ProgrammabilityMedic: Predictable Path Programmability Recovery under Multiple Controller Failures in SD-WANs

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ICDCS'21 (July 8, 2021)





- 1. Background and Motivation
 - 1.1. Software-Defined Networking (SDN)
 - 1.2. Software-Defined Wide Area Networks (SD-WANs)
 - 1.3. Controller failure problem in SD-WANs
- - 2.1. Switch-level mapping solution
 - 2.2. Flow-level mapping solution
- 3. Overview of ProgrammabilityMedic
 - 3.1. Opportunity

 - 3.3. Flow Mode Selection and Switch Mapping problem
 - 3.4. Heuristic solution: ProgrammabilityMedic
- 4. Evaluation
- 5. Summary

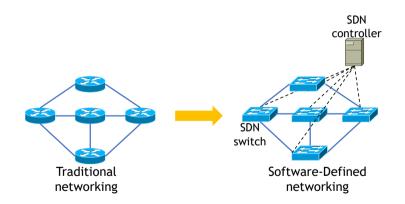
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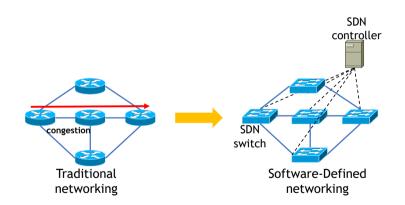
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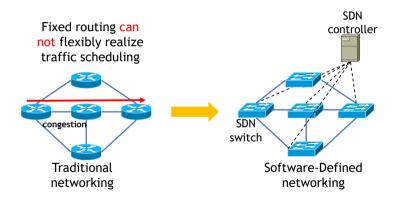




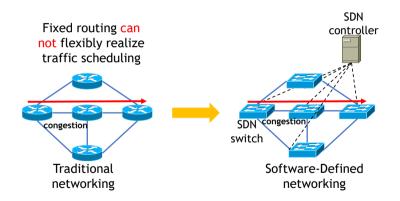




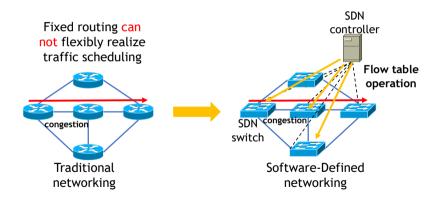




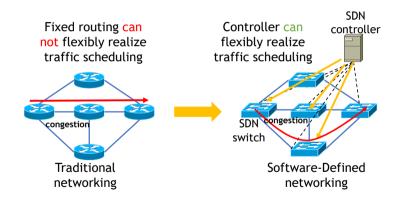














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Software-Defined Wide Area Networks (SD-WANs)



- Large scale with many devices



AT&T topology.

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Software-Defined Wide Area Networks (SD-WANs)



- Large scale with many devices
- Partitioning the network into domains



AT&T topology.

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Software-Defined Wide Area Networks (SD-WANs)



- Large scale with many devices
- Partitioning the network into domains
- Distributed control plane
 - 1. Quick response
 - 2. Control resiliency
 - 3. Controller synchronization



AT&T topology.



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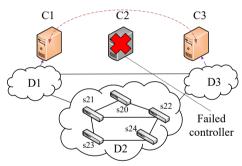
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Controller failure problem in SD-WANs



Controller failure

 Software bugs, Hardware failure, Power outage



An example of controller failure.

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Controller failure problem in SD-WANs

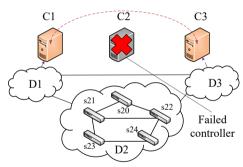


Controller failure

 Software bugs, Hardware failure, Power outage

Maintaining path programmability

Offline switches remapping



An example of controller failure.

Controller failure problem in SD-WANs



Controller failure

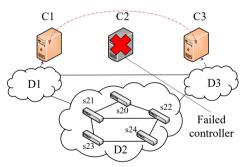
 Software bugs, Hardware failure, Power outage

Maintaining path programmability

Offline switches remapping

Challenges

- Limited control resource
- Path programmability recovery
- Multiple failures



An example of controller failure.

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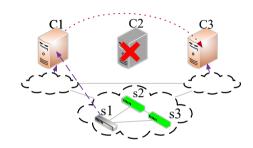
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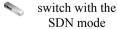


Switch-level mapping solution

RetroFlow*

- Some offline switches work under the legacy routing mode without the controllers
- The rest offline switches with the SDN routing mode





switch with the legacy mode

An example of switch-level solution.

^{*}Z. Guo et al., Retroflow: Maintaining control resiliency and flow programmability for software-defined wans, in IEEE/ACM IWQoS'19.

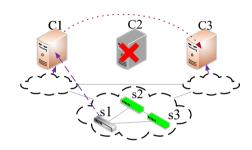
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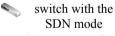
RetroFlow*

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Limitations

- Fixed control cost of switches
- Per-switch mapping



switch with the legacy mode

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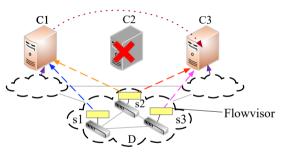
Flow-level mapping solution



Switch-level mapping solution

ProgrammabilityGuardian[†]

- Introducing a middle layer between controller and switches using Flowvisor
- Fine-grained per-flow mapping



An example of flow-level solution.

[†]Z. Guo et al., Improving the path programmability for software-defined wans under multiple controller failures, in IEEE/ACM IWQoS'20.

Flow-level mapping solution



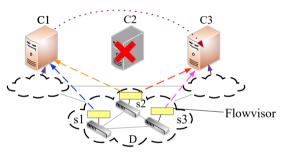
Switch-level mapping solution

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- Introducing a middle layer between controller and switches using Flowvisor
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Limitations

- Increasing the processing delay
- Bringing new unreliability



An example of flow-level solution.

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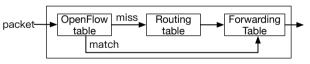
Opportunity



Hybrid SDN/legacy routing mode

- Specifically hybrid OpenFlow/OSPF routing mode
- Selectively deciding the routing mode for each offline flows
- Dynamically changing the control cost of offline flows





Hybrid SDN/legacy routing mode.



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Design considerations



Consideration 1:

• Recovering offline flows as many as possible

Design considerations



Consideration 1:

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Consideration 2:

Balancing path programmability

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Design considerations



Consideration 1:

• Recovering offline flows as many as possible

Consideration 2:

Balancing path programmability

Consideration 3:

• Fully utilizing controllers' control resource



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Switch-controller mapping constraint

• Each switch can be mapped to at most one controller

$$\sum_{j=1}^{M} x_{ij} \le 1, \forall i. \tag{1}$$

Controller resource constrain

• The control load of a controller should not exceed the controller's available control resource

$$\sum_{l=1}^{L} \sum_{i=1}^{N} (x_{ij} * \beta_i^l * y_i^l) \le A_j^{rest}, \forall j.$$
 (2)



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Flow programmability constraint

• r is used to denote the least programmability of all offline flows

$$pro^{l} = \sum_{i=1}^{N} \sum_{j=1}^{M} (\bar{p}_{i}^{l} * x_{ij}^{l} * y_{i}^{l}) \ge r, \forall l.$$

$$(3)$$

$$G = \sum_{i=1}^{M} \sum_{i=1}^{N} (\alpha_{ij} * \gamma_i * D_{ij}). \tag{4}$$

$$\sum_{i=1}^{L} \sum_{j=1}^{M} \sum_{i=1}^{N} (x_{ij} * \beta_i^l * y_i^l * D_{ij}) \le G.$$
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 (3)

Propagation delay constraint

Total propagation delay should not exceed the propagation delay of the ideal recovering case

$$G = \sum_{i=1}^{M} \sum_{i=1}^{N} (\alpha_{ij} * \gamma_i * D_{ij}). \tag{4}$$

$$\sum_{l=1}^{L} \sum_{i=1}^{M} \sum_{i=1}^{N} (x_{ij} * \beta_i^l * y_i^l * D_{ij}) \le G.$$
 (5)

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Flow Mode Selection and Switch Mapping problem





Objective function

• To recover offline flows as many as possible and let them have similar programmability

$$obj_1 = r. (6)$$

To make full use of the control resource of active controllers

$$obj_2 = \sum_{l=1}^{L} pro^l. (7)$$

$$\max_{r,x,y} r + \lambda \sum_{l=1}^{L} pro^{l} \tag{P}$$

$$r > 0, x_{ij}, y_i^l \in \{0, 1\}, \forall i, \forall j, \forall l.$$

Flow Mode Selection and Switch Mapping problem



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Problem formulation

$$\max_{r,x,y} r + \lambda \sum_{l=1}^{L} pro^{l} \tag{P}$$

subject to

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Heuristic solution: ProgrammabilityMedic



Preferably recovering offline flows, which have the least programmability

- Finding switch s_{i_0} to recover
- ullet Mapping switch s_{i_0} to controller C_{j_0}
- ullet Selecting the routing mode for flows at switch s_{i_0}

Making full use of available control resource to improve the total programmability

Improving the total programmability

```
1: X = \emptyset, Y = \emptyset, S^* = S, \sigma = 0, test count = 0:
   while test count < TOTAL ITERATIONS do
         \delta = 0, i_0 = \text{NULL}, i_0 = \text{NULL}
         find switch s<sub>i</sub>, to recover
        for s_i \in S^* do
             TEST NUM - 0:
             for l \in \{\beta^l = 1, l \in [1, L]\} do
                 if h^l == \sigma then
                      TEST NUM = TEST NUM + 1:
                  end if
             end for
             if TEST_NUM > \delta then
                 \delta = TEST NUM, i_0 = i_1
             end if
        //map switch s_4, to controller C_4.
        if (i_0, *) \in \mathcal{X} then
             use io to find io from X:
             for C_i \in C(i_0) do
                 if A_{\gamma}^{rest} \ge \gamma_{t_0} then
                     i_0 = i:
                  end if
             end for
             if is == NULL then
                 A_{i}^{rest} = max(A), j_0 = j;
        X \leftarrow X \cup (i_0, j_0), S^* \leftarrow S^* \setminus s_{i_0};
        //select the routing mode for flows at switch s_{in}
        for l_0 \in \{\beta^1 = 1, l \in [1, L]\} do
             if h^{l_0} \le \sigma and (i_0, l_0) \notin \mathcal{Y} and A_{i_0}^{rest} > 0 then
                  A_{cest}^{rest} = A_{cest}^{rest} - 1, h^{l_0} = h^{l_0} + pro_{l_0}^{l_0};
                 V \leftarrow V \cup (i_0, I_0):
             end if
        and for
        if |S^*| == \emptyset then
            S^* = S, test_count++, \sigma = \min(\mathcal{H});
    //improve the total programmability
 2: for (i_0, l_0) \in \{\beta^l = 1, i \in [1, M], l \in [1, L]\} do
       if (i_0, *) \in \mathcal{X} then
             use i_0 to find i_0 from X:
             if A^{rest} > 0 and (i_0, l_0) \notin \mathcal{V} then
                 A_{20}^{rest} = A_{30}^{rest} - 1, h^{l_0} = h^{l_0} + pro_{i_0}^{l_0};
                  V - VIII (in In)
```

Heuristic solution: ProgrammabilityMedic



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        if (i_0,*) \in \mathcal{X} then
            use i_0 to find i_0 from X:
             if A^{rest} > 0 and (i_0, l_0) \notin V then
                 A_{in}^{rest} = A_{in}^{rest} - 1, h^{l_0} = h^{l_0} + pro_{io}^{l_0};
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Simulation setup

- AT&T topology with 25 nodes and 112 (56*2) links
- 6 controllers
- Any two nodes have a flow



AT&T topology.

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Simulation setup

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Comparison algorithms

- RetroFlow
- ProgrammabilityMedic
- Optimal
- ProgrammabilityGurdian



AT&T topology.

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Simulation scenarios

- Scenario 1. One controller failure
- Scenario 2. Two controllers failure
- Scenario 3. Three controllers failure

Performance metrics

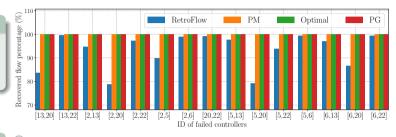
- Path programmability of flows
- Percentage of total path programmability of recovered flows to RetroFlow
- Percentage of recovered programmable flows from offline switches
- Number of recovered offline switches
- Control resource of active controllers
- Per-flow communication overhead



Two controllers failure

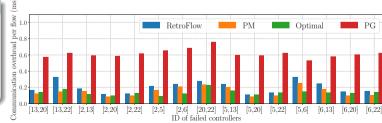
Recovered programmable flows

- PM, Optimal, and PG recover all offline flows
- RetroFlow: 78-99% to PM



Communication overhead

- The lower, the better
- PG performs the worst because the middle layer's processing time significantly increases the overhead



More results in paper

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Summary



New idea

• We propose to recover path programmability of offline flows by approximately realizing flow-controller mappings using hybrid SDN/legacy routing supported by high-end commercial SDN switches.

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Summary



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 We propose to recover path programmability of offline flows by approximately realizing flow-controller mappings using hybrid SDN/legacy routing supported by high-end commercial SDN switches.

New problem and solution

• We formulate the **Flow Mode Selection and Switch Mapping (FMSSM) problem**, which is a mix integer programming with high computation complexity. To efficiently solve the problem, we reformulate the problem with linear techniques and solve the problem with the proposed efficient **heuristic algorithm** named PM.

Good performance

 We evaluate the performance of PM under different controller failure scenarios. The results show that PM outperforms existing switch-level solutions by maintaining balanced programmability and increasing the total programmability under multiple controller failures.

Summary



New idea

 We propose to recover path programmability of offline flows by approximately realizing flow-controller mappings using hybrid SDN/legacy routing supported by high-end commercial SDN switches.

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Q&A

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