# Re-mapping the Internet: Bring the IXPs into Play

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Abstract—The Internet topology is of high importance in designing networks and architectures, evaluating performance, and economics. Interconnections between domains (ASes), routers, and points of presence (PoPs), have been measured, analyzed, and modeled. However, existing models have some serious shortcomings, related to ease, accuracy and completeness of measurements, and limited applicability to emerging research areas. To this end, in this paper, we propose a novel approach towards capturing the inter-domain Internet topology. Motivated by the recent interest in the Internet eXchange Points (IXPs), we introduce a network graph model based on IXPs and their AS memberships. The proposed model aims to complement previous modeling efforts, shed light on unexplored characteristics of the Internet topology, and support new research directions. We also collect and make available Internet connectivity data, analyze main topological properties, and discuss application-related issues.

#### I. Introduction

The Internet is composed of Autonomous Systems (ASes), like ISP networks, CDNs, university networks, located all over the world. To connect with each other, ASes establish physical links and use routers, located in different points-of-presence (PoPs). Connections can be either private (between a pair of ASes) or hosted by an Internet eXchange Point (IXP). This Internet ecosystem (of ASes, routers, links, PoPs, IXPs, etc.) is highly dynamic, and its evolution is driven by both technological and economic factors [1], [2]. Changes in the network topology are frequent and are done in a distributed way; ASes decide individually if and how to add, remove, or modify (physical or logical) links to other ASes.

Knowing the current topology of the Internet can help operators to design, configure, or optimize their network [3]. However, since the Internet is not centrally controlled, and ASes do not use to publish their private network structure and peering relationships, it becomes difficult (if not impossible) to have a centralized/global view of the Internet topology [4].

Only partial knowledge can be obtained by measuring the Internet from the edge, or some vantage points (using traceroutes, looking glass servers, etc.) [5], [6]. The collected data can then be used to build a *network graph*, which is a common modeling approach that facilitates analysis of the network characteristics. Graph nodes/vertices often correspond to ASes, routers, or PoPs (resulting to an AS- [7], *router*- [8], or *PoP*- [9] *level* topology, respectively), while edges denote a physical (or logical) link between nodes.

Despite their usefulness (providing an initial view of the network structure, in simulation studies, etc.), existing network

models are in some cases insufficient to provide a thorough view of the Internet topology, or lead researchers to correct conclusions and insights [10]. This is mainly due to measurement limitations, or absence of verification ("ground truth") for the proposed network models [4], [8], [11], [12].

To (i) *complement* previous models, (ii) overcome some of their shortcomings, and (iii) keep up with the recent Internet research directions, in this paper, we propose a new, fundamentally different approach for mapping the *inter-domain* Internet topology. At the heart of our model are the *Internet eXchange Points (IXPs)*: the facilities where many ASes meet and exchange traffic. Our selection for an IXP-based model is motivated by the fact that IXPs (a) reside in the core of the Internet, and (b) play an increasingly important role in the Internet's connectivity (e.g., peering links [5], [6]) and structure (e.g., flattening of the topology [13], [14]).

Specifically, we define the *IXP bipartite graph*, a graph model that consists of two disjoint sets of vertices, i.e., IXPs and ASes. An edge between an IXP-AS pair is defined when the AS is member of the IXP; edges between AS-AS or IXP-IXP pairs are not allowed. The importance and usefulness of the IXP bipartite graph lies mainly on the following directions:

- The information needed to build the IXP bipartite graph (i.e., IXP memberships) is published by the IXPs themselves (which have incentives to do so), and is easily accessible [15], [16], [17]. Thus, the proposed representation of the Internet does not rely on measurements, which are a main cause of inaccuracies in previous models.
- A lot of recent studies focus on IXPs and their role in the Internet [5], [6], [13], [14], [18], [19]. The IXP-based model can become a useful tool in IXP-related research. Using the IXP bipartite graph, instead of or in conjunction with the AS/router/PoP-level graphs, can (i) shed light on further characteristics of the Internet topology, and (ii) enable new research on areas like inter-domain routing, or network economics.

The remainder of the paper is structured as follows. We first introduce the IXP-based model, and discuss its main characteristics and applicability to use cases (Section II). Then, we build the IXP bipartite graph from collected data (which we make publicly available [20]), analyze its main characteristics, and provide application-related insights (Section III). Finally, we discuss related work (Section IV) and conclude our paper (Section V).

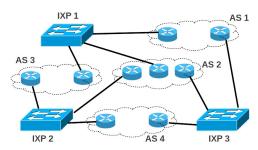


Fig. 1: Physical topology of a network with 4 ASes and 3 IXPs.

## II. THE IXP-BASED MODEL

In this section, we introduce our Internet topology model. After providing some basic information about IXPs (Section II-A), we define the model, the *IXP bipartite graph* and its derivatives (Section II-B). Then, we discuss its main characteristics (Section II-C), as well as extensions of it (Section II-D). Finally, we provide some use cases where applying our model could facilitate solutions for practical problems (Section II-E).

## A. Preliminaries: Internet eXchange Points

Connections between ASes can take place over private links (between a pair of ASes) or Internet eXchange Points. The main functionality of an IXP is equivalent to a layer-2 switch. An AS *member* of the IXP has a router (or a few routers) connected to the IXP infrastructure, and, thus, is able to establish a connection with *any* other IXP member. The main incentive for an AS to become member of an IXP, is that, using the same equipment (e.g., 1 router, 1 physical link), it can connect to many ASes, which leads to cost decrease (compared to private links) and increase of its accessibility.

Fig. 1 shows an example network of 4 ASes (depicted as clouds) and 3 IXPs (depicted as switches); this could be a part of the Internet topology. An AS can connect to more than one IXPs, from different locations of its intra-network (e.g., AS-1 connects to IXP-1 and IXP-3 from two different routers).

## B. Model Definition

We now define our IXP-based model for the Internet topology, the *IXP bipartite graph* (BG). Let us first denote the set of IXPs and ASes in the Internet as  $\mathcal{IXP}$  and  $\mathcal{AS}$ , respectively. We also denote that an AS  $j \in \mathcal{AS}$  is member of an IXP  $i \in \mathcal{IXP}$  as  $j \to i$ . The IXP BG is defined as follows.

**Definition 1** (IXP bipartite graph). The IXP bipartite graph is the undirected graph  $\mathcal{BG} = \{V_{BG}, \mathcal{E}_{BG}\}$  whose vertices are the IXPs and ASes of the network:

$$V_{BG} = IXP \cup AS$$

An edge  $e_{ij}$  between two vertices  $i \in IXP$  and  $j \in AS$  exists when j is a member of i, i.e.,

$$\mathcal{E}_{BG} = \{e_{ij} : i \in \mathcal{IXP}, j \in \mathcal{AS}, j \to i\}$$

Under the above definition, edges can exist only between an IXP and an AS; IXP-to-IXP and AS-to-AS edges do not exist in the IXP BG. As a result, the graph of Def. 1 consists of two

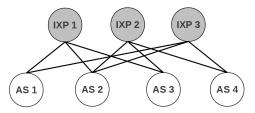


Fig. 2: IXP bipartite graph (IXP BG).

disjoint sets of nodes, the IXPs and the ASes, or, equivalently, it is a *bipartite* graph. In Fig. 2 we draw the IXP BG that corresponds to the example network topology of Fig. 1. We denote the nodes with circles (gray and white, for IXPs and ASes, respectively) and the edges with lines.

Remark: In practice, AS-to-AS edges exist as well due to private links (IXP-to-IXP connections are rare). However, we remind that the goals of our model (towards the analysis of topology characteristics, or applications; see, e.g., Section III) are different from previous models, like the AS-graphs, which consider also private AS-to-AS links. Moreover, the IXP BG can be used *complementarily* with other models as we discuss later on.

**Graph Derivatives.** From the basic model of the IXP BG, one can build two derivative graphs. These graphs are simpler, may fit different use cases better, and are of smaller size, a property that is essential for many applications employing online algorithms [18]. Specifically, one can build the *IXP multigraph* (MG). The IXP MG is defined as *the projection of the BG onto the set of the IXP nodes*<sup>1</sup>. Nodes in IXP MG are the IXPs, i.e.,  $\mathcal{V}_{MG} = \mathcal{IXP}$ , and an edge  $e_{ij}$  between two nodes  $i, j \in \mathcal{IXP}$  exists when an AS is member of both IXPs i and j, i.e.,

$$\mathcal{E}_{MG} = \{e_{ij} : i, j \in \mathcal{IXP}, k \in \mathcal{AS}, k \to i, k \to j\}$$

As it can be seen, the IXP MG consists of much less nodes than the BG ( $|\mathcal{V}_{MG}| = |\mathcal{I}\mathcal{X}\mathcal{P}| \ll |\mathcal{V}_{BG}| = |\mathcal{I}\mathcal{X}\mathcal{P}| + |\mathcal{A}\mathcal{S}|$ ).

Since more than one ASes can be members at the same two IXPs, the resulting graph is a *multigraph*. In the example of Fig. 1,  $AS_2$  and  $AS_3$  are members to both  $IXP_1$  and  $IXP_2$ . Thus, in Fig. 3, where we present the corresponding IXP multigraph, the nodes  $IXP_1$  and  $IXP_2$  are connected with two edges (through  $AS_2$  and  $AS_3$ ).

The AS multigraph (or, AS MG) can be defined and represented similarly; we omit the details due to space limitations.

## C. Model Characteristics

We proceed to discuss issues related to the construction of the graph, how it compares to existing Internet topology models, and its main characteristics and usefulness.

**Graph Construction.** To build the IXP bipartite graph (BG) we need to know *the set of IXPs and their member ASes*, i.e., the ASes that are physically connected to each IXP. With this

 $<sup>^{1}</sup>$ The projection of a bipartite graph onto one set of its nodes X, is defined as a graph (with single or multiple edges) whose nodes are in X, and two nodes are connected if they have a common neighbor in BG.

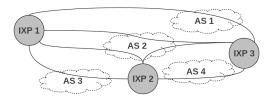


Fig. 3: IXP multi-graph (IXP MG).

information the construction of the IXP BG is straightforward; one needs simply to follow the rules of Def. 1.

Information about AS memberships is usually *publicly* available at IXPs' websites, or in databases like PeeringDB [15], PCH [16], or Euro-IX [17], that bring together aggregate data about IXPs and their members. Moreover, IXPs (as well as ASes) have incentives to publish this information, in order to attract peers or clients and increase their popularity [4]. This makes the construction of the IXP BG a much simpler task compared to previous modeling approaches, which require complex data collection and processing methods to infer AS/router/PoP-level links. This information is typically kept private by ISPs, in sharp contrast to our model, for security and competitive strategy reasons.

Furthermore, measurement methods needed for building AS/router/PoP-level graphs have been extensively reported to suffer from a number of deficiencies (see, e.g., the survey of [10]). Protocols (e.g., BGP messages) or tools (e.g., traceroute) used in these methods, have not been designed for Internet topology measurements. For instance, BGP messages contain only best paths, and, thus, many existing (e.g., backup) links are not included in the AS-graphs [4]. In traceroute-based methods, the difficult task of IP alias resolution (i.e., matching IP addresses to routers) can lead to inaccurate router-level graphs [21], [8]. On the contrary, AS membership data are independent of such technological approaches, and avoid problems related to measurements incompleteness/inaccuracy. Indeed, early studies on the correctness of the available IXP membership data are very encouraging [22], [23].

Summarizing, the IXP BG construction process has the following advantages compared to previous models: (a) ease of collection, (b) independence of measurements, and (c) potential for increased accuracy.

Role and Use. The proposed IXP-based model, and its derivatives, map parts of the *inter-domain* Internet topology. Hence, it is conceptually closer to the AS-graph model, rather than the (fine-granular) router/PoP-level models. However, the IXP BG offers a view of the topology from IXPs, whereas the AS-graph is usually built from information collected at the edge [4]. Moreover, the edges in the IXP BG are well-defined: they are physical connections between ASes' edge routers and IXPs. In contrast, an AS-graph edge might correspond to more than one physical links located in distant locations, which can create misunderstandings and/or lead to inaccurate conclusions [4], [10].

# D. Enriching the Graph

Extra information can be added (e.g., as attributes to nodes or edges) in the model of Section II-B to extend its applicability. Some examples are presented in the following.

**Location data.** IXPs are located in one or a few nearby buildings. Therefore, a location attribute (e.g., country, city, or GPS coordinates) can be assigned to an IXP-node [24]<sup>2</sup>.

AS type. ASes can be classified according to their business type. For example as AS can be an ISP (Internet Service Provider), a CDN (Content Distribution Network), an education/research organization, an enterprise, etc. Assigning types to AS-nodes, and analyzing the resulting graphs, could help us understand further the Internet structure and the underlying economics, as we show in Section III.

**IP prefixes.** The IP prefixes (or, *customer cone*) of each AS can be added as an attribute to AS-nodes. This information can then be used in routing problems, but also as an indicator of the AS importance/size [18], thus allowing a *joint investigation* of the structural and functional Internet characteristics.

**Peering policies.** Peering agreements (e.g., peer-to-peer, customer-to-provider) between ASes determine if and how they exchange traffic over an IXP fabric. Hence, a "layer" containing policy information can be added on top of the IXP BG or the AS MG, (as directed or active/inactive edges, etc.).

# E. Applications

Since the IXP BG offers a view of the inter-domain topology, as it is seen from the IXPs, it can be useful in research areas, like inter-domain routing [25], [26], [18], IXP-related innovation [19], [18], or network economics [27].

Solving practical problems relating to selection of IXPs (e.g., based on their topological characteristics), can be facilitated using the IXP BG, by making it easier to apply already used heuristics (based on costs, performance, etc.). Moreover, the IXP BG provides a graph representation of the topology, which makes easier to formalize a number of IXP-related problems as the well-known *set cover* problems [28], [29]. Hence, the large literature on set cover problems can be used towards finding optimal solutions even for complex cases. In the following (as well as in Section III) we discuss some relevant examples<sup>3</sup>.

**Outsourcing middleboxes** is a novel way to decrease infrastructure, costs, etc., for enterprises [30]. Candidate locations for installing middleboxes are IXPs [31], due to their accessibility (for ASes and potential clients), good connectivity (high bandwidth, availability, etc.), and colocation with data centers [18]. Since the traffic of an enterprise needs to be directed to the middlebox and then redirected to its source or destination, IXPs in *central points of the Internet* are expected to be good selections for satisfying QoS constraints (e.g., latency). To this end, a middlebox placement strategy

<sup>&</sup>lt;sup>2</sup>ASes might be large networks spanning a large geographical area. Therefore, assigning a location to an AS node is not always possible.

<sup>&</sup>lt;sup>3</sup>Expressing the corresponding optimization problems is straightforward, but requires a detailed examination of the problem, to select the optimization variables, constraints, etc., which is beyond the scope of this paper.

could benefit from the knowledge of the IXP BG. The middlebox/service provider needs to select the set of IXPs, where the equipment will be installed, e.g., having as an objective (a) to cover all its (potential) customers with the minimum deployment cost (e.g., number of sites where middleboxes will be installed, resources per installation site, etc.), or (b) given a cost (CAPEX/OPEX) to cover as many customers as possible.

Remote peering has been recently appeared as a service in major IXPs [32], [33]. In remote peering, a network "reseller" (e.g., an ISP) allows ASes to have (virtual) presence to remote IXPs, i.e., to IXPs that are located outside the area that the network of the AS expands. As a result, ASes are not constrained by locality criteria in the selection of a new membership to an IXP. This allows more flexibility in setting up new memberships, and the IXP BG can be used for an optimal selection of the IXP to which an AS will be connected, based on the current availability of options (i.e., resellers for remote peering), connection costs, etc.

**Deploying a new IXP**, can be considered as an equivalent problem as above, but now from an IXP point of view. A new IXP (or an existing one that expands its infrastructure) combining location information (see, e.g., Section II-D) with the IXP-BG, can similarly select the location of a new site deployment based on the "coverage" (e.g., how many ASes are located there, and if they are already well connected through other IXPs) in order to maximize its expected revenue.

#### III. DATASET ANALYSIS

In this section, we build the IXP BG for an instance of the Internet. We first briefly describe the datasets and methodology we use (Section III-A), and then analyze the graph (Section III-B).

### A. Datasets

As discussed earlier, a key feature of the proposed model is the *ease* of the graph construction. The only information needed to build the IXP BG is the *IXP memberships*. In our study, we collect these data from the PEERINGDB (PDB) [15] and PACKET CLEARING HOUSE (PCH) [16] websites. Combining two information sources, gives a more complete graph.

The (simple) methodology we use to merge and pre-process the data is as follows. Since both datasets do not share the same identifiers for the IXPs, we merge the two IXP lists by matching the IXP IP prefixes and names. Then, we filter out the IXPs denoted as *inactive* or *not approved* in PDB and PCH datasets. We also discard AS-IXP edges with inconsistent information (based on IP addresses), and nodes that do not belong to the giant component (3% and 1% node and edge discards, in total). The final graph is connected, and consists of 504 IXP and 4,692 AS nodes, and 14,651 IXP-AS edges. Finally, to enrich the basic IXP BG and complement our analysis, we use ASes' prefixes from PDB and PCH, and ASes' types and peering relationships from CAIDA [34].

To facilitate further analysis of the IXP graphs, we make available the IXP-AS membership datasets and the respective graphs at [20].

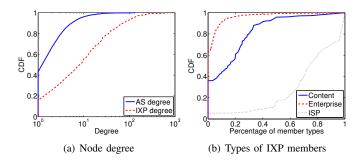


Fig. 4: (a) CDF of the *node degree* for IXP and AS nodes. (b) CDF of the *percentage* of IXP members that belong to different *AS-types*.

## B. Graph Analysis and Applications

From the collected datasets, we build the IXP bipartite graph, as well as, the projected graphs (IXP and AS multigraphs). We detect the main graph properties, and calculate complex network analysis metrics for the whole graph and each node set (IXPs and ASes). Due to space limitation, we present only a subset of the results, comprising the most important, closely-related to applications, and previously unexplored observations. For a clearer presentation, we group our findings in two categories: (i) members and memberships, and (ii) connectivity.

**Members and Memberships.** The degree of a node (i.e., the number of edges connecting it to other nodes) in the IXP BG, depending on the node type, denotes either the *number of AS-members* (for an IXP node), or the *number of memberships to IXPs* (for an AS node). We present the degree distributions (namely, the CDFs, complementary distribution functions) for both node types in Fig 4(a).

An AS connecting to an IXP has the possibility, with a *single physical link*, to establish connections to other AS-members, and obtain access to their networks (peer ASes) and/or parts of the Internet (transit ASes). Hence the degree of an IXP indicates its size, importance, and attractiveness to ASes. As seen in Fig 4(a), the majority of IXPs have up to a few tens of members, while a small percentage (7% or 35 IXPs) has more than 100 members (the largest value of members in our dataset is 677).

Using the AS-type information from [34], we calculate for each IXP the percentage of its members that belong to a specific AS-type (namely, content providers, enterprises, and ISPs). In Fig. 4(b), we present the corresponding CDFs. Some important observations are: (i) 36% and 63% of the IXPs do not have any member that is content provider and enterprise, respectively; (ii) in most IXPs, the majority of the members are ISPs, i.e., the percentage of members-ISPs is less than 50% (x-axis < 0.5) only for 16% of the IXPs (y-axis < 0.16).

The degree of an AS-node, indicates the extent to which it can be *directly accessible* by other ASes. An AS with presence to many IXPs (i.e., high degree) can establish connections with many ASes, and thus reduce its transit costs (by using

peering connections), or increase its revenue (offer transit to more customers), etc. The AS-degree curve in Fig 4(a), shows that 43% of the ASes are connected only to one IXP, which denotes that a large percentage of ASes mainly rely on transit agreements for Internet access. Only 4% of the ASes (i.e., less than 200 ASes) have memberships to more than 10 IXPs, and 1\% (i.e., 6 ASes) to more than 100 IXPs. Towards obtaining a more detailed view of the AS-degree distribution, in Table I we consider the node degree for each AS-type separately. As we can see, while only 19% of all ASes in our dataset are content providers (CDNs), in the subsets of ASes with degrees larger than 20 and 30, the corresponding percentages of CDNs increase significantly to 35% and 64%. This clearly shows that CDNs tend to have presence in more IXPs, compared to other AS types, and reveals an interesting aspect of the dynamics (e.g., economic incentives) behind the inter-domain topology.

The above generic findings, could offer insights for the *IXP selection strategy* of an AS desiring to set a new IXP membership (see also Section II-E). For instance, a small ISP, having a substantial amount of traffic to/from CDNs, should turn its attention to the list of IXPs with many CDN members (which are mostly large IXPs; cf. Table I). On the other hand, a large ISP offering transit, is probably more interested in connections with other (small) ISPs; this indicates a market targeting small-size IXPs. Moreover, the IXP selection process could benefit from information about IP addresses belonging to each AS. However, an interesting finding in our datasets, is that there is *no correlation* (correlation coefficient <= 0.1) between the AS degree and network size (i.e., total announced IP prefixes).

Similarly, with respect to the *remote peering* problem discussed in Section II-E, assume an  $AS_1$  at  $IXP_1$ , and an  $AS_2$  being member of both  $IXP_1$  and  $IXP_2$ ;  $AS_1$  uses  $AS_2$  as a "tunnel" to obtain access to the remote  $IXP_2$  and peer with its members. A careful selection, among the ASes offering remote peering, can be done using the IXP BG, by calculating the number of new connections to ASes a "tunnel" can offer<sup>4</sup>. In Fig. 5 we present this metric for all eligible AS-pairs in our dataset (i.e., AS-pairs colocated in at least one IXP).

TABLE I: Percentage of AS types

| Subset of ASes          | Content | Enterprise | ISP |
|-------------------------|---------|------------|-----|
| All ASes                | 19%     | 5%         | 69% |
| ASes with degree $> 20$ | 35%     | 2%         | 63% |
| ASes with degree $> 30$ | 64%     | 4%         | 32% |

**Connectivity.** We now proceed to study the connectivity between nodes in the Internet. We first calculate the shortest paths in the IXP BG between each AS-pair. Note that in the BG a path from a node  $AS_1$  to a node  $AS_2$  crosses at least one IXP. Table II gives the percentage of paths that cross a certain number of IXPs. Most paths ( $\sim 83\%$ ) cross exactly 2 IXPs, while less than 2% of the paths cross more than 3 IXPs. Here, we need to stress that these paths do *not* coincide

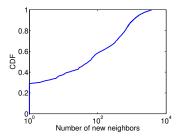


Fig. 5: CDF of the *number of new neighbors* a node can access from a remote peering connection.

always with the existing routing paths (e.g., determined by BGP) in the Internet, mainly due to restrictions imposed by peering policies, existence of private links, etc. However, they reveal the capabilities (under the given topology) for interdomain routing solutions, including: failure or emergency cases management, novel routing services and economic models, etc., [18], [26].

TABLE II: Number of IXPs crossed by AS-to-AS shortest paths.

| Number of IXPs      | 1    | 2     | 3    | 4     | 5      |
|---------------------|------|-------|------|-------|--------|
| Percentage of paths | 7.9% | 83.3% | 8.6% | 0.16% | 0.001% |

Moreover, in Table III we calculate (from the IXP or AS multigraphs) the edge multiplicity between node pairs of the same type, i.e., AS-pairs or IXP-pairs. In the case of IXPpairs, edge multiplicity represents the number of common members (ASes). Since these members are mainly ISPs, they can offer connectivity to IXPs (similarly to their customers), e.g., to enable services hosted at IXP locations [18], [19], [31]. The edge multiplicity metric, quantifies the possible direct connectivity between IXPs. As seen in Table III, direct connectivity (>= 1) can be achieved in a significant percentage of IXP-pairs (20%, i.e., 25k IXP-pairs). In the case of AS-pairs, edge multiplicity represents the number of their common memberships in IXPs. Being connected in more than one points (IXPs), allows ASes to control better their inbound/outbound data traffic, by applying traffic engineering techniques [19]. Table III shows that 8% of AS-pairs (i.e.,  $\sim 800k$  pairs) have common presence in at least one IXP. Moreover, around 40% of these pairs (2.2% of the total ASpairs) have presence to more than one IXP.

TABLE III: Edge multiplicity of IXP- and AS- pairs.

| Edge Multiplicity       | 0     | 1    | 2    | 3    | 4    | >= 5 |
|-------------------------|-------|------|------|------|------|------|
| Percentage of IXP-pairs | 80.2% | 7.9% | 4.7% | 2.3% | 1.2% | 3.7% |
| Percentage of AS-pais   | 92%   | 5.8% | 1.4% | 0.4% | 0.2% | 0.2% |

## IV. RELATED WORK

The Internet topology has been studied from a number of different perspectives. The main modeling approaches focus on the AS-, router-, and PoP- topology.

AS topology. Among the first efforts to study the interdomain Internet topology and map it in an AS-level graph,

<sup>&</sup>lt;sup>4</sup>Note that here, as AS can select among *only the neighboring ASes*, while in the aforementioned case the selection is among *all IXPs*.

are [35], [36]. In AS-models, an AS is represented as a single node, while edges connecting AS-pairs correspond to AS-relationships and routing policies [37], eBGP sessions [7], etc. The construction of the AS-graph mainly relies on BGP and router-level measurement data. However, measurements often suffer from missing or inaccurate data due to issues related to insufficient vantage points [4], Multiple Origins ASes (MOAS) [11], load balancing [38], etc.

**Router topology.** Router-level models [8], represent the Internet with finer granularity than an AS-graph. A router-graph denotes routers as nodes, and physical links between routers as edges. Initial studies of the router topology revealed some interesting properties (e.g, power-low degree distribution) [36]. However, inconsistencies between some findings and the real Internet, led researchers to re-evaluate the measurement methods and detect shortcomings, e.g, IP aliasing, [8], [21].

**PoP topology.** The Point of Presence (PoP) models [9], [24] map the geographical location of the Internet physical infrastructure. Since the PoP topology does not change frequently [12], we can get a more comprehensive view in network design principles (scalability, robustness, etc.) [3]. However, like router-models, PoP-models also suffer from inaccuracy issues due to traceroute measurements limitations [12].

Recently, several works highlighted the importance of IXPs in the Internet connectivity and structure [5], [6], [18]. Also, IXP-based data appear more often in studies relating to the Internet topology [13], [14], [24]. In contrast to our work, these studies use IXP data to increase the completeness of the AS [13], [14] or PoP [24] level graphs, whereas our IXP-based model offers an entirely different perspective for the Internet topology. We deem that viewing the Internet from its central points, can facilitate IXP-related research and provide further insights on the interplay between topology and its use cases.

## V. CONCLUSION

Motivated by the increasing role and interest in IXPs, in this work, we propose an IXP-based model for the interdomain Internet topology. Our model, the IXP bipartite graph, can be *easily* built from *publicly available* data, and avoid shortcomings of measurement methods employed by existing models. We believe that the IXP BG can substantially (a) complement previous modeling approaches in revealing interesting characteristics of the Internet topology, and (b) support new research and applications in the areas of inter-domain routing, IXP-related innovation, and network economics (e.g, remote peering, outsourcing middleboxes, traffic engineering).

**Acknowledgements.** This work has been funded by the European Research Council grant agreement no. 338402.

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