Software-defined Network Assimilation: Bridging the Last Mile Towards Centralized Network Configuration Management with NAssim

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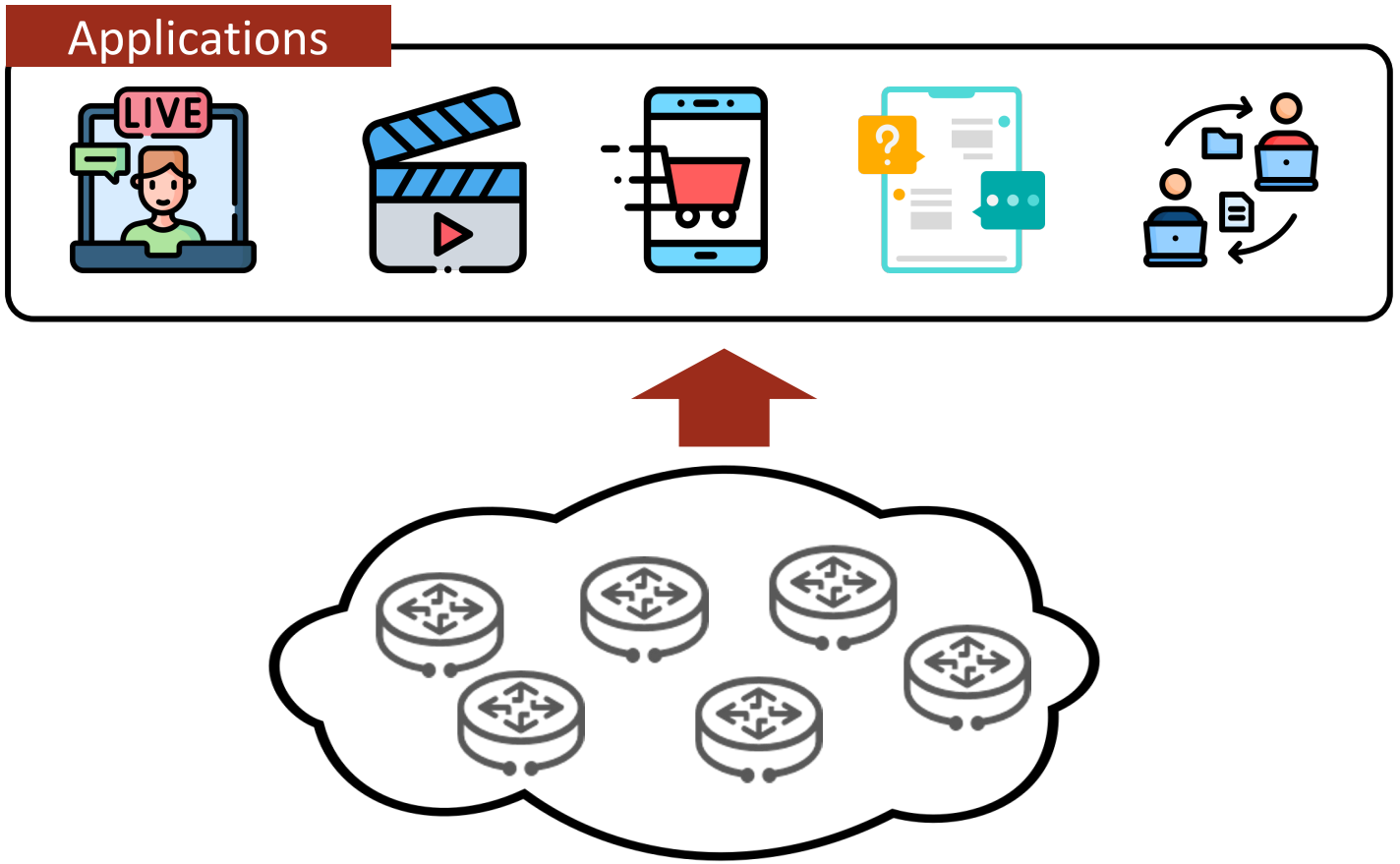
[4]Beijing University of Posts and Telecommunications, [5]The Chinese University of Hong Kong
[6]Shandong Computer Science Center (National Supercomputer Center in Jinan)
[7]Hong Kong University of Science and Technology (Guangzhou & Hong Kong)

SIGCOMM 2022

HUAWEI



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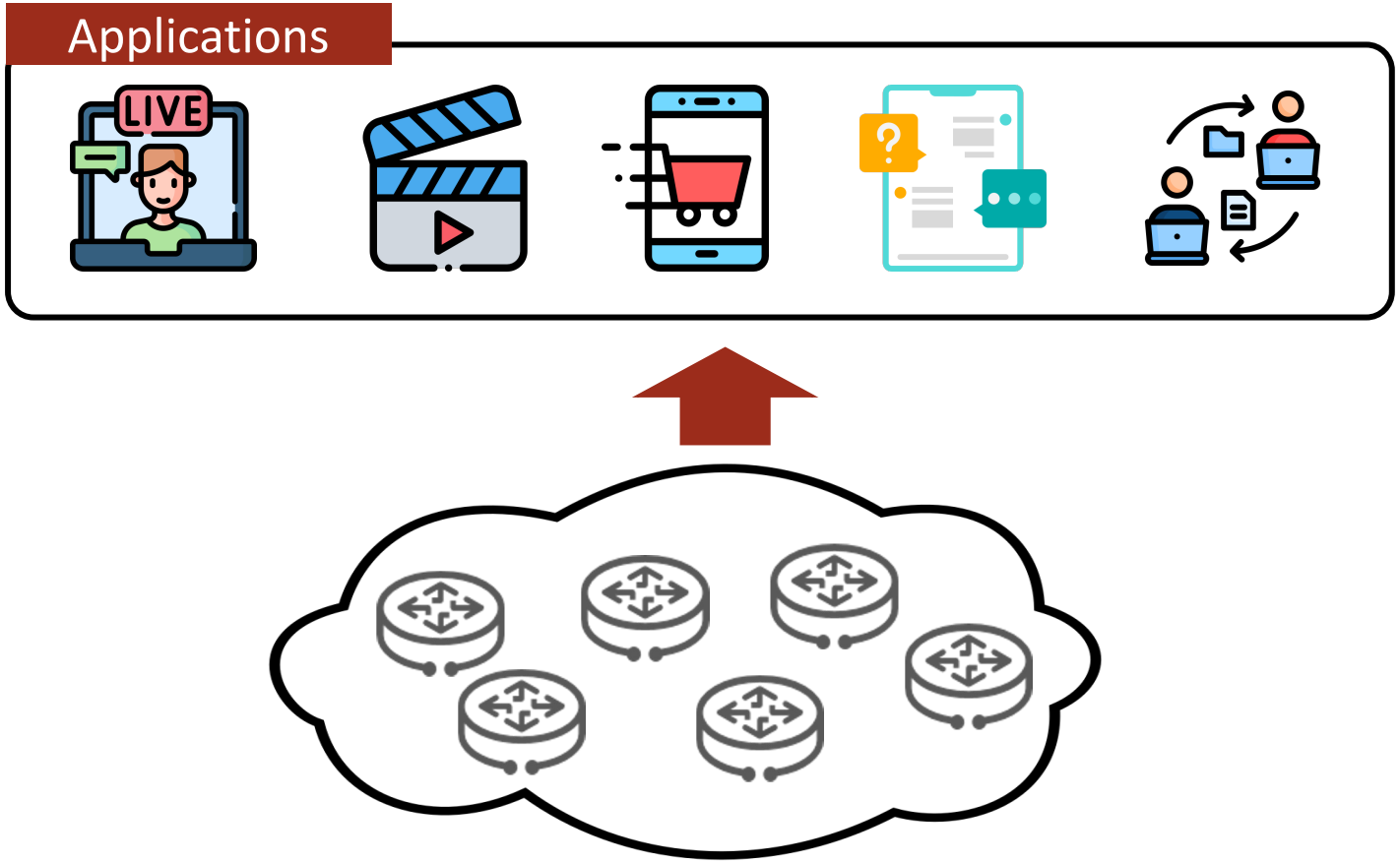

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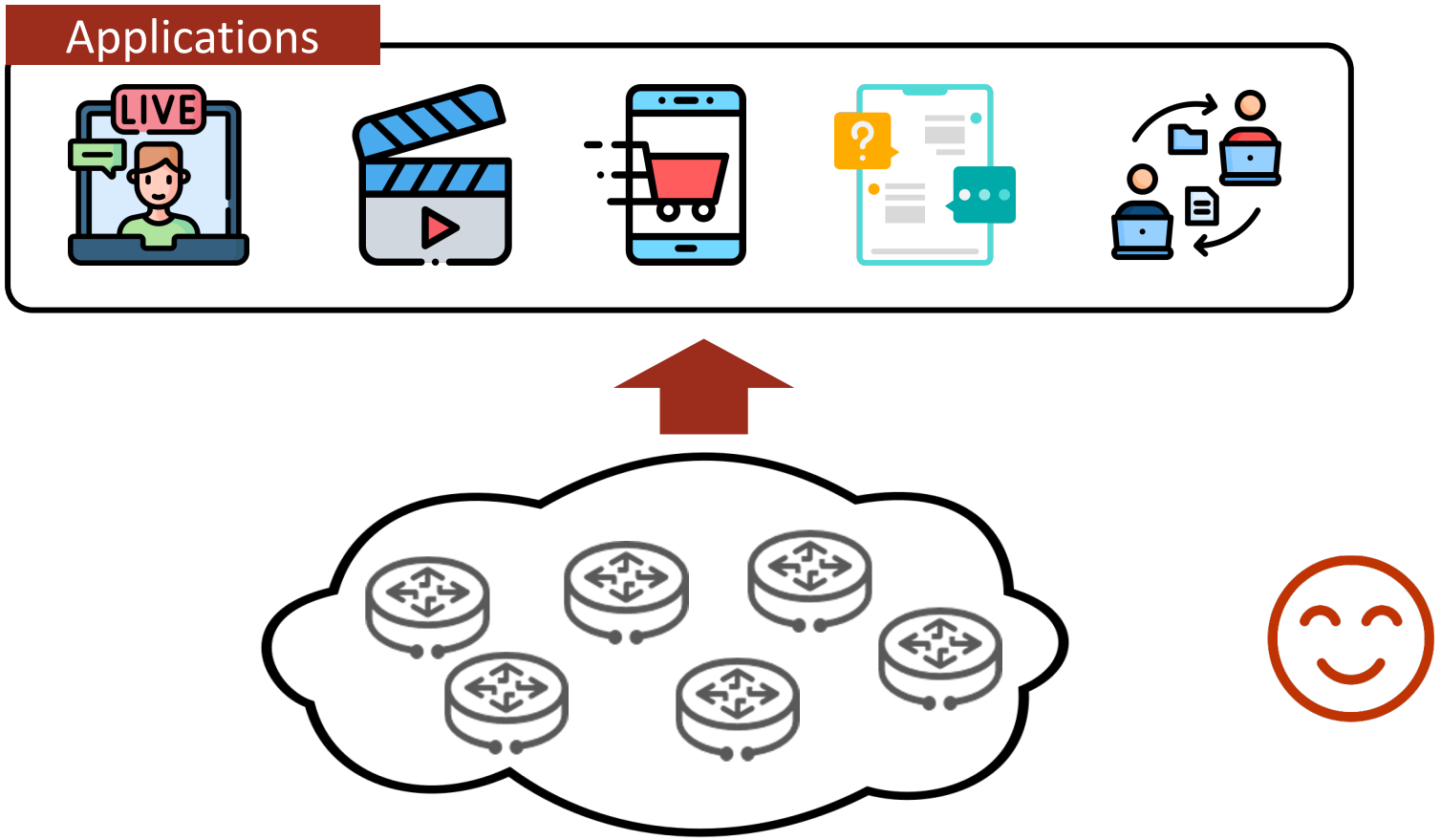

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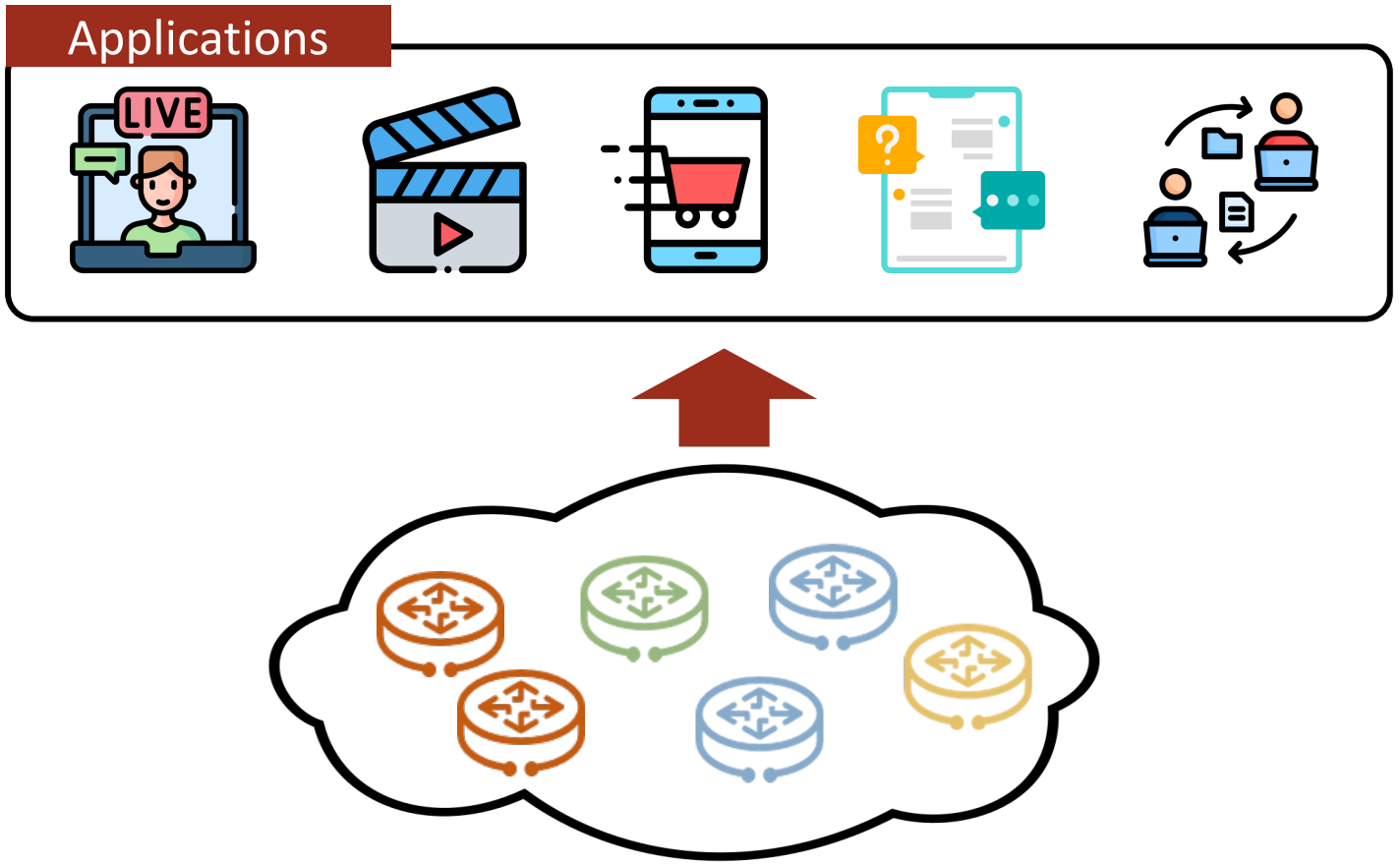

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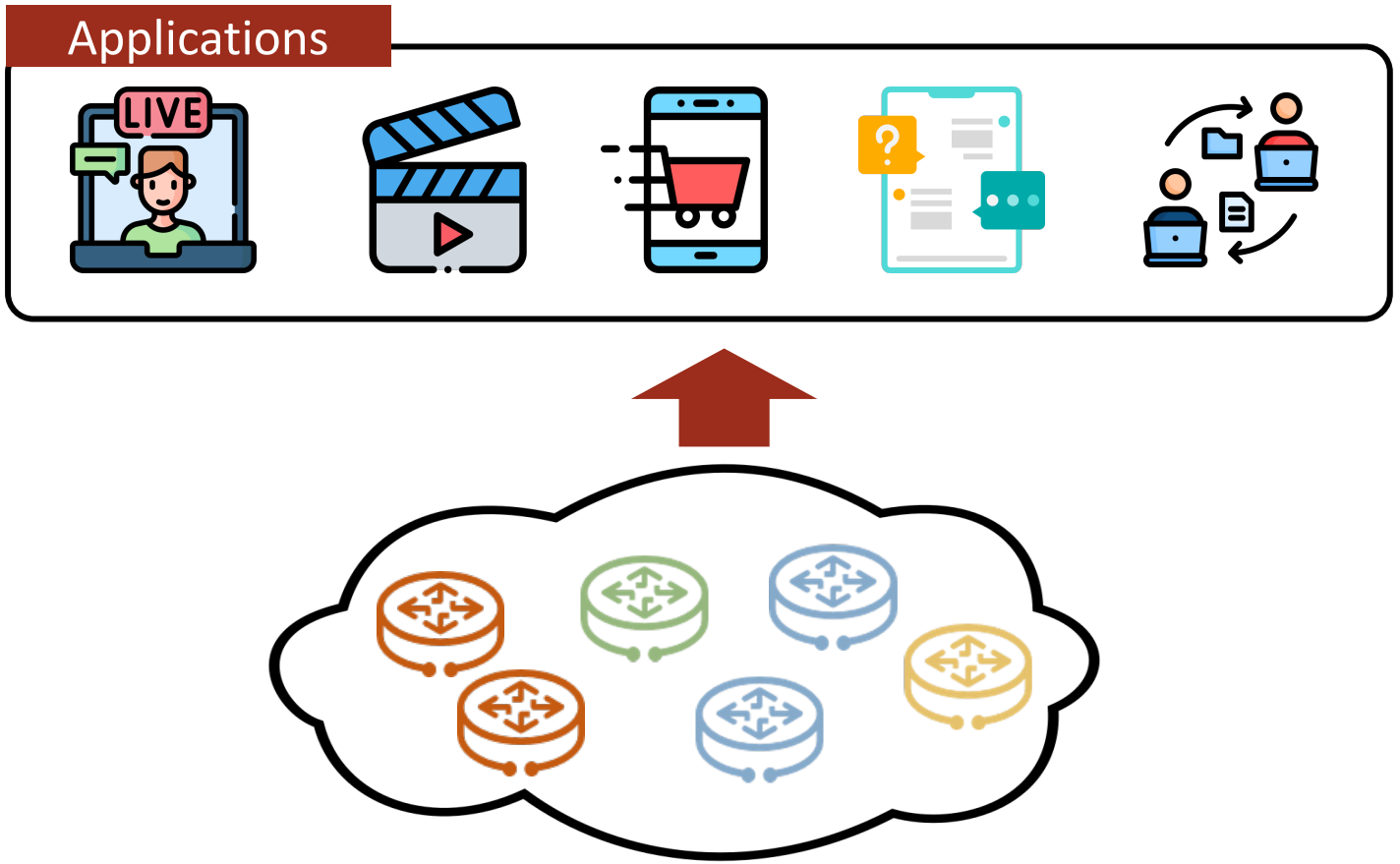

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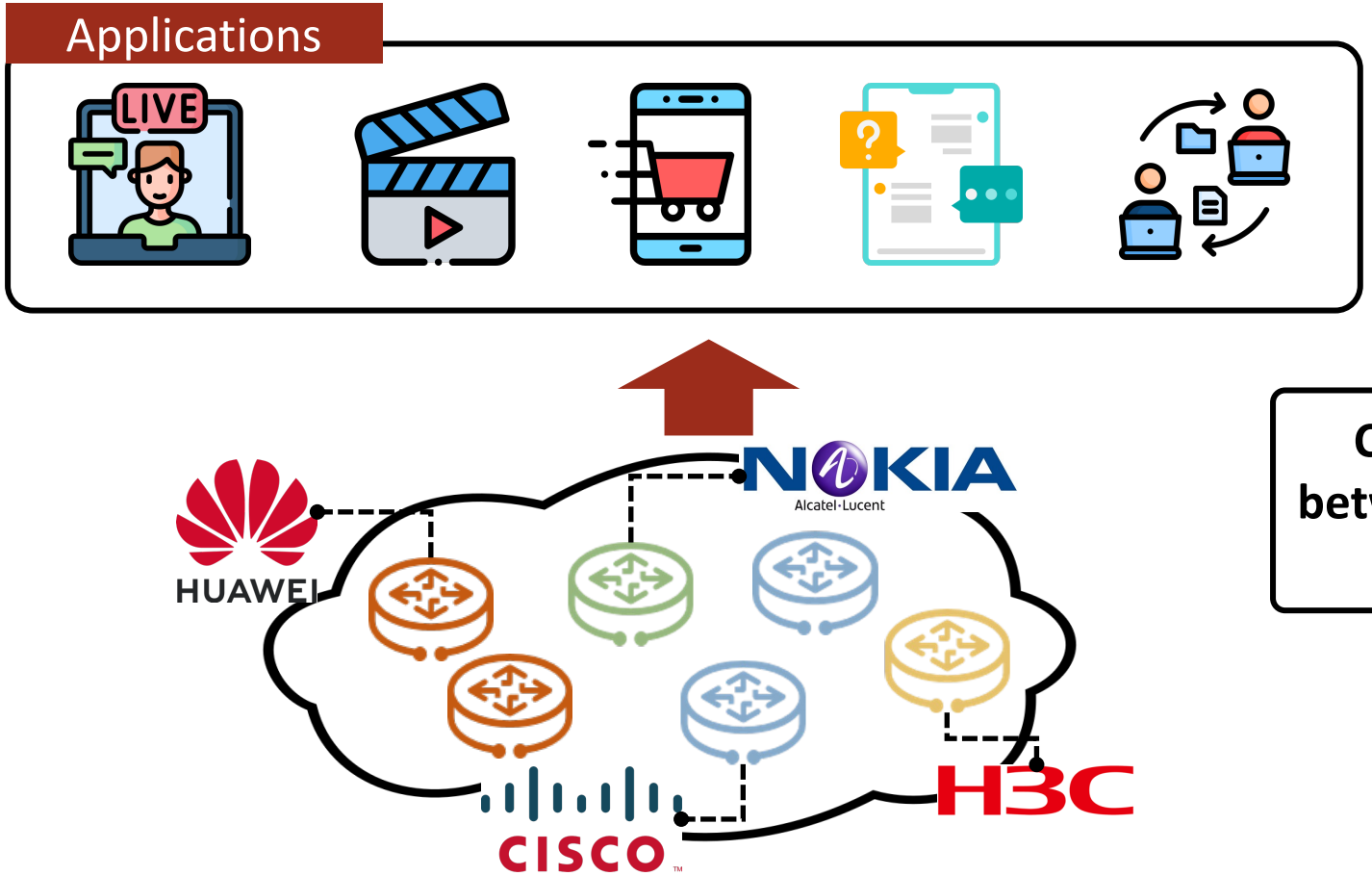

Competition between multiple vendors

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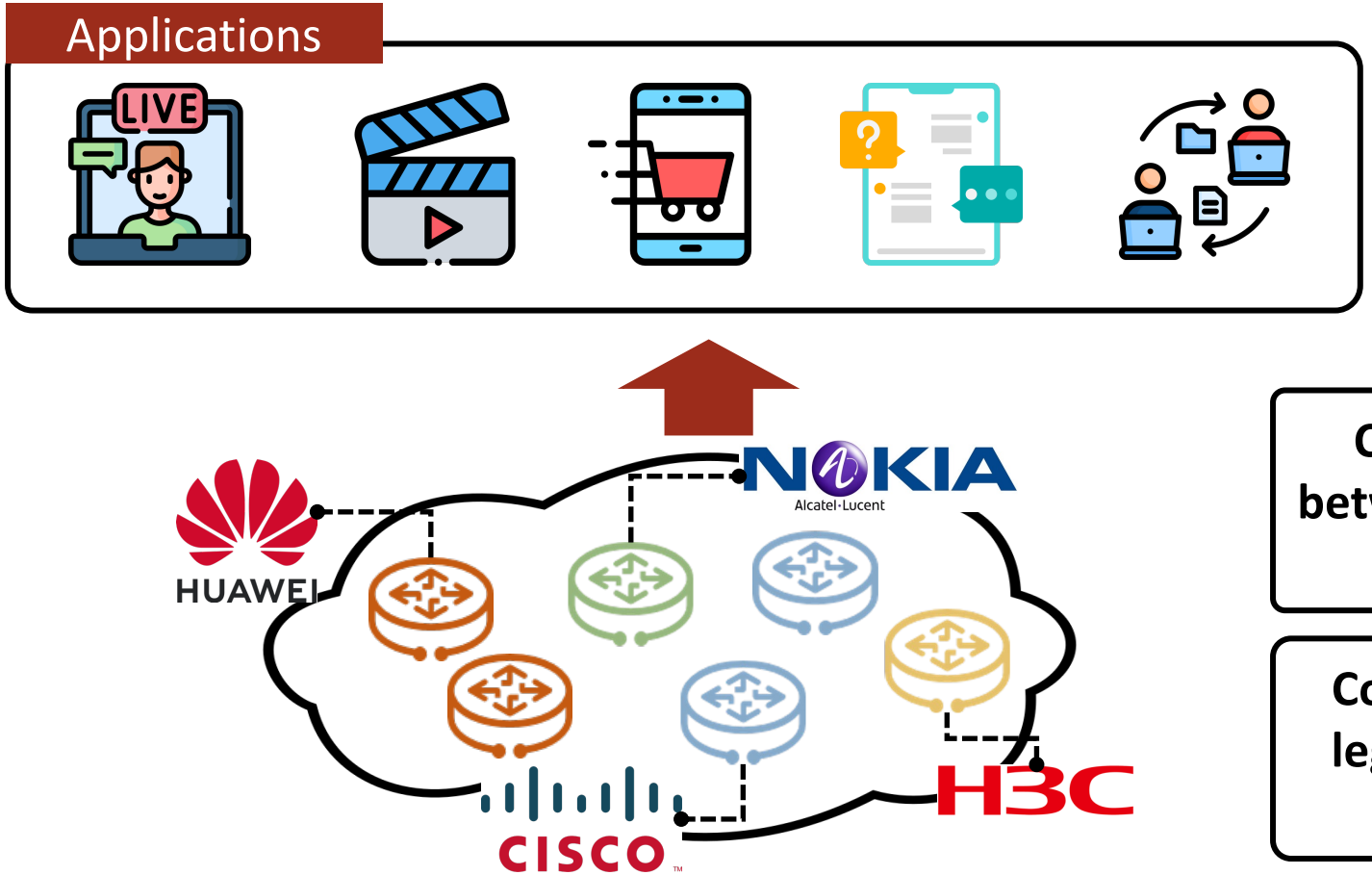

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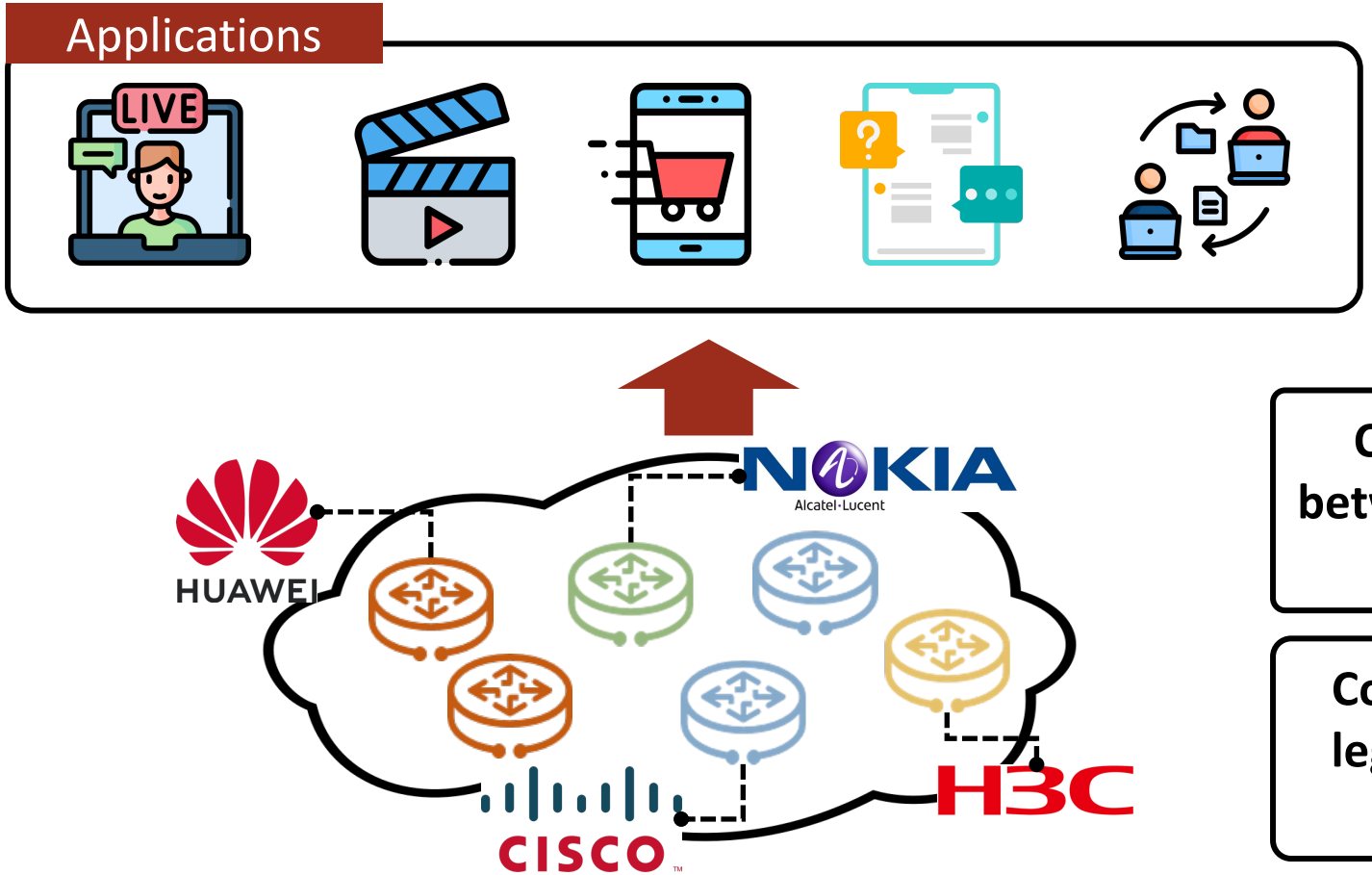

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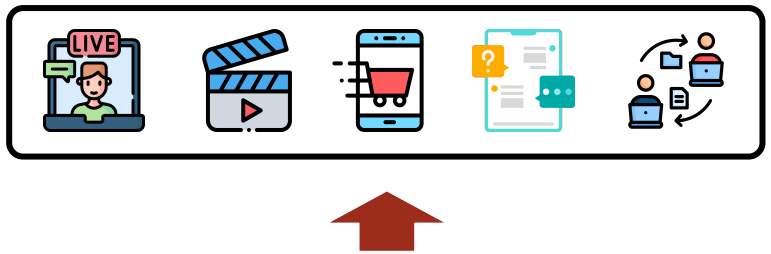

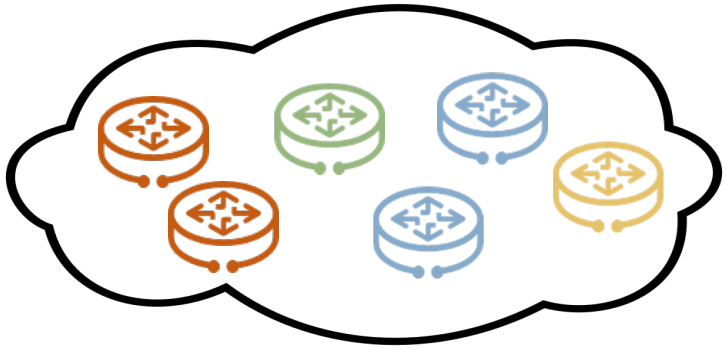

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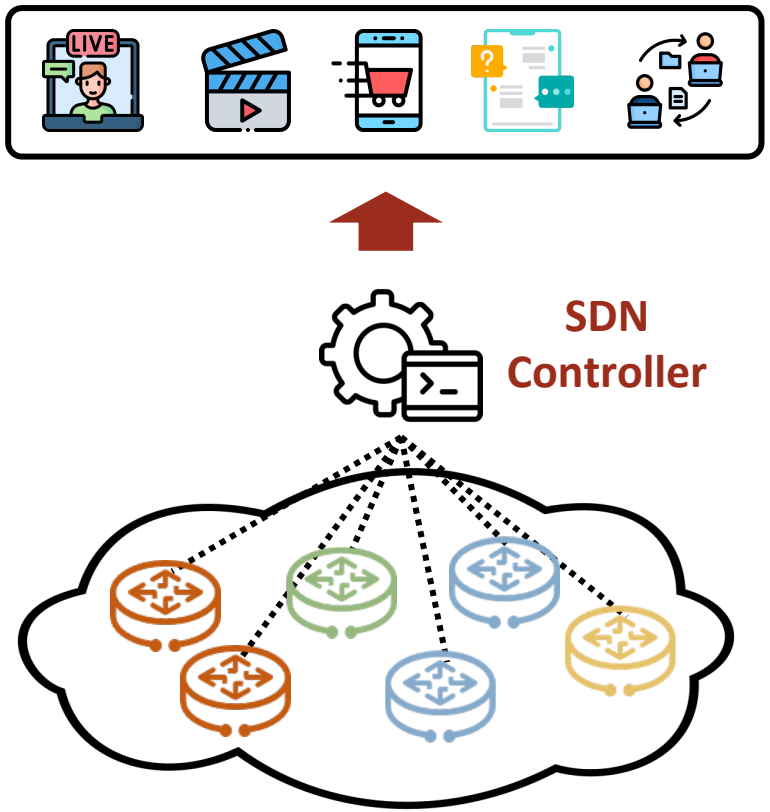

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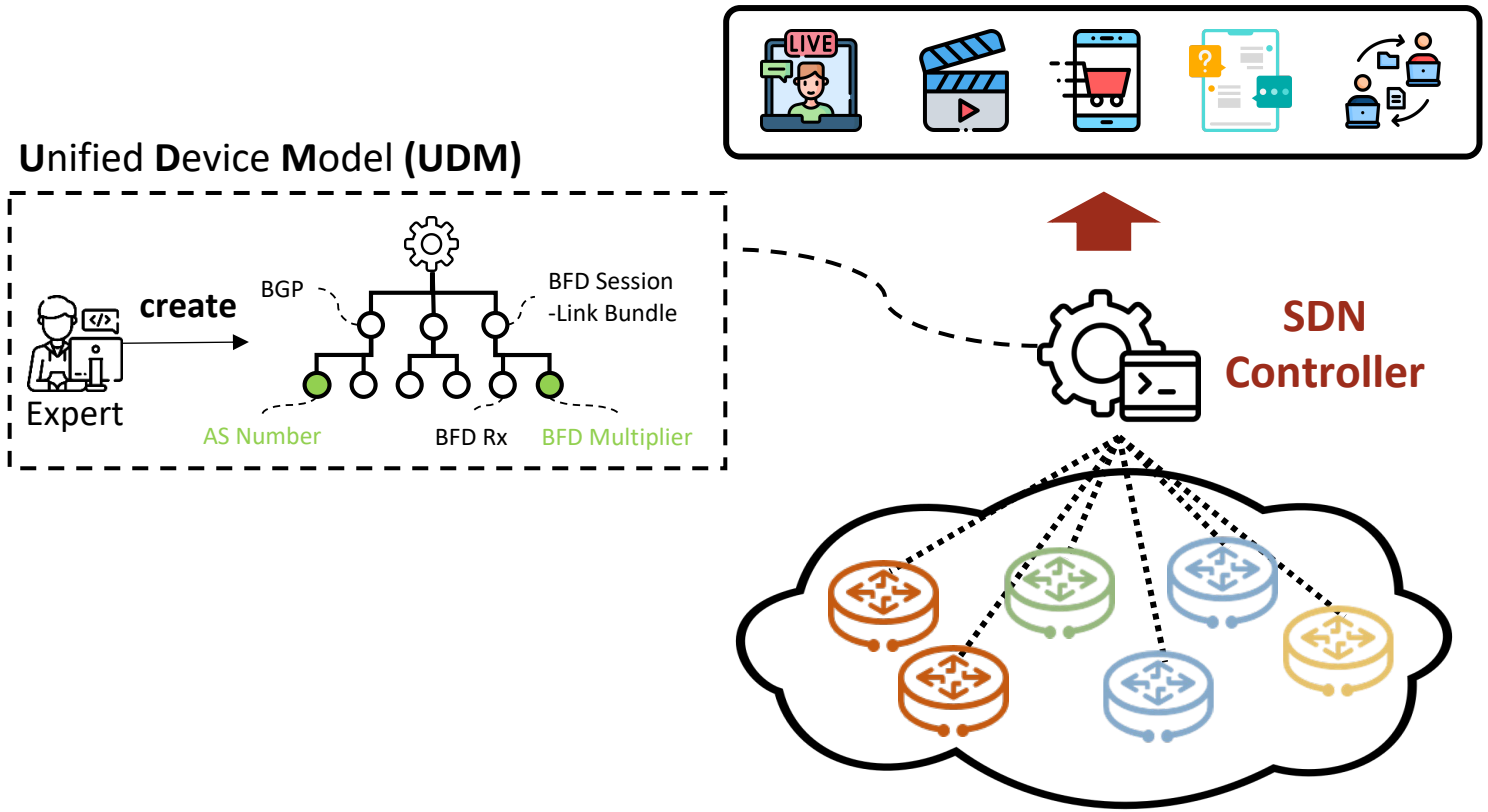

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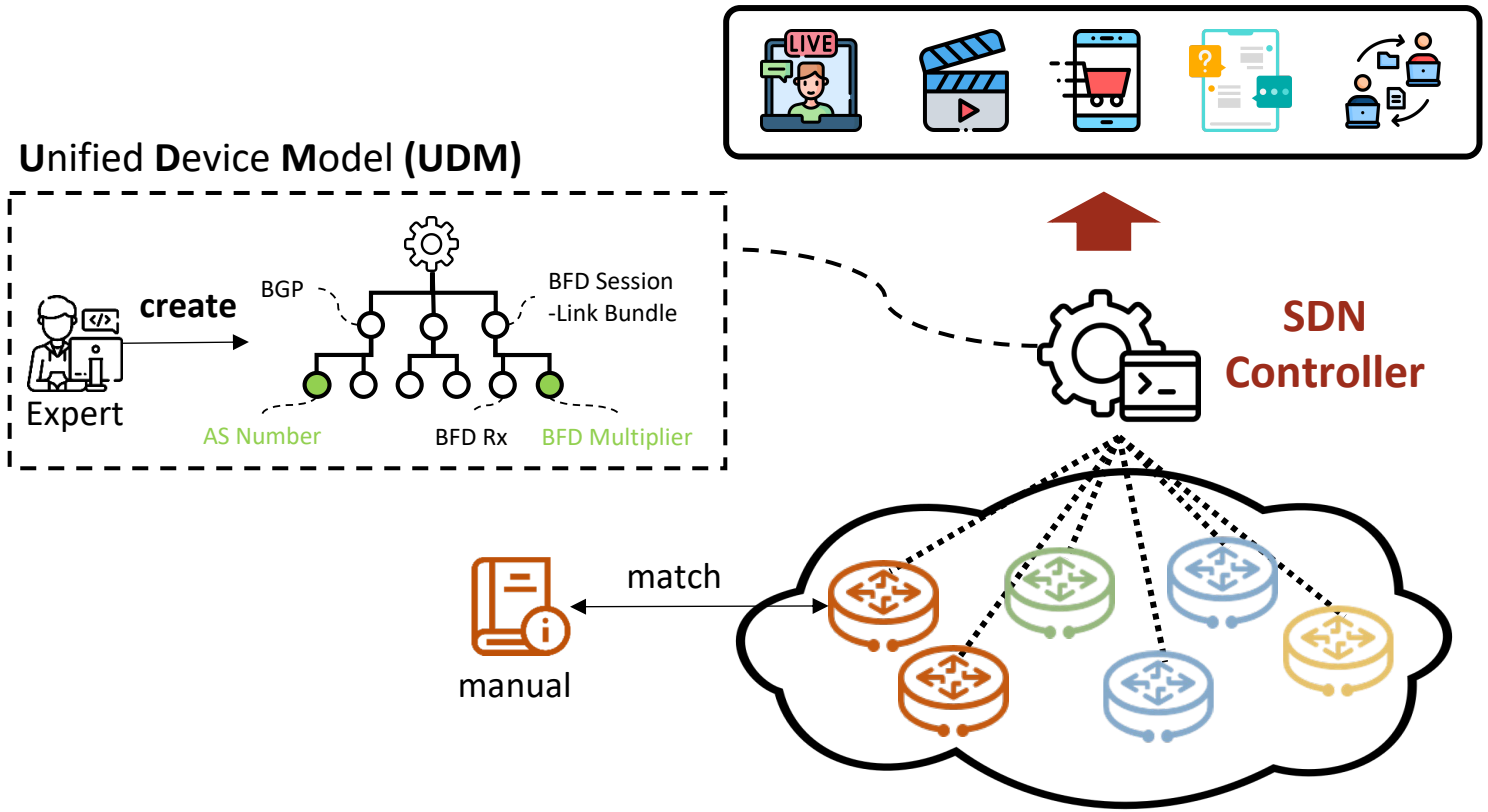

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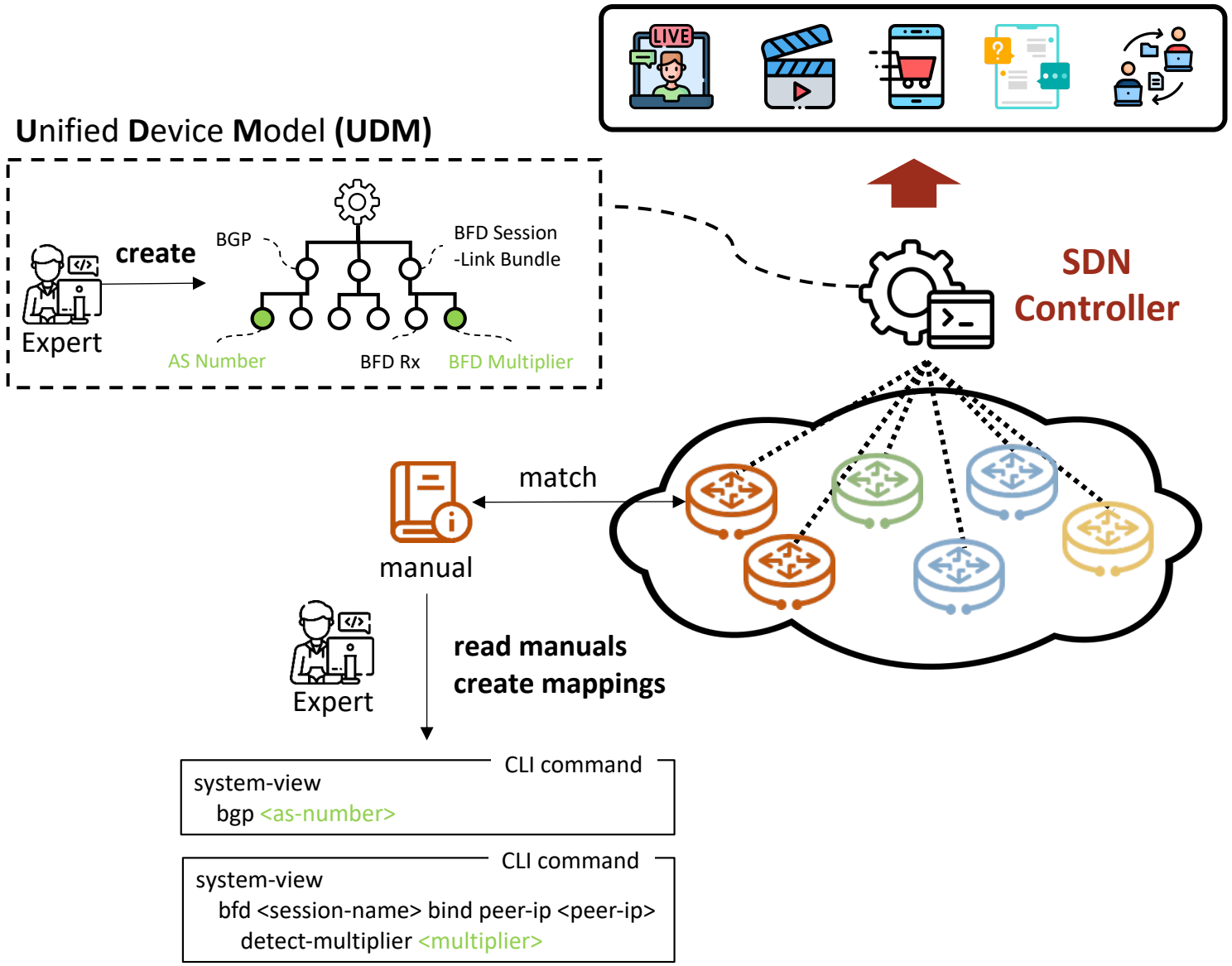

HUAWEI

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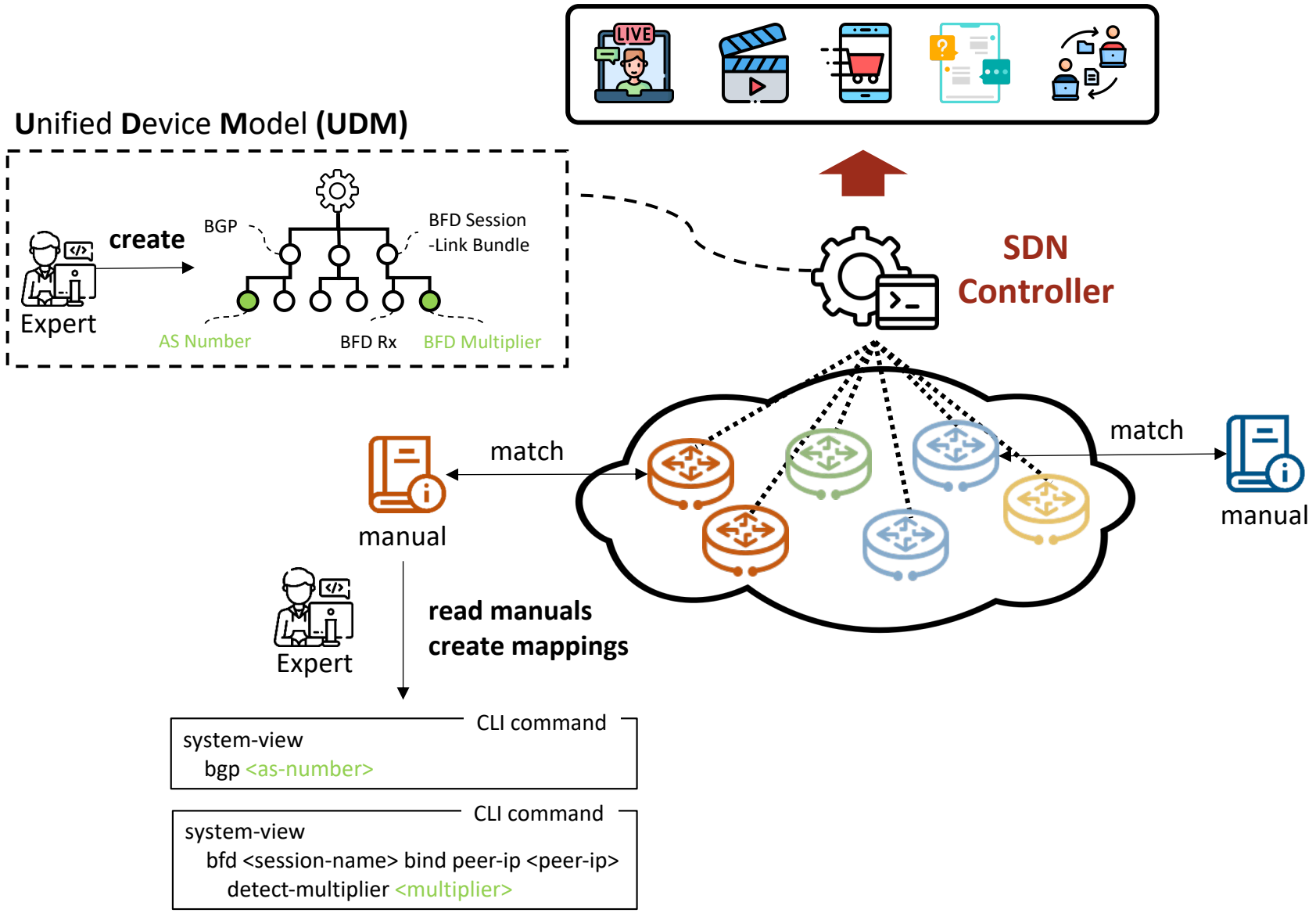

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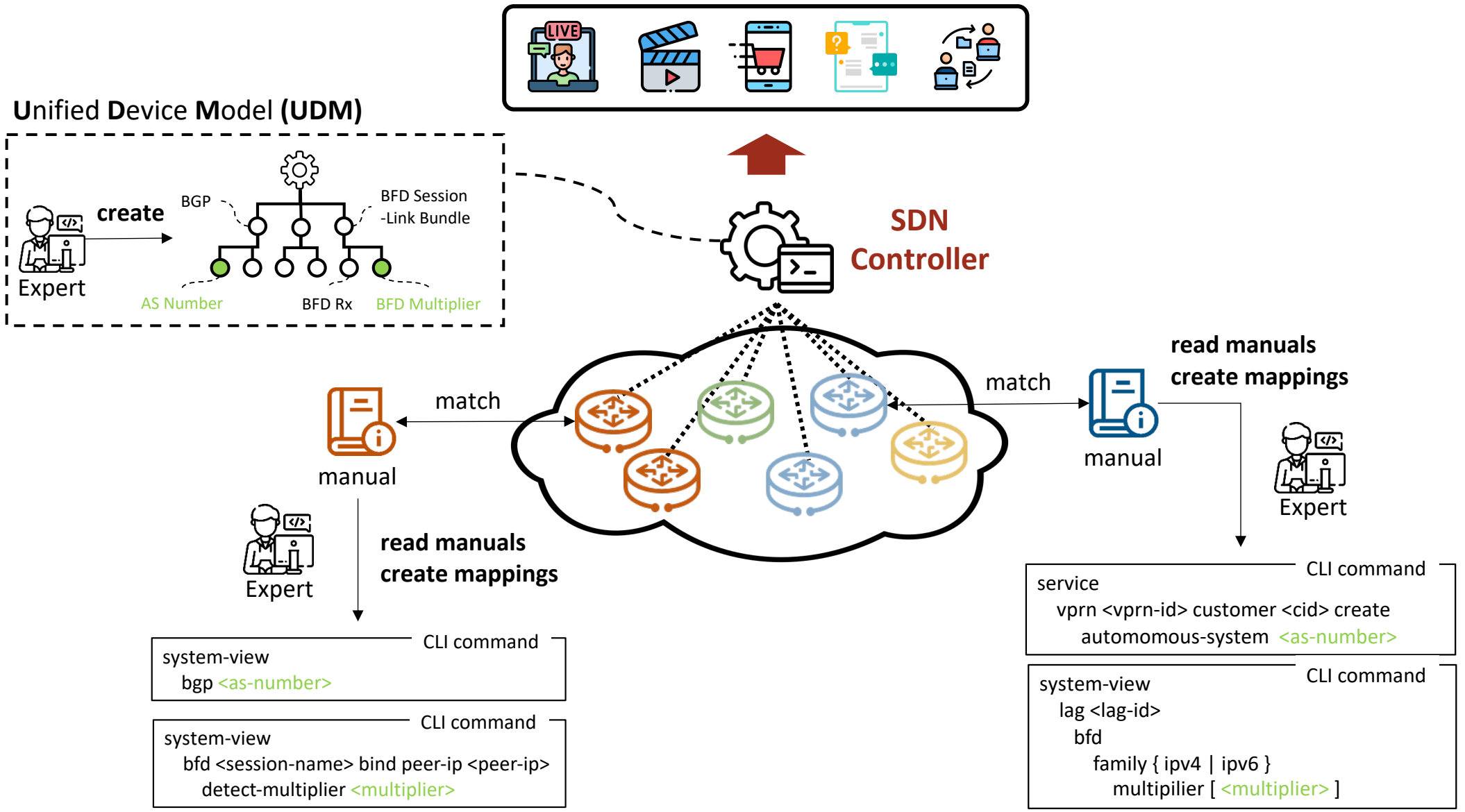

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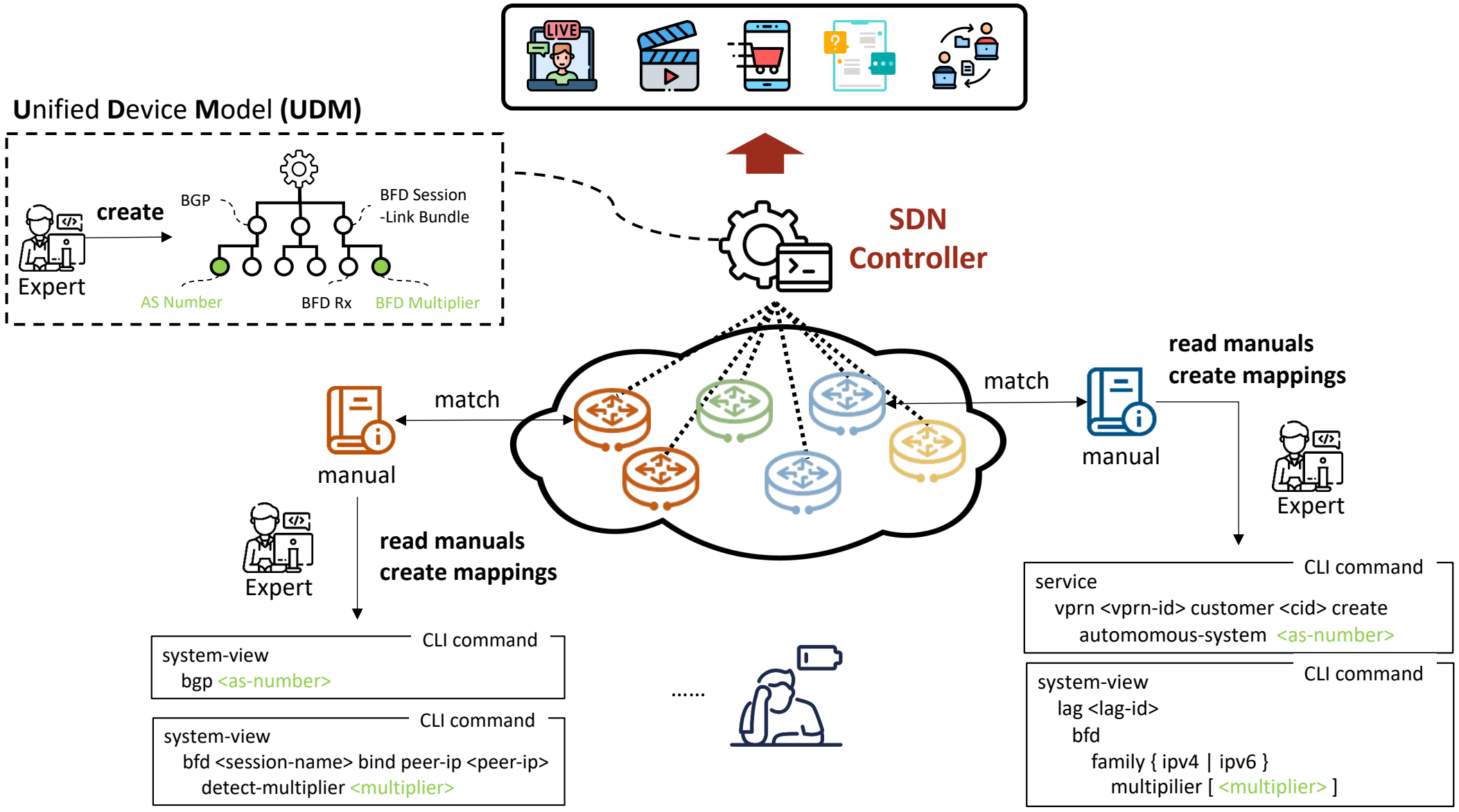

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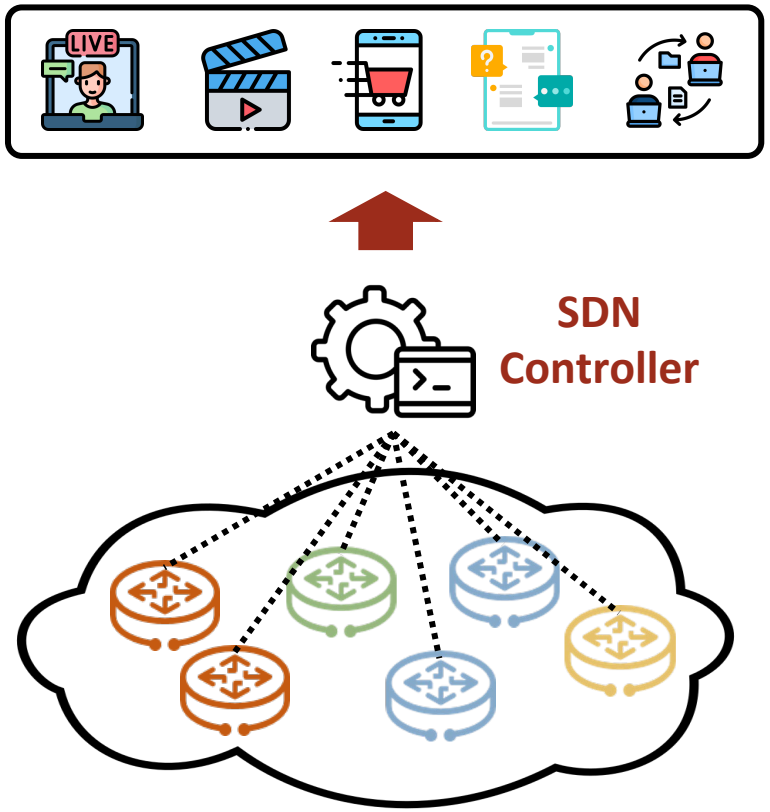
Current SNA approaches require significant human efforts



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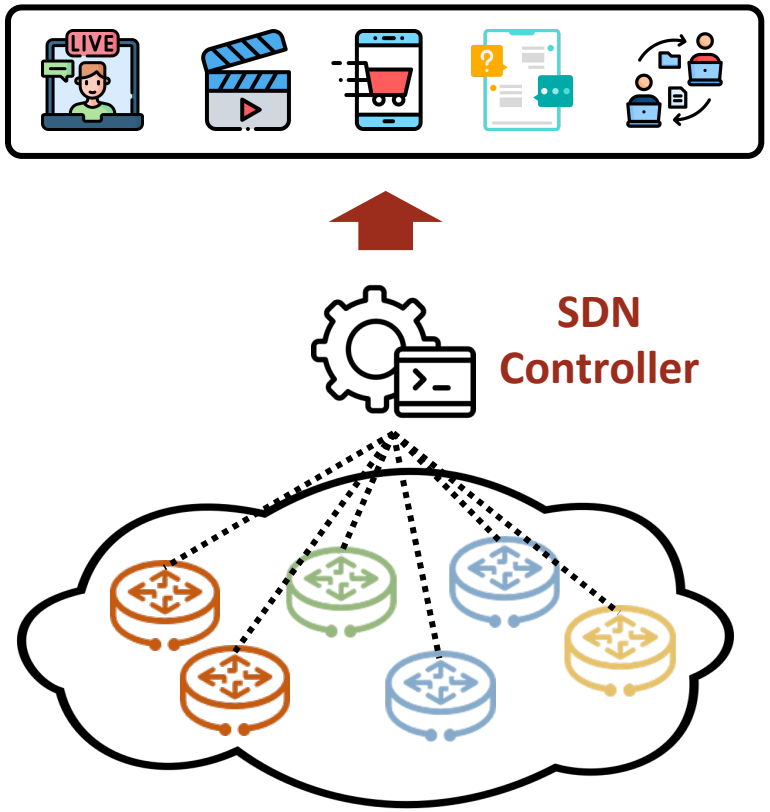

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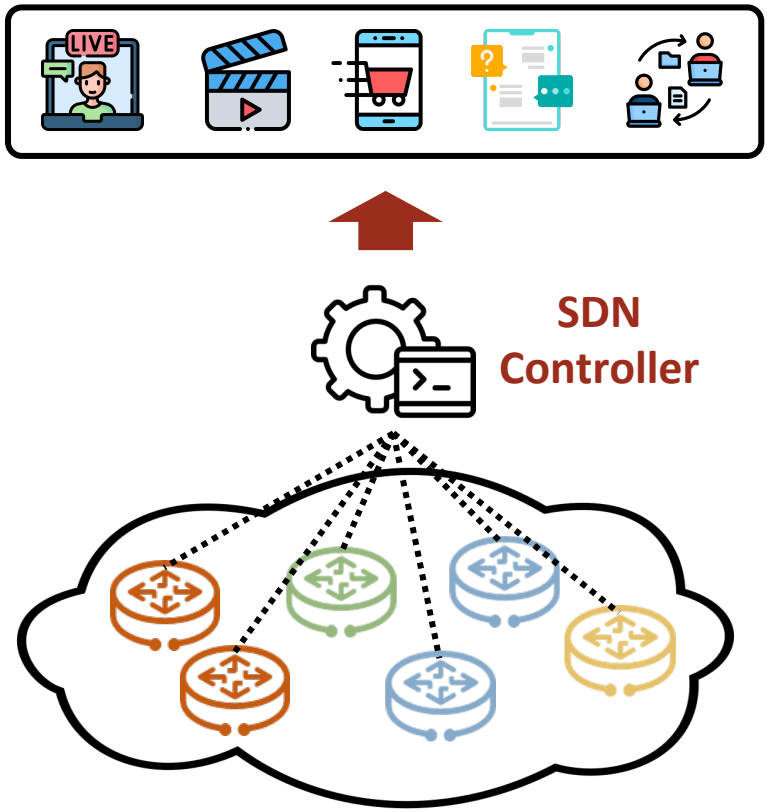
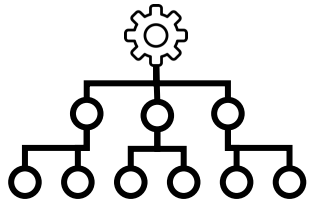


Unified **D**evice **M**odel **(UDM)**



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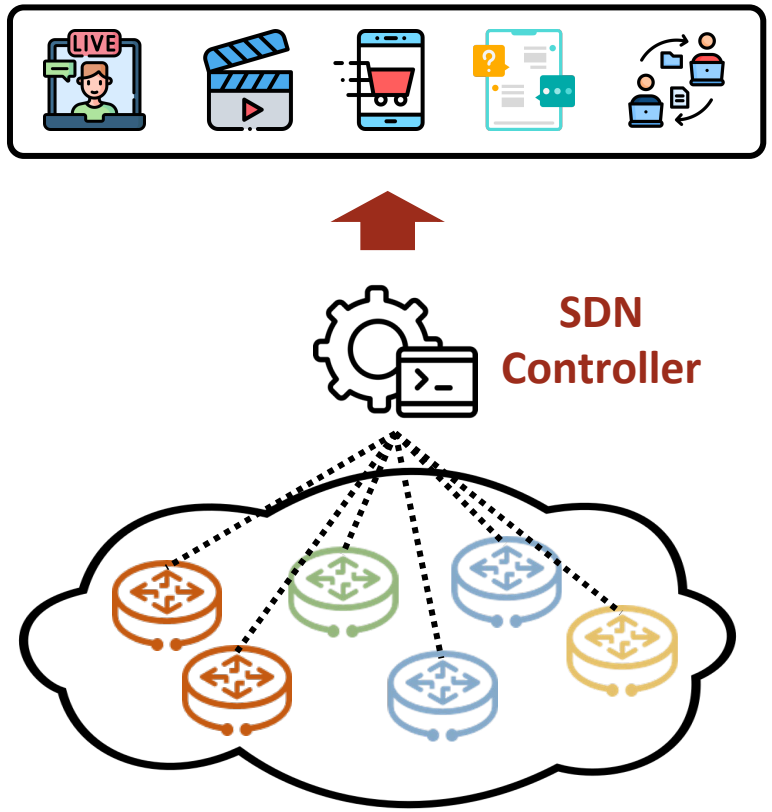

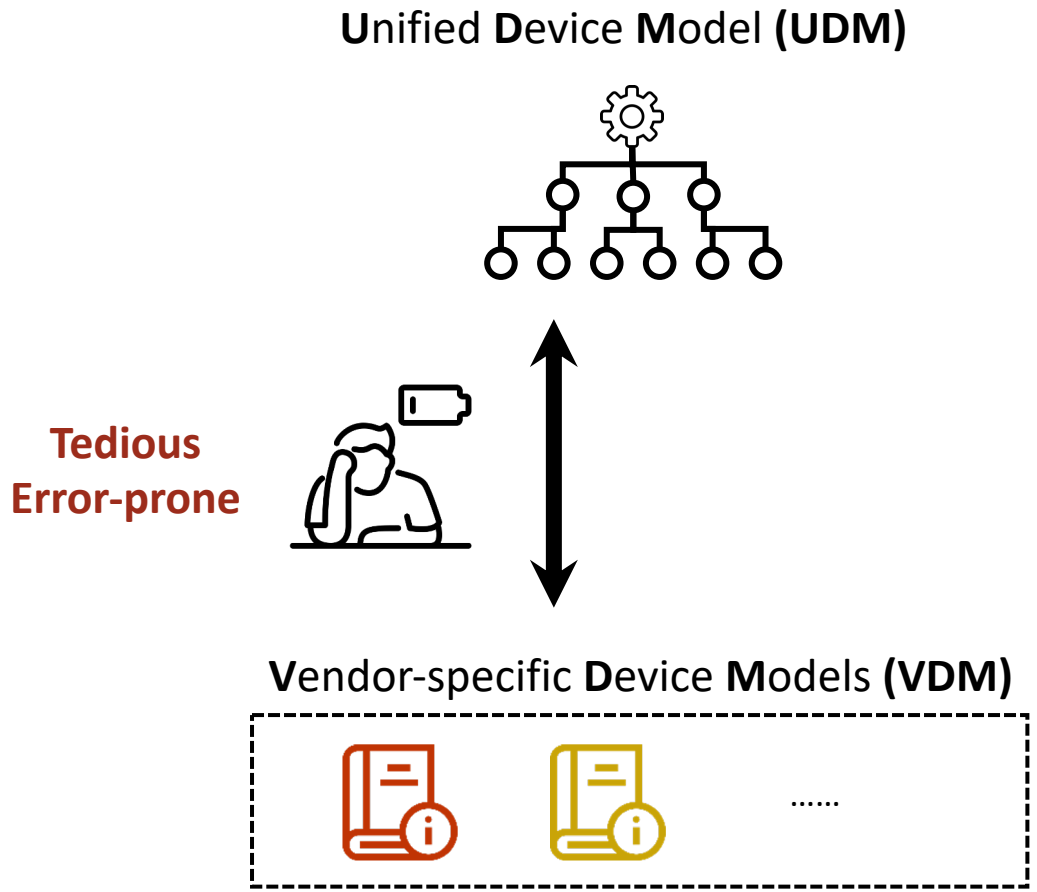

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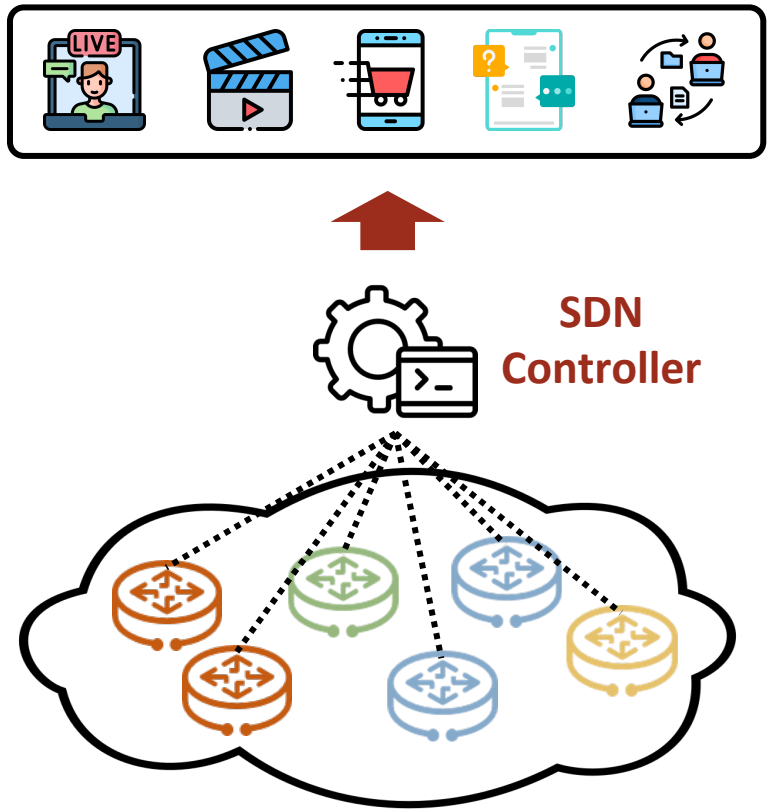

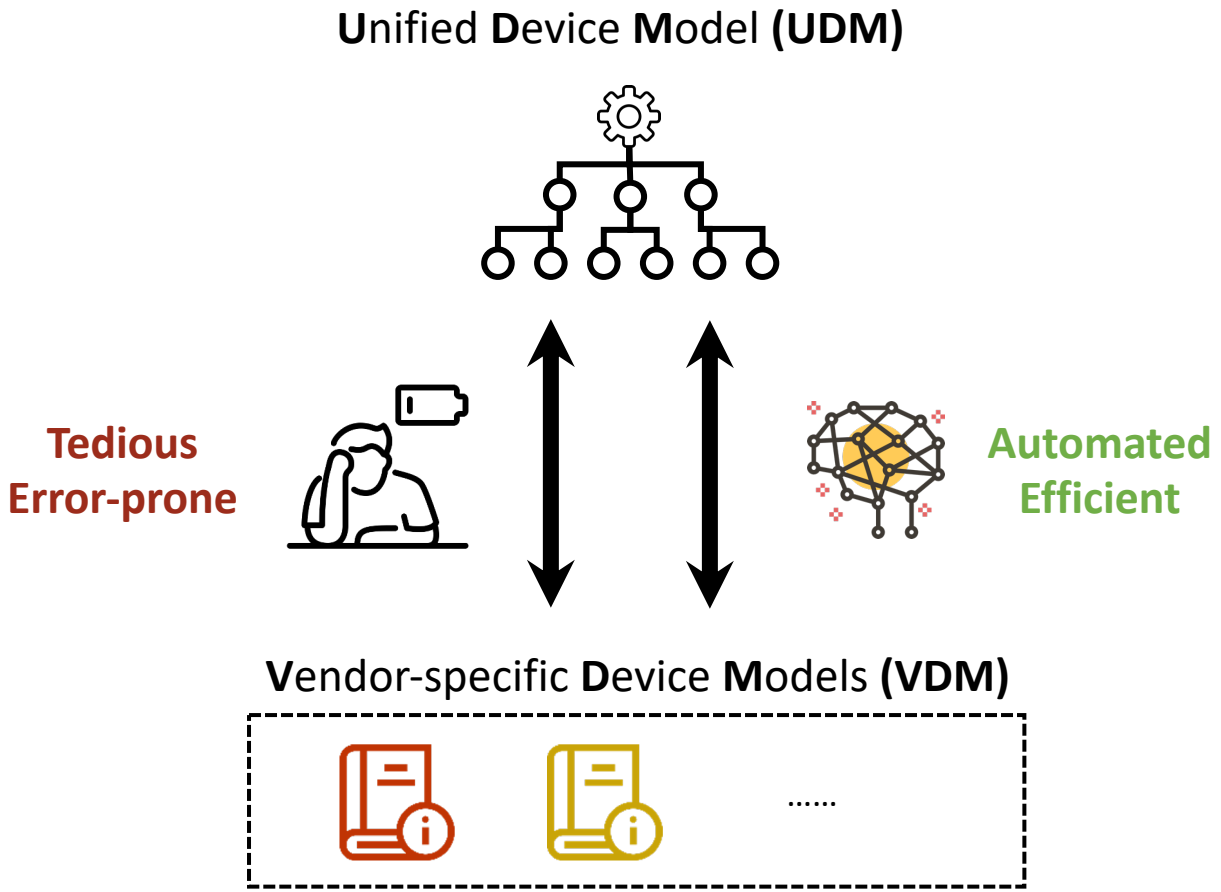

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Basic Insight: Imitating the Practices of NetOps

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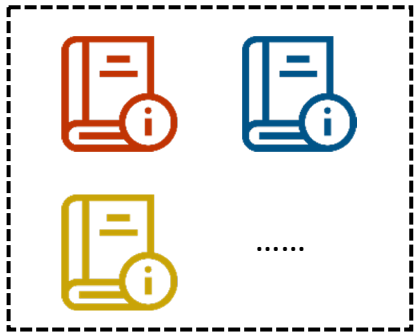

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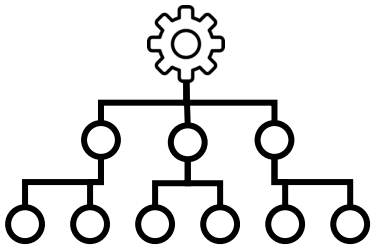

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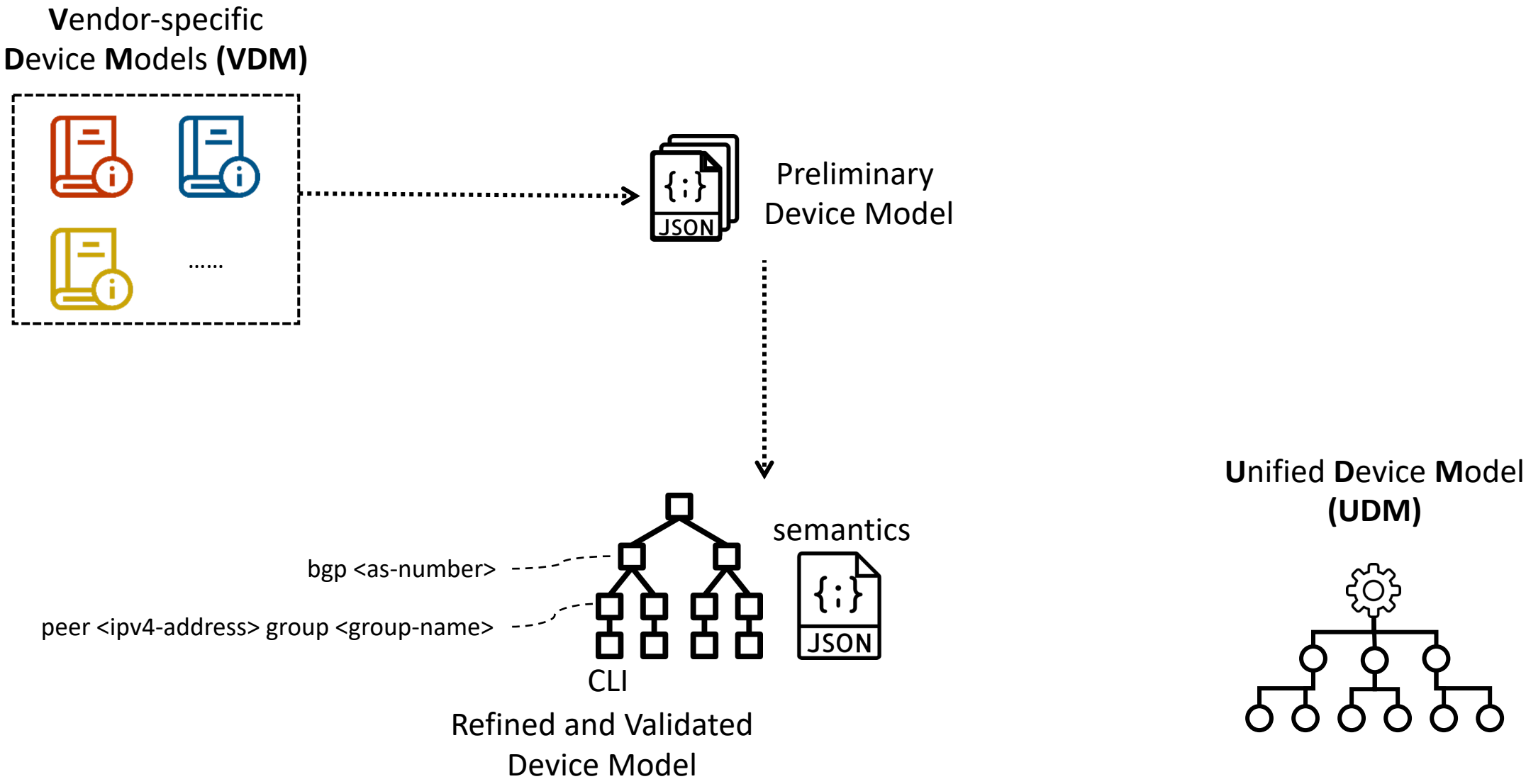

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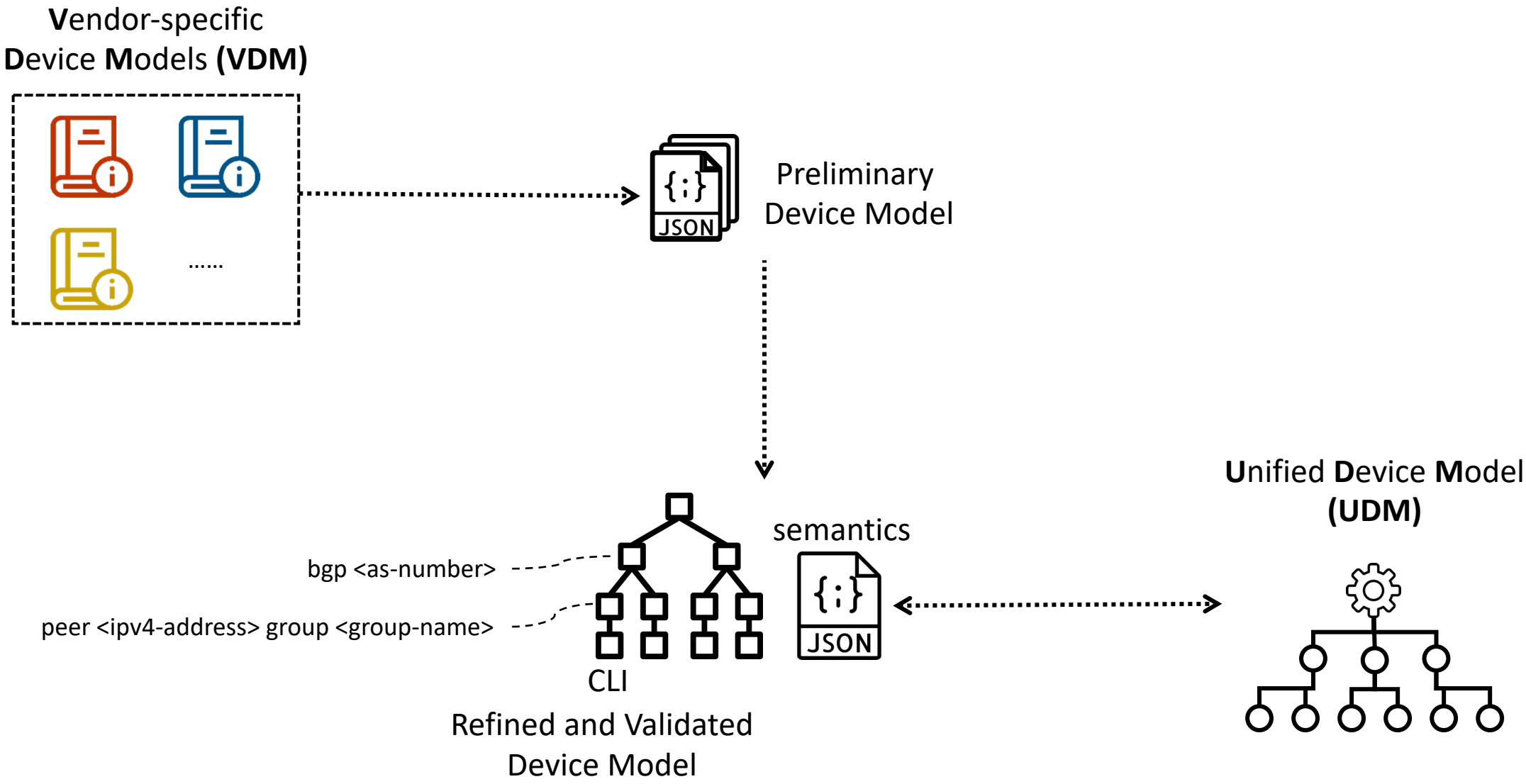
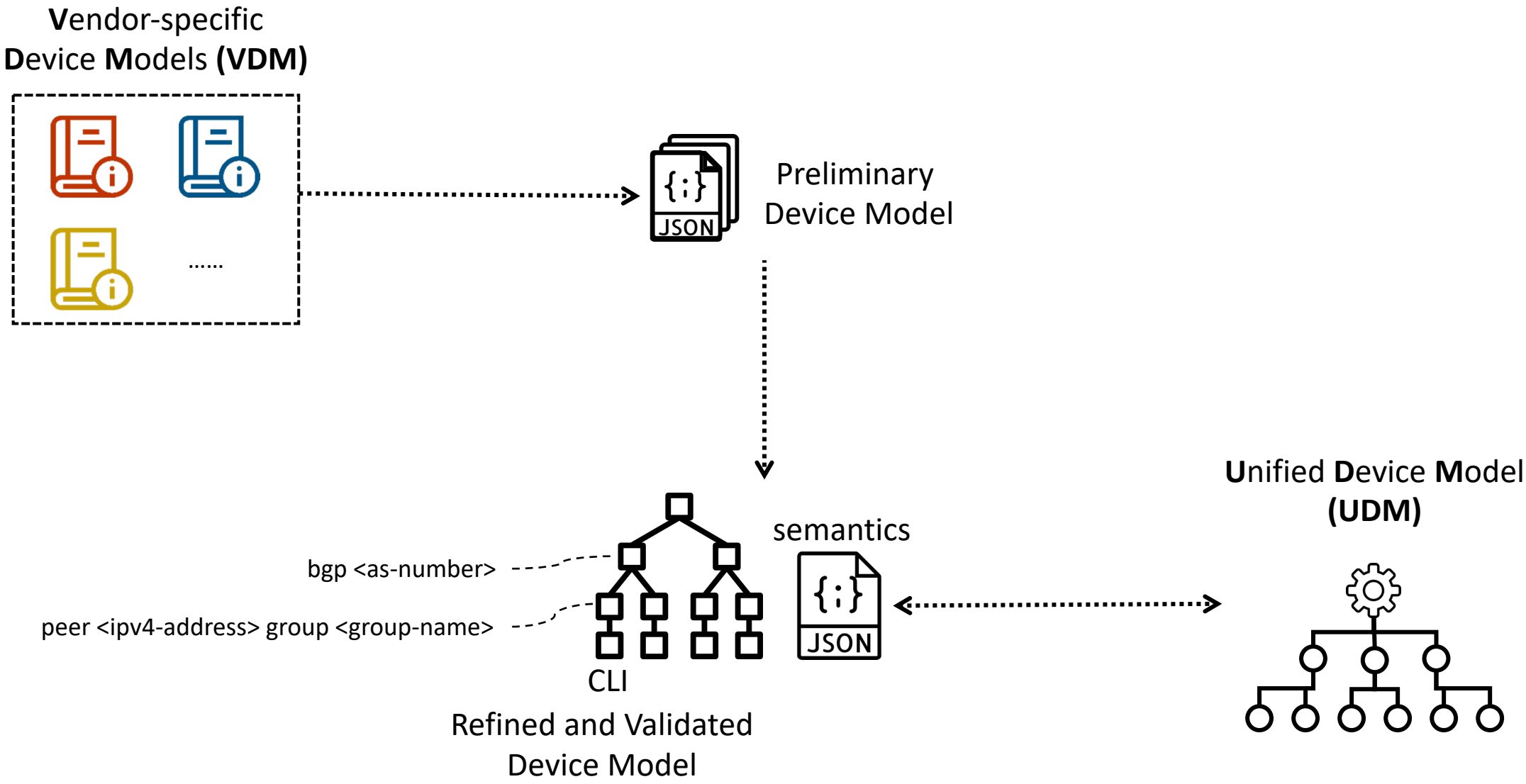


Challenges for SDN Network Assimilation (SNA)



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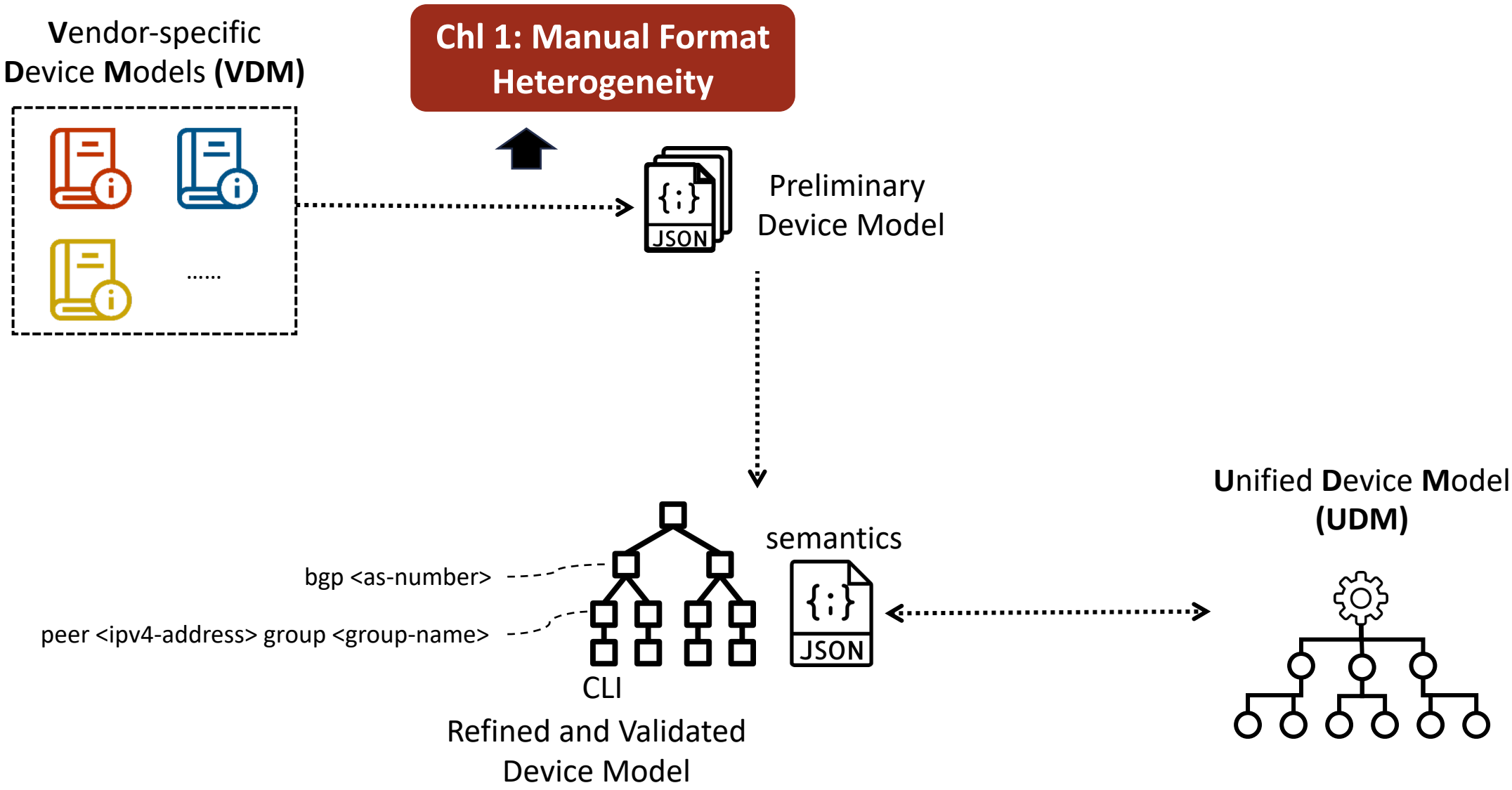

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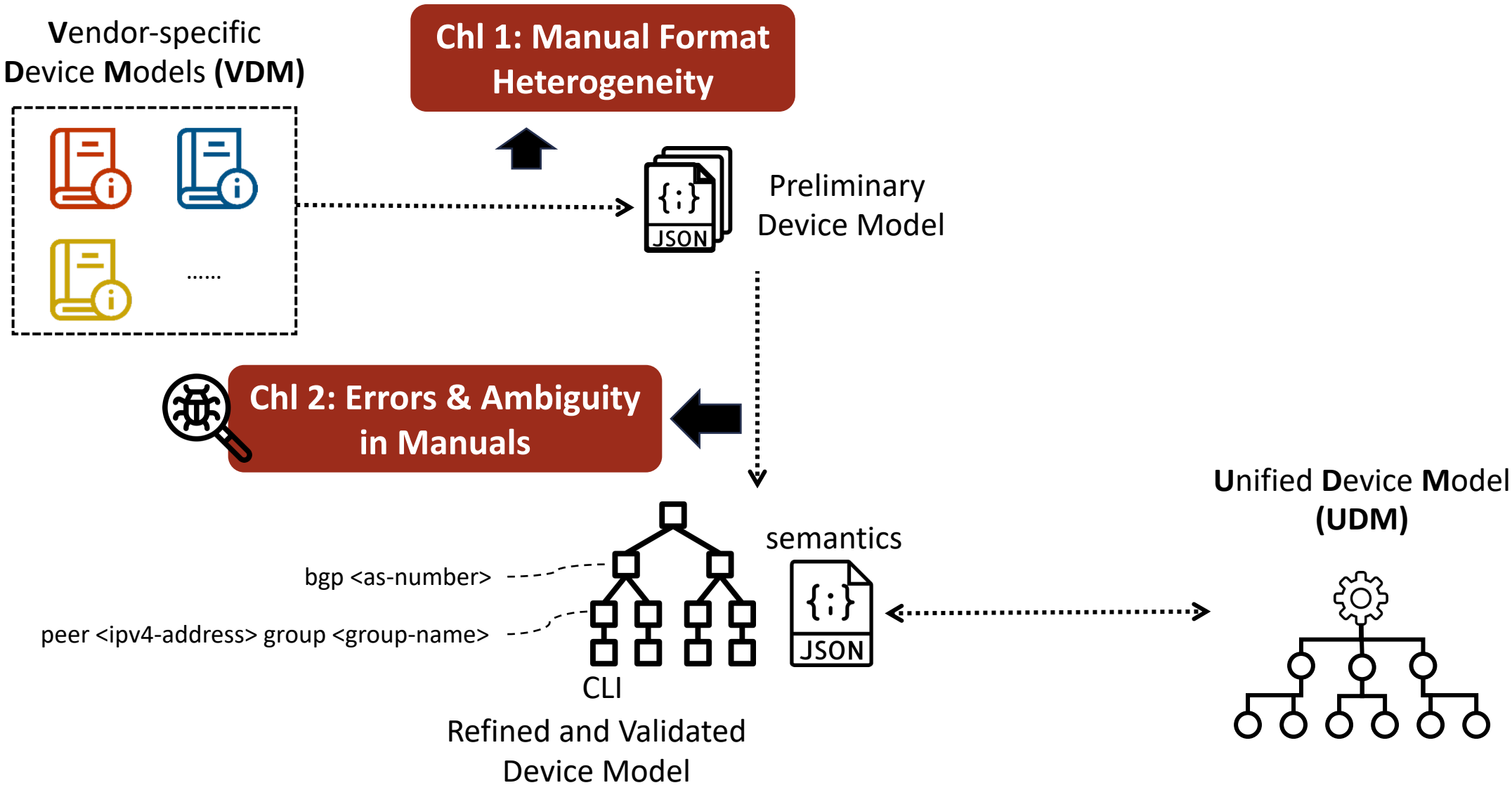

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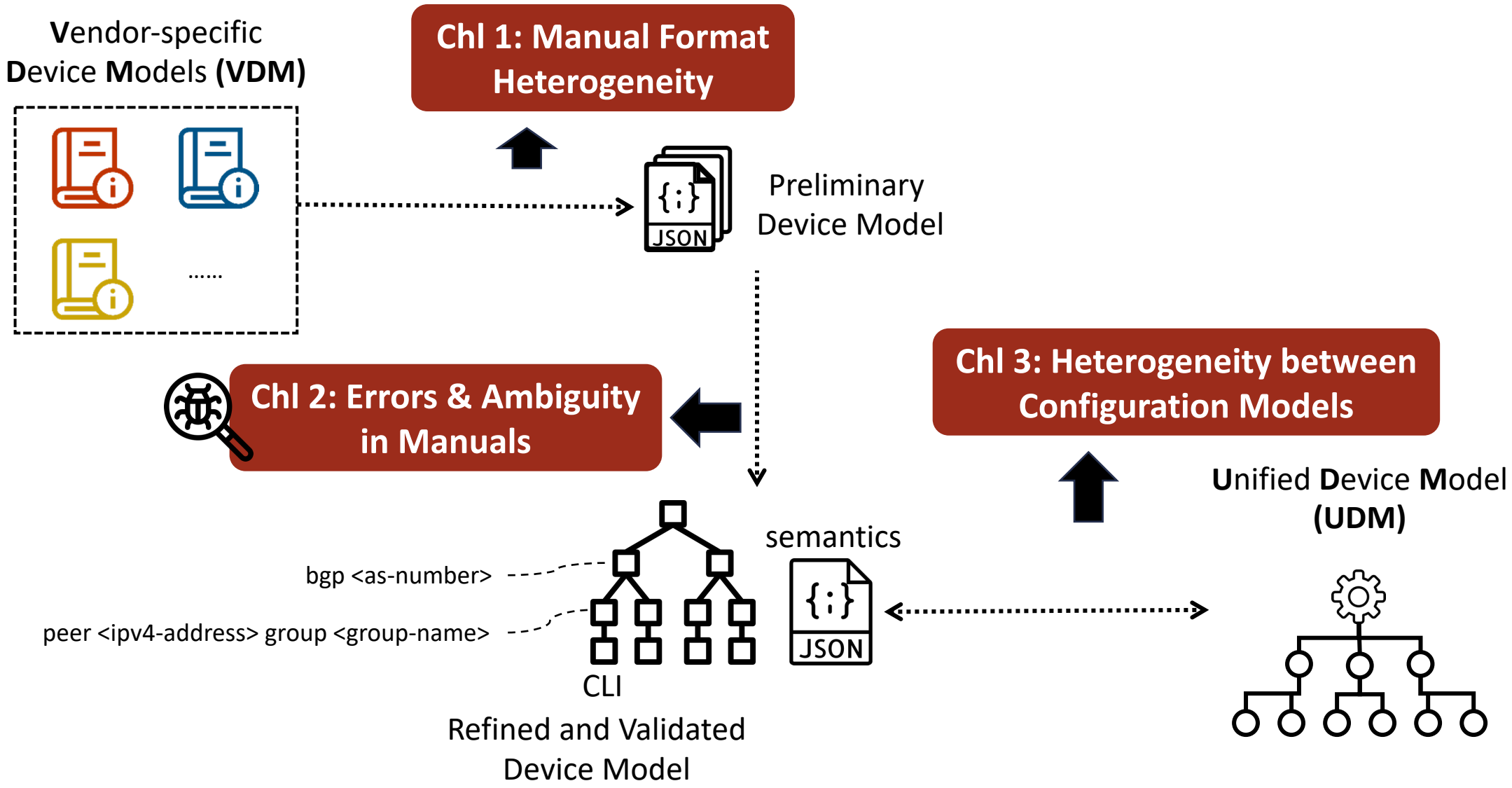

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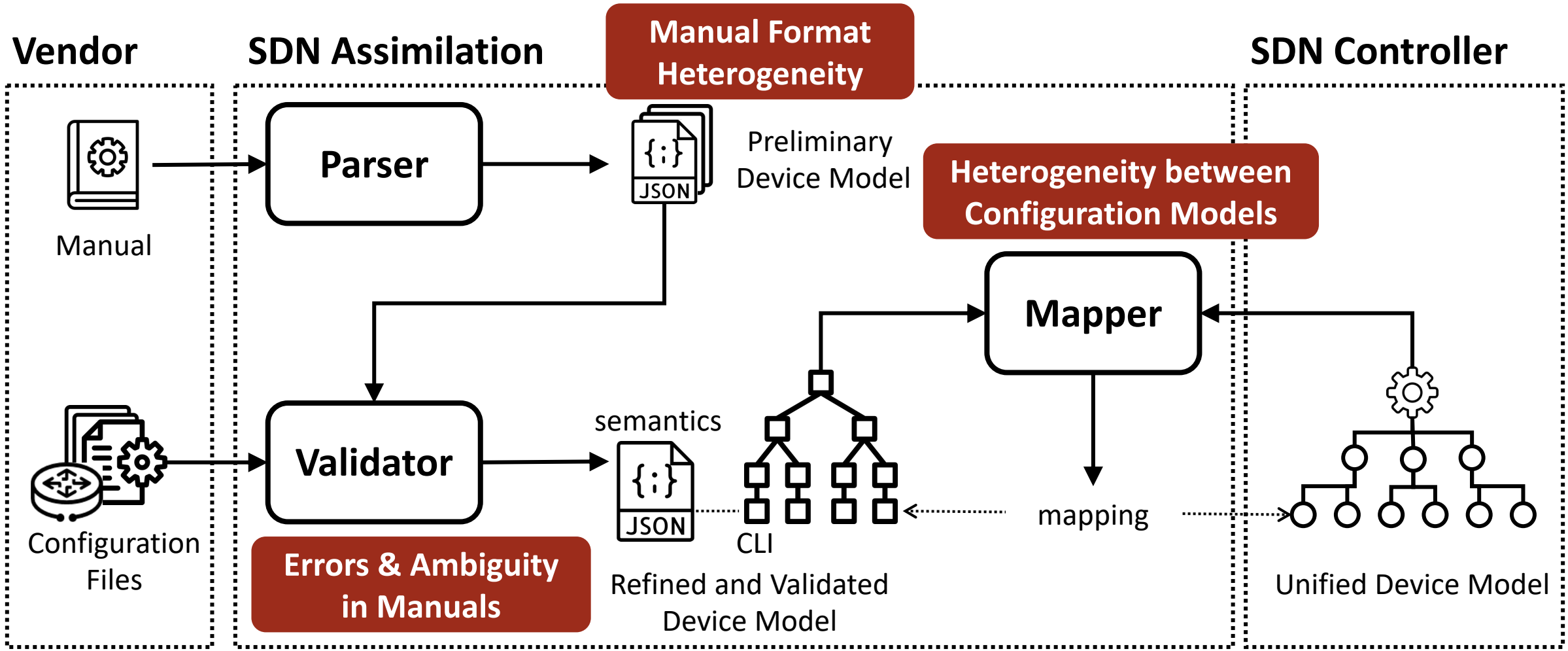
- Dataset: a validated and expert-curated dataset of parsed manual corpus for future research. (https://github.com/AmyWorkspace/nassim)

SDN Network Assimilation (NAssim) in a Nutshell



An Assistant Framework for Bridging the Last Mile Towards Centralized Network Configuration Management

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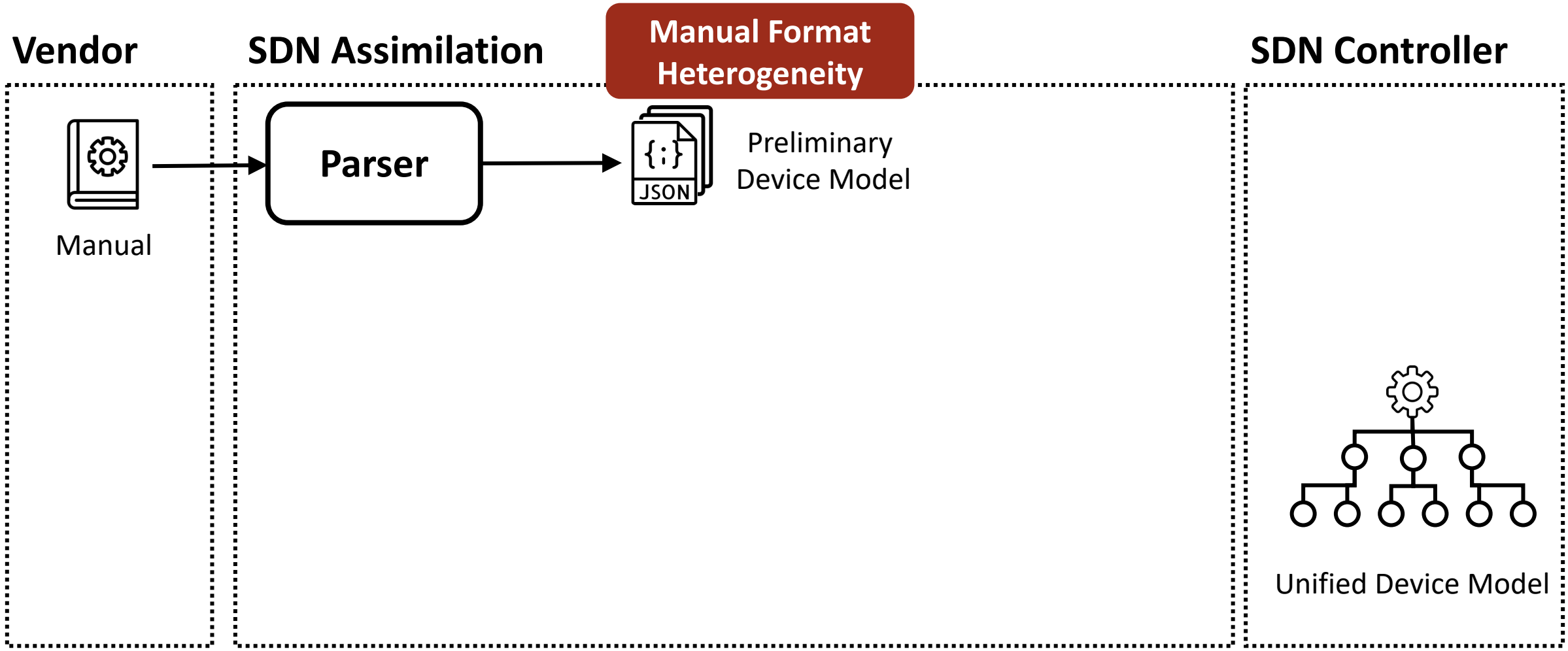

NAssim Parser Framework: Key Insights

the same concept may have different names

Attribute \ Vendor	Huawei	Cisco	Nokia	H3C
CLIs	<class="sectiontitle">Format	<class="pCE_CmdEnv">	<class="SyntaxHeader">Syntax	<class="Command">Syntax
FuncDef	<class="sectiontitle">Function	<class="pB1_Body1>	<class="DescriptionHeader">Description	<class="Command">Description
ParentViews	<class="sectiontitle">Views	<class=pCRCM_CmdRefCmdModes> Command Modes	<class="ContextHeader">Context	<class="Command">View
ParaDef	<class="sectiontitle">Parameters	<class="pCRSD_CmdRefSynDesc"> Syntax Description	<class="ParametersHeader">Parameters	<class="Command">Parameters
Examples	<class="sectiontitle">Examples	<class="pCRE_CmdRefExample"> Examples	/	<class="Command">Examples

Table 1: Diversity of Device User Manuals: The 'CLIs' field denotes the formal syntax of CLI commands, which are command templates with place-holder parameters and special characters to specify selection or optional branches. The 'ParaDef' field contains the implication and value range of place-holder parameters. The 'FuncDef' field describes the functionality of the complete CLI. The 'ParentViews' field indicates the parent/working views of CLIs, *i.e.*, one CLI may have multiple viable working views. The 'Examples' field shows examples of common snippets, *e.g.*, entering a parent view and issuing an instantiated CLI.

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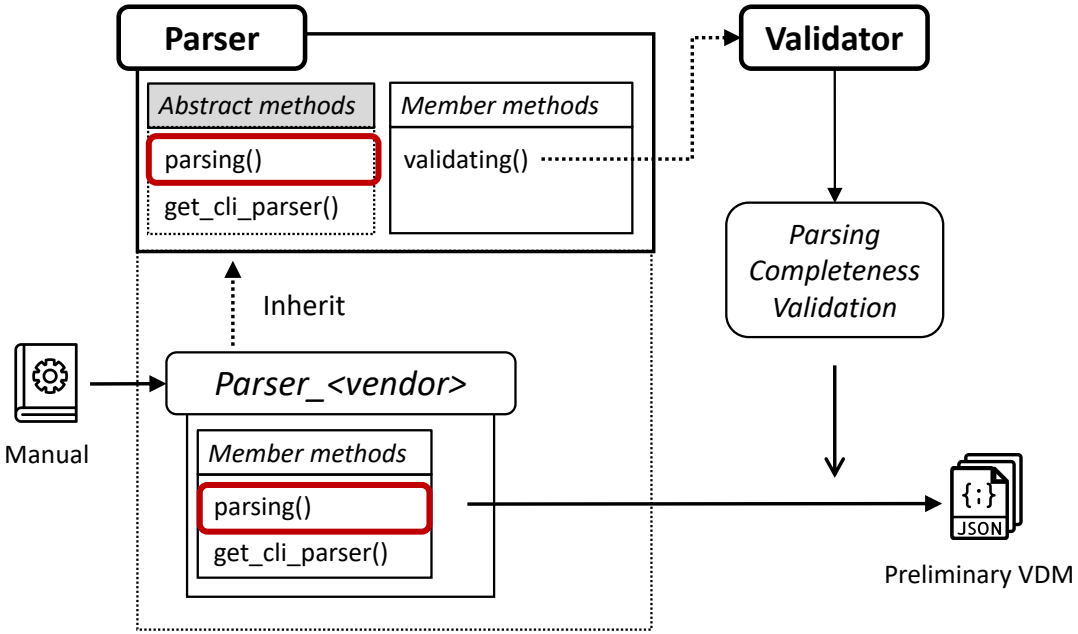

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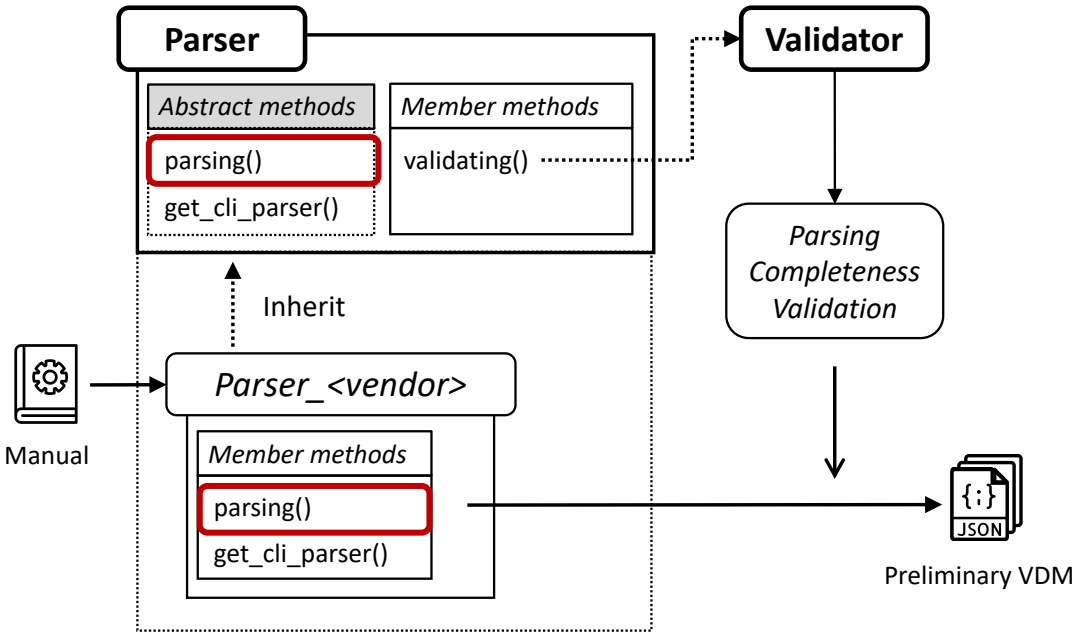

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Format Definition of Vendor-Independent Corpus (JSON)

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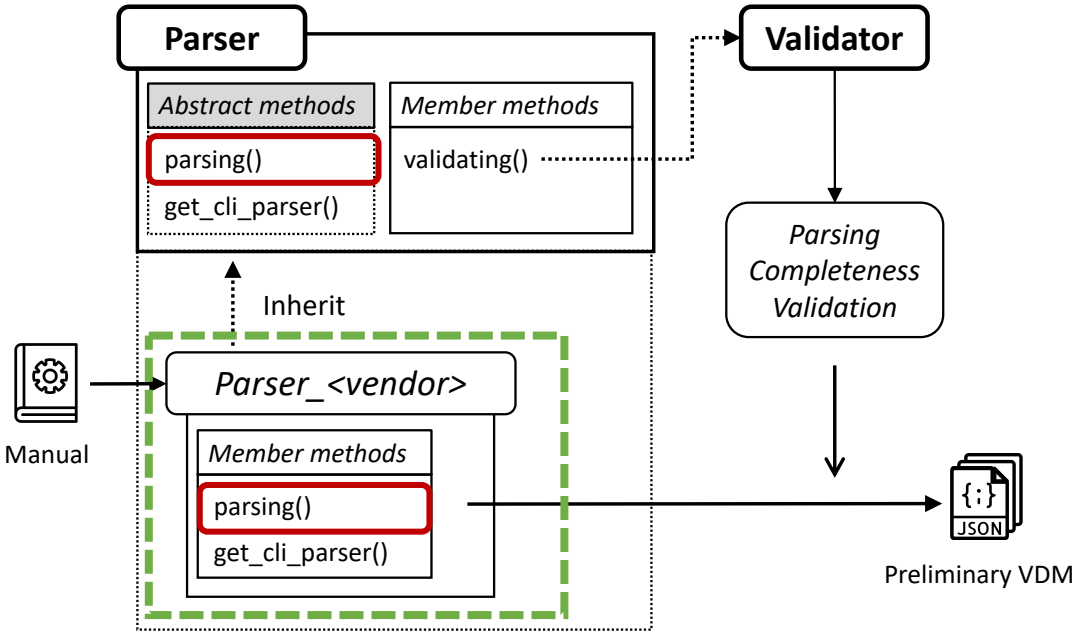

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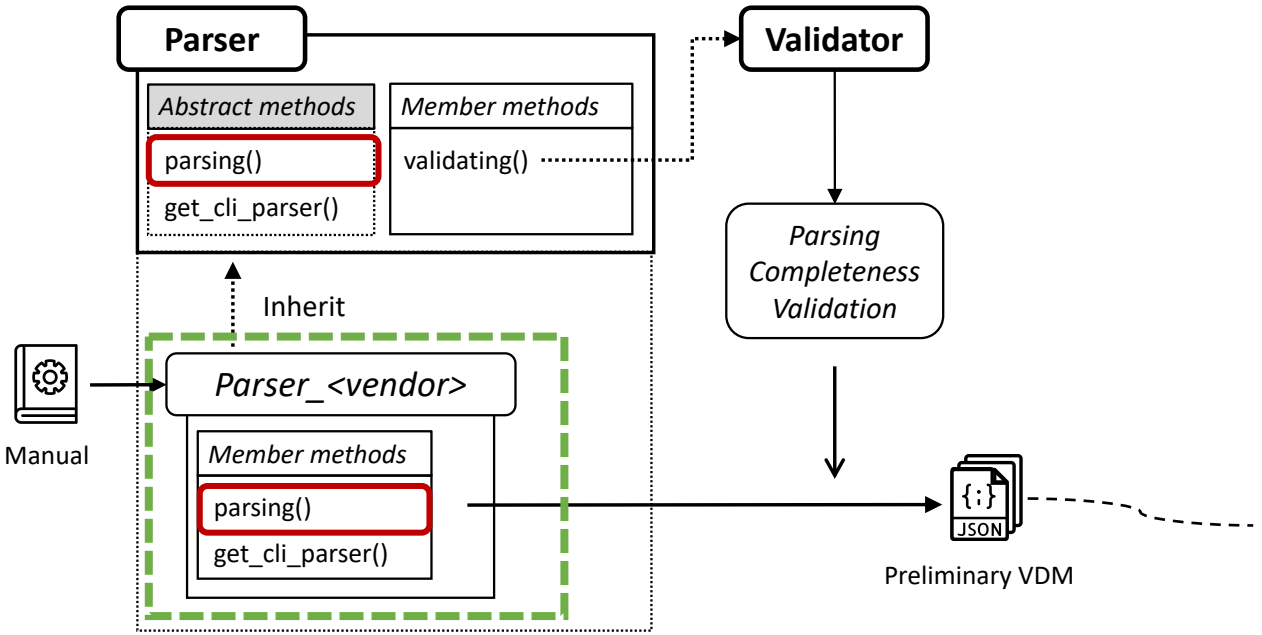

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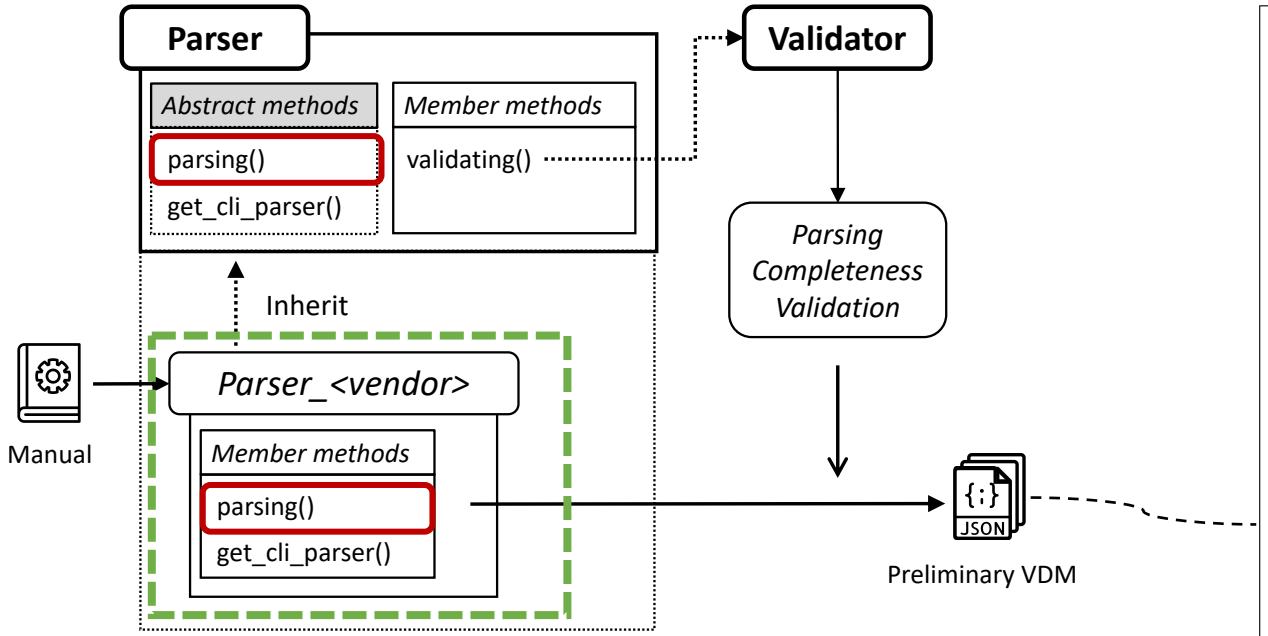

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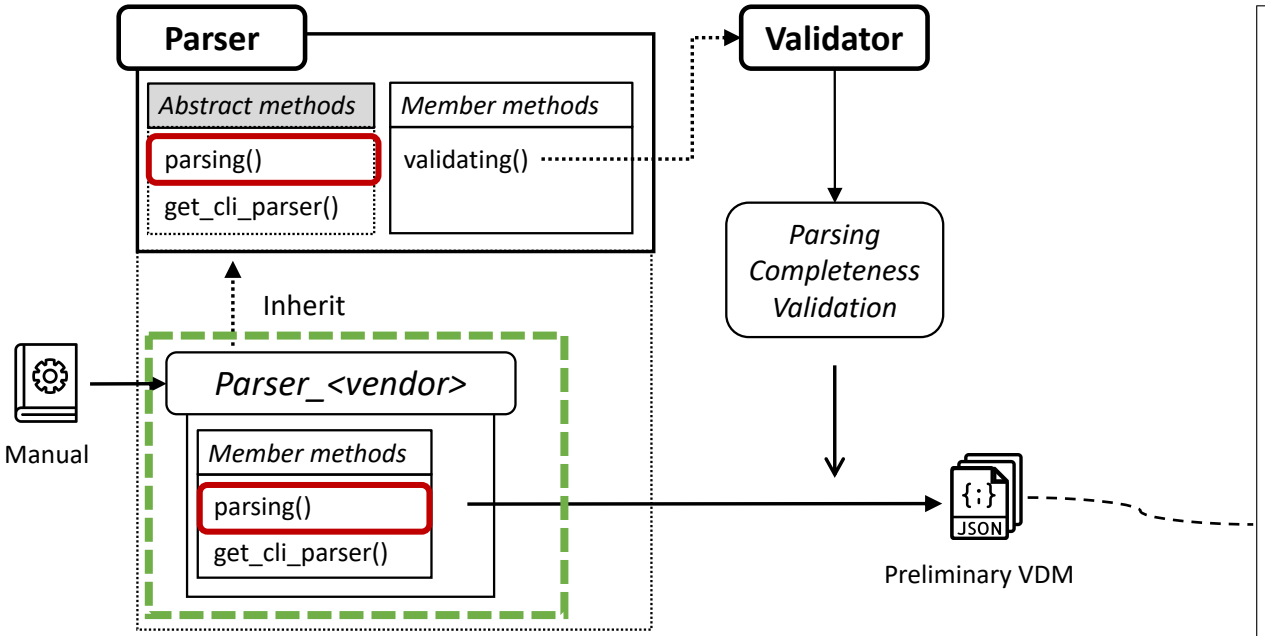
```
{
 "CLIs": [
  "peer <ipv4-address> group <group-name>",
  "undo peer <ipv4-address> group <group-name>"
 ],
 "FuncDef": "The peer group command adds a peer to a peer. The undo peer group command deletes a peer from a peer group and all configurations of the peer. By default, no peer group is created",
 "ParentView": ["BGP view"],
 "ParaDef": [
  {"Parameters": "ipv4-address",
   "Info": "Specifies the IPv4 address of a peer. It is in dotted decimal notation."},
  {"Parameters": "group-name",
   "Info": "Specifies the name of a peer group. The name is a string of 1 to 47 case-sensitive characters, with spaces not supported."}
 ],
 "Examples": [
  ["<HUAWEI> system-view",
   "[~HUAWEI] bgp 100",
   "[*HUAWEI-bgp] group test internal",
   "[*HUAWEI-bgp] peer 10.1.1.1 group test"]
 ]
}

// Extended corpus with distilled ParaType info
{
 "CLIs": [
  "peer <ipv4-address> group <group-name>",
  "undo peer <ipv4-address> group <group-name>"
 ],
 "...": "... ",
 "ParaType": {
     "ipv4-address": [ipv4],
     "group-name": [string, 1, 47]}
}
```

A sample of parsed VDM corpus.

NAssim Parser Framework: Design




```
{
 "CLIs": [
  "peer <ipv4-address> group <group-name>",
  "undo peer <ipv4-address> group <group-name>"
 ],
 "FuncDef": "The peer group command adds a peer to a peer. The undo peer group command deletes a peer from a peer group and all configurations of the peer. By default, no peer group is created",
 "ParentView": ["BGP view"],
 "ParaDef": [
  {"Parameters": "ipv4-address",
   "Info": "Specifies the IPv4 address of a peer. It is in dotted decimal notation."},
  {"Parameters": "group-name",
   "Info": "Specifies the name of a peer group. The name is a string of 1 to 47 case-sensitive characters, with spaces not supported."}
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  ["<HUAWEI> system-view",
   "[~HUAWEI] bgp 100",
   "[*HUAWEI-bgp] group test internal",
   "[*HUAWEI-bgp] peer 10.1.1.1 group test"]
 ]
}
```


Keys	Type Restriction
CLIs	a list of string (non-empty list)
FuncDef	string
ParentViews	a list of string (non-empty list)
ParaDef	a list of dict (Keys:"Paras" and "Info")
Examples	a list of list

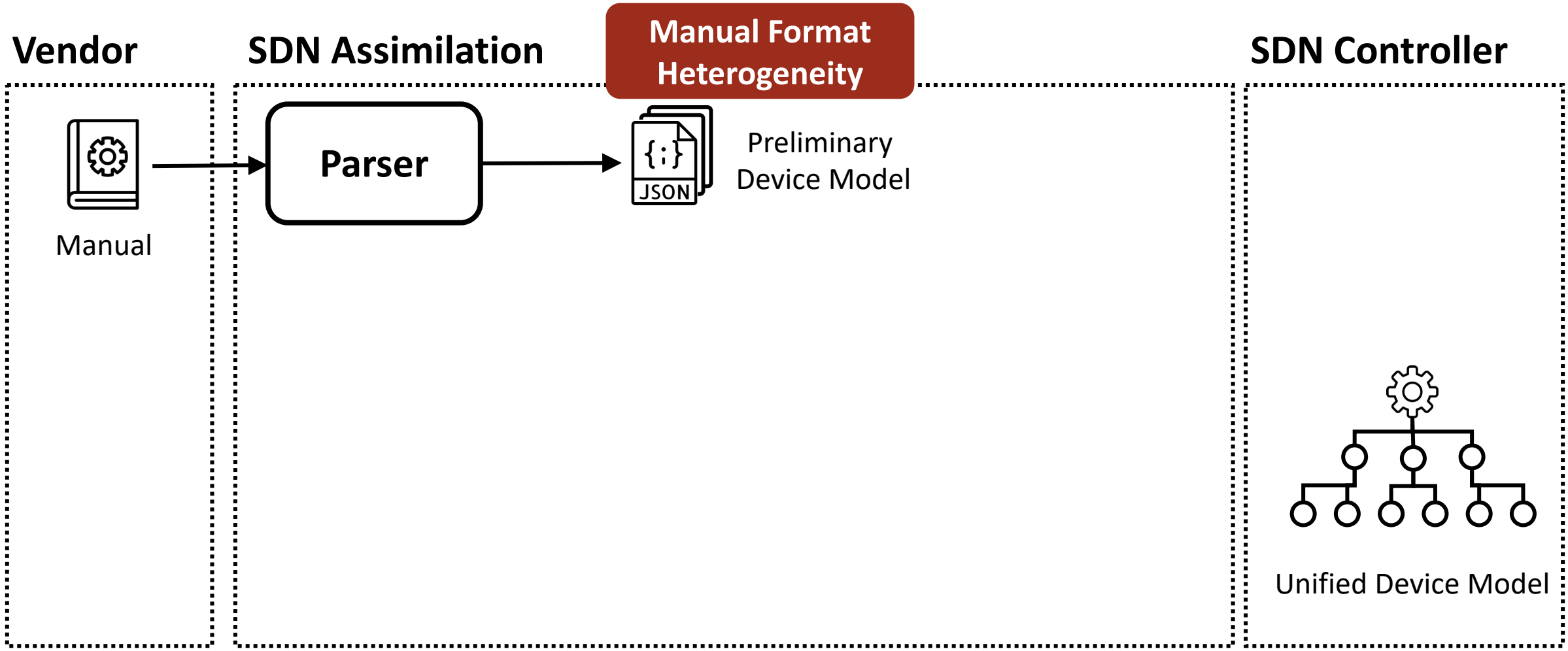
Format Definition of Vendor-Independent Corpus (JSON)

Vendor-independent parsed format captures the commonality of manuals from different vendors, also balancing extendibility and human-readability.

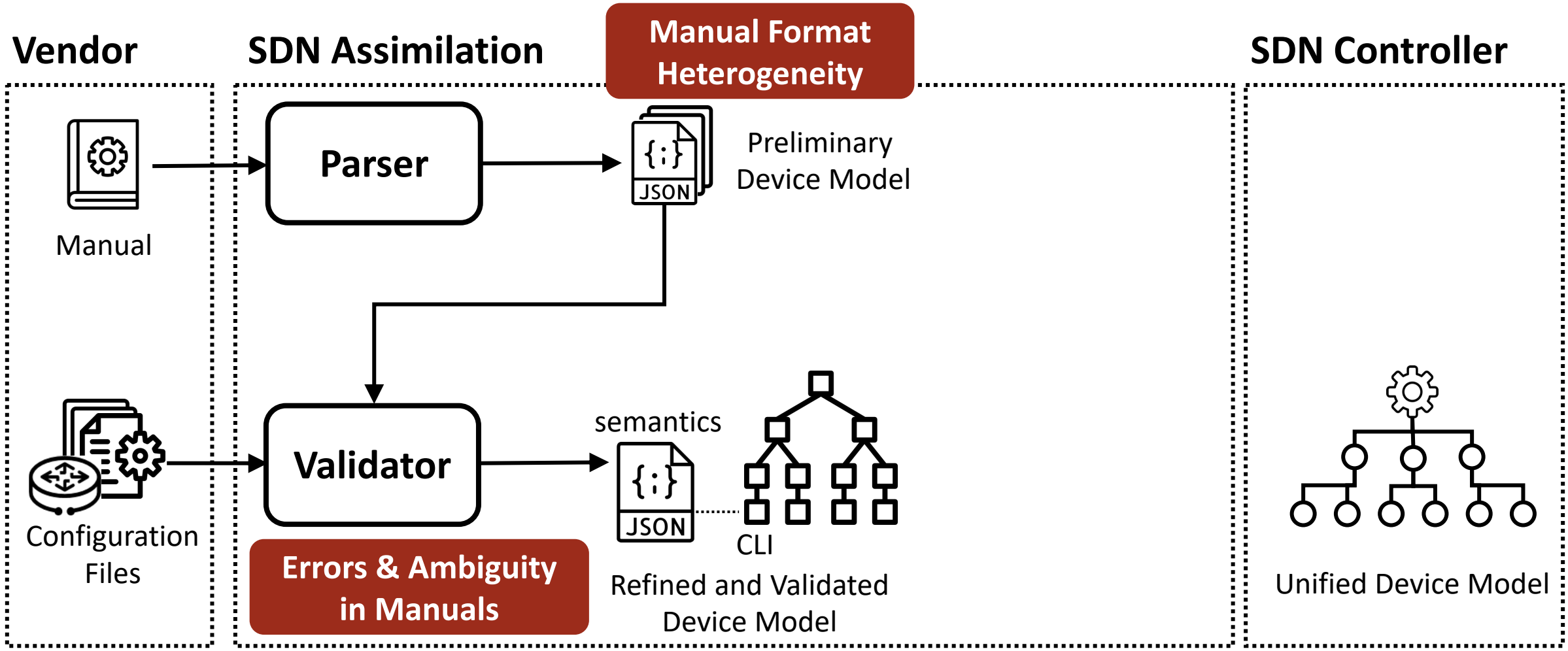

```
"ParaType" :{
   "ipv4-address": [ipv4],
   "group-name": [string, 1, 47]}
}
```


A sample of parsed VDM corpus.

SDN Network Assimilation (NAssim) in a Nutshell



SDN Network Assimilation (NAssim) in a Nutshell



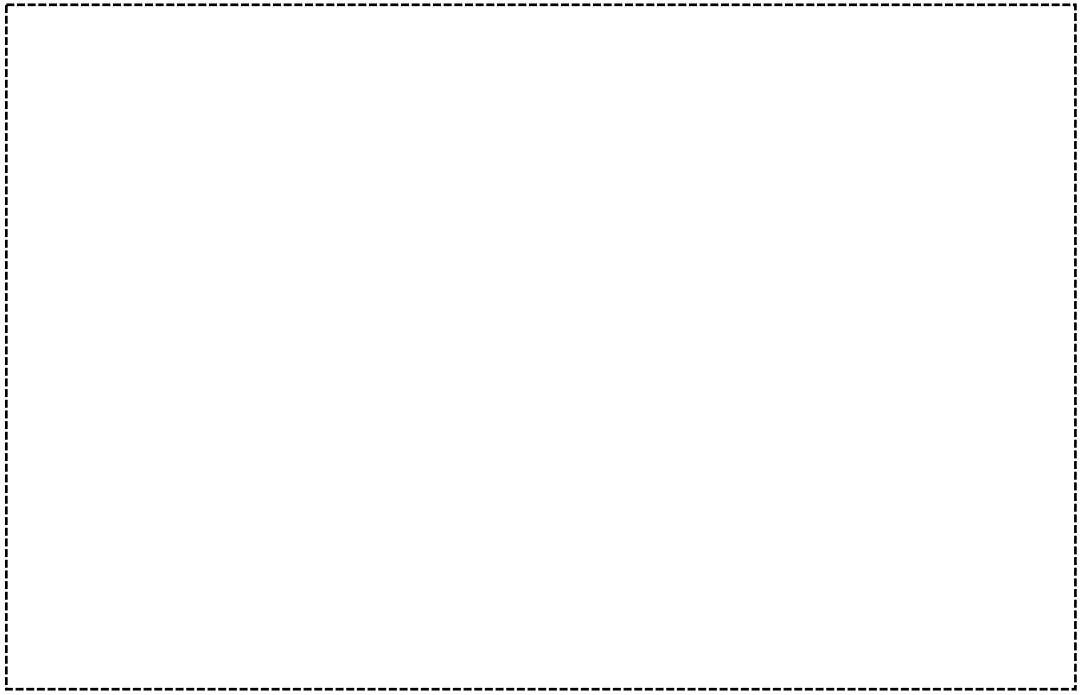
NAssim Validator: Key Insights

NAssim Validator: Key Insights

Manuals are not fully reliable. A rigorous validation scheme needs to catch inevitable errors and ambiguities in human-written manuals.

NAssim Validator: Key Insights

Syntactic Ambiguities



An example of ambiguous CLI command template*

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**https://www.cisco.com/c/en/us/td/docs/switches/datacenter/nexus5500/sw/command/reference/unicast/n5500-ucast-cr/n5500-bgp_cmds_n.html*

NAssim Validator: Key Insights

Syntactic Ambiguities

neighbor { <ip-addr> | <ip-prefix/length> } [remote-as { <as-num>
[<.as-num>] | route-map <name> }

unpaired left bracket

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NAssim Validator: Key Insights

Syntactic Ambiguities

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unpaired left bracket

Correction Option 1: removing the left bracket

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Correction Option 2: adding a right bracket after remote-as symbol

neighbor { <ip-addr> | <ip-prefix/length> } **[** remote-as **]** { <as-num> [<.as-num>] | route-map <name> }

Correction Option 3: adding a right bracket at the end of the CLI

neighbor { <ip-addr> | <ip-prefix/length> } **[** remote-as { <as-num> [<.as-num>] | route-map <name> } **]**

An example of ambiguous CLI command template*

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An example of ambiguous CLI command template*

Hierarchy Ambiguities

An example of ambiguous view

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NAssim Validator: Key Insights

Syntactic Ambiguities

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An example of ambiguous CLI command template*

Hierarchy Ambiguities

```
{
 "CLIs": [
  "import-source acl { acl-number | acl-name }",
  "undo import-source"
 ],
  "...": "... ",
 "ParentView": ["VPN instance MSDP view", "MSDP view of a public network instance"],
  "...": "... ",
 "Examples": [
  ["<HUAWEI> system-view",
   "[~HUAWEI] acl number 3101",
   "...",
   "[*HUAWEI-acl4-advance-3101] quit",
   "[*HUAWEI] multicast routing-enable",
   "[*HUAWEI] msdp",
   "[*HUAWEI-msdp] import-source acl 3101"]
 ]
}
```

An example of ambiguous view

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NAssim Validator: Key Insights

Syntactic Ambiguities

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An example of ambiguous CLI command template*

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  "...": "... ",
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 "Examples": [
  ["<HUAWEI> system-view",
   "[~HUAWEI] acl number 3101",
   "...",
   "[*HUAWEI-acl4-advance-3101] quit",
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   "[*HUAWEI-msdp] import-source acl 3101"]
 ]
}
```

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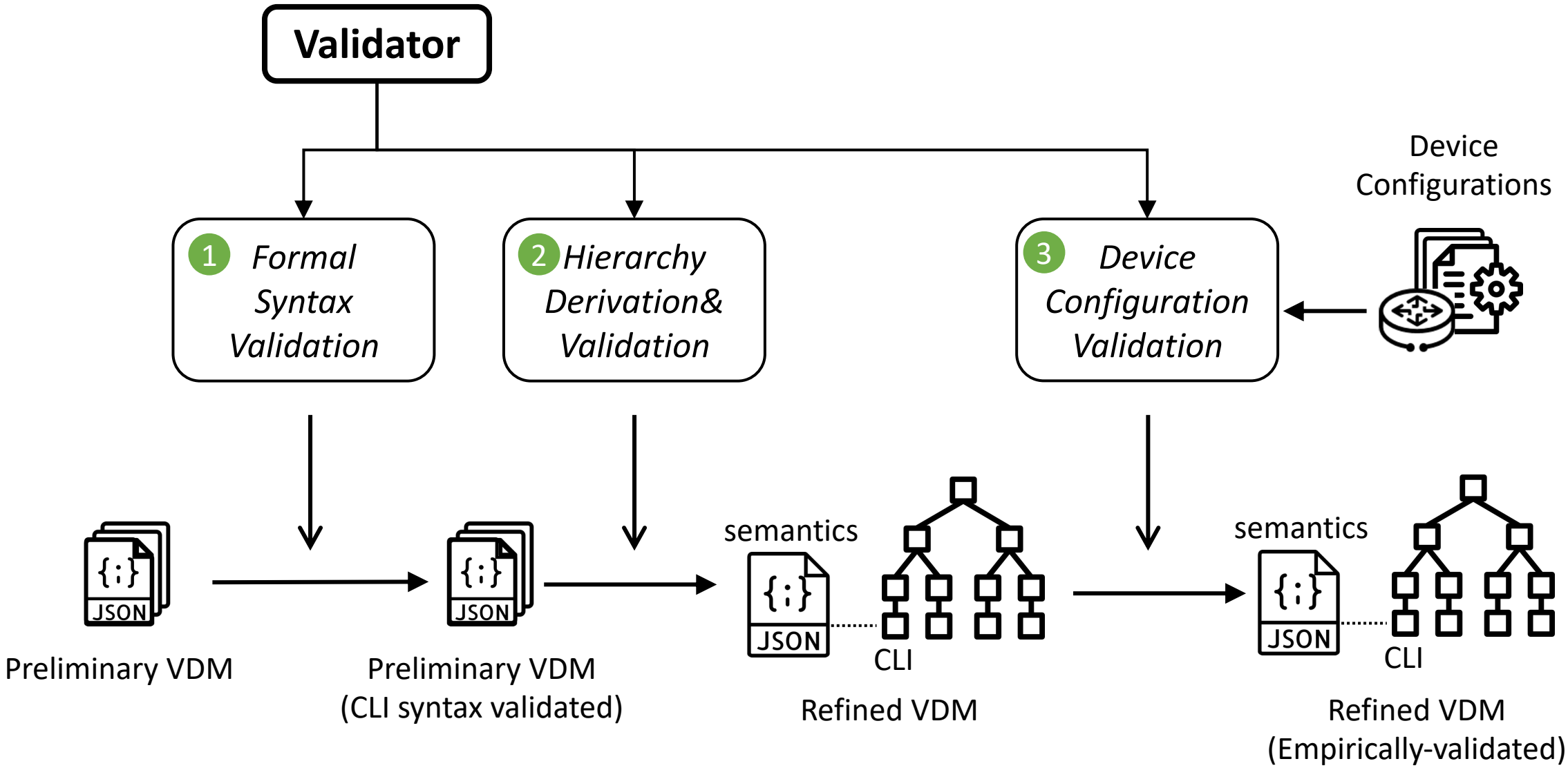
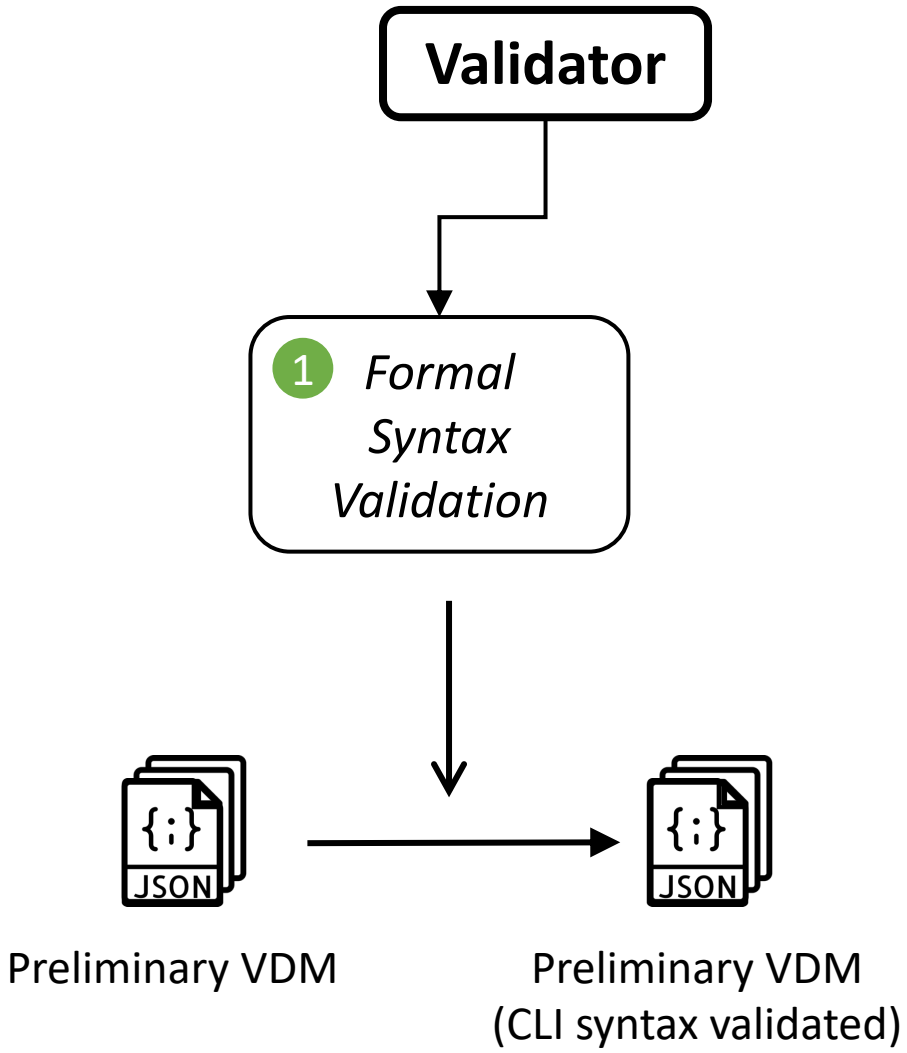
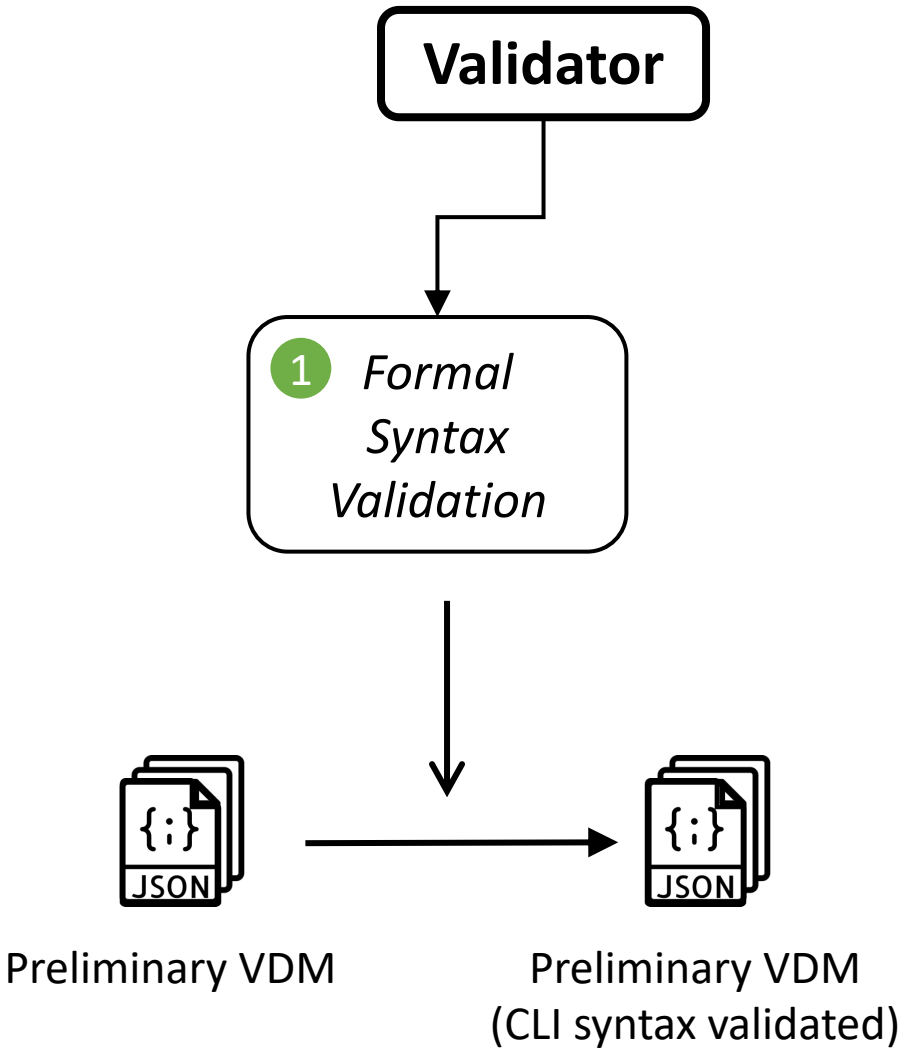
NAssim Validator: Design



NAssim Validator: Design



NAssim Validator: Design



Express command conventions into their equivalent Backus Normal Form (BNF) for formal validation.

Command descriptions use these conventions:

Convention	Description
boldface font	Commands and keywords are in boldface.
italic font	Arguments for which you supply values are in italics.
[ ]	Elements in square brackets are optional.
{x | y | z}	Alternative keywords are grouped in braces and separated by vertical bars.
[x | y | z]	Optional alternative keywords are grouped in brackets and separated by vertical bars.
string	A nonquoted set of characters. Do not use quotation marks around the string or the string will include the quotation marks.

Command convention of Cisco manuals

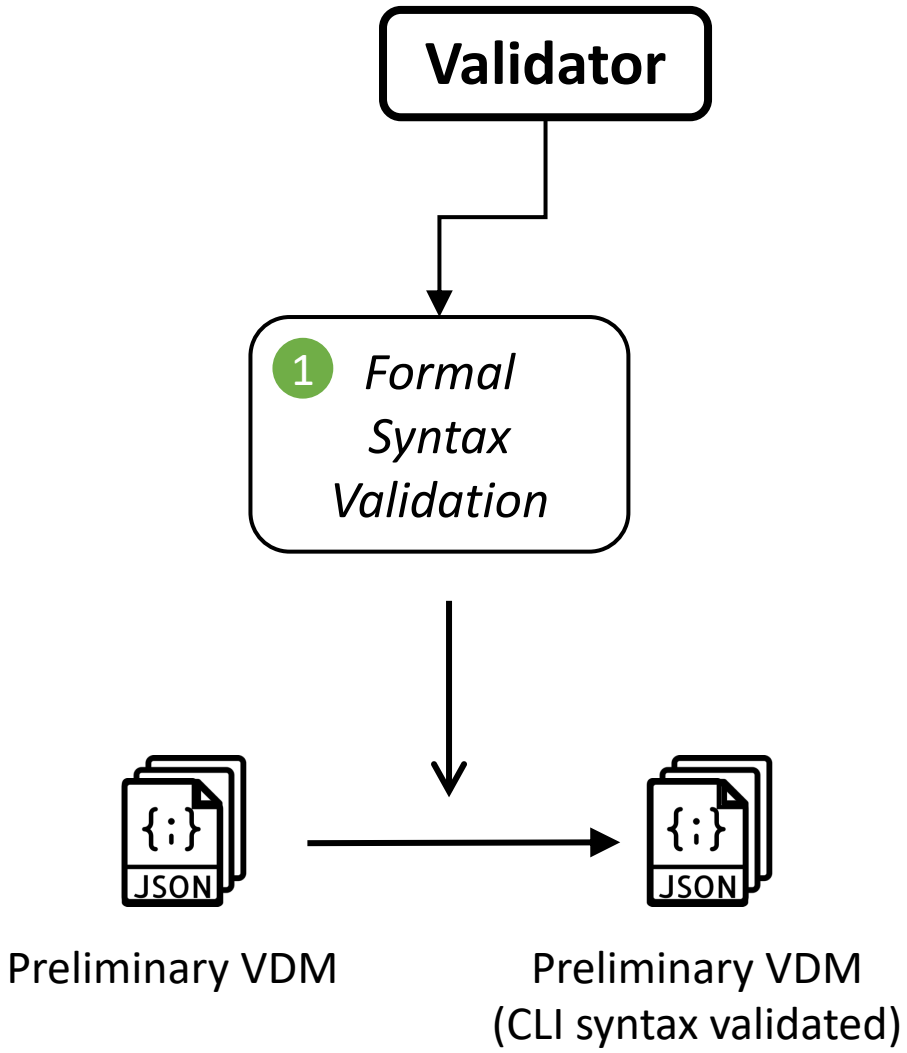
```
import pyparsing as p

# syntax parser for Cisco CLI
word = p.Word(p.printables, exclude_chars='{}[]|#\n').setParseAction(leaf_gen)
ele = p.Forward()
items = ele + p.ZeroOrMore('|' + ele)
select = p.Group('{' + items + '}').setParseAction(select_gen)
option = p.Group('[' + items + ']').setParseAction(option_gen)
ele <<= p.OneOrMore(option ^ select ^ word).setParseAction(ele_gen)

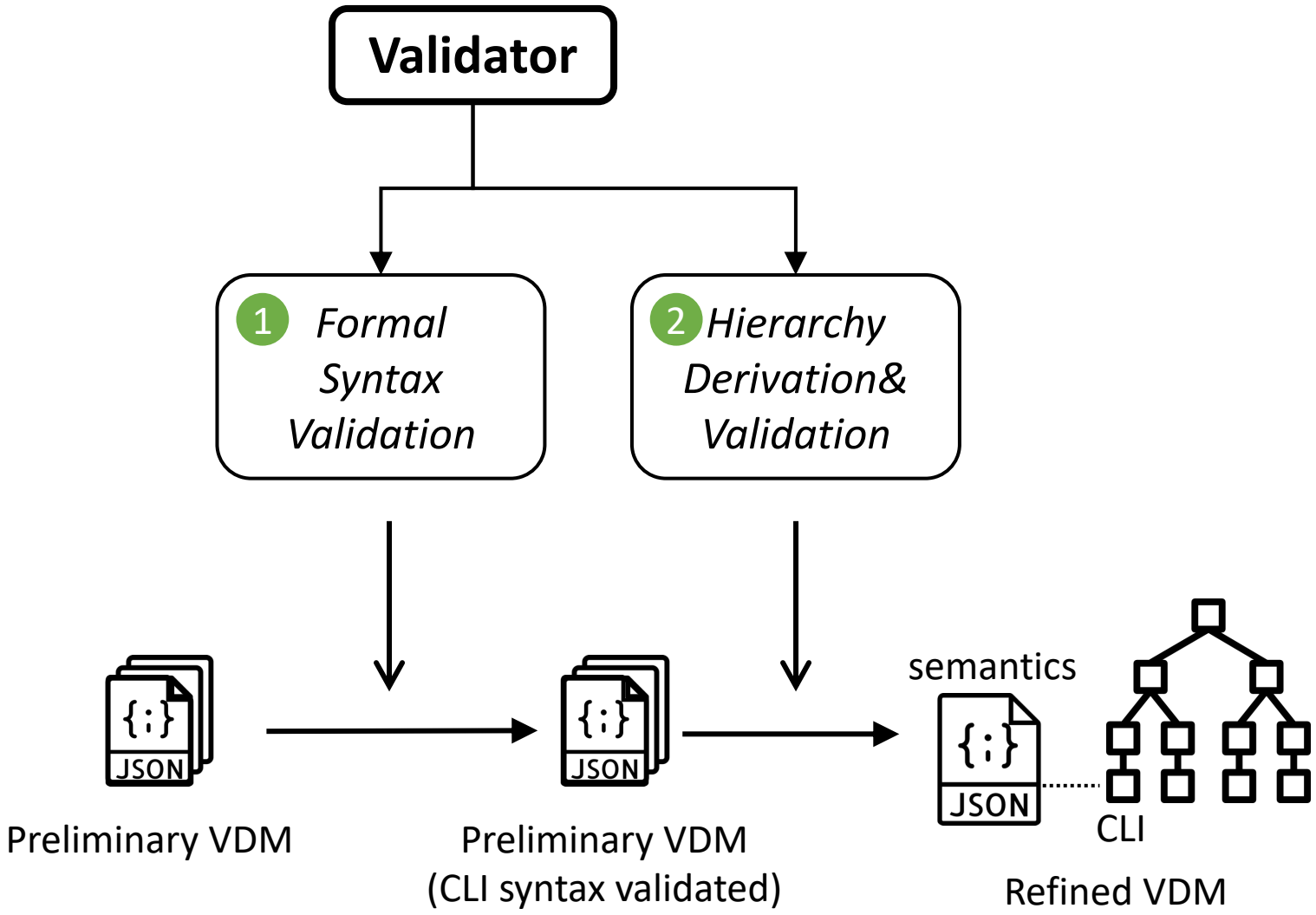
syntax_parser = ele
```

Code snippet for syntax parser generation

NAssim Validator: Design



NAssim Validator: Design



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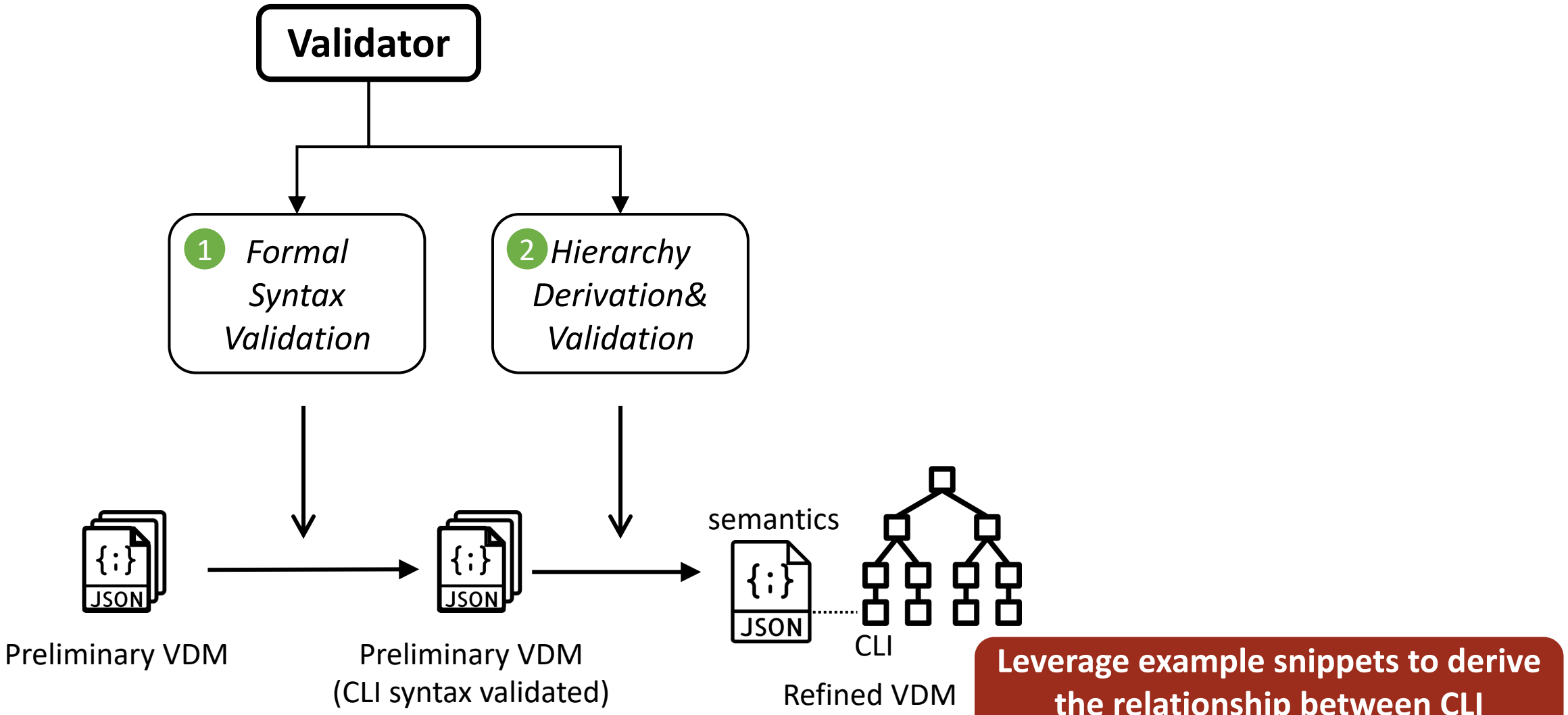
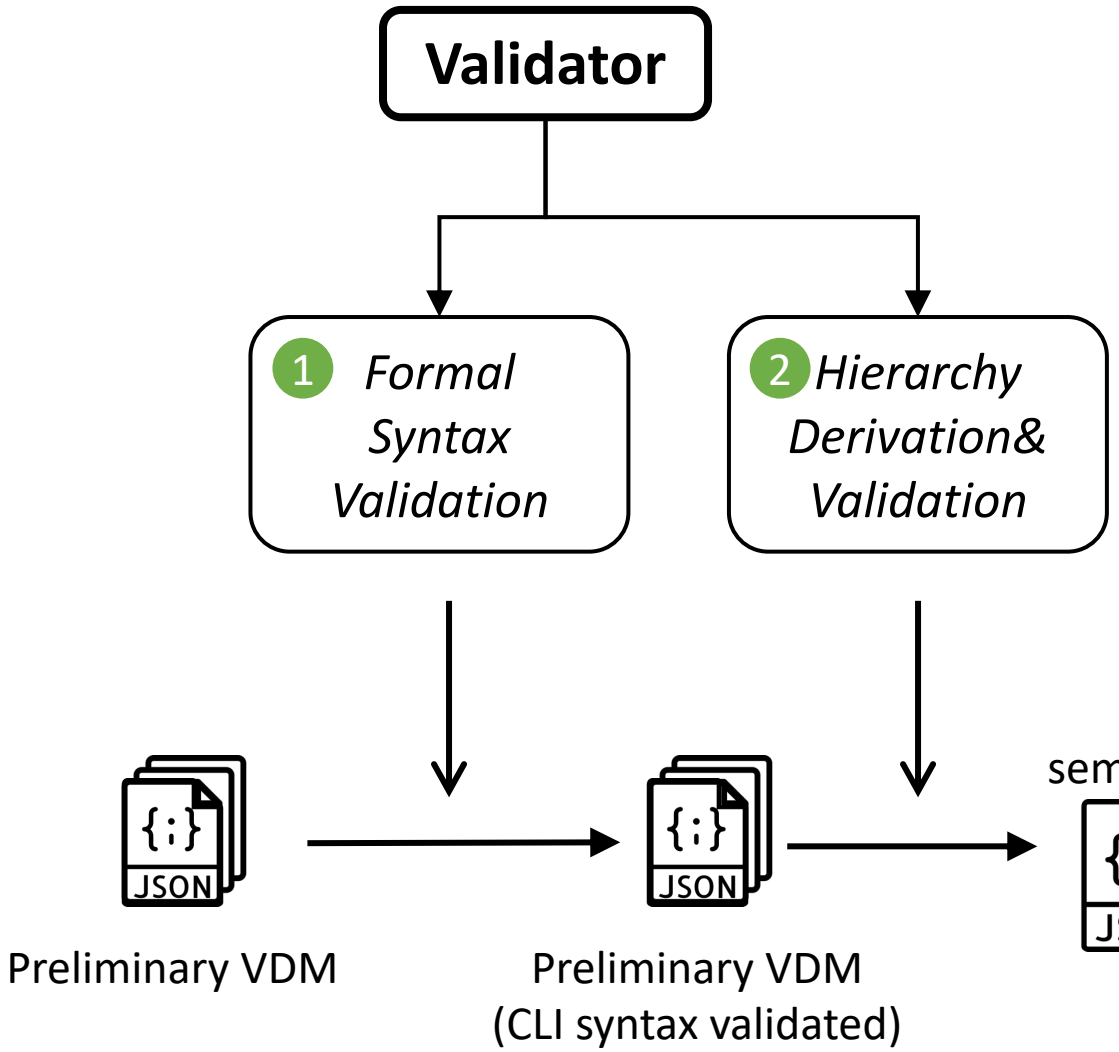


Leverage example snippets to derive the relationship between CLI commands, i.e., CLI model hierarchy.

NAssim Validator: Design

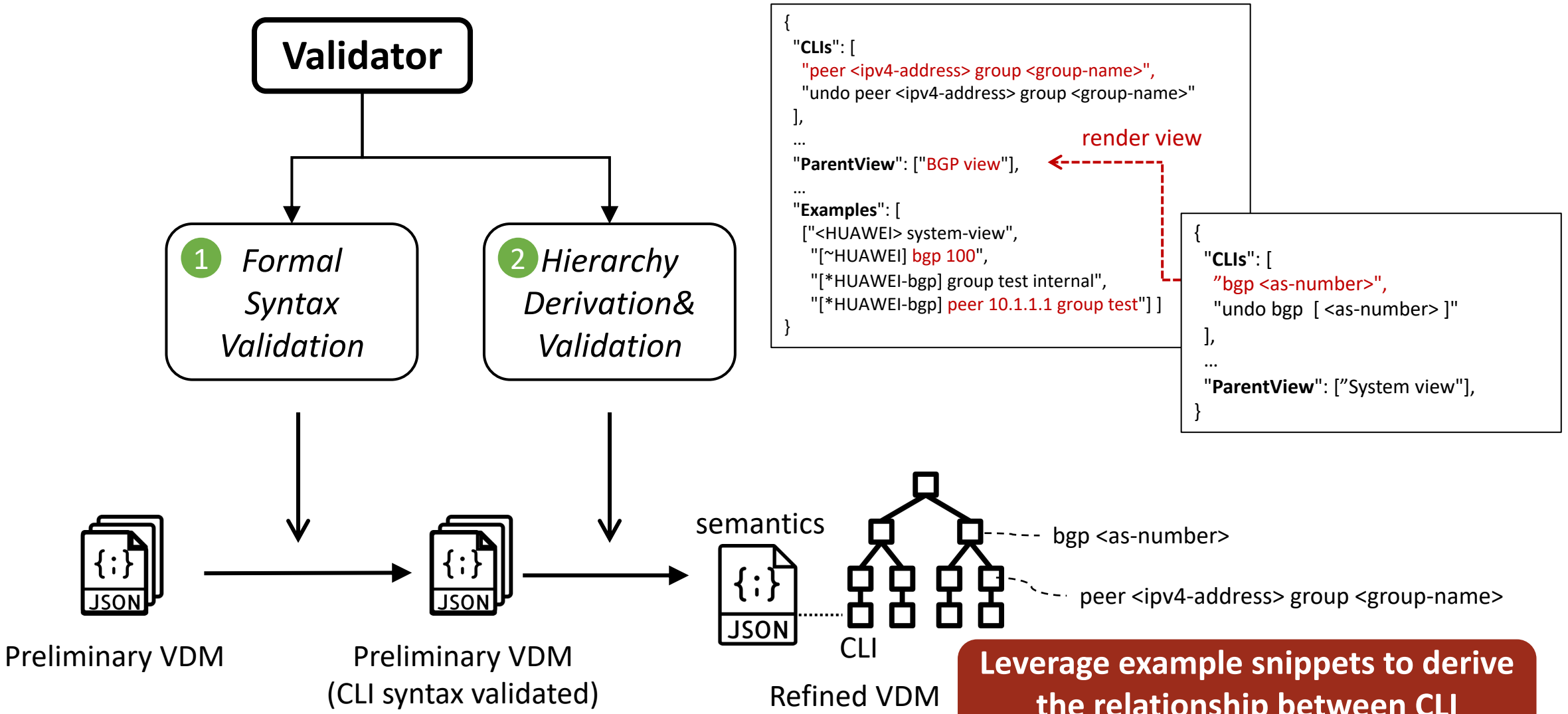



```
{
 "CLIs": [
  "peer <ipv4-address> group <group-name>",
  "undo peer <ipv4-address> group <group-name>"
 ],
 ...
 "ParentView": ["BGP view"],
 ...
 "Examples": [
  ["<HUAWEI> system-view",
   "[~HUAWEI] bgp 100",
   "[*HUAWEI-bgp] group test internal",
   "[*HUAWEI-bgp] peer 10.1.1.1 group test"] ]
}
```

```
{
 "CLIs": [
  ”bgp <as-number>",
  "undo bgp  [ <as-number> ]"
 ],
 ...
 "ParentView": [”System view"],
}
```

Leverage example snippets to derive the relationship between CLI commands, i.e., CLI model hierarchy.

NAssim Validator: Design



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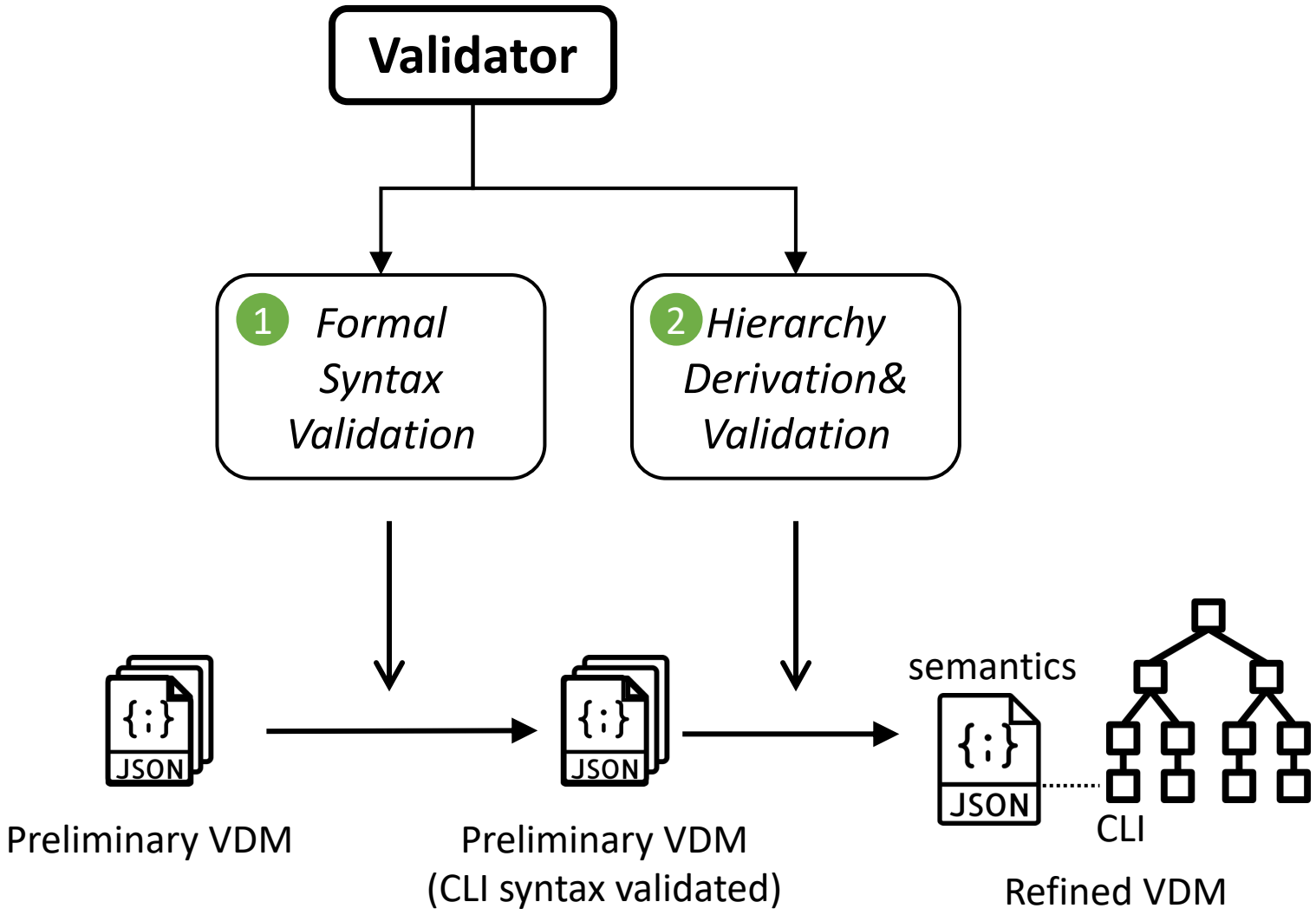

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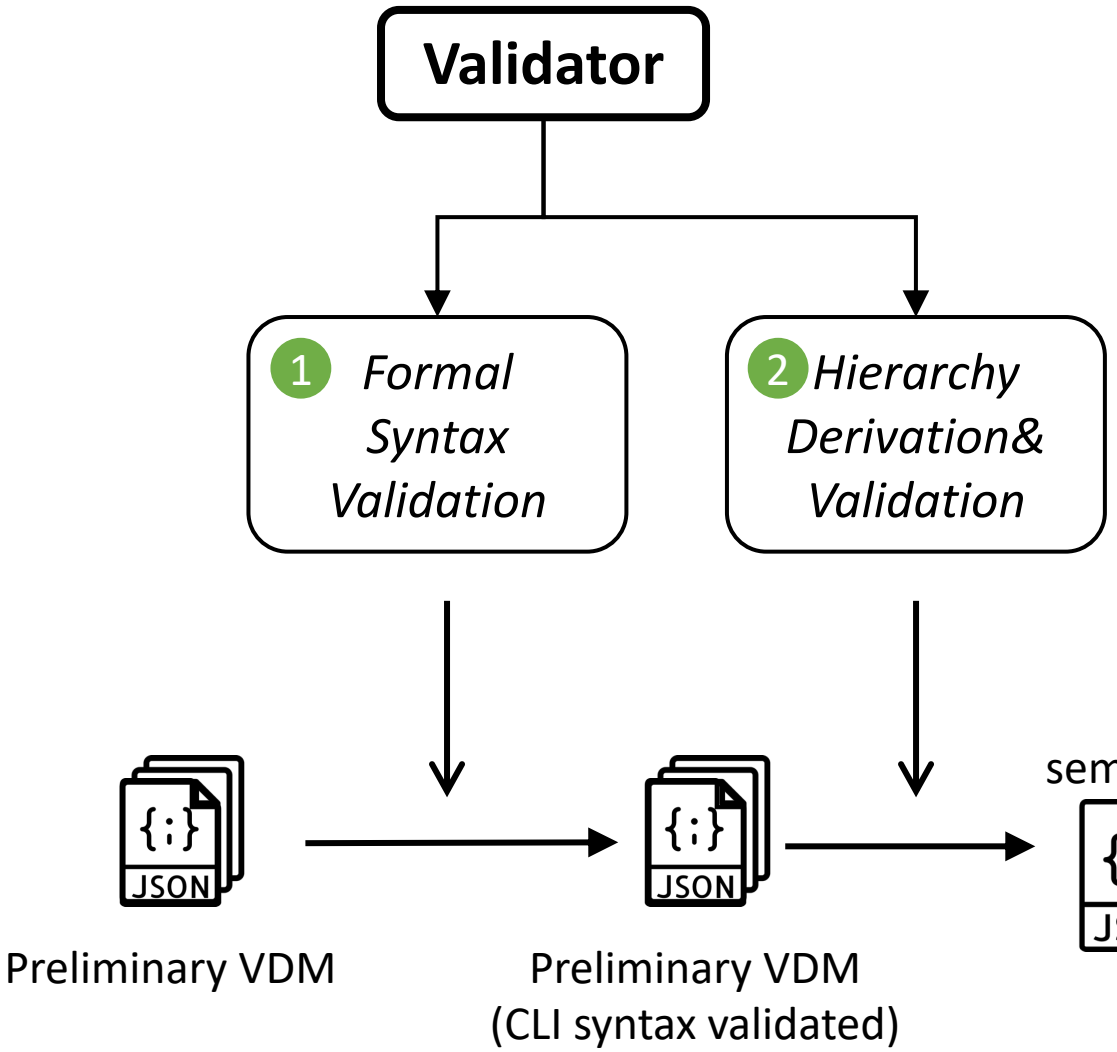


```
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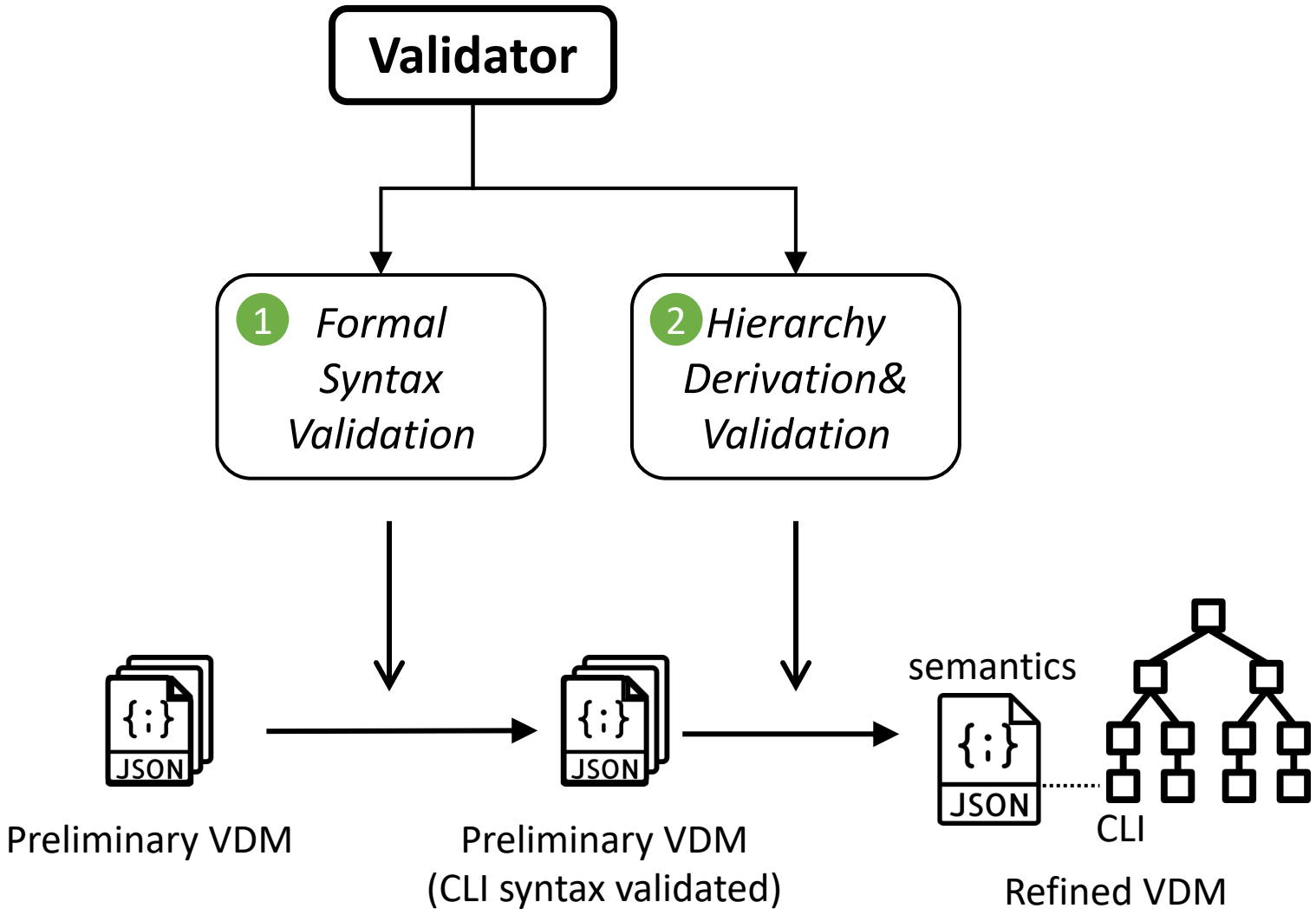
 ]
}
```


An example ambiguous view not be fully resolved by our hierarchy derivation scheme

Quantify the certainty of the derivation to facilitate expert intervention

NAssim Validator: Design



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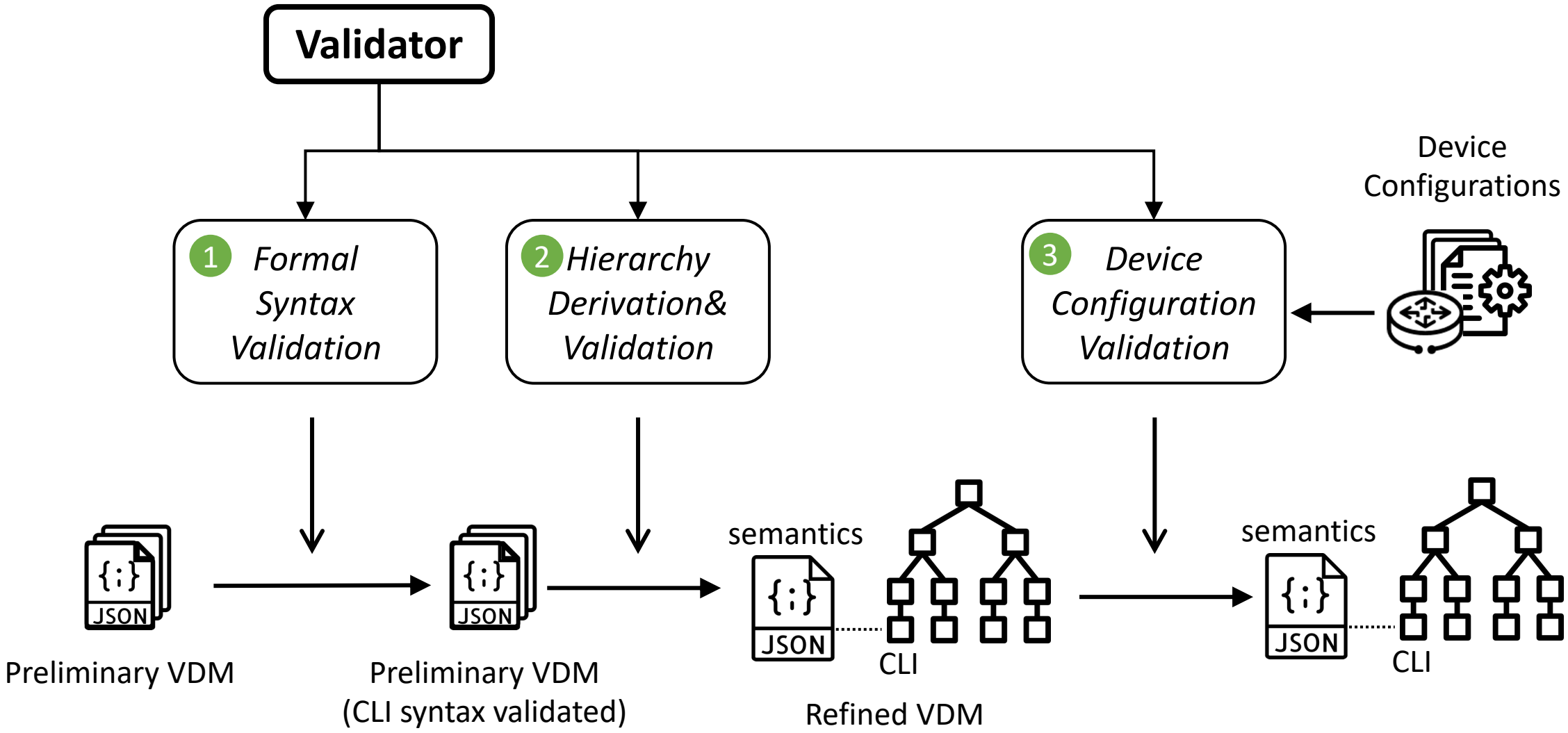

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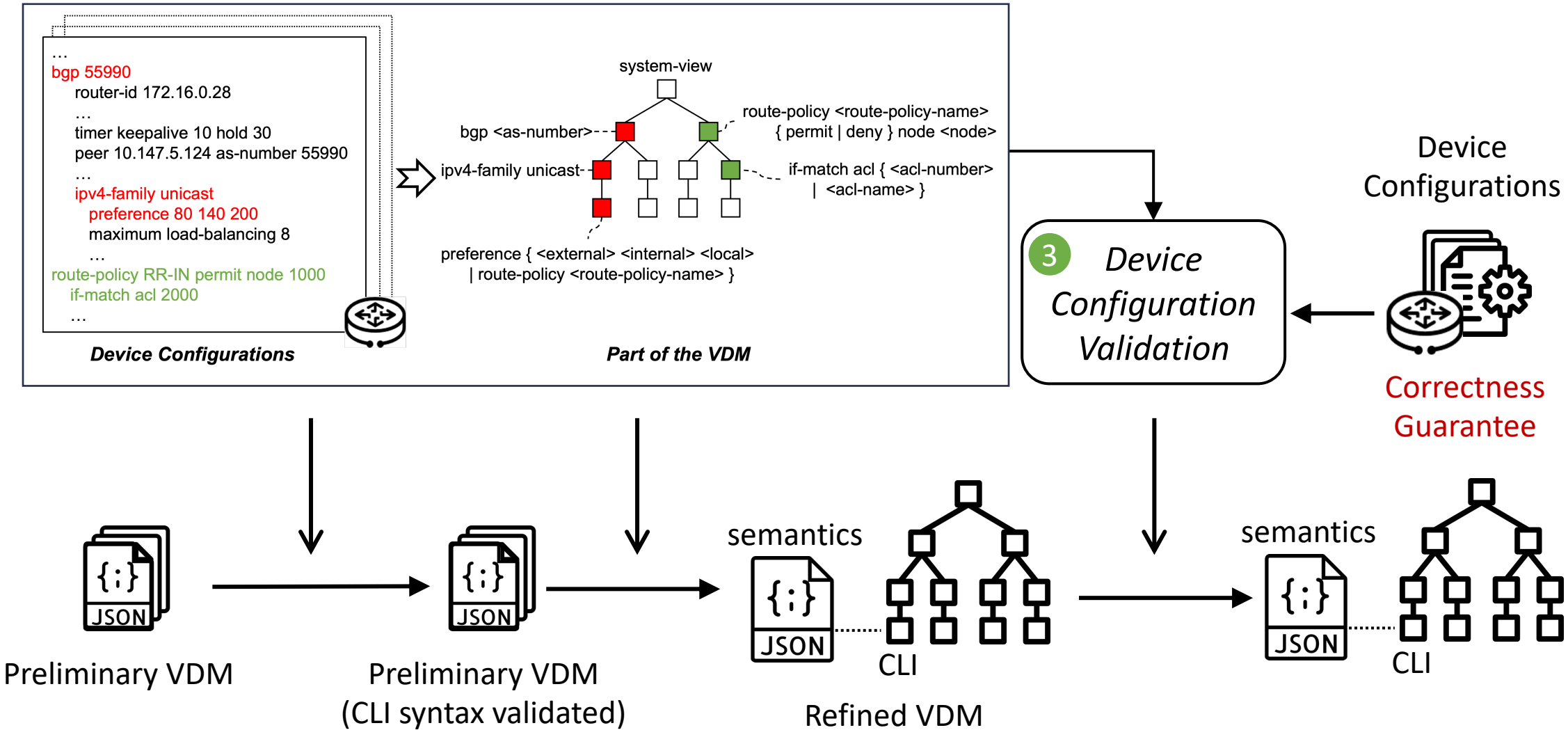

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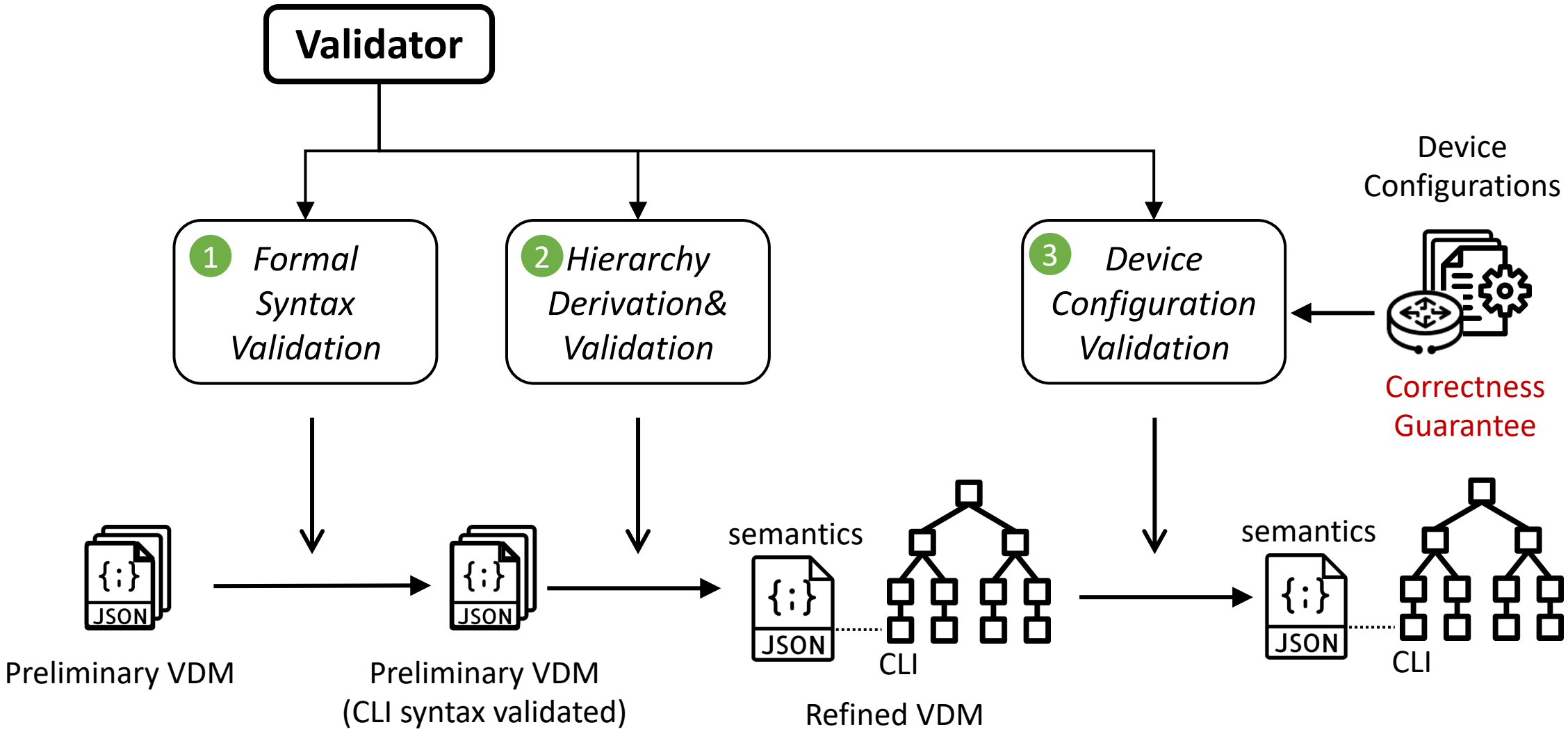

VDM Construction Phase: Parser + Validator

Vendor/Model/ReleaseYear	-	Huawei/NE40E/2021	Cisco/Nexus5500/2011	Nokia/7750SR/2021	H3C/S3600/2009
Main Statistics	#CLI Commands	12874	278	14046	759
	#Views	607	27	3832	28
	#CLI-View Pairs	36274	366	22734	851
Adaption Cost	`parsing()` LOC	45	52	57	41
	`get_cli_parser()` LOC	8	6	10	8
Syntax Validation	#Invalid CLI Commands	13	19	139	13
Model Hierarchy Derivation & Validation	#Example Snippets	15466	523	/	1147
	Construction Time (second)	785.58	14.29	94.56*	34.3
	#Ambiguous Views	47	8	/	4
Device Configuration Validation	#Config Files	197	/	416	/
	Matching Ratio	100%	/	100%	/

Table 3: Evaluation of the VDM Construction Phase. *Nokia manuals do not provide examples, but they explicitly specify model hierarchy in the manuals. Thus, we extract the hierarchy using `Parser_<nokia>` by implementing extra functions

VDM Construction Phase: Parser + Validator

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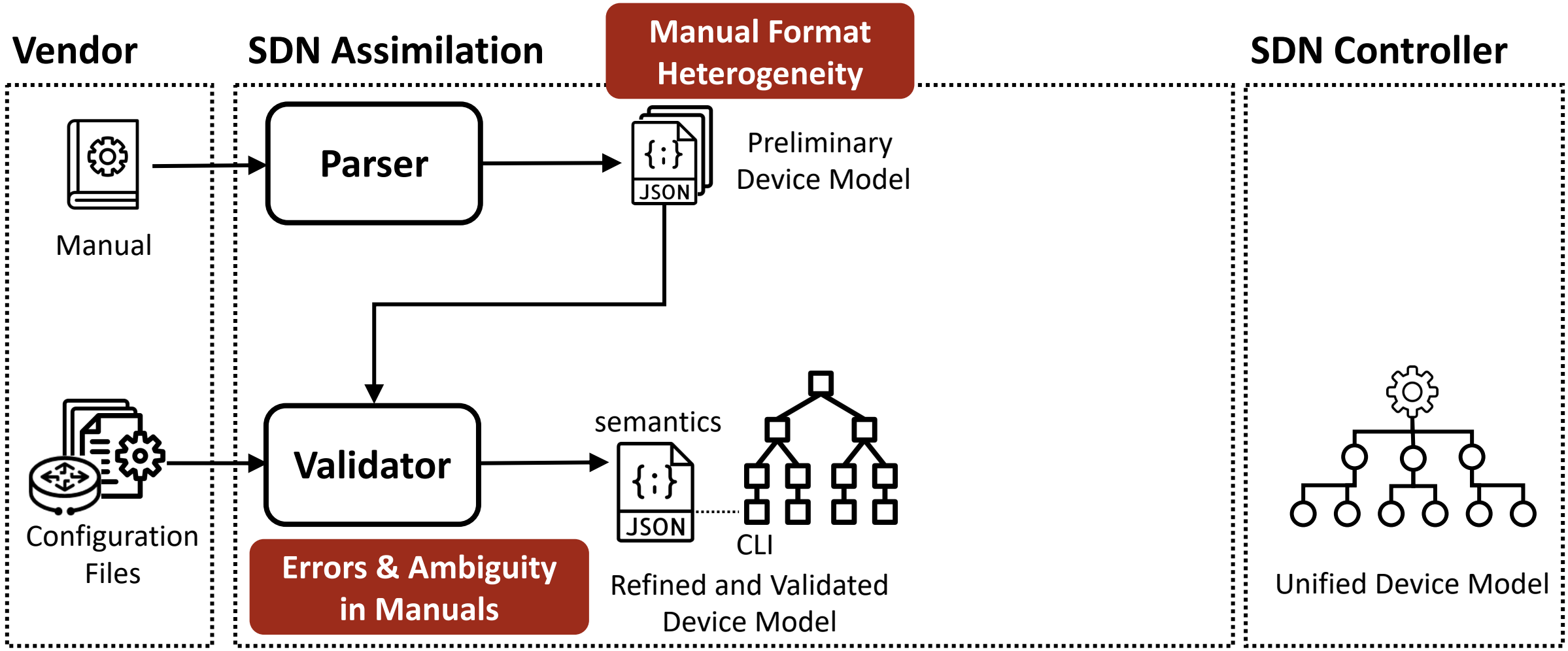
Refer to our repo for more details: https://github.com/AmyWorkspace/nassim

SDN Network Assimilation(NAssim) in a Nutshell



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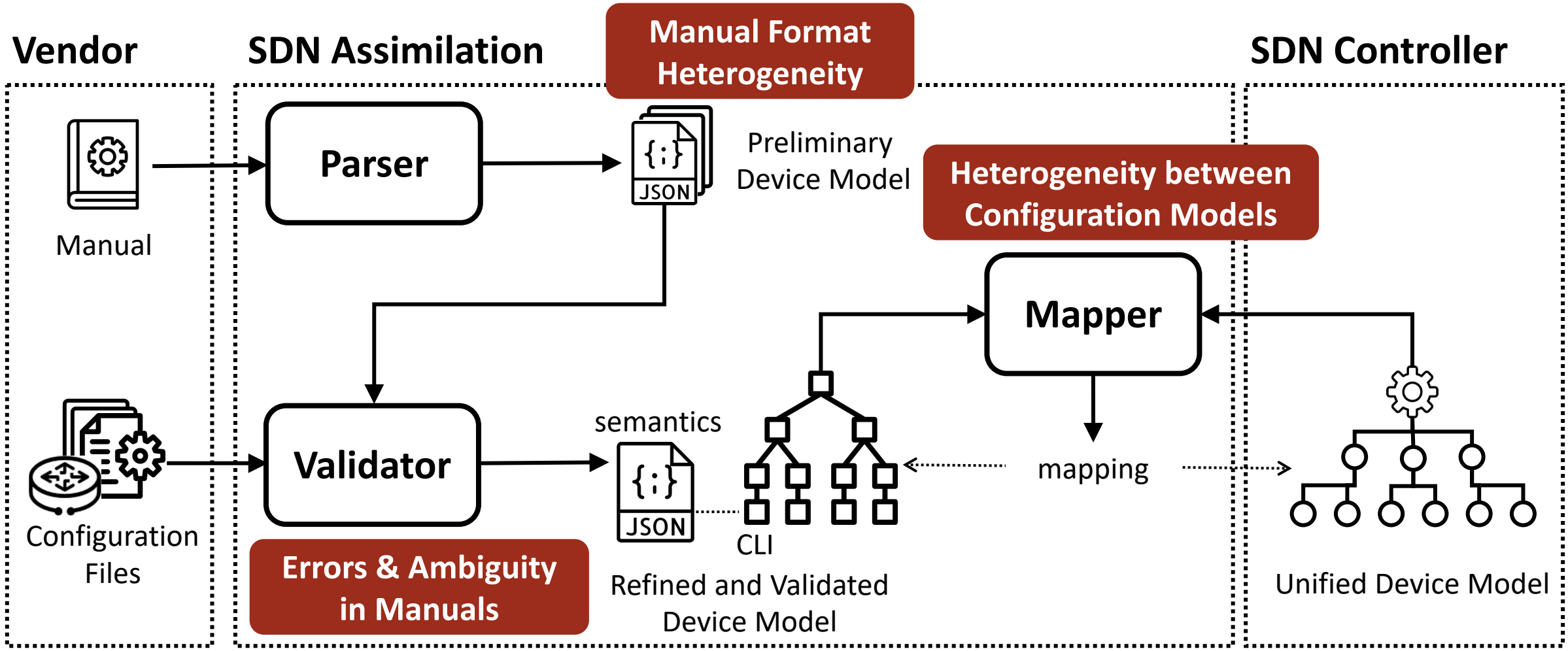
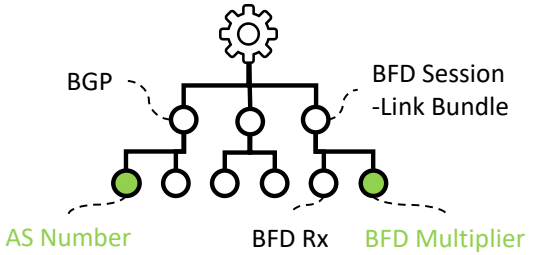


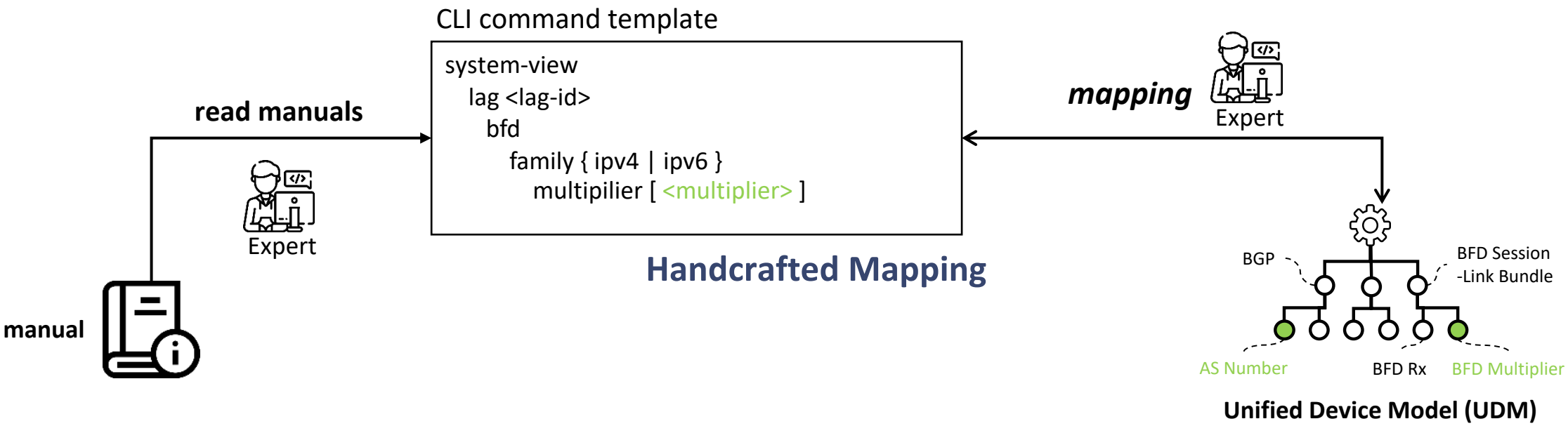
NAssim Mapper: Key Insights

manual

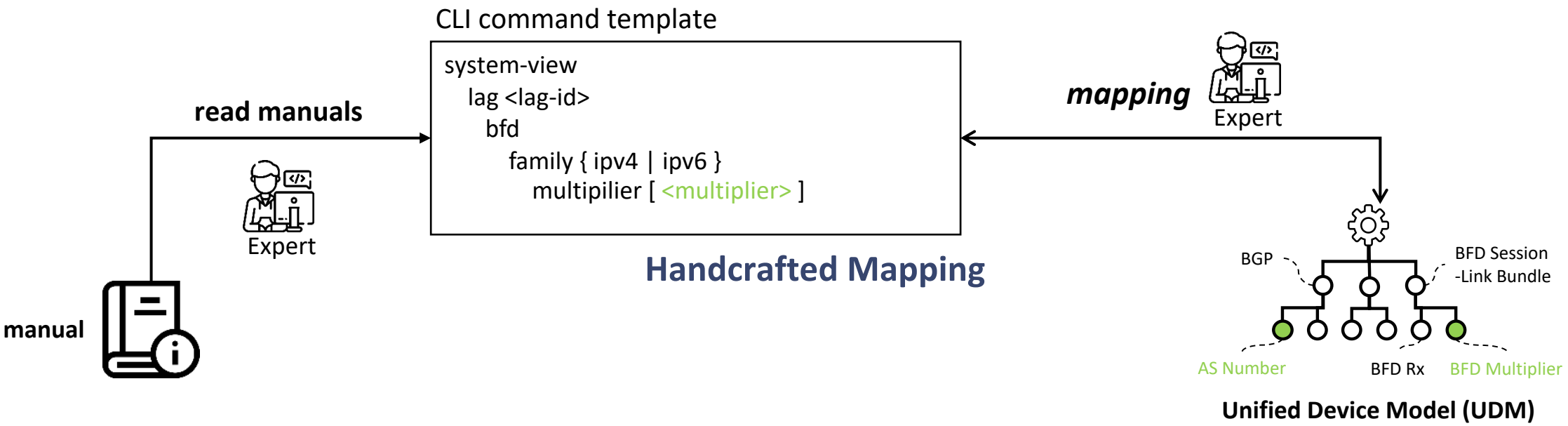


Unified Device Model (UDM)

NAssim Mapper: Key Insights



NAssim Mapper: Key Insights



The key of SNA is to pair semantically similar configuration items.

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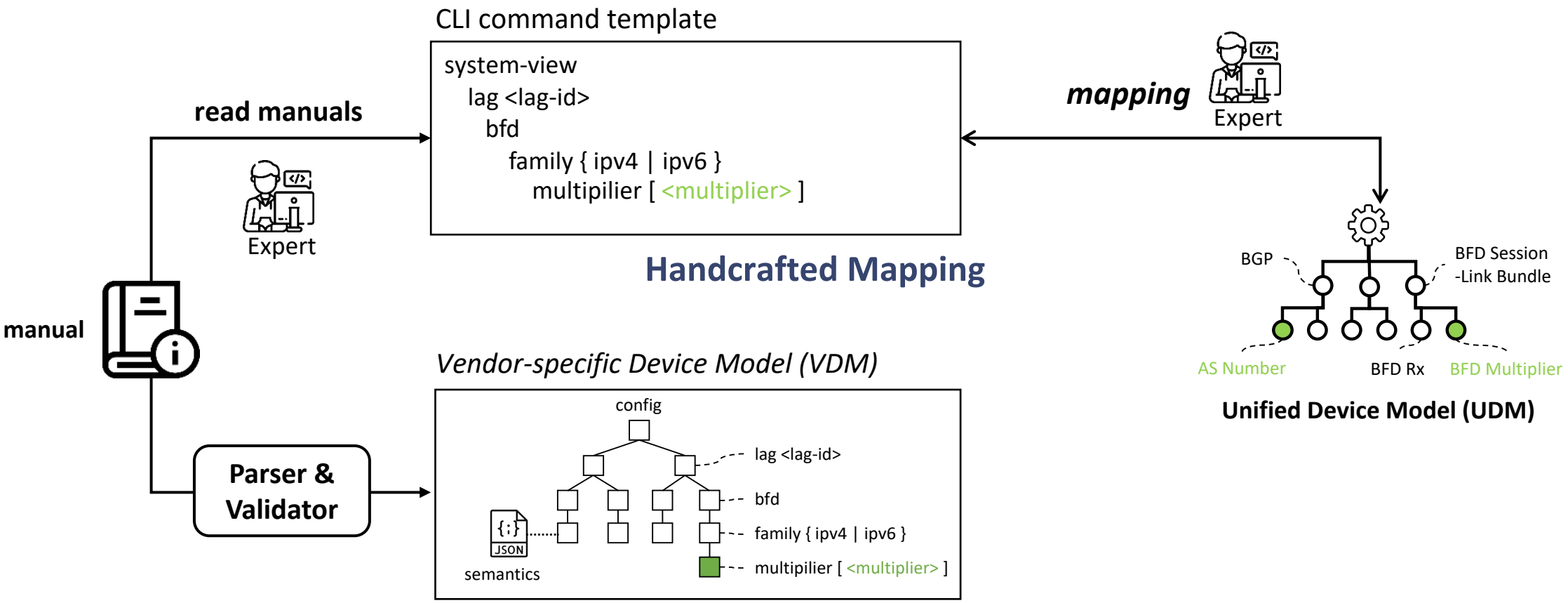

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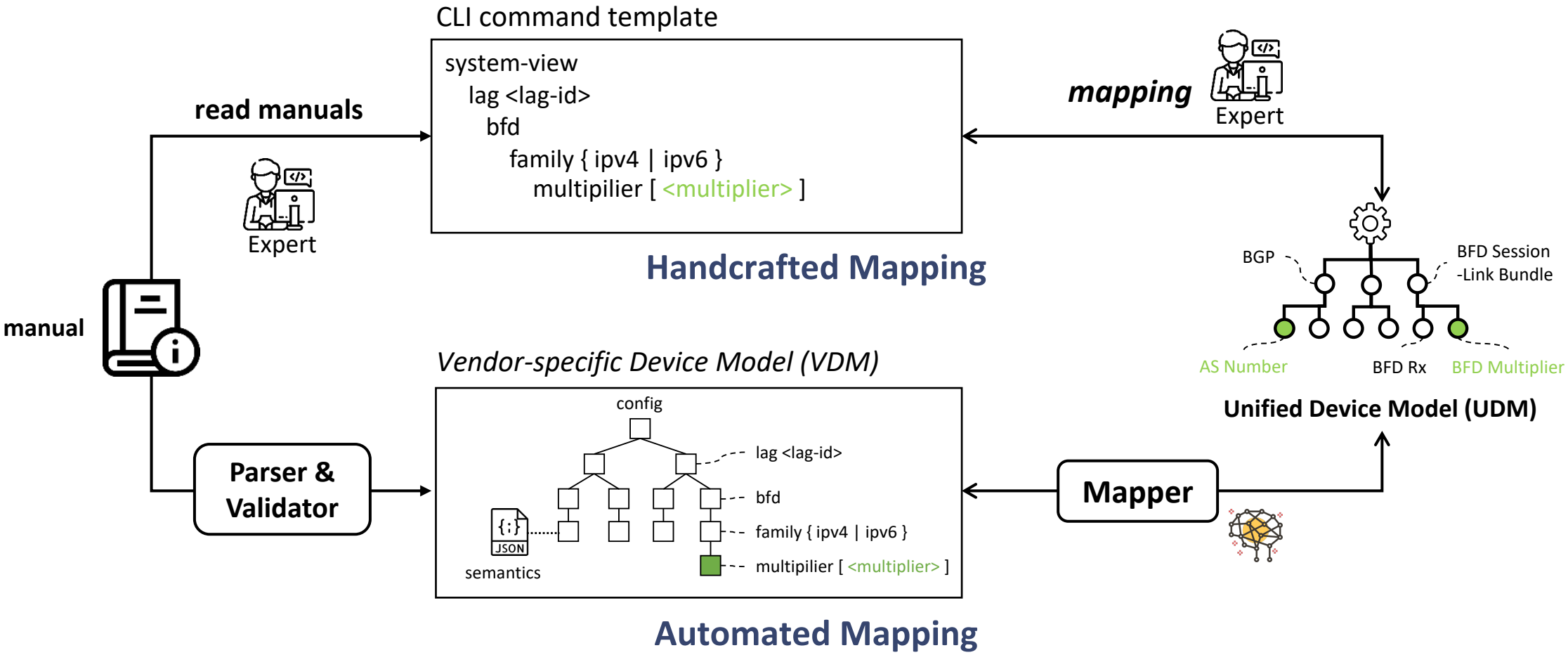

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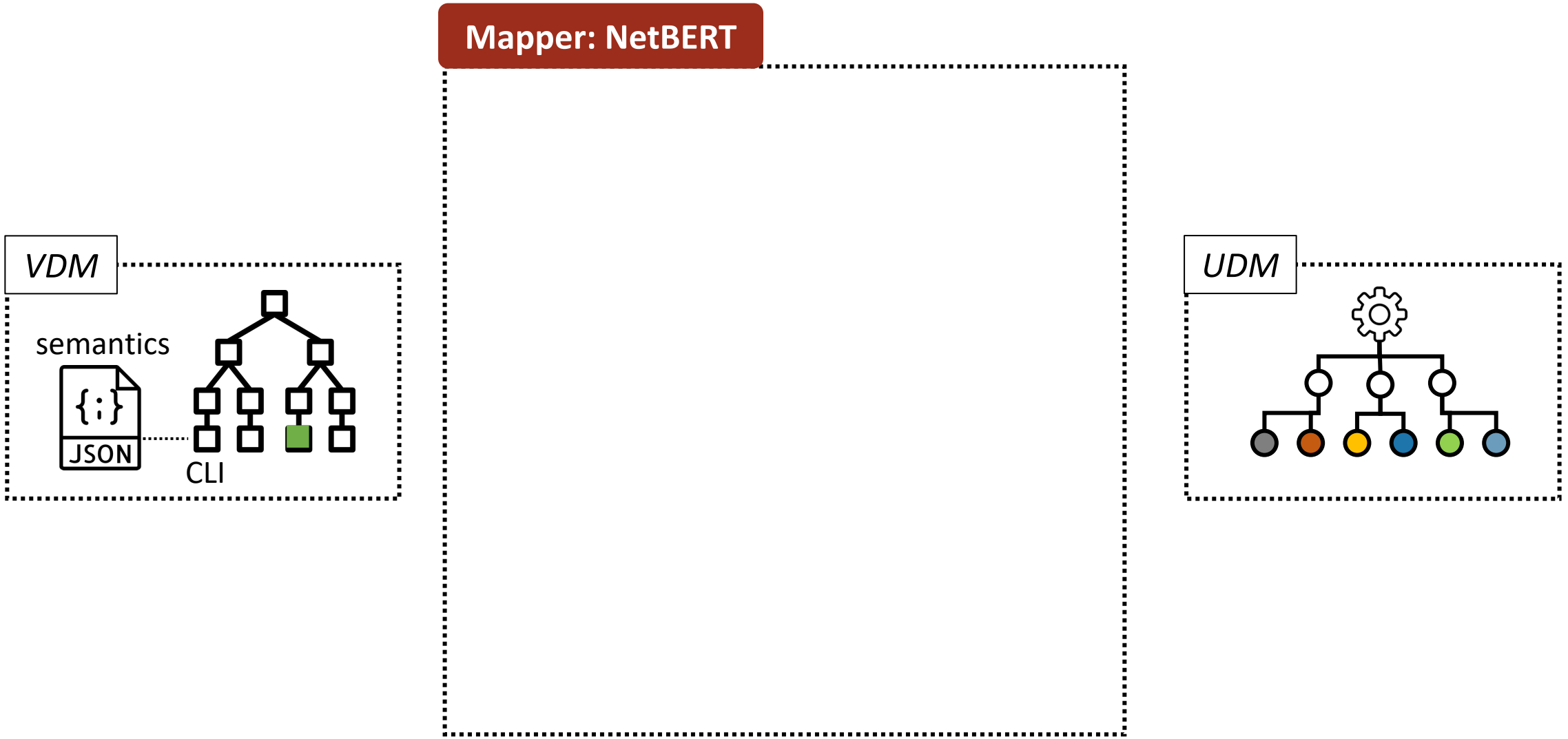
NAssim Mapper: NetBERT



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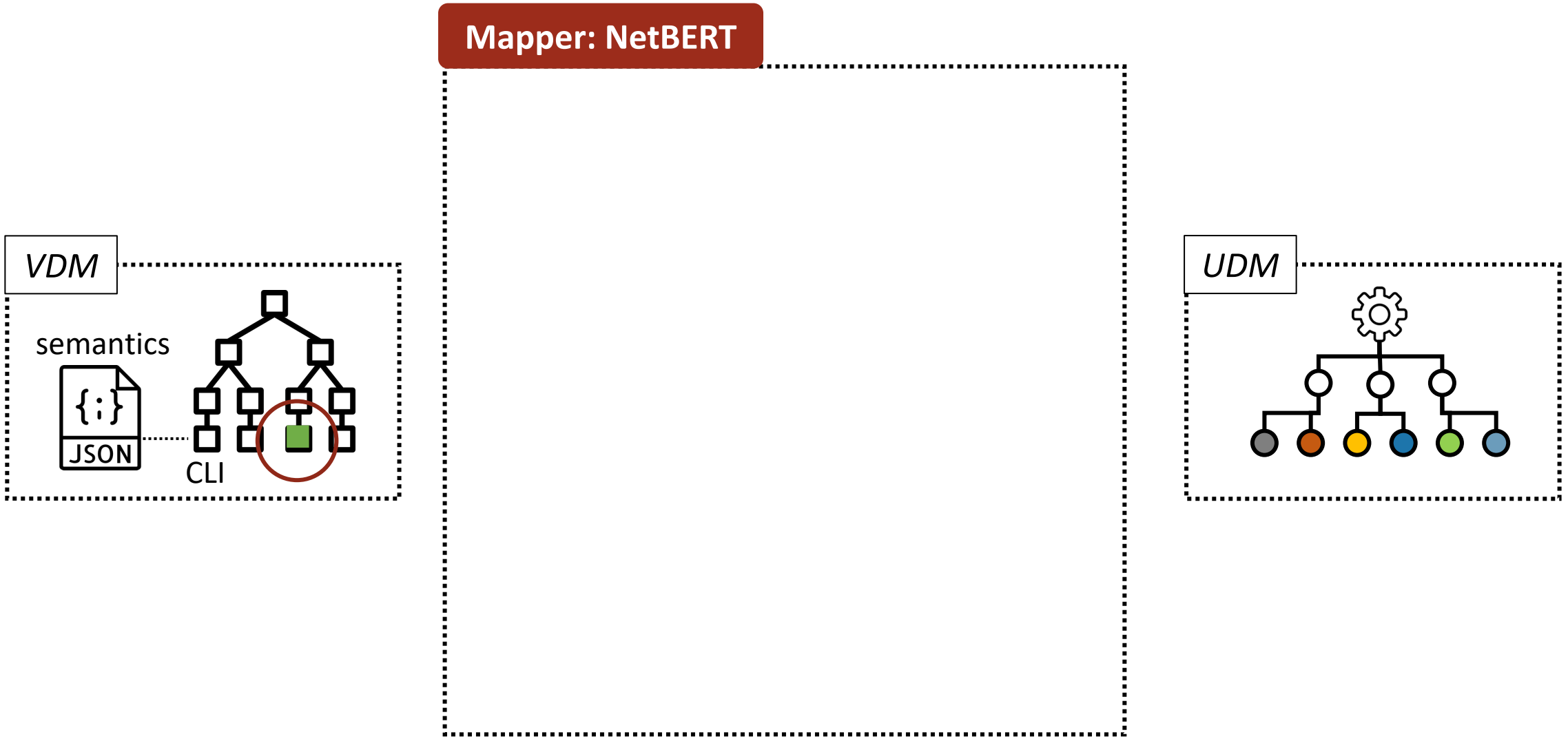

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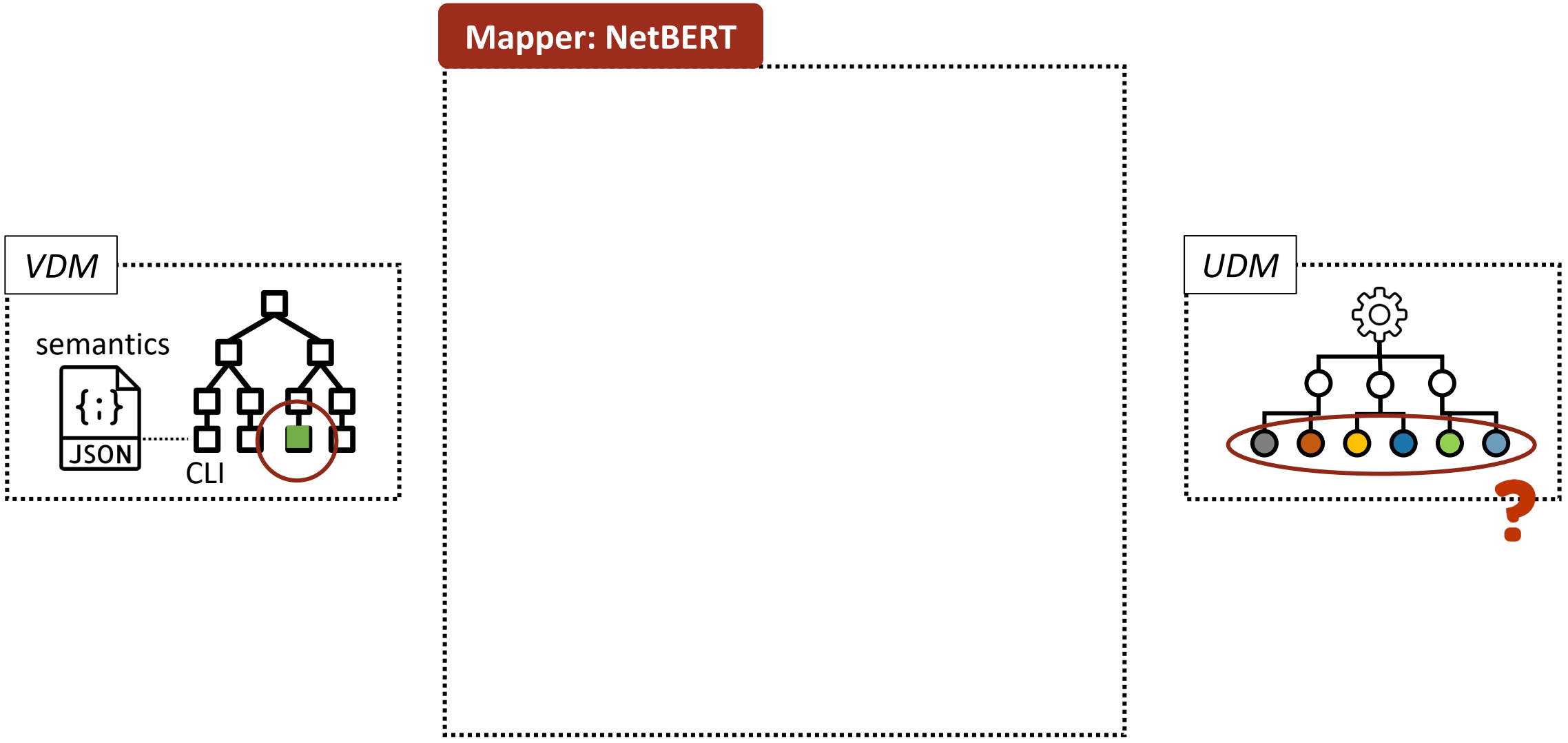

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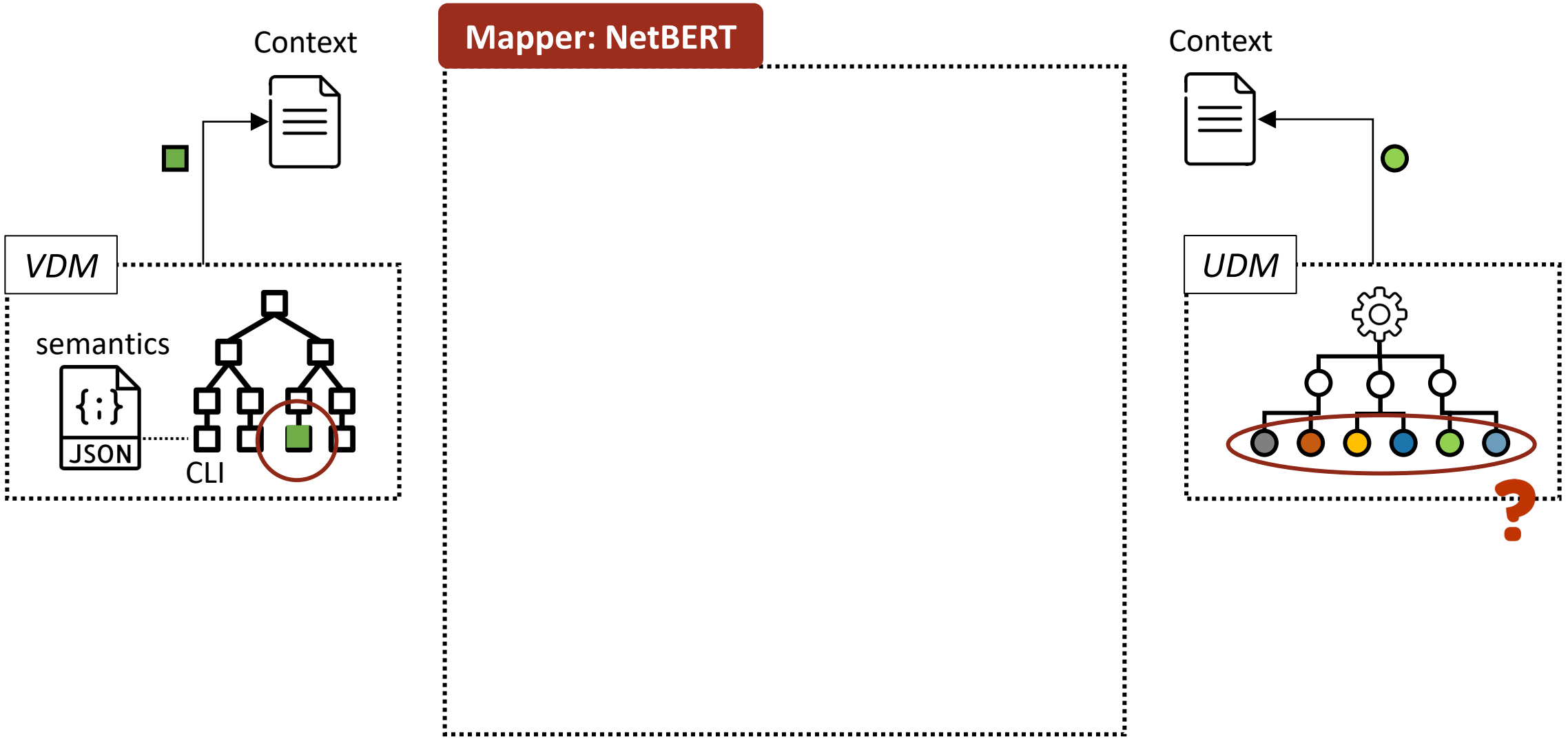

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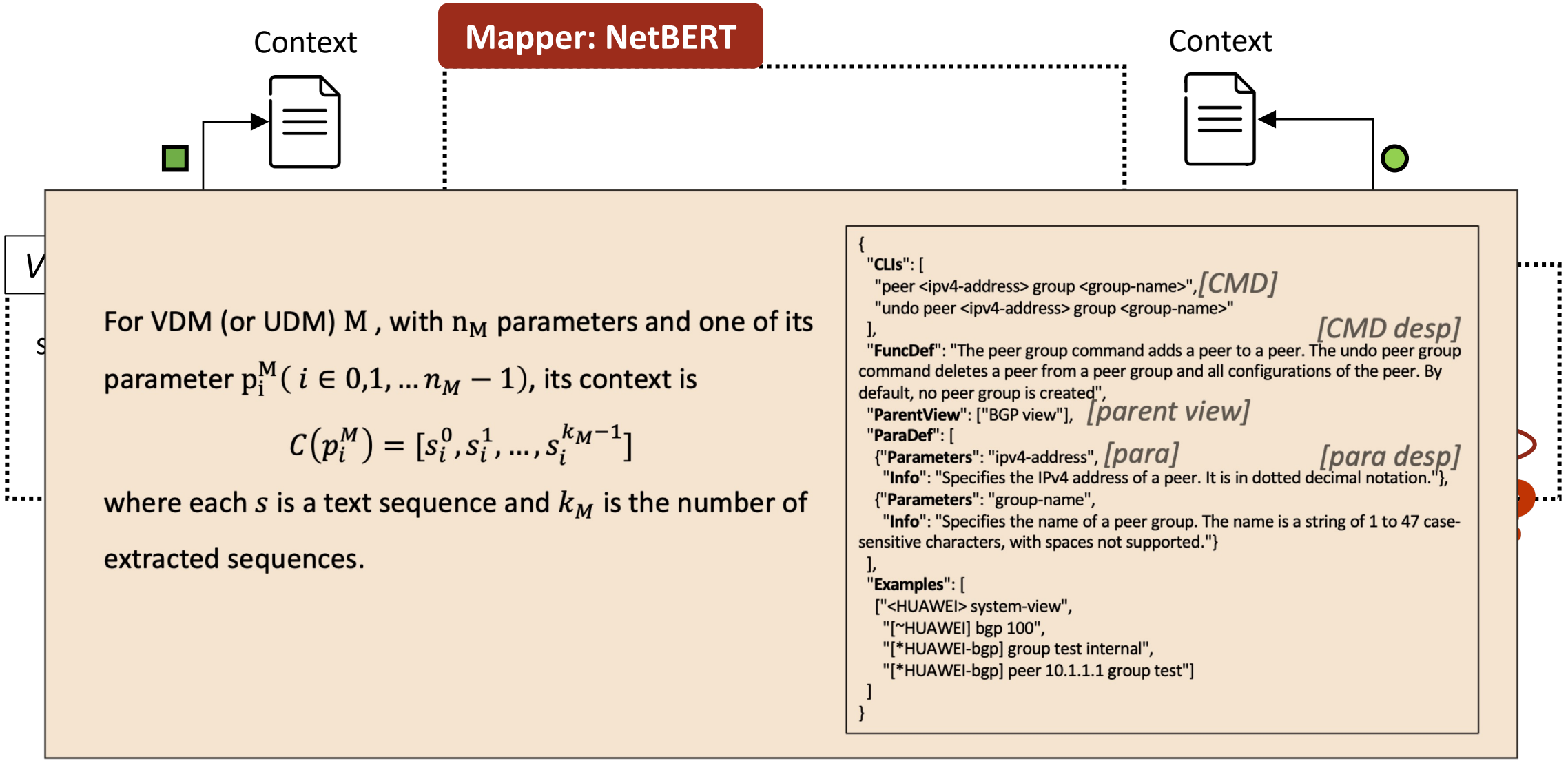

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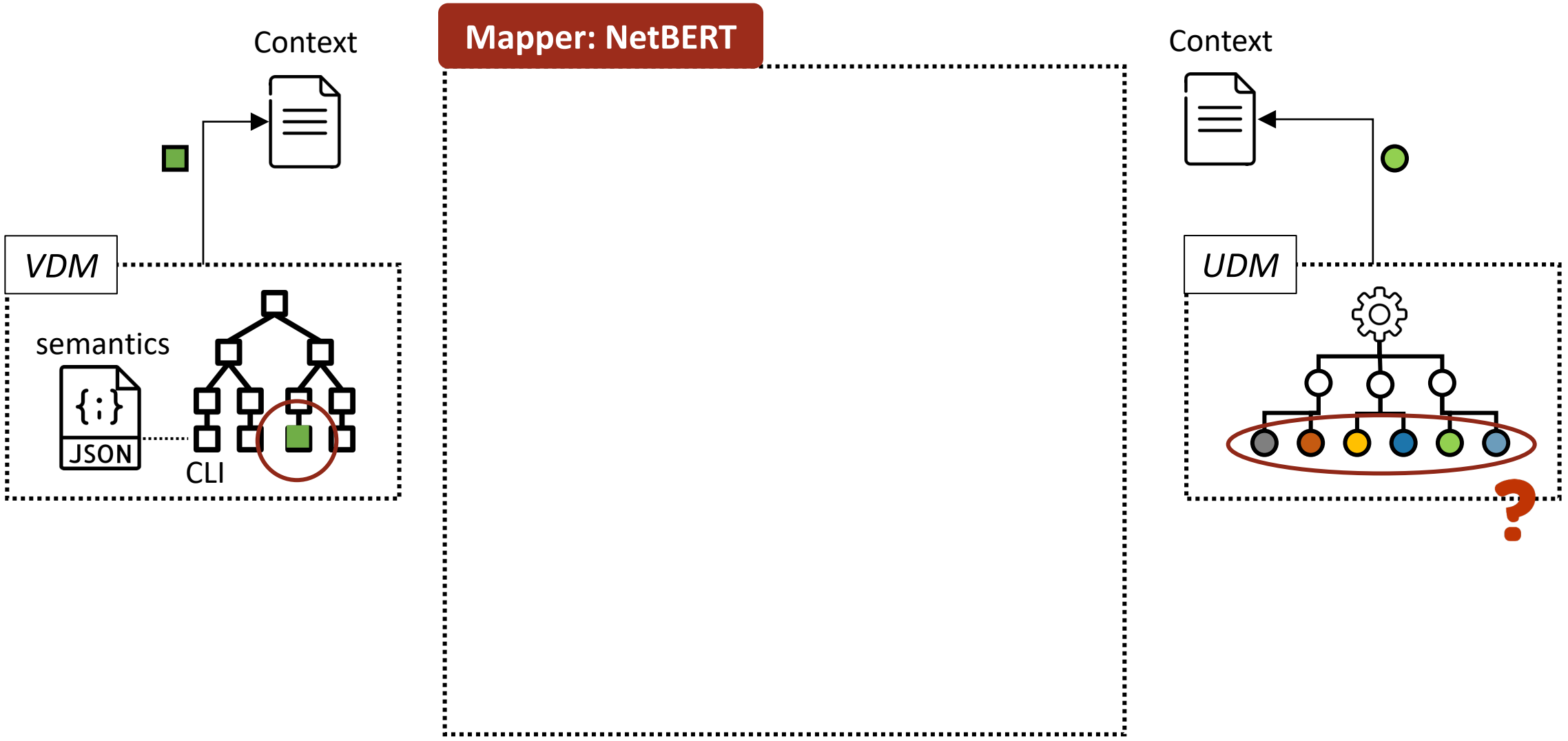

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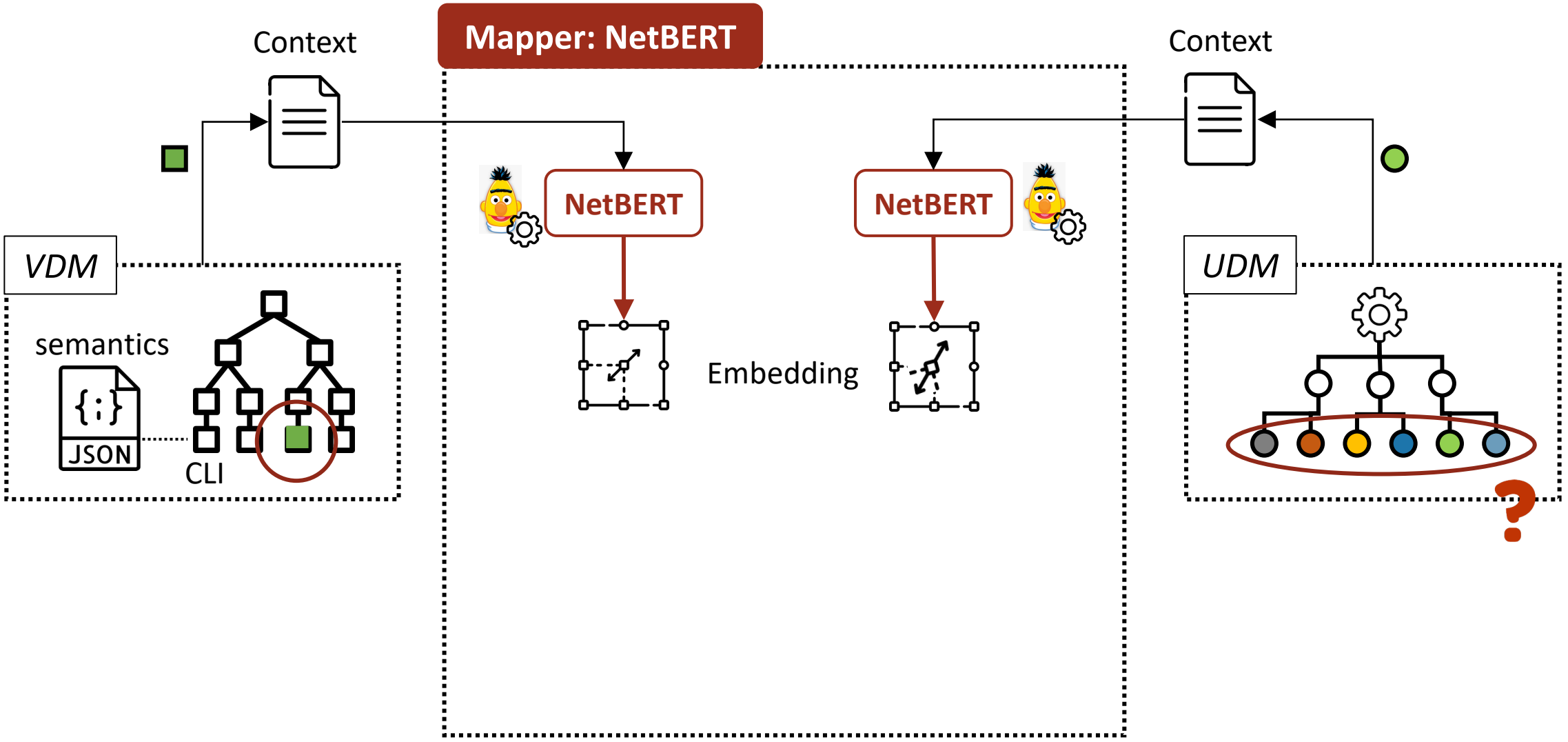

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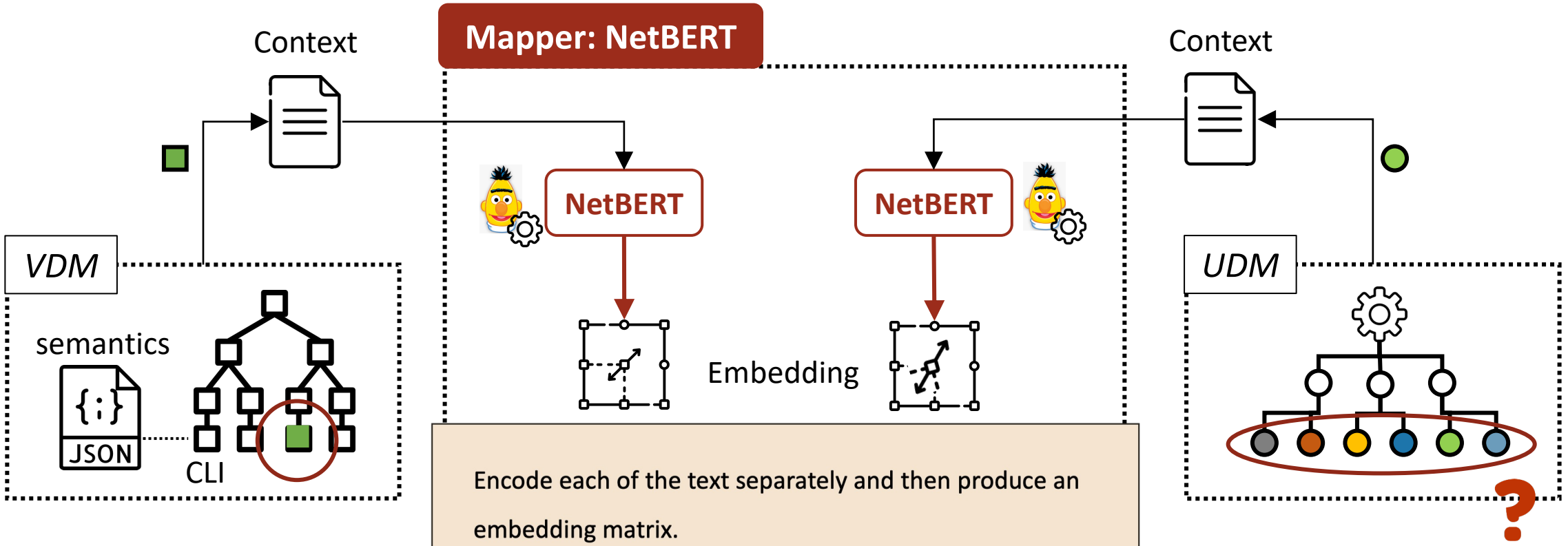

Encode each of the text separately and then produce an embedding matrix.

Assume the output dimension of the encoder $e(\cdot)$ is m, the context embedding of $\mathrm{p}_\mathrm{i}^\mathrm{M}$ is:

$$E_i^M = e(C(p_i^M)) = e([s_i^0, s_i^1, \ldots, s_i^{k_M-1}]) \in R^{k_M \times m}$$

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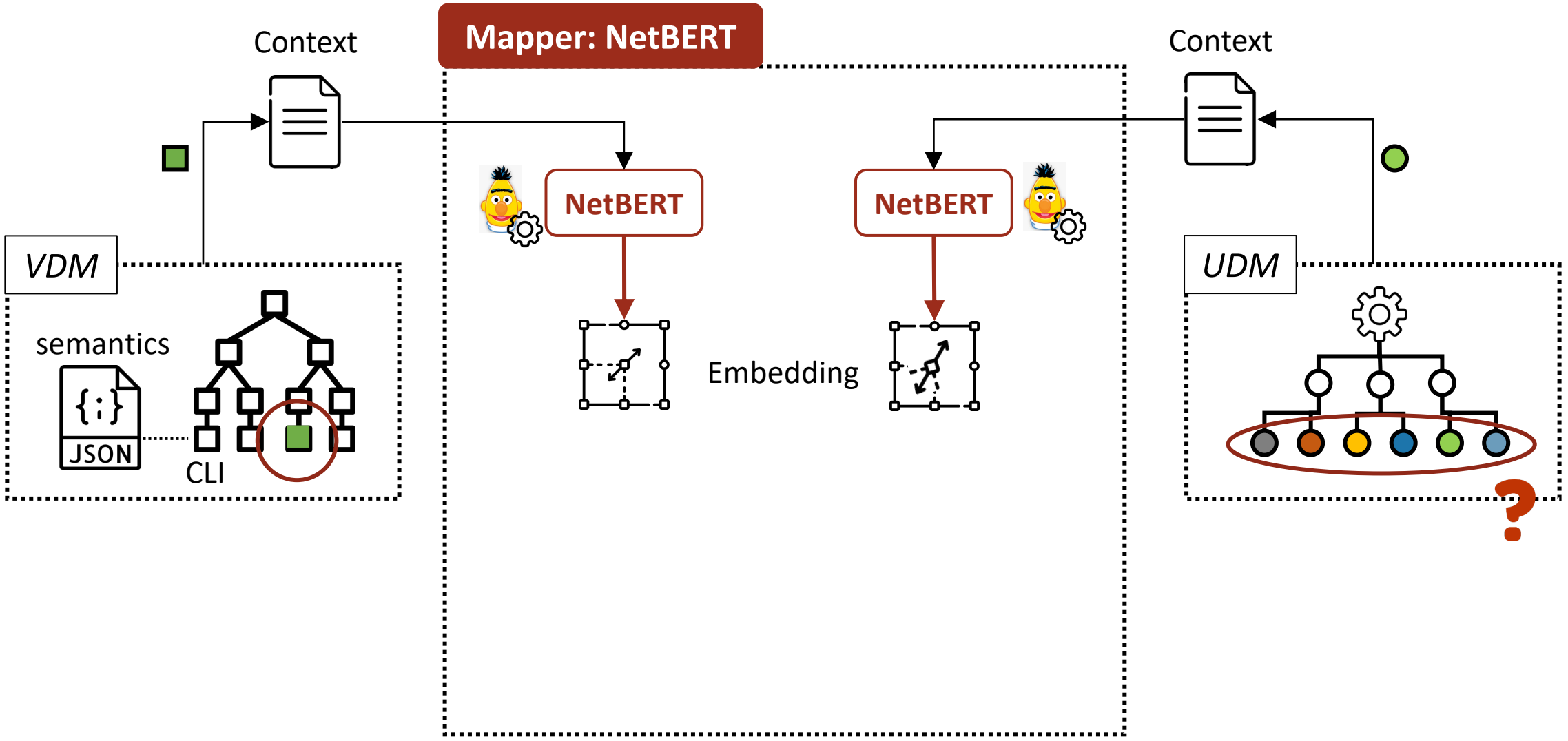

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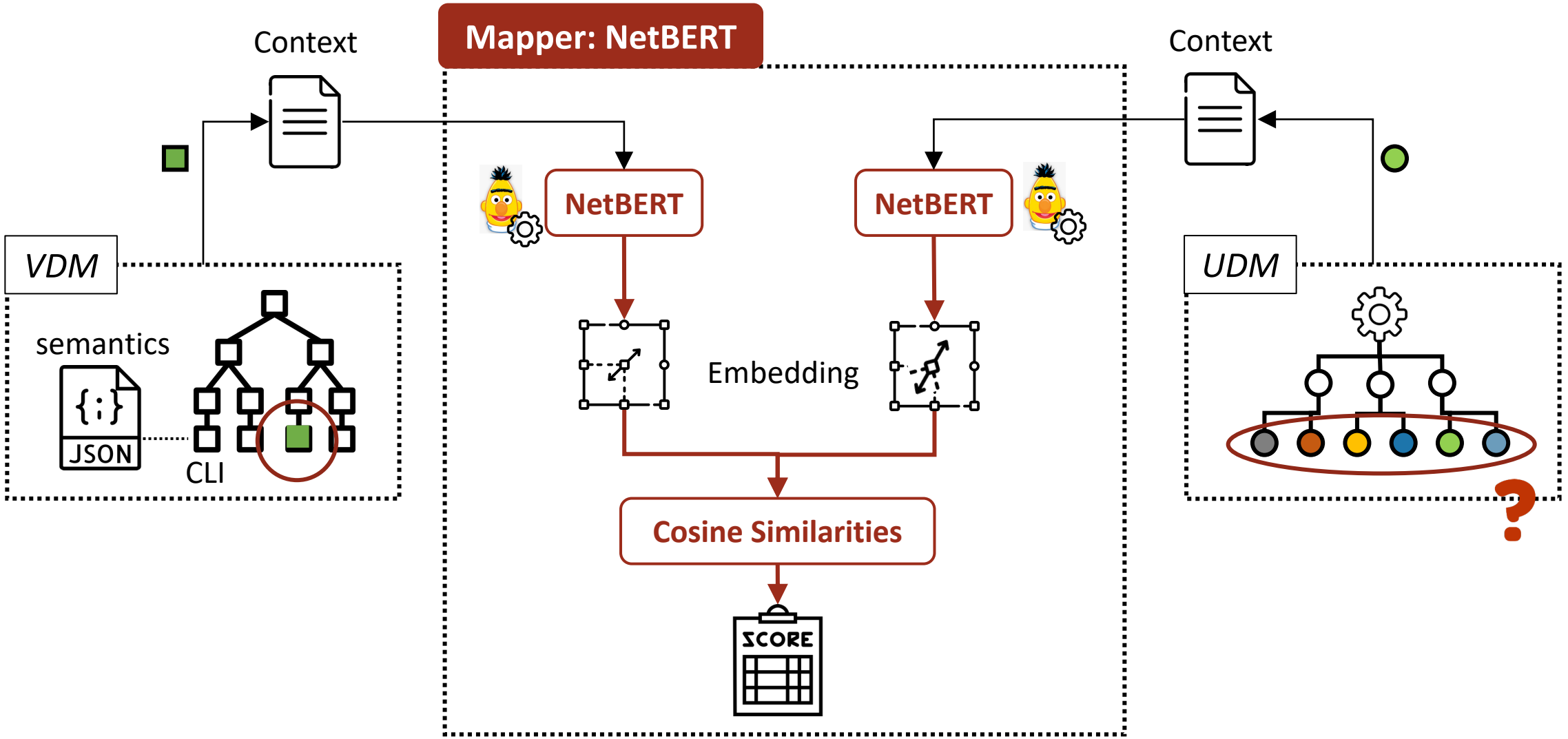

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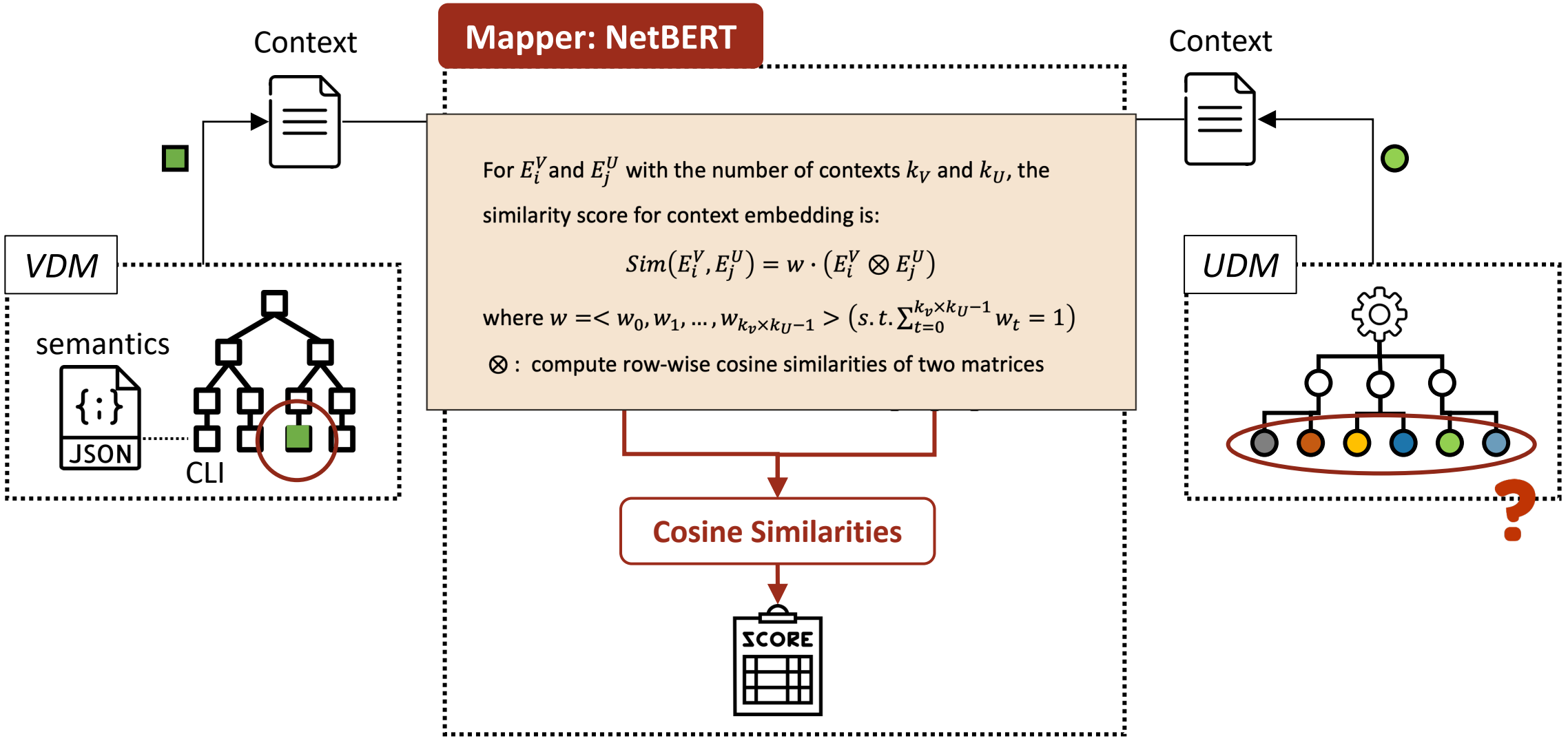

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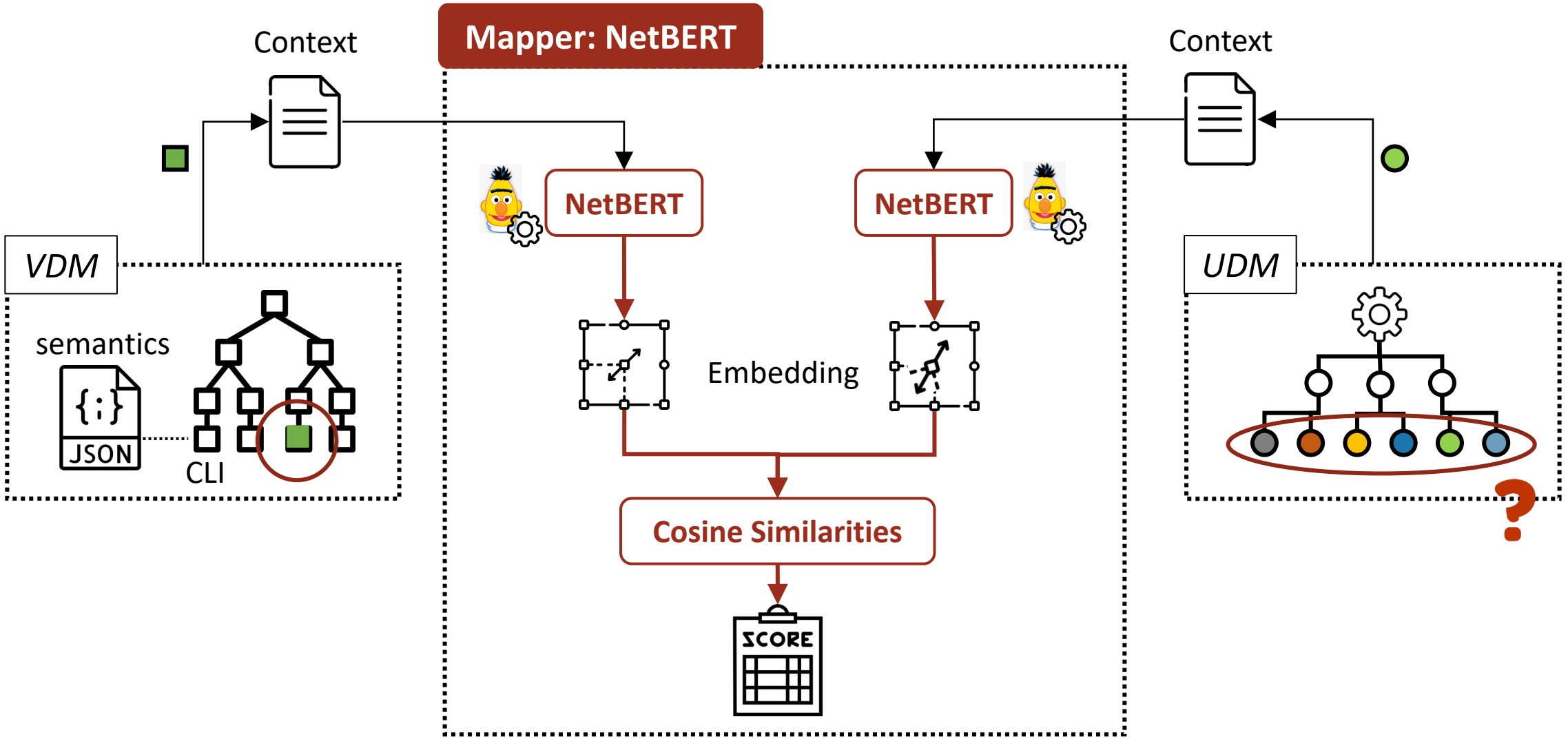

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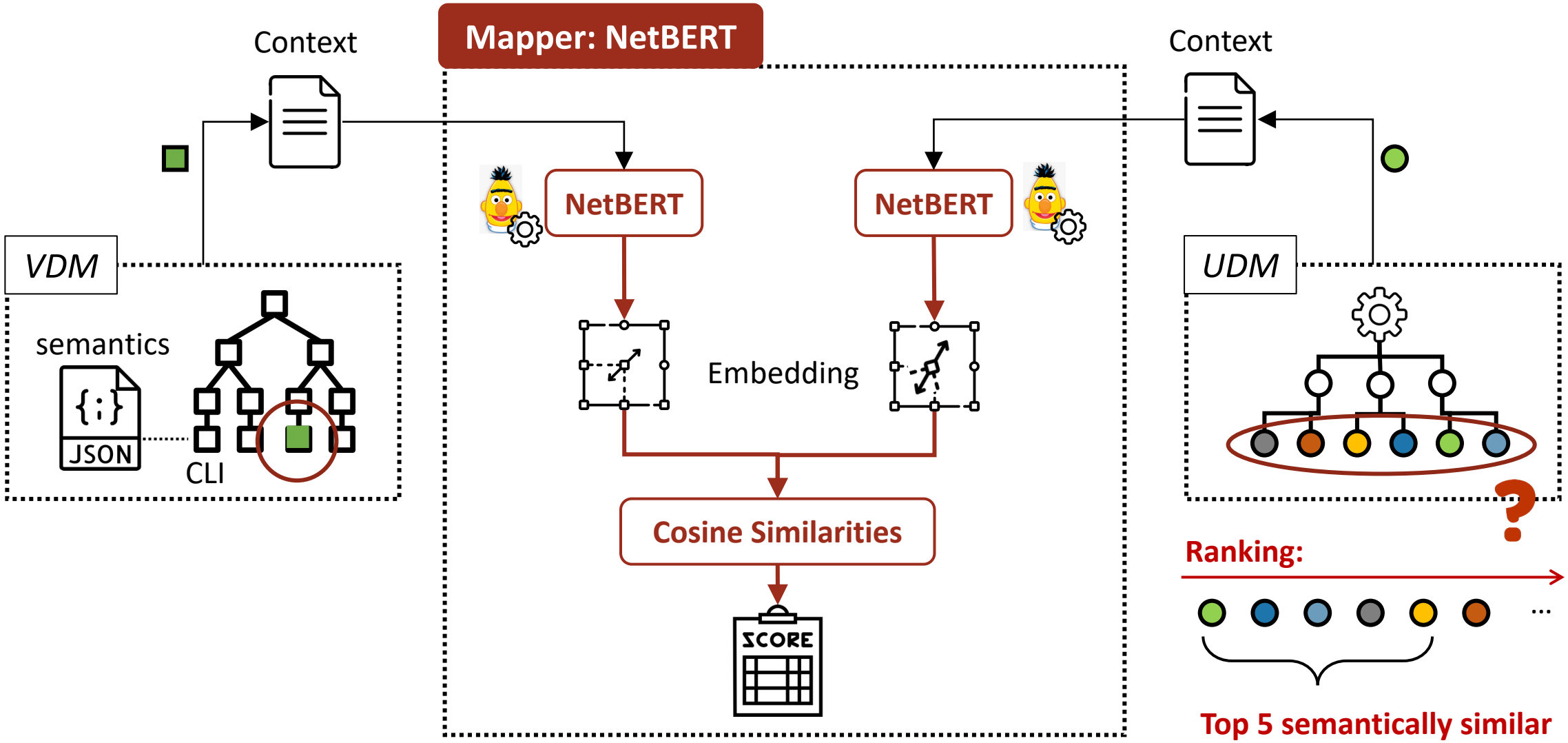
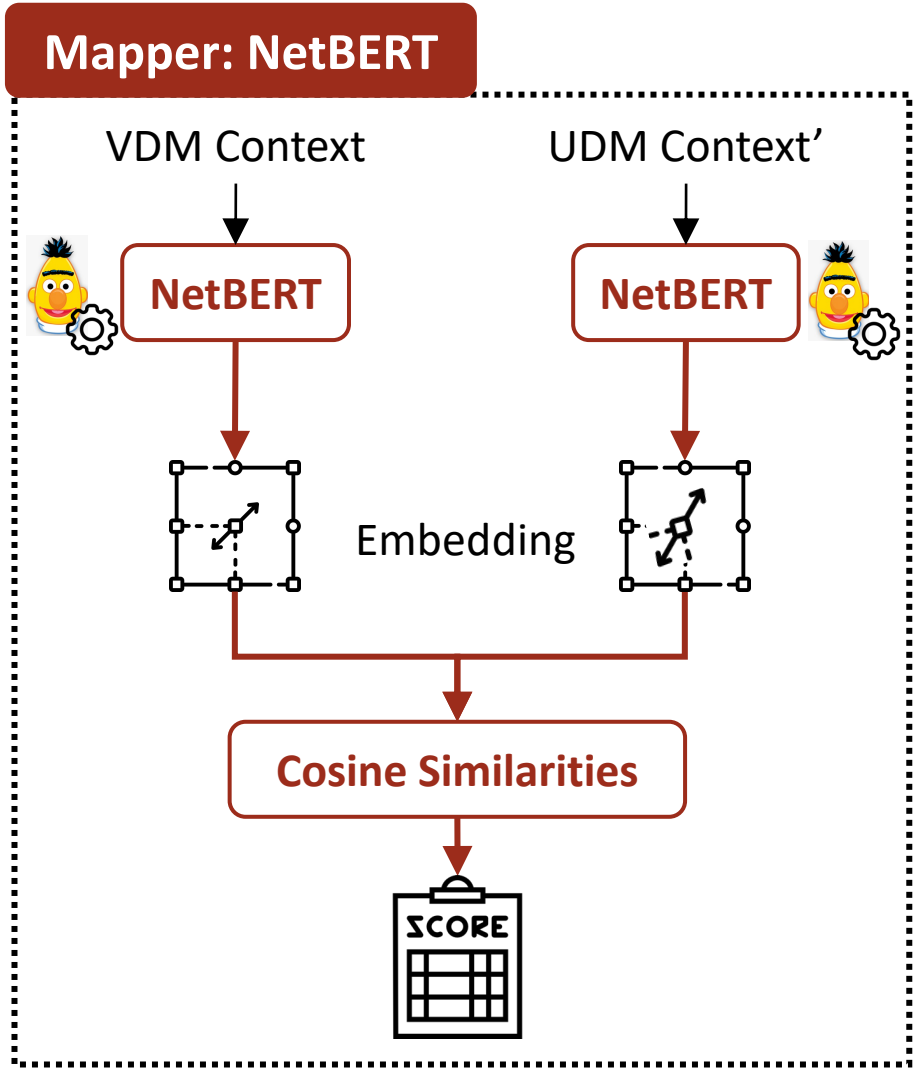
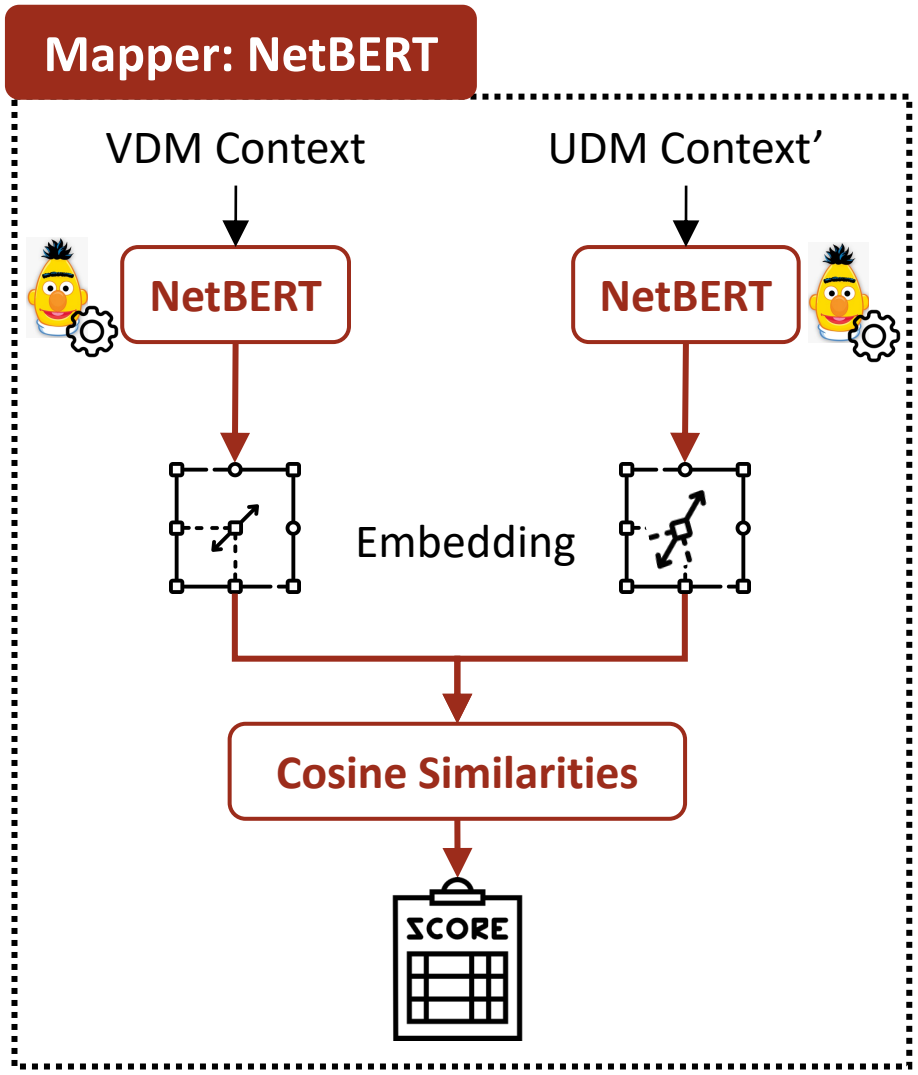


NAssim Mapper: NetBERT Training



NAssim Mapper: NetBERT Training

Pre-trained model*



**Reimers, Nils, et al. "Sentence-BERT: Sentence Embeddings using Siamese BERT-Networks." EMNLP, 2019.*

NAssim Mapper: NetBERT Training

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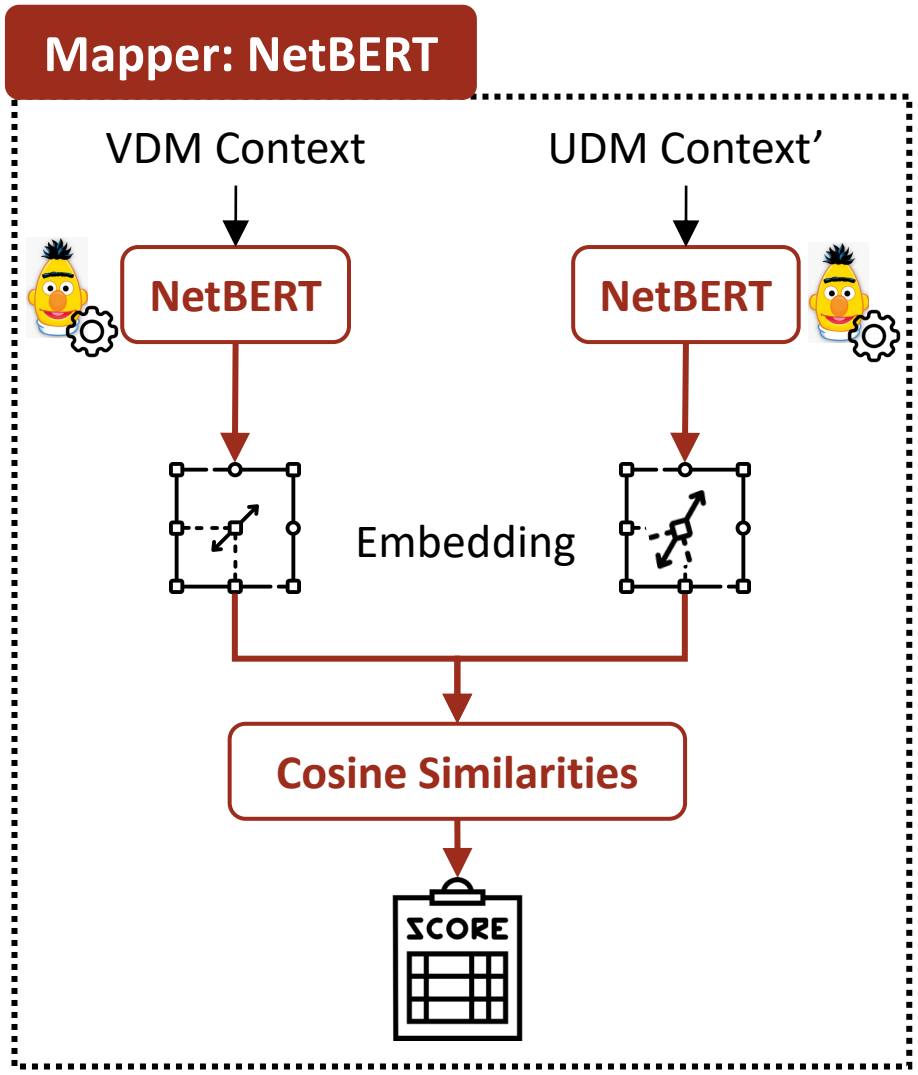
Net-Config Domain Data



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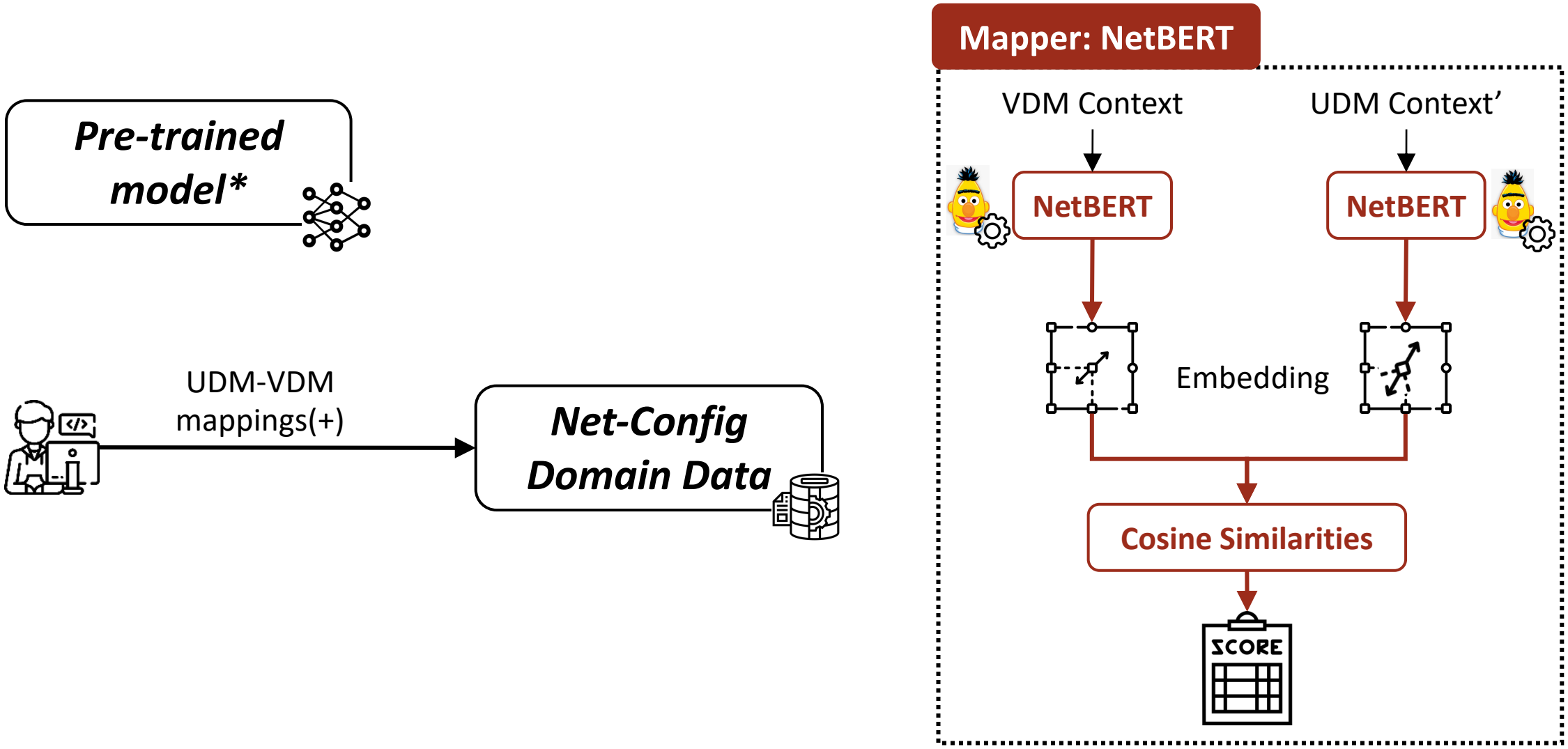

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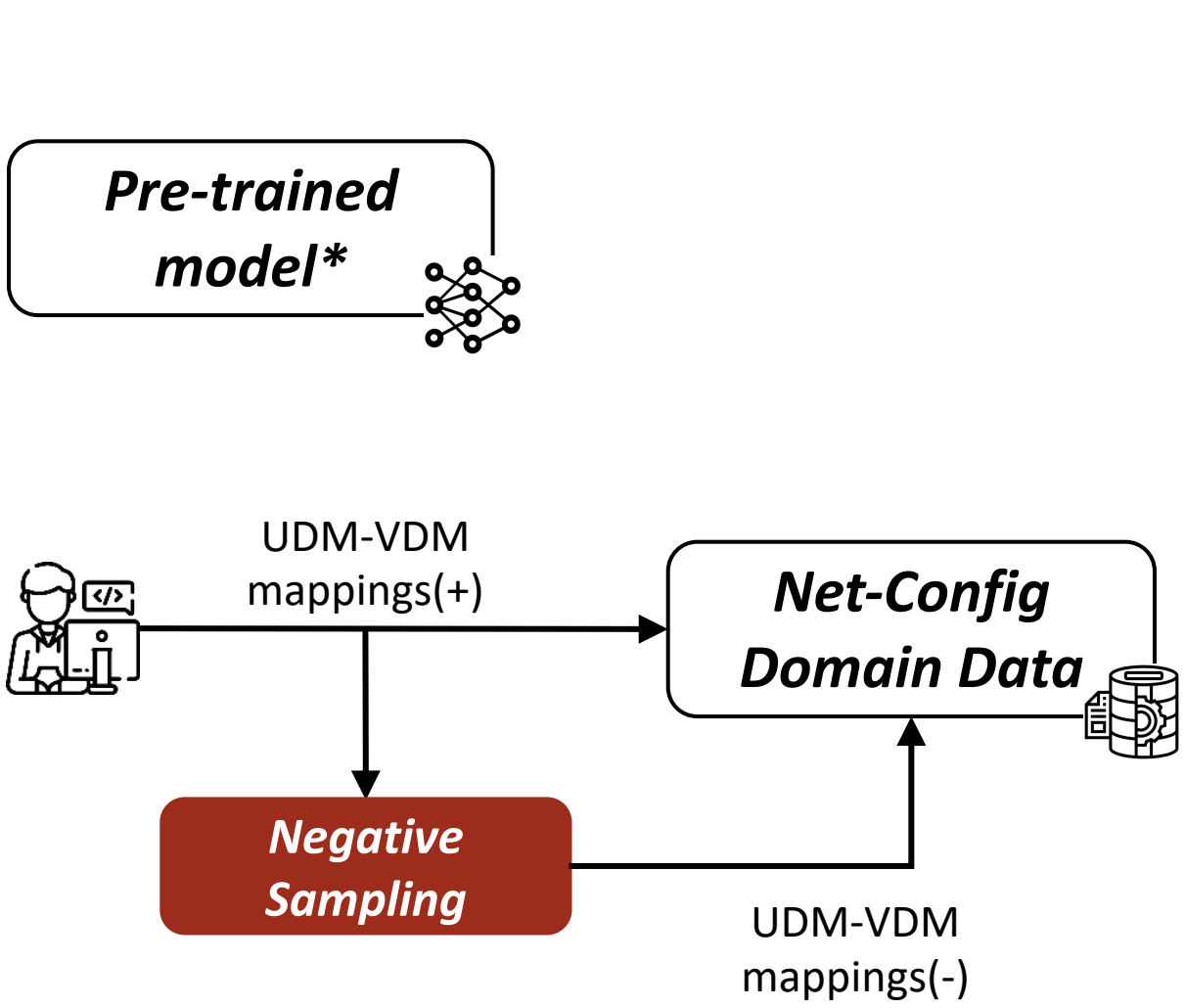

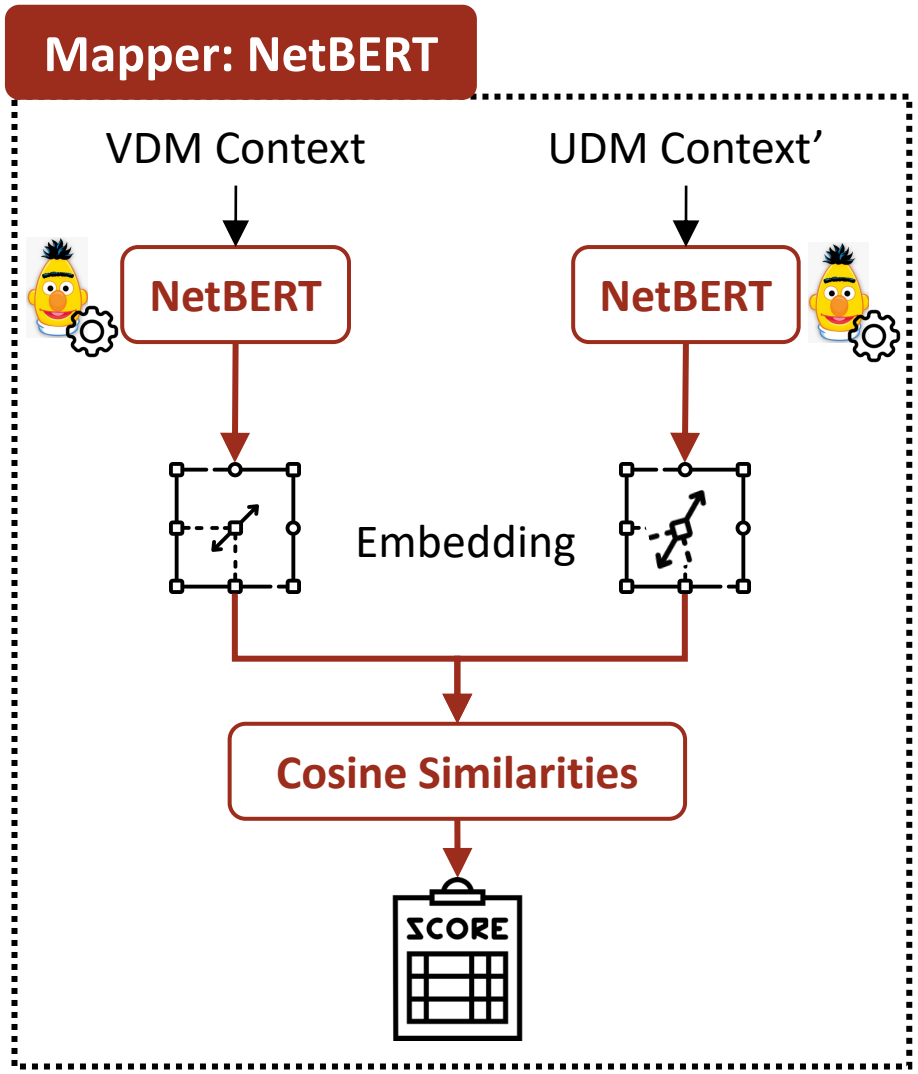

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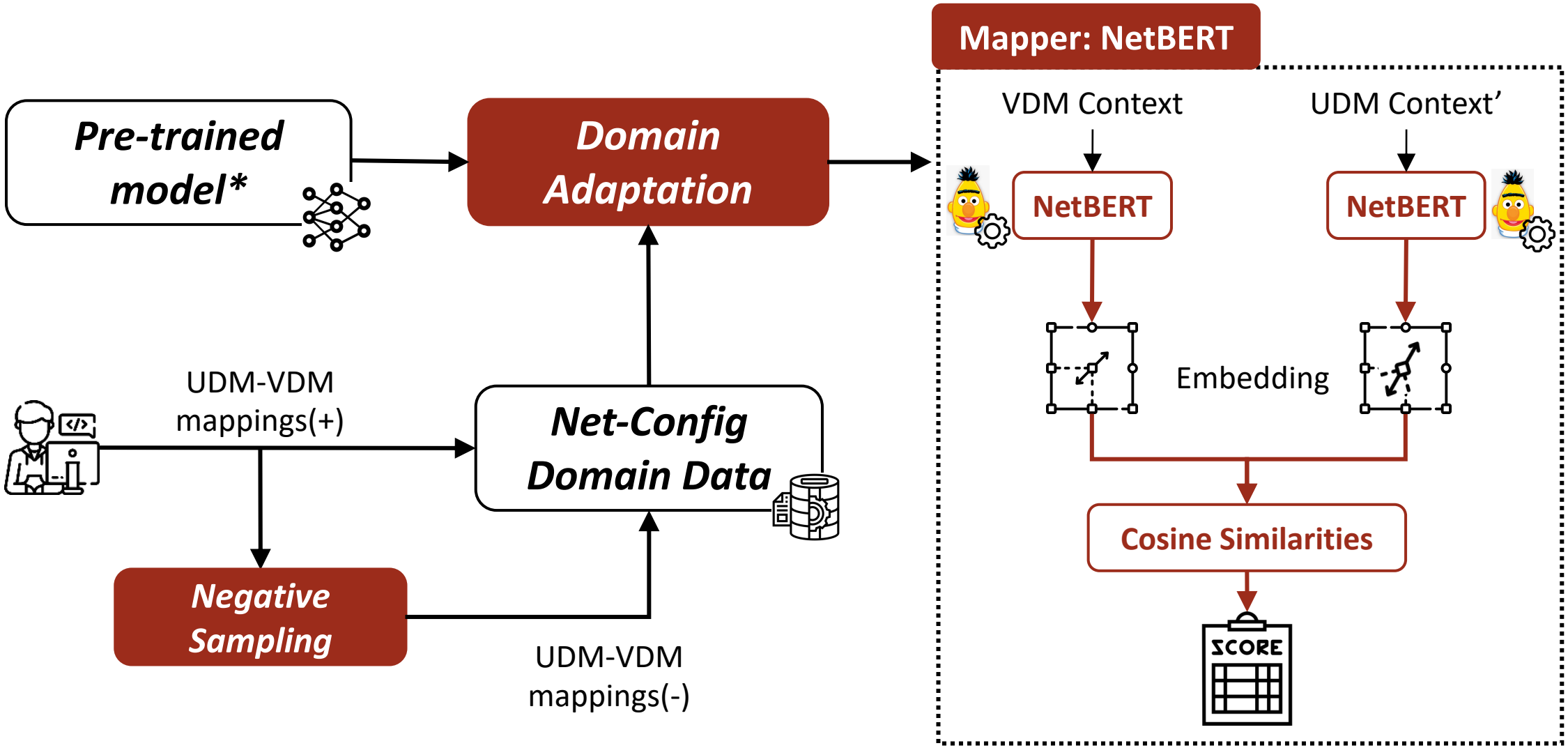

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VDM-UDM Mapping Phase: Mapper

Mapping Setting	Models	k in recall@top k (%)											
		1	2	3	4	5	6	7	8	9	10	20	30
Huawei-UDM	IR	41	52	61	66	69	74	76	78	79	80	90	93
	SimCSE	40	53	59	63	66	67	68	69	70	72	77	81
	SBERT	53	66	72	76	79	80	81	82	84	85	89	92
	IR+SimCSE	43	61	68	74	75	77	79	80	81	82	89	92
	IR+SBERT	56	69	75	79	81	83	85	86	87	88	91	94
	NetBERT	57	69	74	78	80	84	85	86	86	87	91	94
	IR+NetBERT	**58**	**71**	**78**	**81**	**83**	**85**	**86**	**87**	**88**	**89**	**93**	**95**
Nokia-UDM	IR	24	31	41	45	48	56	57	59	59	60	66	70
	SimCSE	20	27	31	33	37	38	39	39	39	42	45	48
	SBERT	34	35	38	44	49	49	49	52	52	52	58	53
	IR+SimCSE	24	31	35	40	42	43	46	48	48	48	57	61
	IR+SBERT	34	40	42	49	52	52	54	55	55	58	62	72
	NetBERT	34	40	43	50	53	**58**	**66**	67	67	**70**	71	73
	IR+NetBERT	**35**	**41**	**47**	**51**	**55**	57	65	**67**	**68**	68	**71**	**73**

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9.1x

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- We release a validated and expert-curated dataset of parsed manual corpus for future research. (https://github.com/AmyWorkspace/nassim)

Thank you!

Theory Lab, Hong Kong Research Center (HKRC), Huawei Technologies, Co. Ltd.

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Gong ZHANG: nicholas.zhang@huawei.com

Welcome to join us and do impactful works ！

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