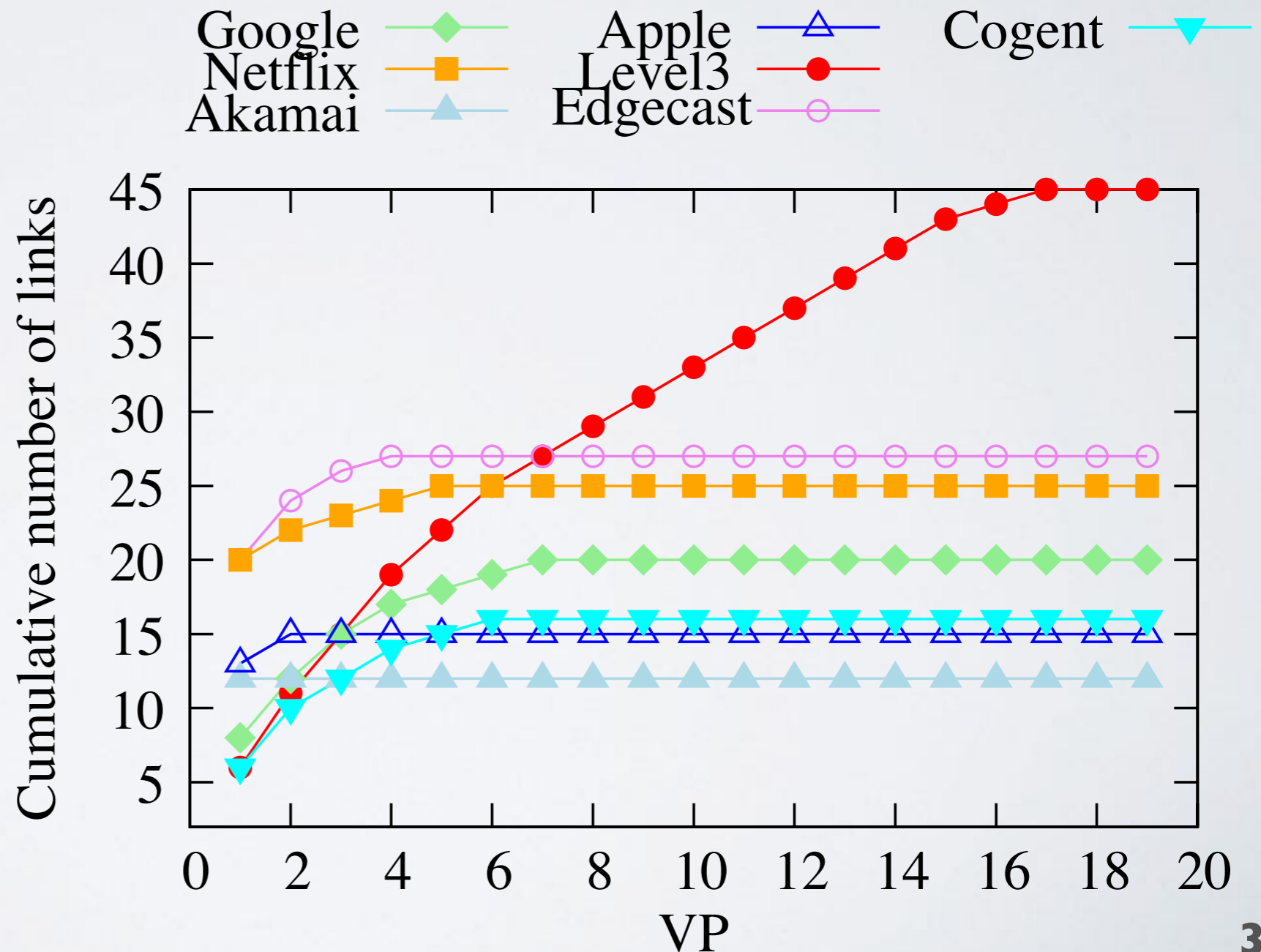
SamKnows / BISmark: 450Mhz MIPS CPU,  
64-128MB RAM, 16MB flash storage

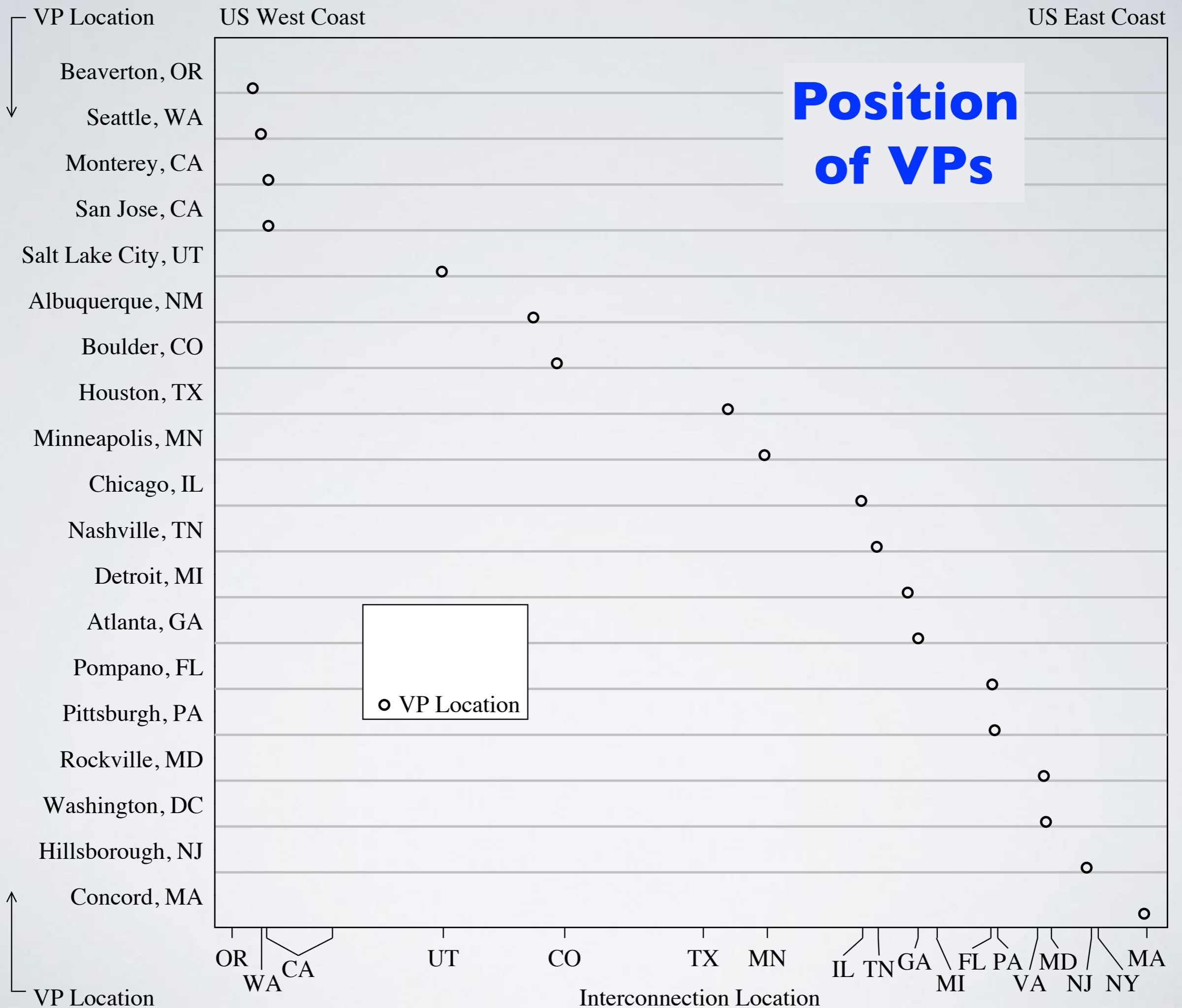
# Interconnection Insights

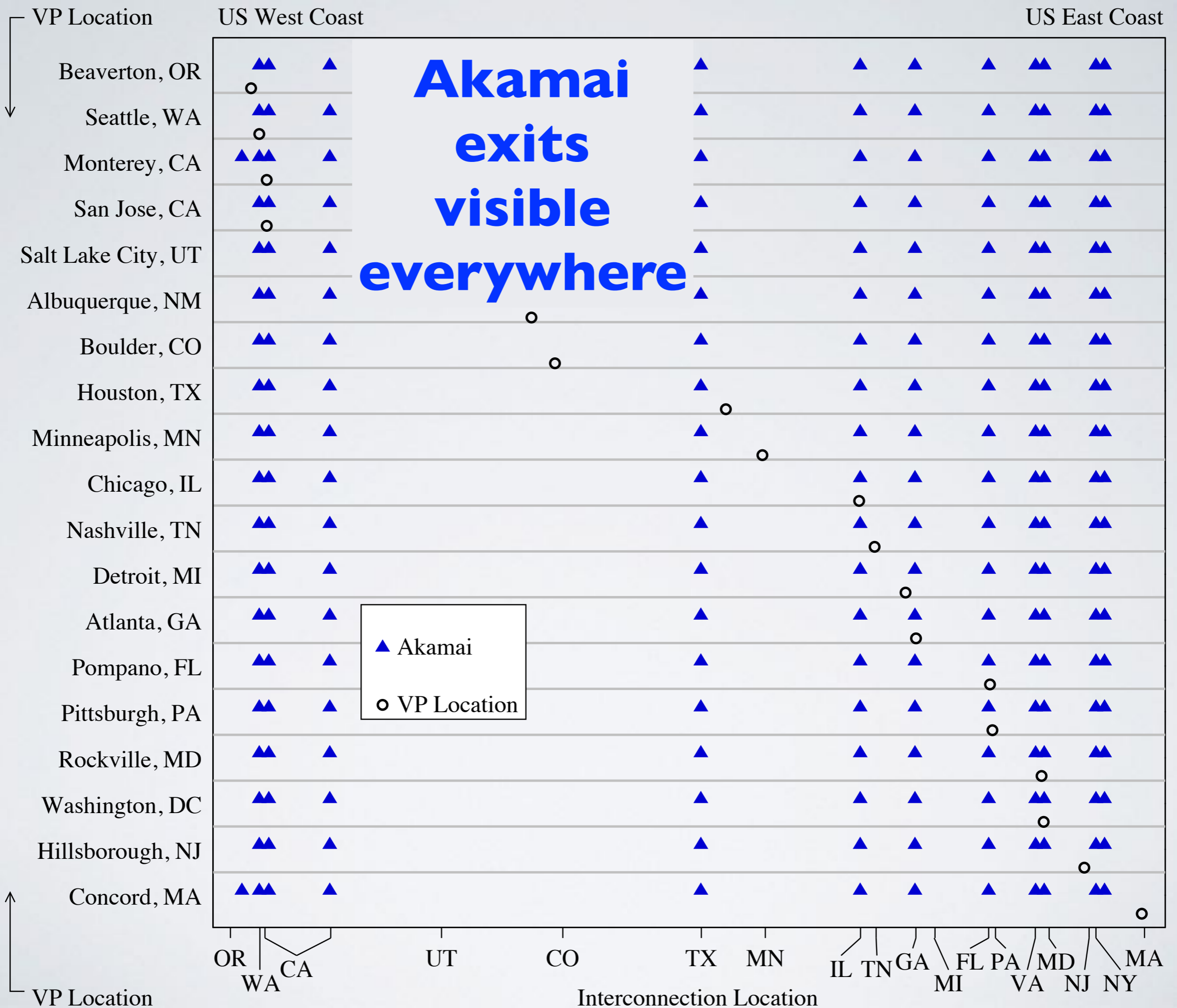
- We used 19 geographically distributed VPs inside Comcast to map router-level interdomain connectivity of Comcast in January 2016

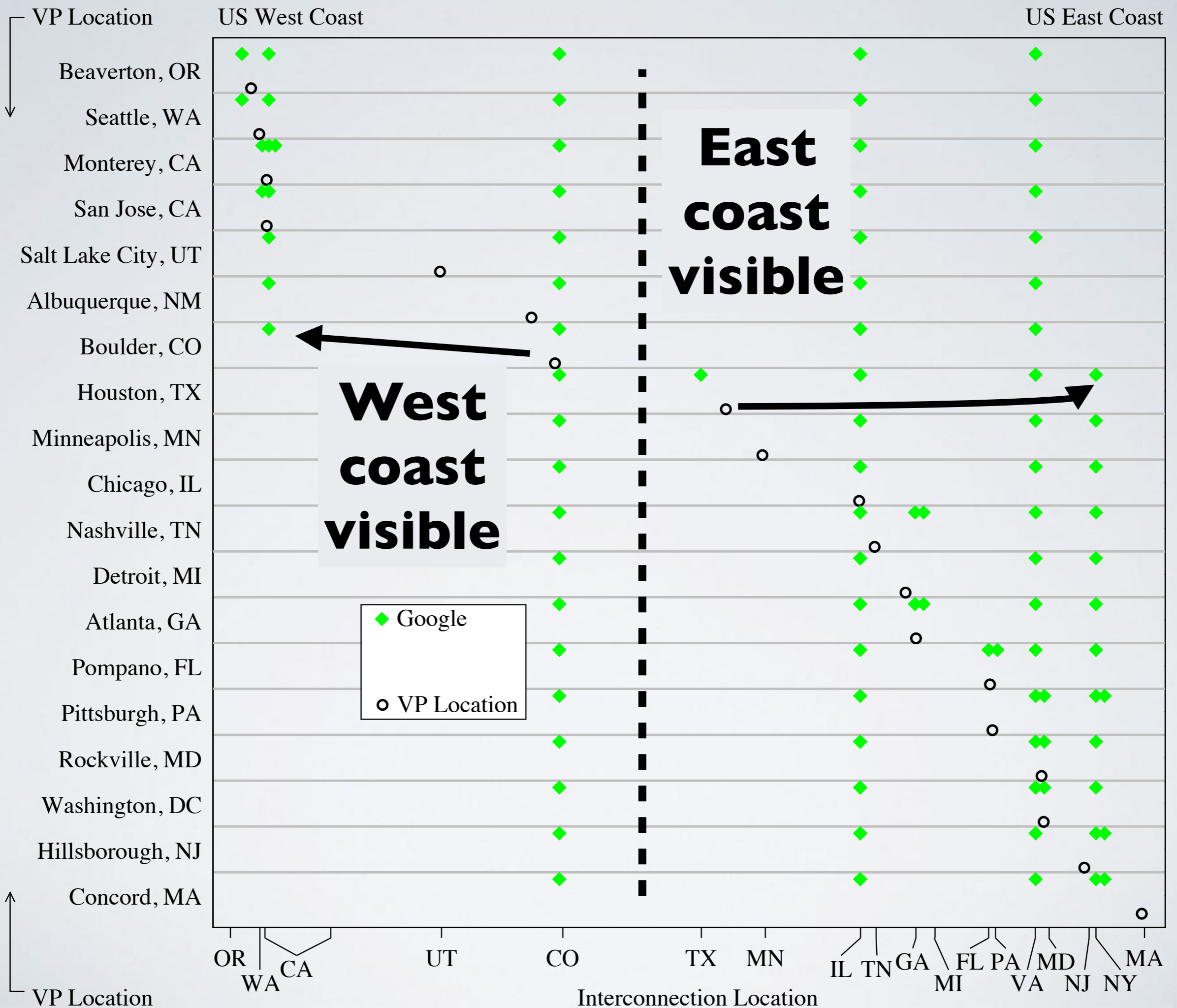
Max interconnection density: 45 router links with Level3.

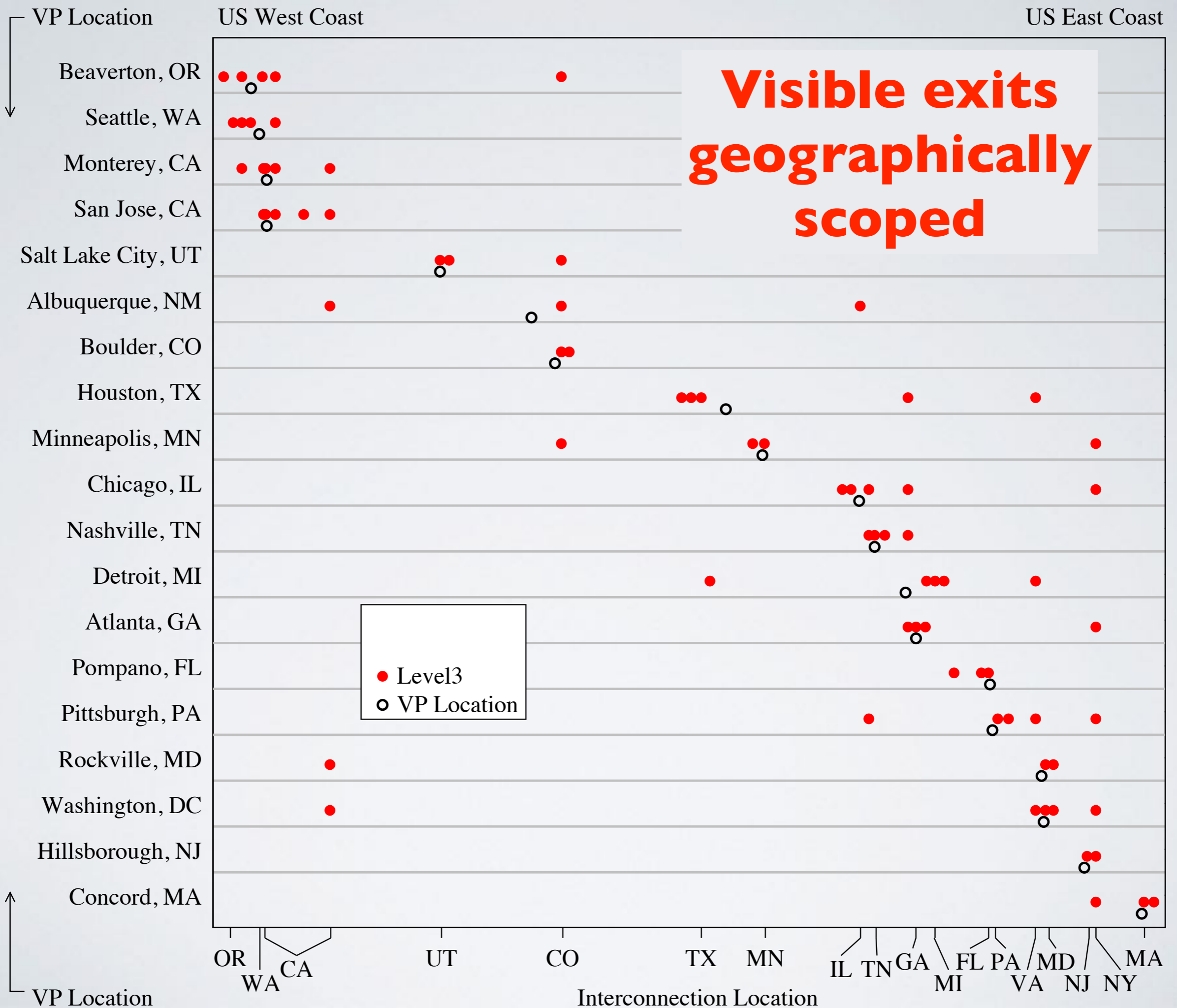
Required 17 VPs to observe them all











# Summary

- We used **active measurement** techniques to build a router-level map focused on **router ownership inference** for interdomain links for a network hosting a VP
- We **developed and validated heuristics** to distinguish VP-routers from neighbor routers, and to infer the operator of neighbor routers
- We used our system to **investigate modern interconnection arrangements**
- We **publicly release** our source code implementation

<https://www.caida.org/tools/measurement/scamper/>



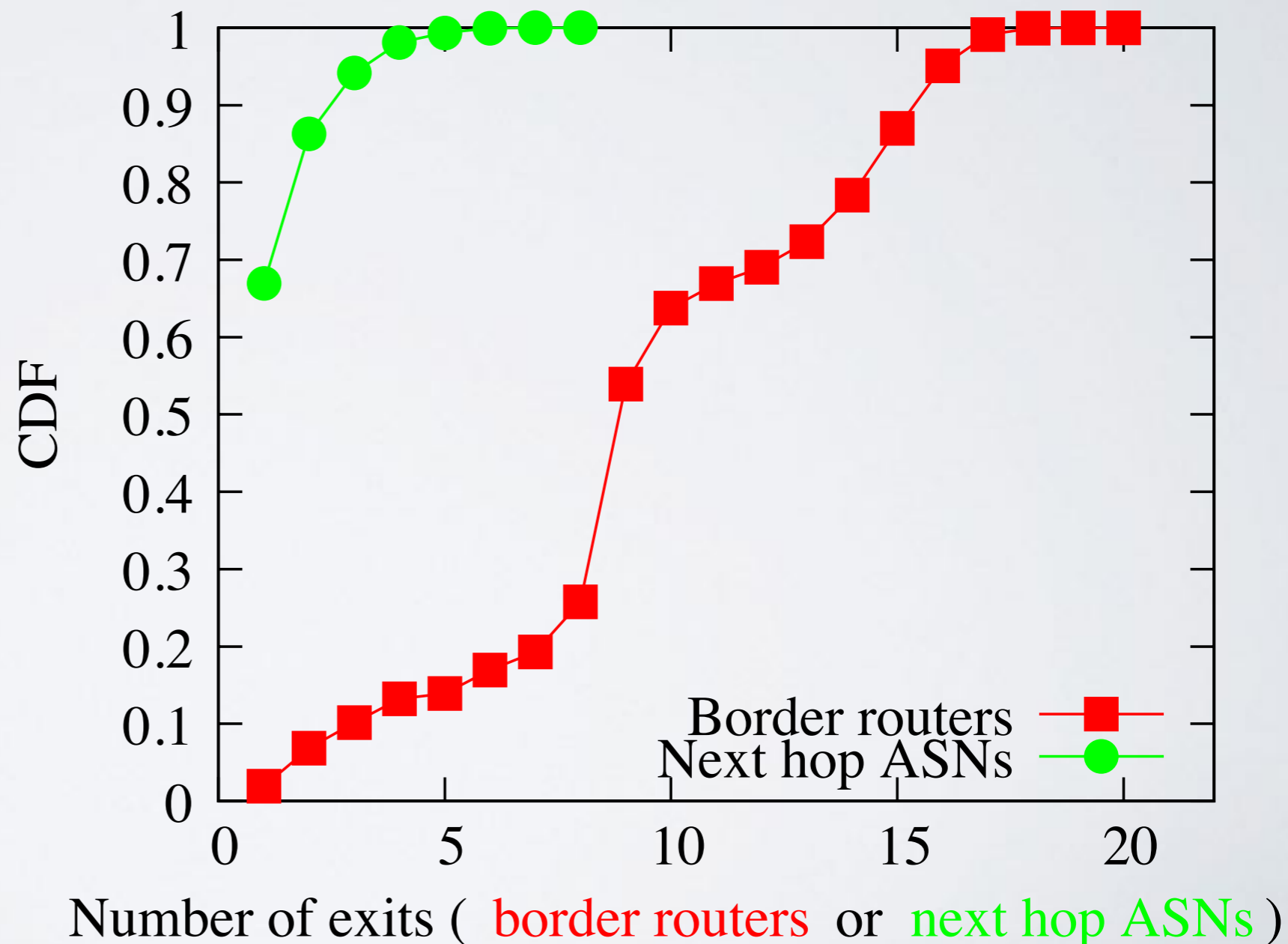
BACKUP SLIDES

# Interconnection Insights

- We used 19 geographically distributed VPs inside Comcast to map router-level interdomain connectivity of Comcast in January 2016

Fewer than 2% of prefixes left network via the same border for each VP.

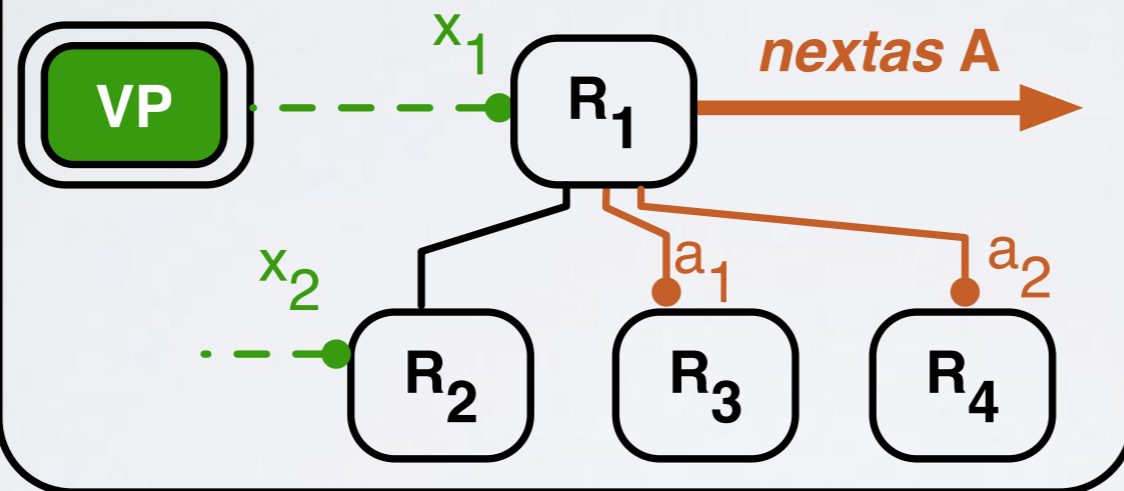
For 73% of prefixes, we observed 5-15 distinct border routers, and 13% of prefixes had more than 15 exits.



# Infer routers operated by the network hosting the VP

## step 1

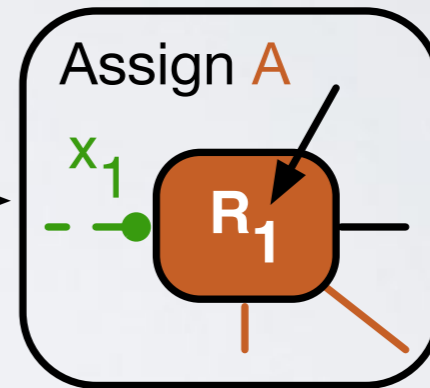
1.1 R1 has interface in X, subsequent interface in X, but majority in A and nextas A



yes

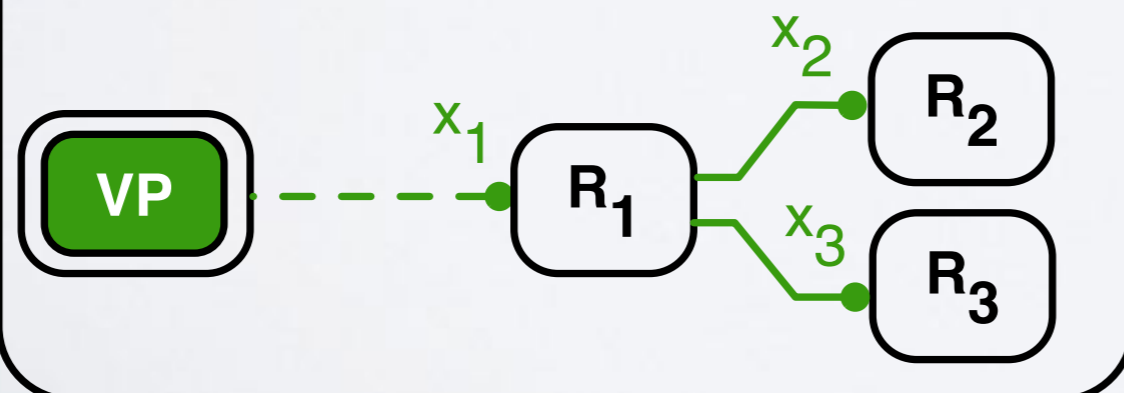
**multihomed**

Assign A



no

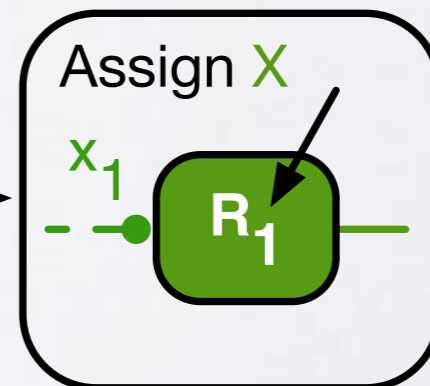
1.2 subsequent interface in X?



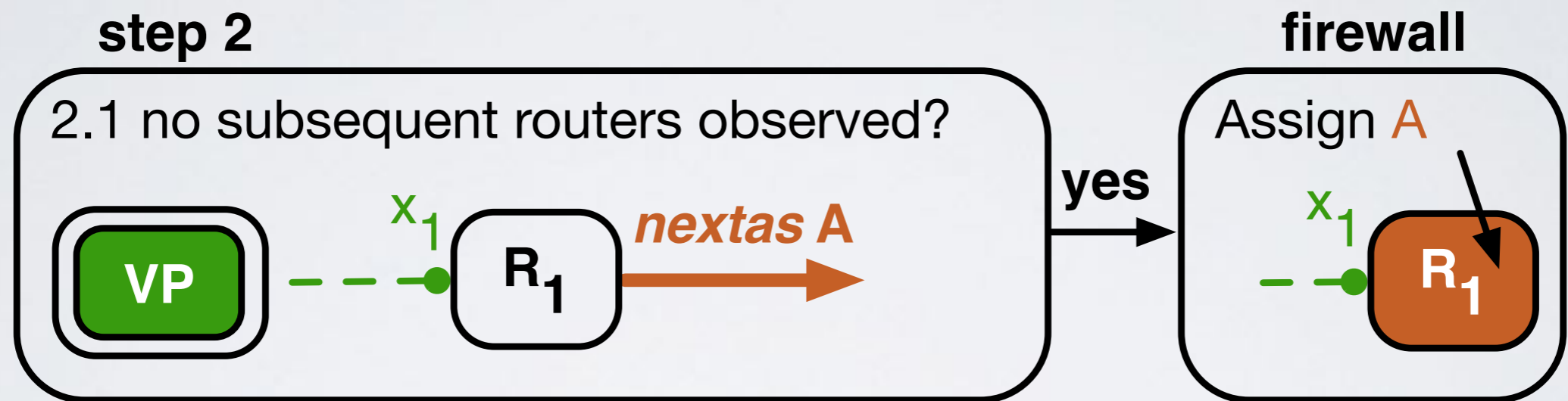
yes

**first**

Assign X



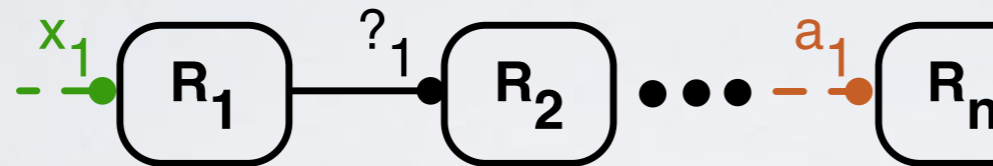
# Inferring owner of neighbor routers with firewalls



# Infer operator of neighbor routers that use unrouted IP

step 3

3.1 unannounced address space followed addresses only in A?



yes

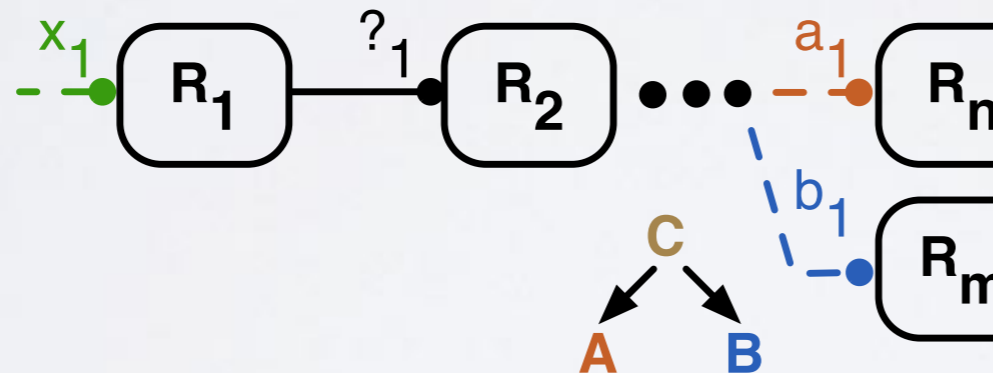
unrouted

Assign A



no

3.2 subsequent majority common provider C?



yes

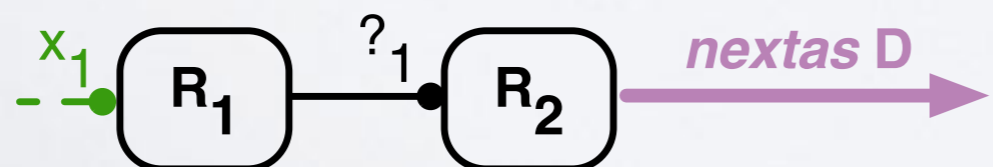
unrouted

Assign C



no

3.3 no subsequent topology observed?



yes

unrouted

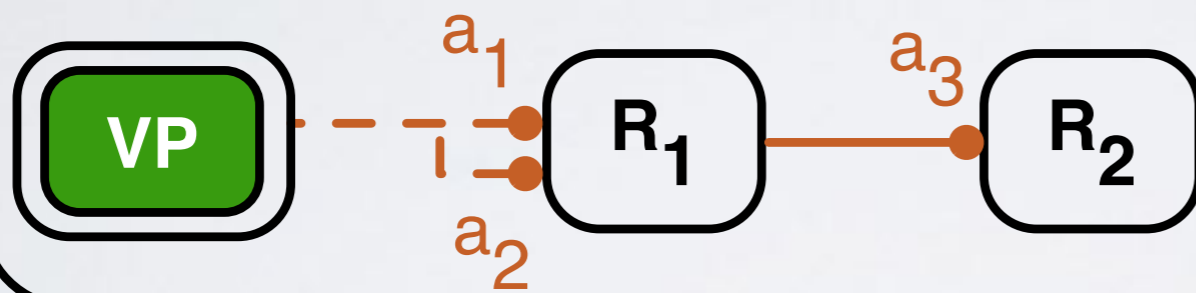
Assign D



# Use IP-AS mappings to infer operator of neighbor routers

## step 4

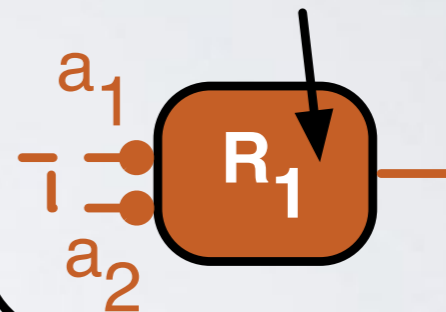
4.1 All interfaces in  $A$  and least one subsequent interface in  $A$ ?



yes

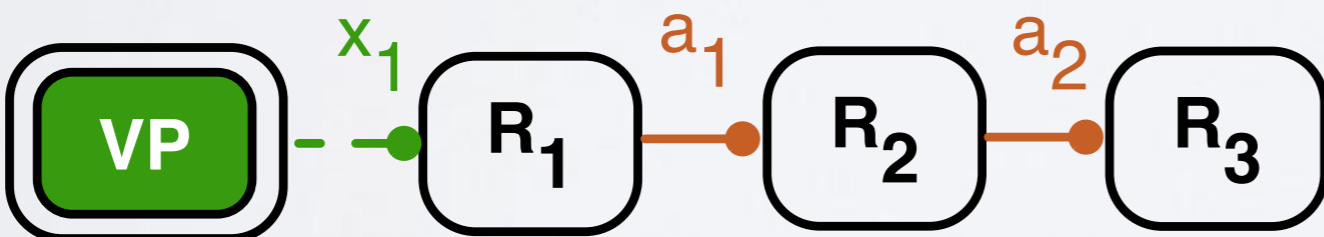
onenet

Assign  $A$



no

4.2 two subsequent interfaces in  $A$ ?



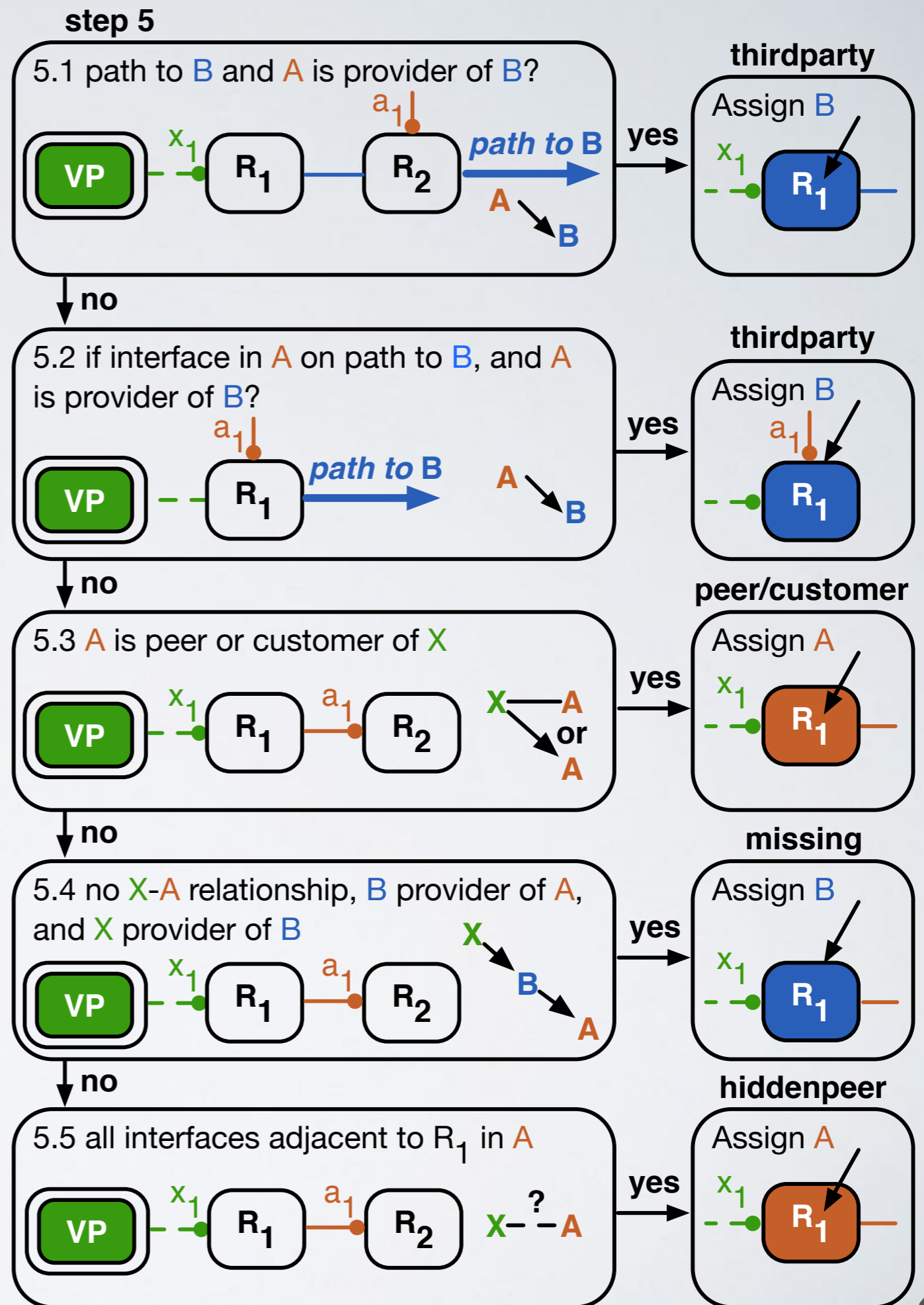
yes

onenet

Assign  $A$



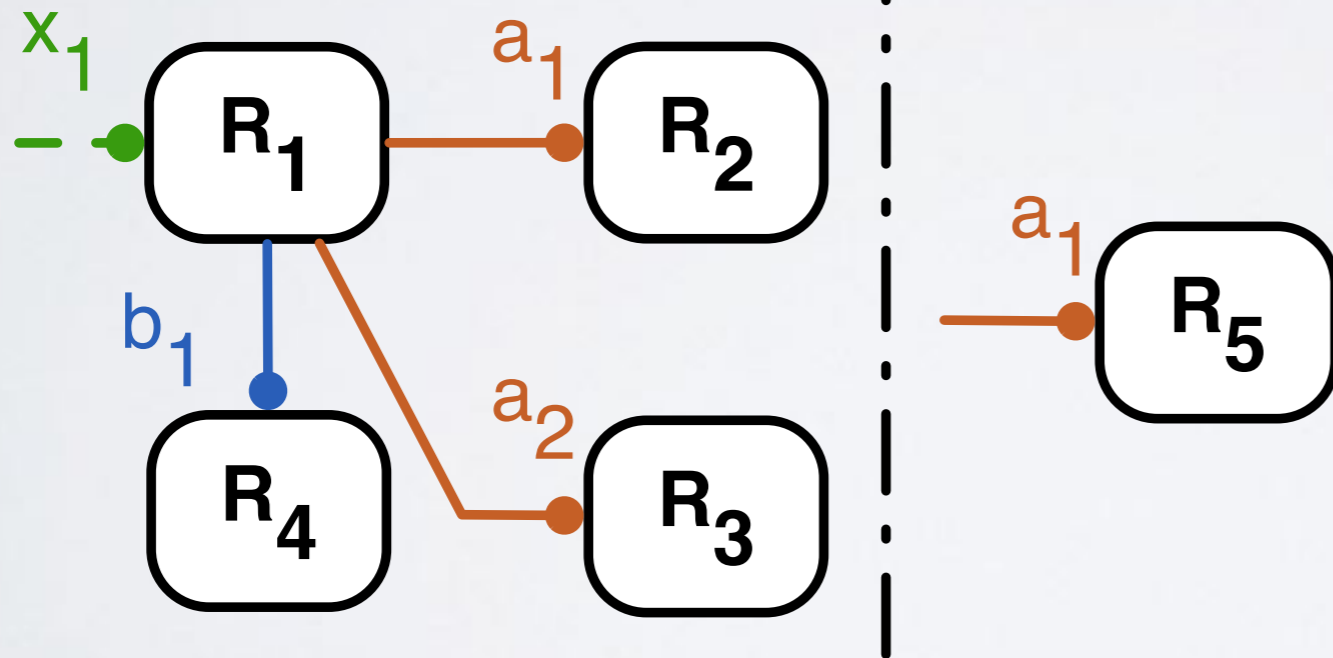
Use AS relationship inferences to infer operator of neighbor routers



# Use IP-AS mappings to infer operator of neighbor routers in ambiguous scenarios

**step 6**

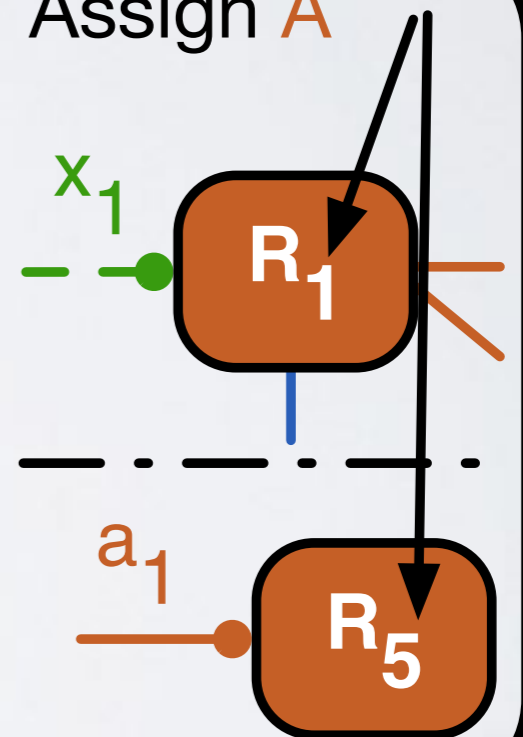
6.1 majority of interfaces in **A**?



yes

**count**

Assign **A**

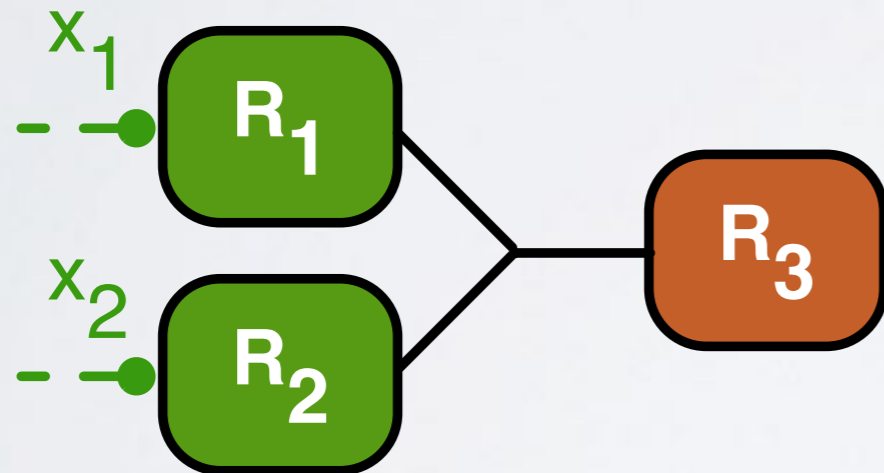




# Infer additional aliases for border routers

## step 7

7.1  $R_1$  and  $R_2$  (owned by  $X$ ) connect to  $R_3$  (owned by  $A$ )



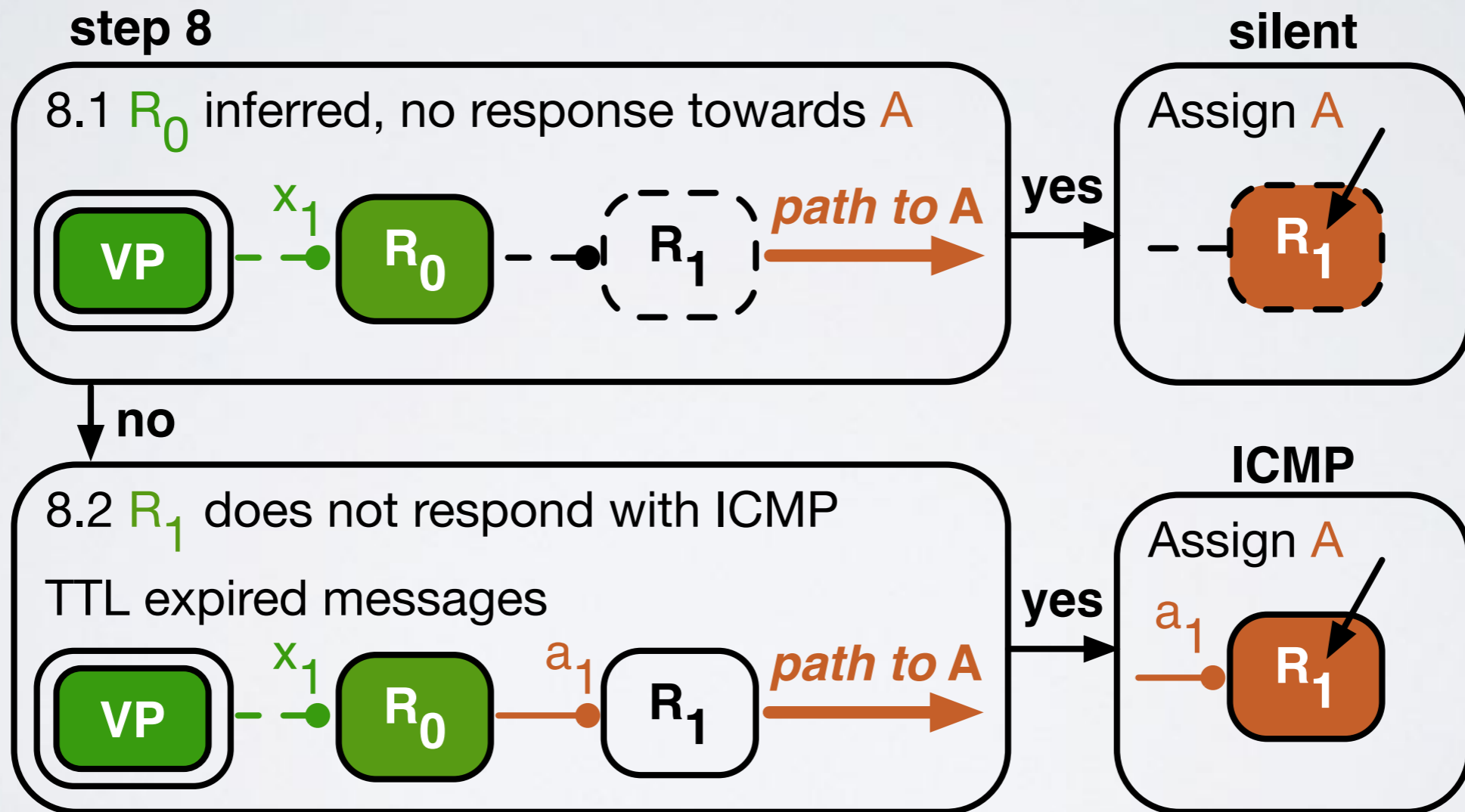
yes

## alias

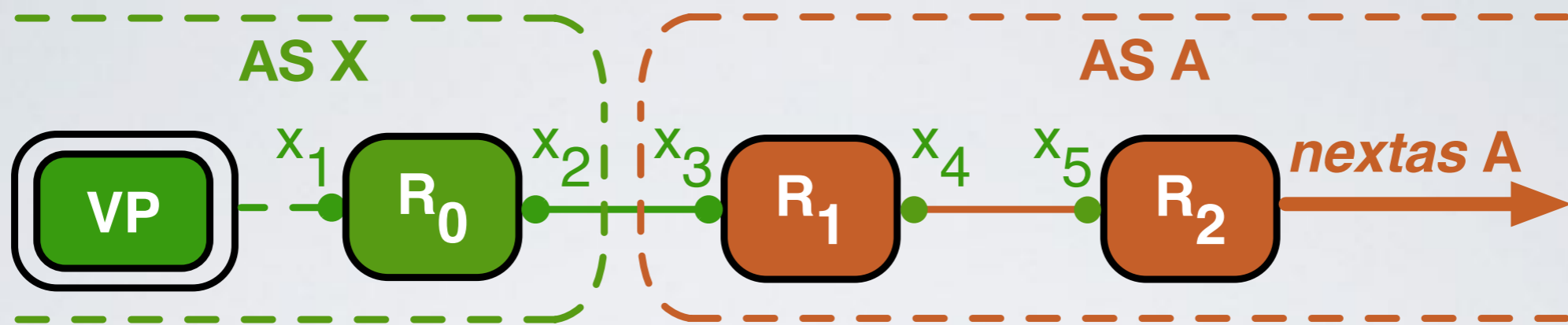
$x_1$  and  $x_2$  are aliases



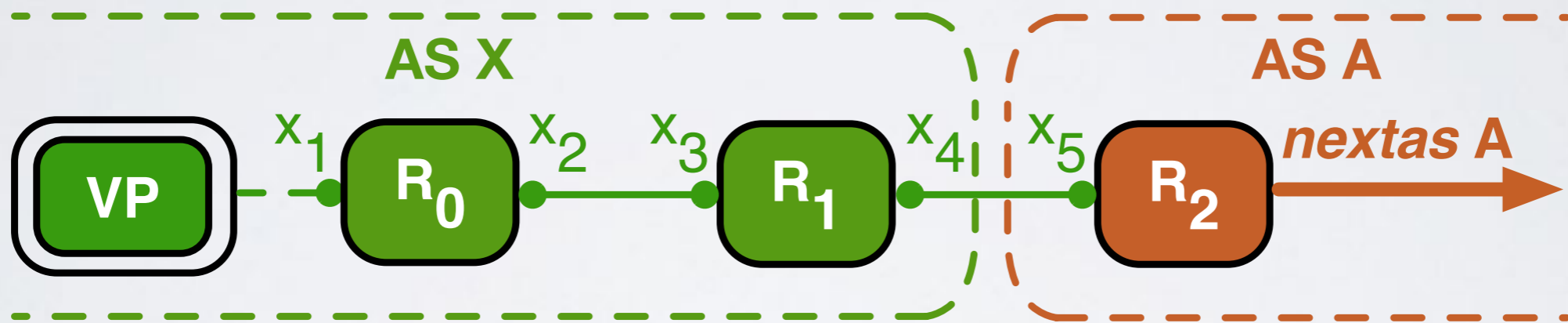
# Infer operator of neighbor routers without TTL expired messages



# Limitations



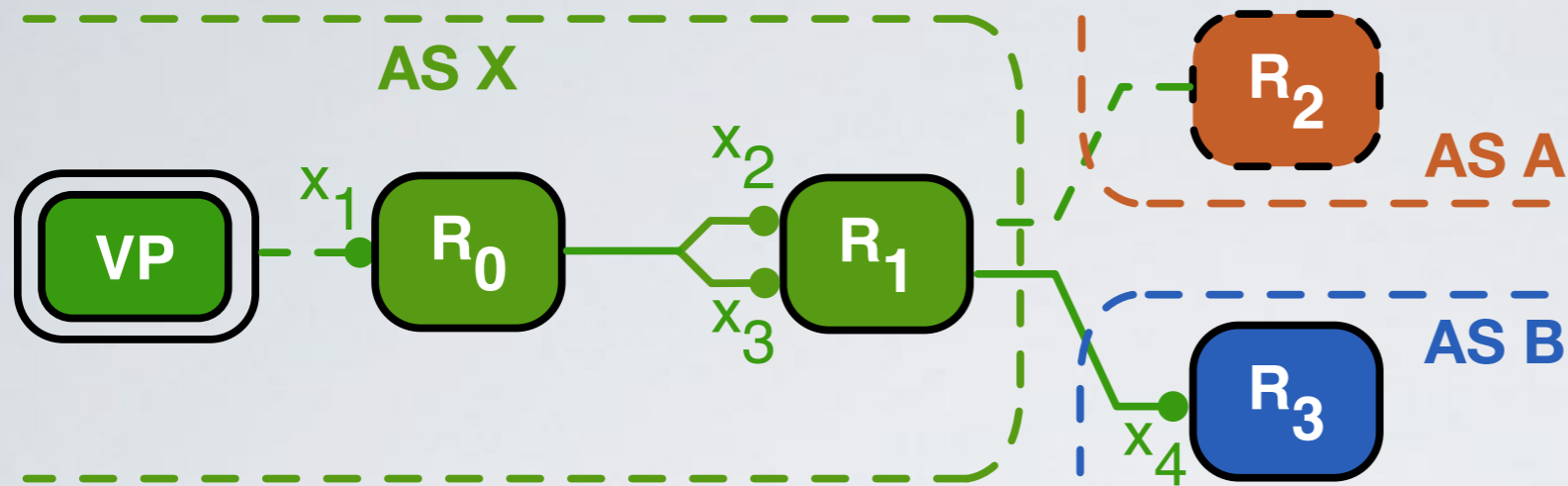
(a) Actual router ownership



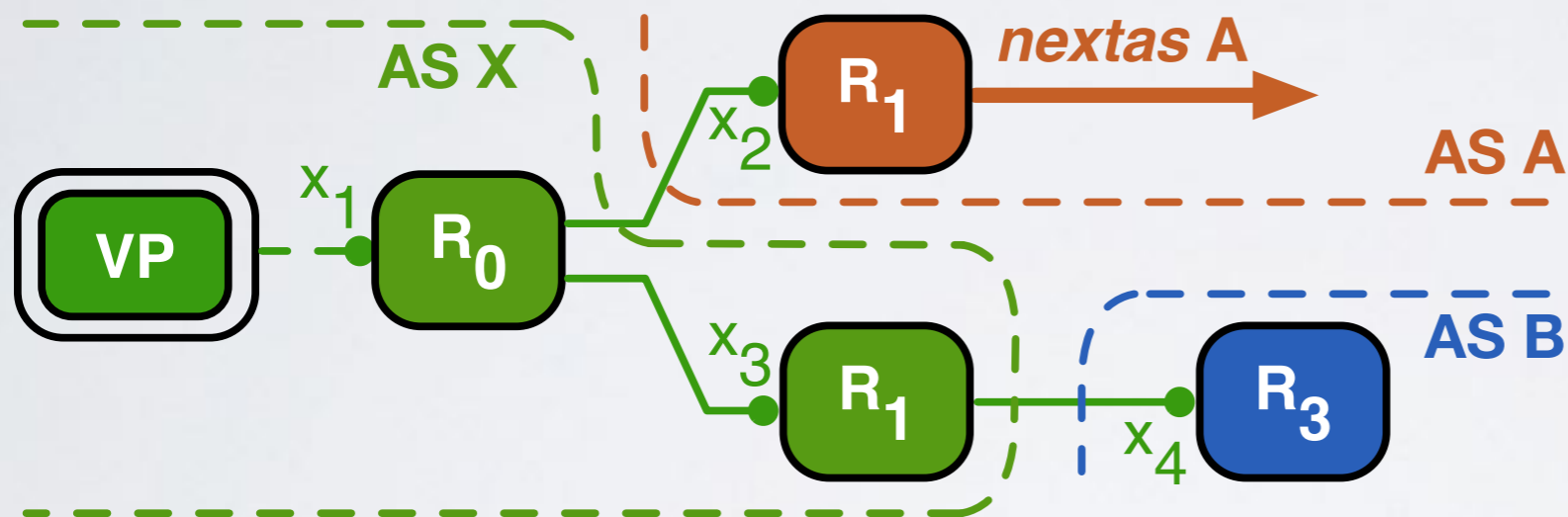
(b) Inferred router ownership

If an AS uses provider-aggregatable address space from their provider on interfaces on their internal routers, bdrmap may incorrectly infer the [position](#) of interdomain link.

# Limitations

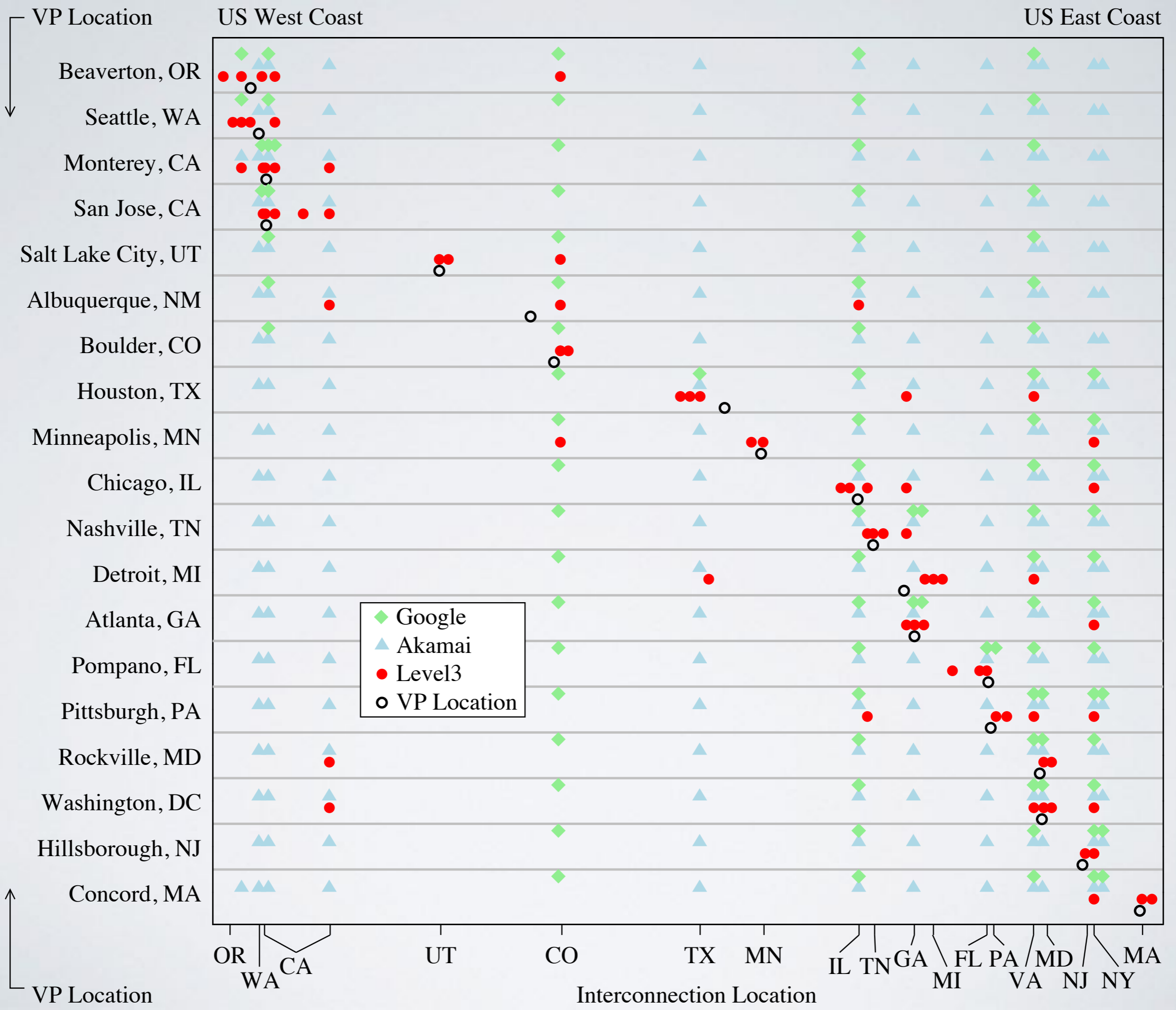


(a) Actual router ownership



(b) Inferred router ownership without alias resolution

If router R<sub>1</sub> responds with different IP addresses depending on the destination probed, and those addresses are not inferred to be aliases, bdrmap may incorrectly infer the position of an interdomain link.



# Development Approach

- We designed and implemented our algorithm over the course of a year, without validation data.
- We used DNS-naming, where available, to infer if our methods appeared to yield correct inferences
- Border routers with high out-degree usually implied an incorrect inference
- We did not use DNS-naming for validation as we found mislabeled interfaces, as well as names containing organization names, rather than AS numbers