Securing Workflows

On the Use of Microservices and Metagraphs to Prevent Data Exposures

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Workflows are used everywhere and by everyone.



Supply chain, customer orders, ticketing systems, etc.

Businesses and operations - Sometimes convoluted



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They can be complex.

Businesses and operations - Sometimes straightforward



• Sequence of tasks processing a set of data.



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In the movie industry, data is often stored **unencrypted** in the cloud.

Sensitive data is accessed by an unauthorized party.





Breach

 $^{^1}$ Jonathan Stempel and Jim Finkle. Yahoo says all three billion accounts hacked in 2013 data theft. 2017

• At rest¹ or in transport.



Breach

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- 2013 Yahoo data theft.





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- At rest¹ or in transport.
- 2013 Yahoo data theft.
- 88% of cloud breaches due to human error.



Breach

¹Jonathan Stempel and Jim Finkle. *Yahoo says all three billion accounts hacked in 2013 data theft.* 2017

Leak due to **processing**.



Leak

 $^2{\rm Brian}$ Krebs. First American Financial Corp. Leaked Hundreds of Millions of Title Insurance Records. 2019

Leak due to **processing**.

• Mistake² or malicious.





²Brian Krebs. *First American Financial Corp. Leaked Hundreds of Millions of Title Insurance Records.* 2019

Leak due to processing.

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Leak

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Exposures are trending up³



³Risk Based Security. Data Breach Quickview 2020 Year End Report. 2021

Exposures are trending up³



Record = **collection** of related fields.

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82% of compromised records from five leaks.

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- 2. Exposures are widespread, outcomes of critical vulnerabilities, and happening more.
- 3. The shift to the cloud has brought **new security risks**.

Enforce secure multi-party workflows and prevent data exposures

• **<u>RQ1</u>**: How can we use microservices to enable multi-party workflow?

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- **<u>RQ2</u>**: How do we verify a policy specification corresponds to its implementation?
- **RQ3:** How do we verify a policy specification contains no redundancies?

A Secure Infrastructure to Prevent Data Exposures

- Workflow is a **sequence of tasks** processed by a set of actors.
- Owner of the data interacts with contractors to realize task.
- Actors have agents: employee or automated service.



How can we enforce workflows and prevent data exposures?

• Data security at rest: stored encrypted,



• Data security **at rest**: stored **encrypted**, access restricted by **isolation** and **policy**.



- Data security **at rest**: stored **encrypted**, access restricted by **isolation** and **policy**.
- Data security in transport: exchanged encrypted, with integrity and authentication checks.



- Data security at rest: stored encrypted, access restricted by isolation and policy.
- Data security **in transport**: exchanged **encrypted**, with integrity and **authentication** checks.

The data cannot be **leaked** in both cases.



Service			
service			
Isolation			

Encrypted storage, encrypted communications, policy enforcement.



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Encrypted storage, encrypted communications, policy enforcement.

Proof of Concept deployed on Google Cloud Platform

Post-production movie workflow.



- One Kubernetes cluster per actor.
- One n1-standard-v2 per cluster (2 vCPUs, 7.5 GB of memory), except the owner which has two.

Pod startup time and Request duration.

Effect of policy engine on pod startup time

- Independent-samples t-test
- Two deployments: one with policy engine and one without.
- 130 observations per pod (*N* = 1820).



Figure 1: Startup time distribution

Time increased by **2 seconds on** average (32.72%).

Effect of policy size on request duration



We analyze intra-region and inter-region communications.

- +5 10ms on average.
- Low impact inter-region.



• Infrastructure to secure communications in a workflow.

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- Proof of concept: Code, data and guidance available.
- We verified communications and security.
- Performance analysis: Acceptable tradeoff.

The policy is optimal and error-free.

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Prone to errors:



Prone to errors:

• Attackers.



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- Distributed deployments.



Prone to errors:

- Attackers.
- Distributed deployments.
- Refinement: Semi-automatic or automatic tools.

• Verify the implementation matches the specification

• Pinpoint errors

• Existing works dealing with policy verification use SAT solvers [2], decision diagrams [3] or graphs [10].

	SAT solvers	Decision diagrams	Graphs	Metagraphs
Natural policy modeling				
Visual representation				

• Properties **specific to metagraphs** for detecting conflicts and redundancies⁴.

⁴Dinesha Ranathunga, Matthew Roughan, and Hung Nguyen. "Verifiable Policy-Defined Networking using Metagraphs". In: *IEEE Transactions on Dependable and Secure Computing* (2020).

The metagraph: a collection of directed set-to-set mappings [1]



Employees (u_1, u_2) and tasks (*create_form*, *fill_form*, *review_form*, *transfer_money*) are put into relation by the edges (e_1, e_2, e_3) between sets of elements.



Tools

- 1 RandomWorkflowSpecGenerator
- (2) YawlToMetagraph / TriplesToMetagraph
- ③ SpecToRego
- ④ RegoToMetagraph
- (5) SpecImplEquivalence



Policy specification: YAWL, or metagraph-like format.



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We can pinpoint errors in the policy.

Performance analysis (5)





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Rego policy files between 305 and 24729 lines of code, **in line** with observed policies.

Time increases with number of elements and policy size



- Verification times between 0 and 12 ms on average.
- Error rate has a negligible effect (correlation of 0.01).

• New policy verification method using metagraphs.

 $^{^5\}mathsf{Code},$ data and guidance at https://github.com/loicmiller/policy-verification

Conclusion: 2nd axis

- New policy verification method using metagraphs.
- Motivated the use of metagraphs to represent and verify policies.

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- New policy verification method using metagraphs.
- Motivated the use of metagraphs to represent and verify policies.
- Developed suite of tools⁵:
 - RandomPolicySpecGenerator
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Conclusion: 2nd axis

- New policy verification method using metagraphs.
- Motivated the use of metagraphs to represent and verify policies.
- Developed suite of tools⁵:
 - RandomPolicySpecGenerator
 - YawlToMetagraph / SpecToRego
 - RegoToMetagraph
 - SpecImplEquivalence
- Evaluated our method: verification times **between 0 and 12 ms** on average.

⁵Code, data and guidance at https://github.com/loicmiller/policy-verification
The policy is optimal and error-free.

Assumption used so far



Motivation: Speed, reduce clutter, reduce errors.

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Metagraphs have already been used to detect redundancies [9]...

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Metagraphs have already been used to detect redundancies [9]... ...but the current solution has shortcomings.

Metapaths are not simple paths



 $M_1({u_1, u_2}, {transfer_money}) = {e_1, e_2, e_3}$ is a <u>metapath</u>.

Metapaths are not simple paths



 $M_1(\{u_1, u_2\}, \{transfer_money\}) = \{e_1, e_2, e_3\}$ is a <u>metapath</u>. A metapath is **dominant** if it is both <u>input-dominant</u> and <u>edge-dominant</u>.

Input dominance - Minimality of input



$$\begin{split} &M_1(\{u_1, u_2\}, \{transfer_money\}) = \{e_1', e_2', e_3\} \text{ is not} \\ &\text{input-dominant because} \\ &M_2(\{u_1\}, \{transfer_money\}) = \{e_1, e_2, e_3\} \text{ is a metapath.} \end{split}$$

Edge dominance - Minimality of edges



 $M_1(\{u_1\}, \{transfer_money\}) = \{e_1, e_2, e_3, e_4, e_5\}$ is not edge-dominant because $M_2(\{u_1\}, \{transfer_money\}) = \{e_1, e_2, e_3\}$ is a metapath.

Elements not on any dominant metapath are redundant.

Rationale: In every possible access, we can do without the redundancy.

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"...simply check all feasible metapaths in a policy metagraph for edge and input dominance, if either fails, the policy includes redundancies" - Ranathunga et al. [9]. Elements not on any dominant metapath are redundant.

Rationale: In every possible access, we can do without the redundancy.

"...simply check all feasible metapaths in a policy metagraph for edge and input dominance, if either fails, the policy includes redundancies" - Ranathunga et al. [9].

Great! Problem solved, right?

• Checking all metapaths takes too much time.

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- Even worse, just finding all metapaths takes too much time.

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Implementing their method, it took $1\ hour$ to process metagraphs of $13\ elements\ at\ most.$

- No simple algorithm.
- Can it be done?
- NP-Hard? Yes.

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Hypergraphs, a structure related to metagraphs.

X🤈

X₃

e₁



e₂

x₆

e₄



B-edge







B-hypergraph





B-edge





BF-hypergraph

Hyperpaths



- Minimal sub-hypergraph \mathcal{H}' .
- Invertex of new edge must already be in hyperpath.





• Find all redundant edges in \mathcal{H} .



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• Find all redundant edges in \mathcal{H} .

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An input-dominant hyperpath using *e* means *e* is not redundant.

The **Forced Path Edge Problem**: simple graph version of the FHEP.

Reduction from **2-VDPP**, a known NP-Hard problem.



Proving the FHEP is NP-Complete with simple graphs



Disjoint paths (2-VDPP)

Suppose we have an instance of 2-VDPP.

Proving the FHEP is NP-Complete with simple graphs





Disjoint paths (2-VDPP)

G' construction (FPEP)

Construction G' with added forced edge.

Proving the FHEP is NP-Complete with simple graphs





Disjoint paths (2-VDPP)

G' construction (FPEP)

A solution to FPEP is a simple path from s_1 to t_2 via e'.
Proving the FHEP is NP-Complete with simple graphs





Disjoint paths (2-VDPP)

G' construction (FPEP)

A solution to FPEP is a solution to 2-VDPP.

Proving the FHEP is NP-Complete with simple graphs





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The Forced Path Edge Problem is NP-Complete.

Proving the FHEP is NP-Complete with simple graphs





Disjoint paths (2-VDPP)

G' construction (FPEP)

The Forced Path Edge Problem is NP-Complete. Corollary: the FHEP is NP-Complete.

			Redundancy
Forced Edge	Cyclic	В	NP-Hard [13]
		F	NP-Hard [13]
		BF	NP-Hard [13]
	Acyclic	В	P (linear) [13]
		F	?
		BF	?

			Redundancy
Forced Edge	Cyclic	В	NP-Hard [13]
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	Acyclic	В	P (linear) [13]
		F	NP-Hard [8]
		BF	NP-Hard [8]

Reduction from 3-SAT.

 $(v_1 \lor v_2 \lor \neg v_4) \land (v_1 \lor \neg v_2 \lor \neg v_3)$



3-SAT instance

Our construction.

The FHEP in an acyclic F-hypergraph is NP-Complete.

• Correct result by enumeration (1 hour / 6 elements).

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What aspects of metapaths can we exploit to be faster?

Dominance!

- We only need **dominant metapaths** to compute the solution, not all of them.
- A dominant metapath is **minimal**, no need to test **supersets**.
- Testing if a metapath is dominant is **polynomial**.

- Build iteratively from the top.
- Only add set if not dominant.
- This guarantees we test only when necessary.



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- Only add set if not dominant.
- This guarantees we test only when necessary.



Performance results



- SAT almost instant for generated instances.
- Pascal's triangle method up to 28 edges.

- Finding redundancies is NP-Hard.
- Roadblocks in SAT formulation.
- Efficient algorithm using Pascal's triangle.

• Microservices to enable leak-free multi-party workflows.

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- Metagraphs are a useful model for policies.
- Policy verification to check implementations.
- Policy analysis to check specifications.

This thesis therefore focuses on the prevention of data exposures, in workflows in particular.

#	Contribution	Tool	Repository (github.com/)
1	Secure infrastructure design [6, 5]	Proof of Concept	loicmiller/secure-workflow
2	Policy verification [7, 5]	Policy verification	loicmiller/policy-verification
		MGToolkit for Python 3	loicmiller/mgtoolkit
3	Policy redundancy elimination [8]	Redundancy elimination	loicmiller/policy-analysis
		SAT formulation	loicmiller/fhep-sat-formulation

All code, data, results and figures are publicly available.

- Miller et al. "Towards Secure and Leak-Free Workflows Using Microservice Isolation". In: HPSR (2021).
- Miller et al. "Verification of Cloud Security Policies". In: HPSR (2021).
- Miller et al. "Securing Workflows Using Microservices and Metagraphs". In: Electronics (2021).
- Gil Pons et al. "Finding (s,d)-Hypernetworks in F-Hypergraphs is NP-Hard". In: arXiv (2022).

Future Works

- Improved SAT generation (De Morgan's Law).
- Explore related complexity issues.

- Explore security properties (separation of duties).
- Explore impact of workflow patterns (cancellation).

- Constitution of a policy benchmark dataset.
- Distributed policy (least privilege).

- Split a single policy across distributed elements?
- Verify correctness? Least privilege?

- Policy composition (algebras).
- Who specifies what? Multiple languages?

Thank you!

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Effect of policy engine on pod startup time

- Independent-samples t-test
- Two deployments: one with policy engine and one without.
- 130 observations per pod (*N* = 1820).

Time increased by 2 seconds on average (32.72%).



Figure 2: Startup time distribution

- t(1818) = 43.19, p < 0.001
- High effect size: d = 1.985
- High statistical power:
 - $1 \beta = 0.999$

Effect of policy size on request duration



We analyze intra-region and inter-region communications.

One-way between subjects ANOVA.

40 observations per communication per scenario (N = 1600).

Policy scenarios: no opa, all allow, minimal ,+100 (+147%), +1000 (+1470%).

High (low) impact on intra (inter) region request time

Intra-region

- F(4,795) = 364.05,
 p < 0.001
- **High** effect size: $\eta_p^2 = 0.65$

Inter-region

- F(4,795) = 15.23,
 p < 0.001
- Low effect size: $\eta_p^2 = 0.07$



• Significant difference in request duration between the five scenarios for both types.

(S, D)-hypernetwork: Sum of all hyperpaths



- FHEP reducible to SDHP.
- If FHEP is NP-complete, SDHP is NP-Hard.
- Reduction from 3-SAT (NP-Complete).

$$(v_1 \lor v_2 \lor \neg v_4) \land (v_1 \lor \neg v_2 \lor \neg v_3)$$

We construct a corresponding acyclic F-hypergraph.

Any forced edge hyperpath corresponds to a solution to 3-SAT instance.
The construction

$$(v_1 \lor v_2 \lor \neg v_4) \land (v_1 \lor \neg v_2 \lor \neg v_3)$$



 p_0 is the source. f the destination.

 p_i for each variable. $q_{i,1}, q_{i,2}, q_{i,3}$ for each clause.

Edge where a variable appears in a clause.

Complexity summary for finding a hyperpath

			Edge-dom	Input-dom	Dom
Regular	Cyclic	В	P (linear)	P (linear)	Р
		F	Р	Р	Р
		BF	Р	Р	Р
	Acyclic	В	P (linear)	Р	Р
		F	Р	Р	Р
		BF	Р	Р	Р
Forced Edge	Cyclic	В	NP-Hard [13]	?	NP-Hard [13]
		F	NP-Hard [13]	?	NP-Hard [13]
		BF	NP-Hard [13]	?	NP-Hard [13]
	Acyclic	В	P (linear) [13]	?	?
		F	?	?	?
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		ΒF	NP-Hard [13]	?	NP-Hard [13]
	Acyclic	В	P (linear) [13]	?	?
		F	NP-Hard [8]	?	NP-Hard [8]
		BF	NP-Hard [8]	?	NP-Hard [8]