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# Static Taint Analysis for Web Applications

Haven't we solved this problem yet?

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Oracle Labs Australia  
20<sup>th</sup> November 2015

# Introduction and Motivation

Why are we doing this?

# Why Static Taint Analysis?

Let's take a look at the most common flaws in web applications...

Ranking	Defect
1	Injection (SQL, OS, LDAP)
2	Broken authentication and session management
3	Cross-site scripting (XSS)
4	Insecure direct object references
5	Security misconfiguration
6	Sensitive data exposure
7	Missing function level access control
8	Cross-site request forgery (CSRF)
9	Using components with known vulnerabilities
10	Unvalidated redirects and forwards

# Why Static Taint Analysis?

Most of them can be detected with taint analysis!

Ranking	Defect
1	<b>Injection (SQL, OS, LDAP)</b>
2	Broken authentication and session management
3	<b>Cross-site scripting (XSS)</b>
4	<b>Insecure direct object references</b>
5	Security misconfiguration
6	<b>Sensitive data exposure</b>
7	<b>Missing function level access control</b>
8	<b>Cross-site request forgery (CSRF)</b>
9	Using components with known vulnerabilities
10	<b>Unvalidated redirects and forwards</b>

# Common Attack Vector

## Phishing emails

From: accounts@company.com

**Subject: Your Account Has Been Suspended**

Dear user,

We are sending this email to let you know that your credit card has expired. To update your account information, please visit [Your Account](#).

Best regards,  
<Company XYZ>

# Understanding XSS Flaws

## Detailed example of a reflected cross-site scripting flaw



```
public class Page {  
    public String getParameter(HttpServletRequest request, String name) {  
        return request.getParameter(name);  
    }  
}
```

```
<html>  
<%  
    ...  
    String xslTitle = page.getParameter(request, "xslTitle");  
%>  
<head>  
    <title><%= xslTitle %></title>
```



# Understanding XSS Flaws

## Detailed example of a reflected cross-site scripting flaw



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public class Page {  
    public String getParameter(HttpServletRequest request, String name) {  
        return request.getParameter(name) ;  
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}
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<html>  
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    ...  
    String xslTitle = page.getParameter(request, "xslTitle");  
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<head>  
    <title><%= xslTitle %></title>
```

# Understanding XSS Flaws

## Detailed example of a reflected cross-site scripting flaw

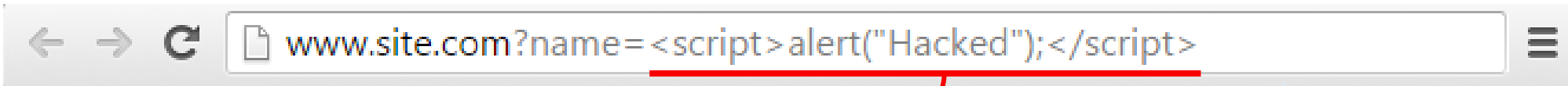


```
public class Page {  
    public String getParameter(HttpServletRequest request, String name) {  
        return request.getParameter(name) ;  
    }  
}
```

```
<html>  
<%  
    ...  
    String xslTitle = page.getParameter(request, "xslTitle") ;  
%>  
<head>  
    <title><%= xslTitle %></title>
```

# Understanding XSS Flaws

## Detailed example of a reflected cross-site scripting flaw

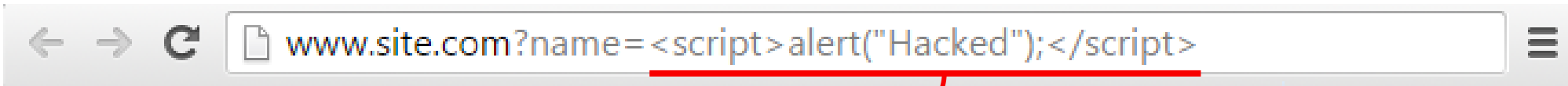


```
public class Page {  
    public String getParameter(HttpServletRequest request, String name) {  
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    }  
}
```

```
<html>  
<%  
    ...  
    String xslTitle = page.getParameter(request, "xslTitle") ;  
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<head>  
    <title><%= xslTitle %></title>
```

# Understanding XSS Flaws

## Detailed example of a reflected cross-site scripting flaw

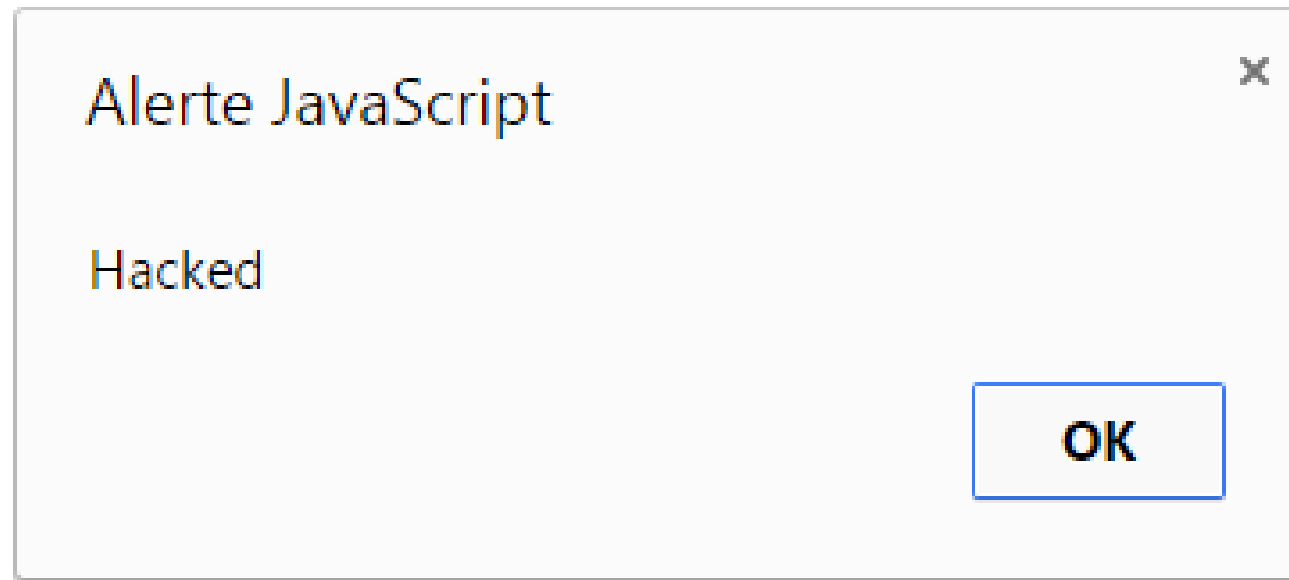


```
public class Page {
    public String getParameter(HttpServletRequest request, String name) {
        return request.getParameter(name);
    }
}
```

```
<html>
<%
    ...
    String xslTitle = page.getParameter(request, "xslTitle");
%>
<head>
    <title><%= xslTitle %></title>
```

# Without Sanitization

Malicious script is executed



# Preventing XSS Flaws

## Sanitization is the key



```
public class Page {  
    public String getParameter(HttpServletRequest request, String name) {  
        return request.getParameter(name);  
    }  
}
```

```
<html>  
<%  
    ...  
    String xslTitle = htmlEncode(page.getParameter(request, "xslTitle"));  
%>  
<head>  
    <title><%= xslTitle %></title>
```

# Preventing XSS Flaws

## Sanitization is the key



```
public class Page {  
    public String getParameter(HttpServletRequest request, String name) {  
        return request.getParameter(name) ;  
    }  
}
```

```
<html>  
<%  
    ...  
    String xslTitle = htmlEncode(page.getParameter(request, "xslTitle"));  
%>  
<head>  
    <title><%= xslTitle %></title>
```

# Preventing XSS Flaws

## Sanitization is the key



```
public class Page {  
    public String getParameter(HttpServletRequest request, String name) {  
        return request.getParameter(name) ;  
    }  
}
```

```
<html>  
<%  
    ...  
    String xslTitle = htmlEncode(page.getParameter(request, "xslTitle")) ;  
%>  
<head>  
    <title><%= xslTitle %></title>
```



# Preventing XSS Flaws

## Sanitization is the key

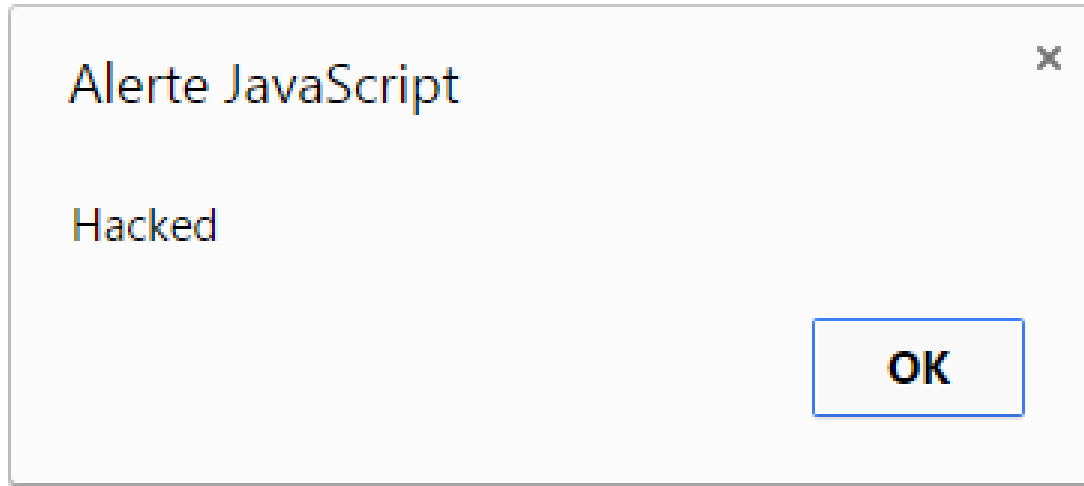


```
public class Page {  
    public String getParameter(HttpServletRequest request, String name) {  
        return request.getParameter(name);  
    }  
}
```

```
<html>  
<%  
    ...  
    String xslTitle = htmlEncode(page.getParameter(request, "xslTitle"));  
%>  
<head>  
    <title><%= xslTitle %></title>
```

# Effect of Sanitization

**Without sanitizer: Successful attack**



**With sanitizer: A string is displayed**

```
<script>alert("Hacked");</script>
```

# Static Taint Analysis of Industrial Web Applications

Experiments with IFDS and points-to analysis

# Modelling Web Application Behaviour

## Supporting the RequestDispatcher


```
RequestDispatcher rd = request.getRequestDispatcher("index.jsp");  
if ("include".equalsIgnoreCase(action)) {  
    rd.include(request, response);  
} else if ("forward".equalsIgnoreCase(action)) {  
    rd.forward(request, response);  
}
```

# Modelling Web Application Behaviour

## Supporting the RequestDispatcher

```
RequestDispatcher rd = request.getRequestDispatcher("index.jsp");  
if ("include".equalsIgnoreCase(action)) {  
    rd.include(request, response);  
} else if ("forward".equalsIgnoreCase(action)) {  
    rd.forward(request, response);  
}
```


Configuration file analysis  
needed to map “index.jsp”  
to an actual servlet.



# Modelling Web Application Behaviour

## Supporting the RequestDispatcher

```
RequestDispatcher rd = request.getRequestDispatcher("index.jsp");  
if ("include".equalsIgnoreCase(action)) {  
    rd.include(request, response);  
} else if ("forward".equalsIgnoreCase(action)) {  
    rd.forward(request, response);  
}
```

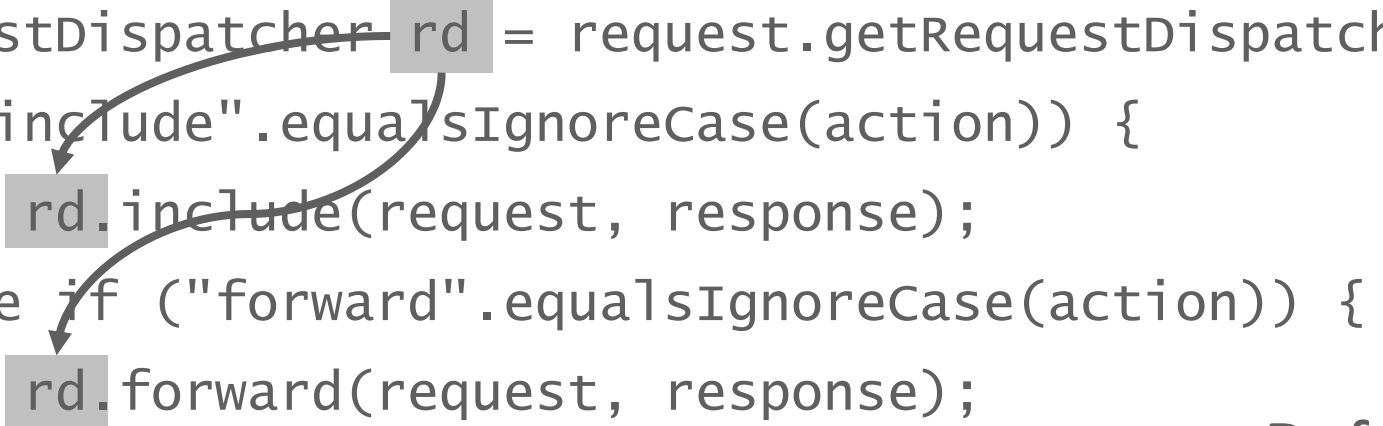


JEE server injects an instance of the servlet in the RequestDispatcher object.

# Modelling Web Application Behaviour

## Supporting the RequestDispatcher

```
RequestDispatcher rd = request.getRequestDispatcher("index.jsp");  
if ("include".equalsIgnoreCase(action)) {  
    rd.include(request, response);  
} else if ("forward".equalsIgnoreCase(action)) {  
    rd.forward(request, response);  
}
```



Def-use analysis needed to track the dispatcher.

# Modelling Web Application Behaviour

## Supporting the RequestDispatcher

```
RequestDispatcher rd = request.getRequestDispatcher("index.jsp");  
if ("include".equalsIgnoreCase(action)) {  
    rd.include(request, response);  
} else if ("forward".equalsIgnoreCase(action)) {  
    rd.forward(request, response);  
}
```

include and forward calls are replaced with calls to the `_jspService()` method of the servlet instance contained in `rd`.



# IFDS Framework

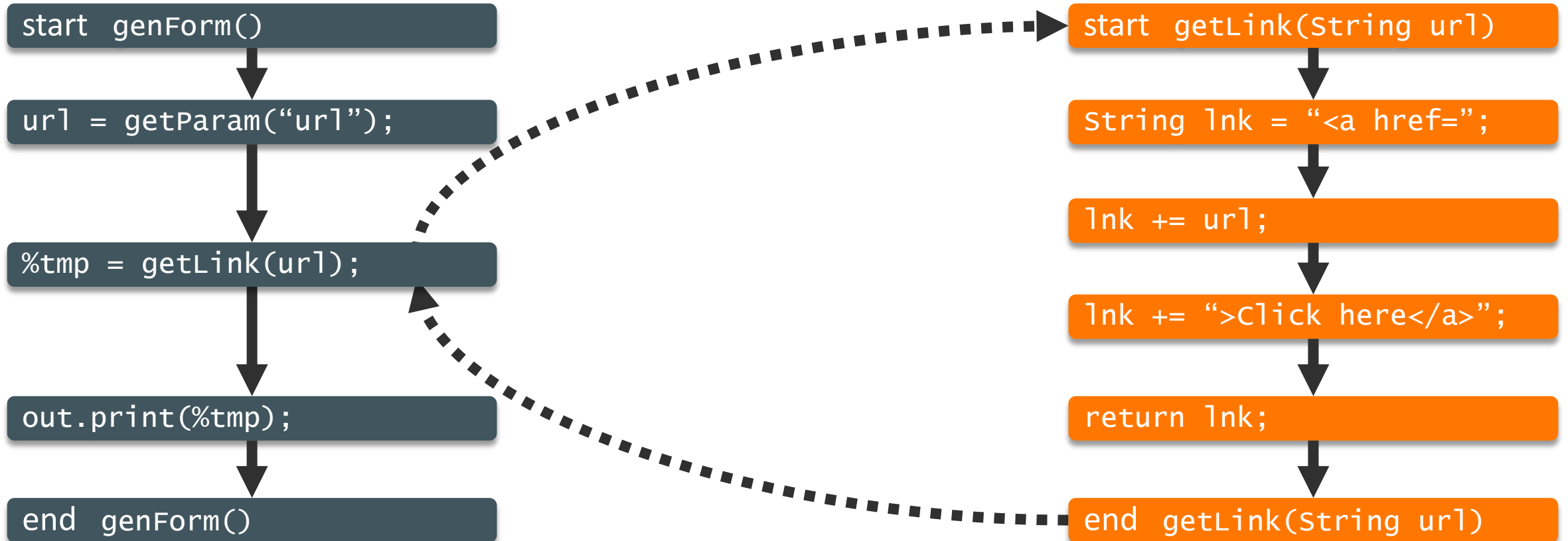
- Framework for solving inter-procedural, finite, distributive, subset (IFDS) problems.
- Flow functions are defined over a finite domain **D** and have to be distributive over the meet operator:  $f(a) \wedge f(b) = f(a \wedge b)$ .
- IFDS reduces data-flow problems to graph reachability problems.

# Working Example

```
public void genForm() {  
    ...  
    url = getParam("url");  
    out.print(getLink(url));  
    ...  
}
```

```
public String getLink(String url) {  
    ...  
    String link = "<a href=";  
    link += url;  
    link += ">Click here</a>";  
    return link;  
}
```

# Control Flow Graph



# Supergraph

```
start genForm()
```

```
url = getParam("url");
```

```
call %tmp = getLink(url);
```

```
call-ret %tmp = getLink(url);
```

```
out.print(%tmp);
```

```
end genForm()
```

```
start getLink(String url)
```

```
String lnk = "<a href=";
```

```
lnk += url;
```

```
lnk += ">Click here</a>";
```

```
return lnk;
```

```
end getLink(String url)
```

# Exploded Supergraph

	0	url	tmp	0	url	lnk	
start genForm()	•	•	•	•	•	•	start getLink(String url)
url = getParam("url");	•	•	•	•	•	•	String lnk = "<a href=";
call %tmp = getLink(url);	•	•	•	•	•	•	lnk += url;
call-ret %tmp = getLink(url);	•	•	•	•	•	•	lnk += ">Click here</a>";
out.print(%tmp);	•	•	•	•	•	•	return lnk;
end genForm()	•	•	•	•	•	•	end getLink(String url)

# Exploded Supergraph

```
start genForm()
```

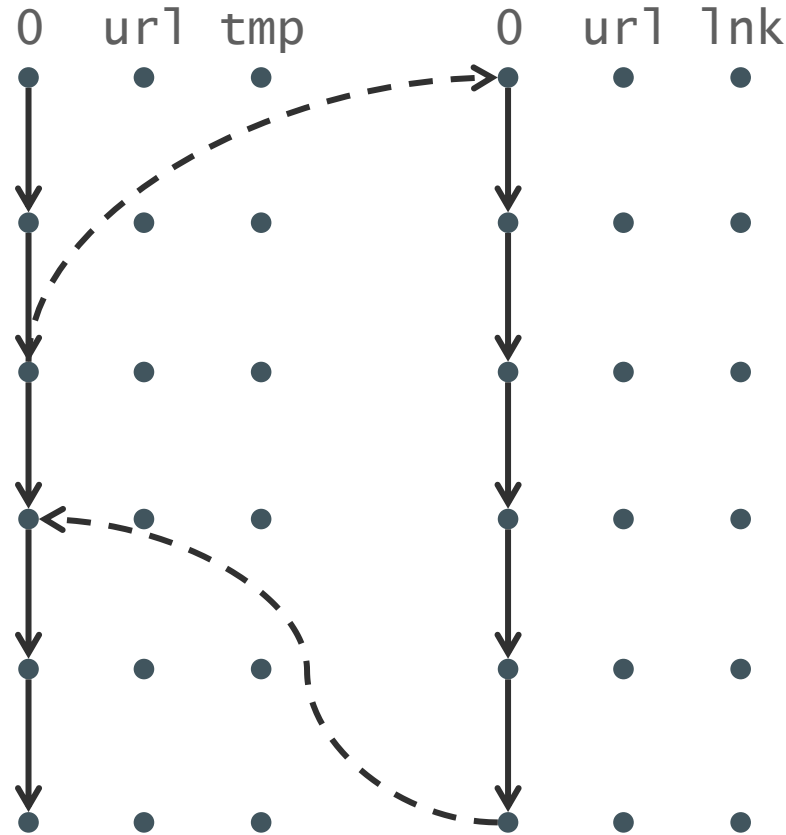
```
url = getParam("url");
```

```
call %tmp = getLink(url);
```

```
call-ret %tmp = getLink(url);
```

```
out.print(%tmp);
```

```
end genForm()
```



```
start getLink(String url)
```

```
String lnk = "<a href=";
```

```
lnk += url;
```

```
lnk += ">Click here</a>";
```

```
return lnk;
```

```
end getLink(String url)
```

# Exploded Supergraph

```
start genForm()
```

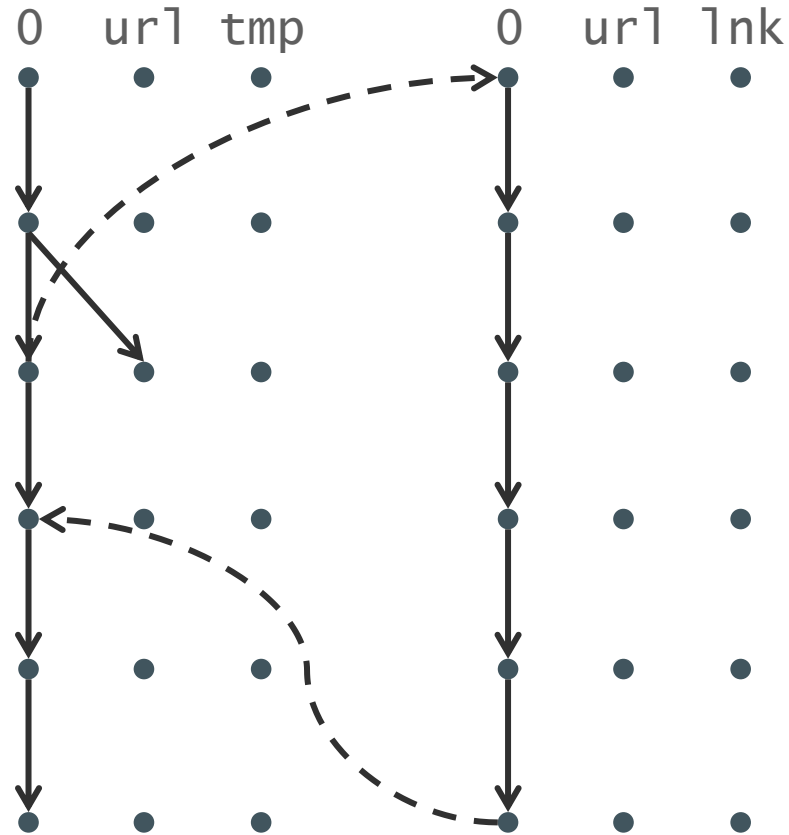
```
url = getParam("url");
```

```
call %tmp = getLink(url);
```

```
call-ret %tmp = getLink(url);
```

```
out.print(%tmp);
```

```
end genForm()
```



```
start getLink(String url)
```

```
String link = "<a href=";
```

```
link += url;
```

```
link += ">Click here</a>";
```

```
return link;
```

```
end getLink(String url)
```

# Exploded Supergraph

```
start genForm()
```

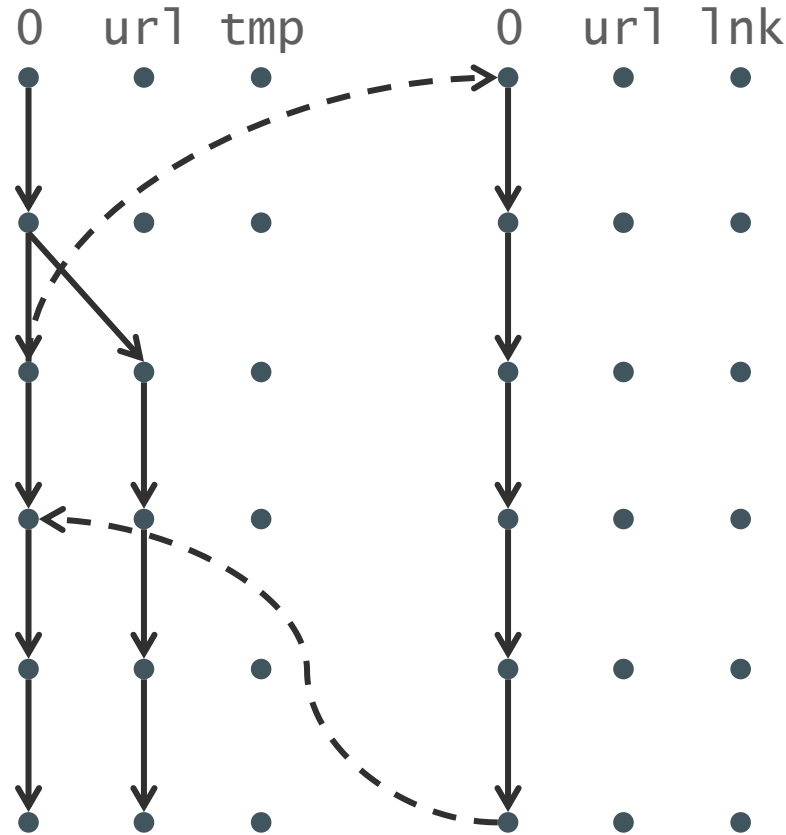
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```
start getLink(String url)
```

```
String link = "<a href=";
```

```
link += url;
```

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link += ">Click here</a>";
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```
return link;
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```
end getLink(String url)
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# Exploded Supergraph

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start genForm()
```

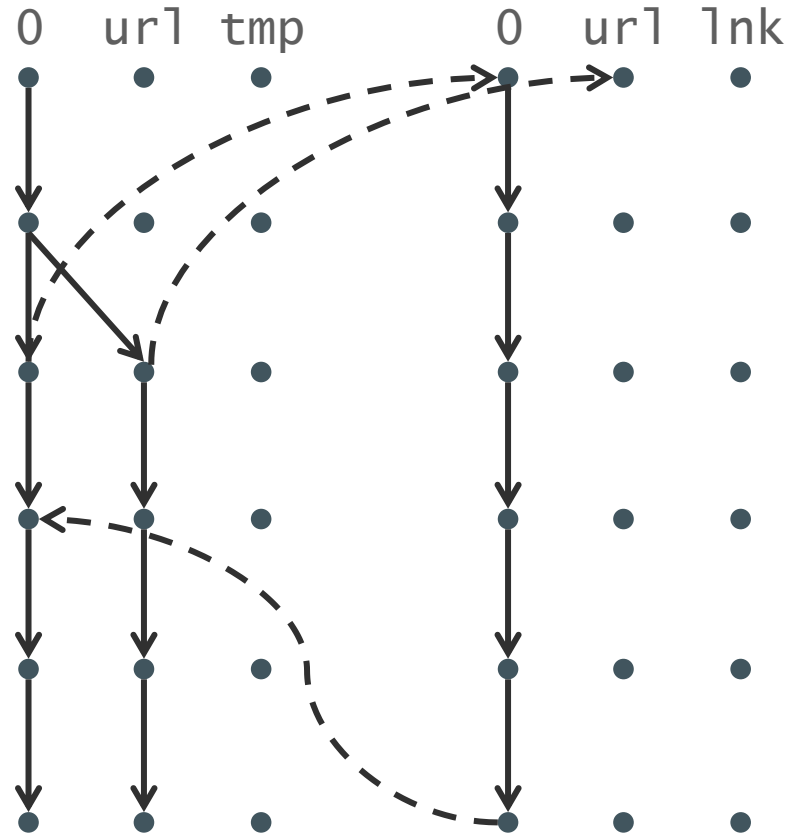
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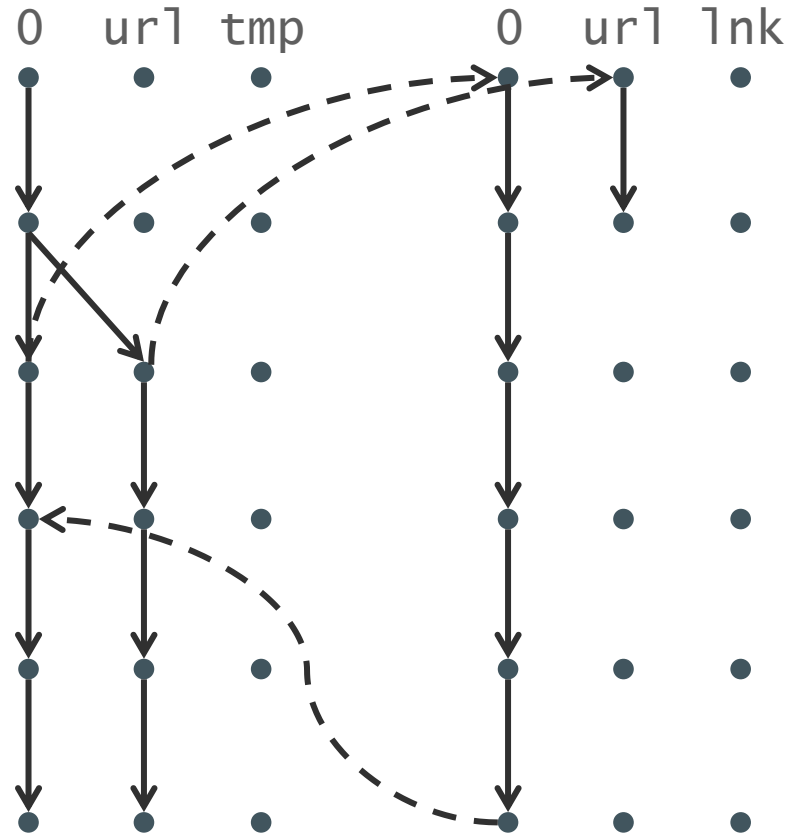
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String link = "<a href=";
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link += url;
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# Exploded Supergraph

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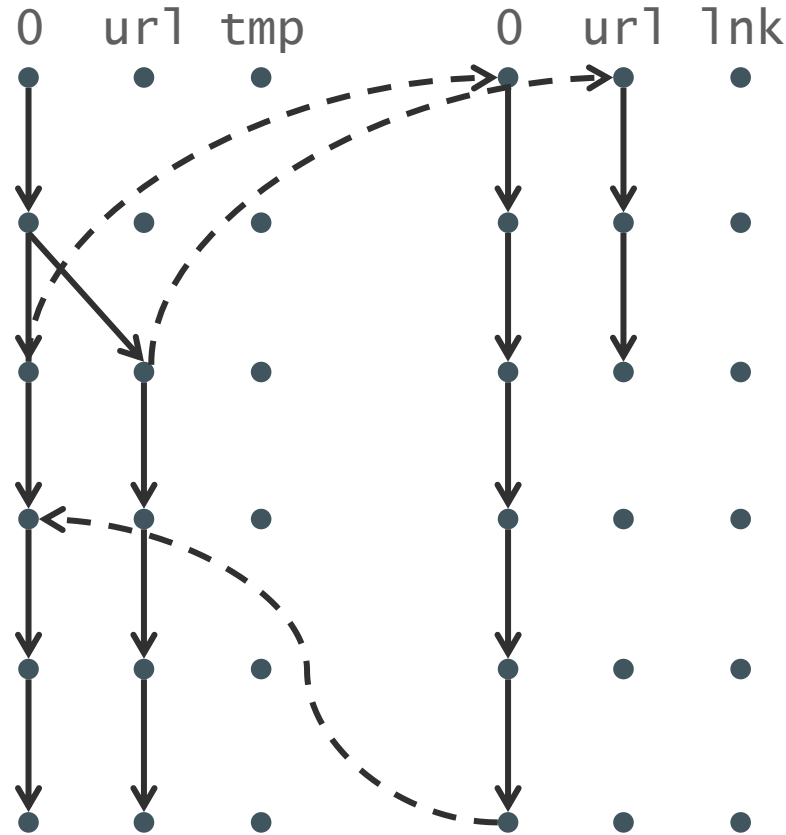
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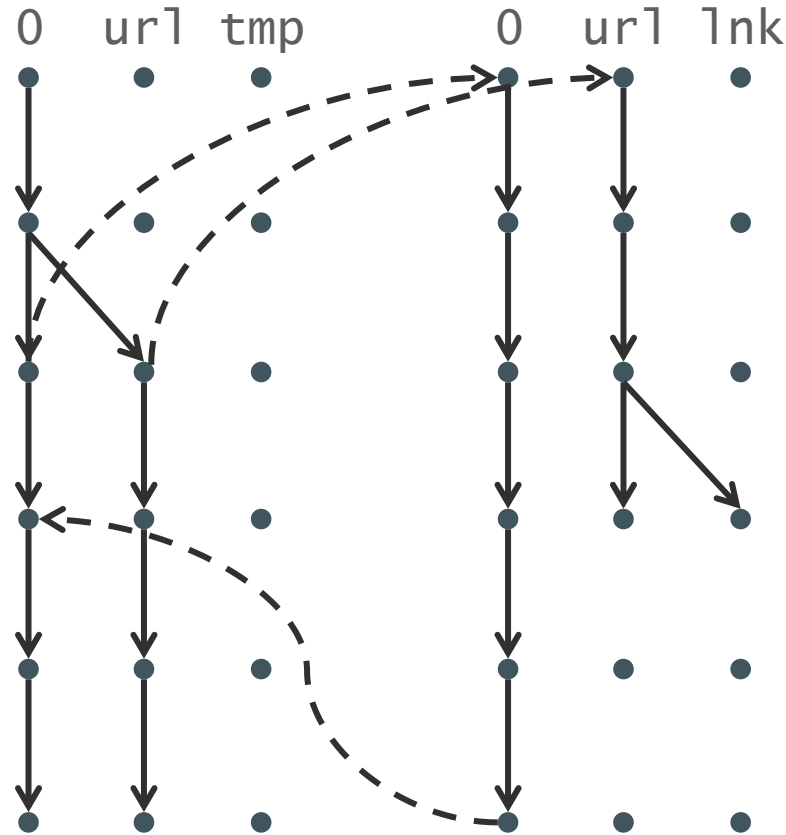
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end getLink(String url)
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# Exploded Supergraph

```
start genForm()
```

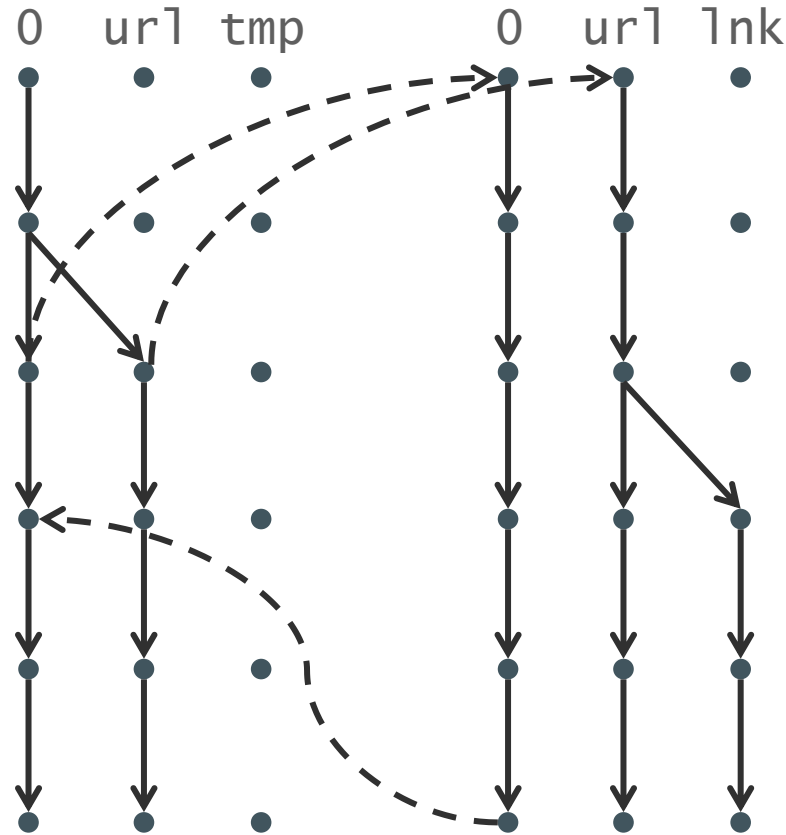
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```
String lnk = "<a href=";
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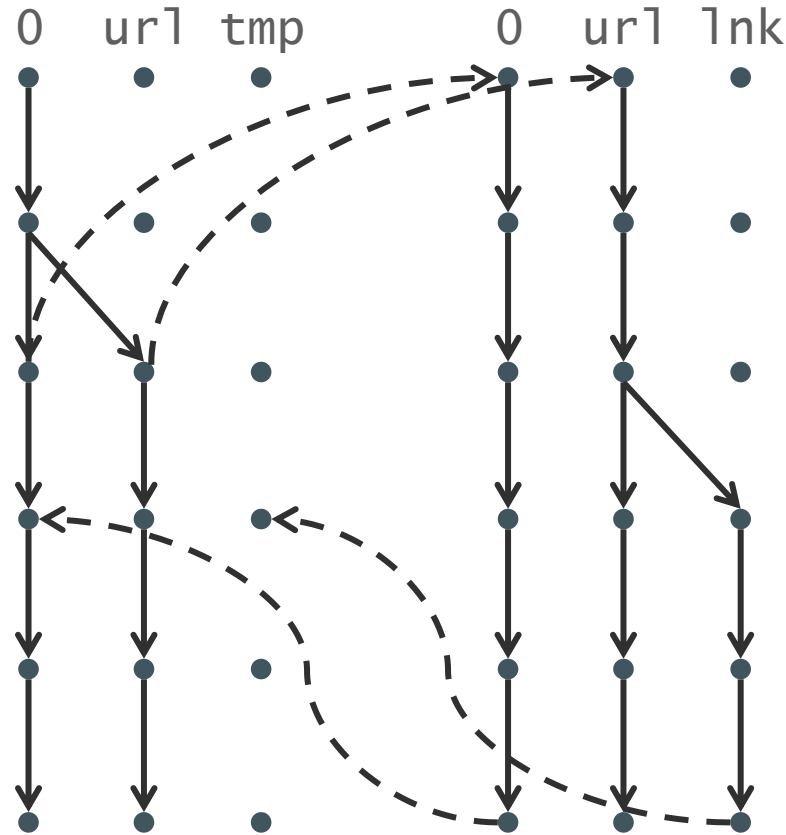
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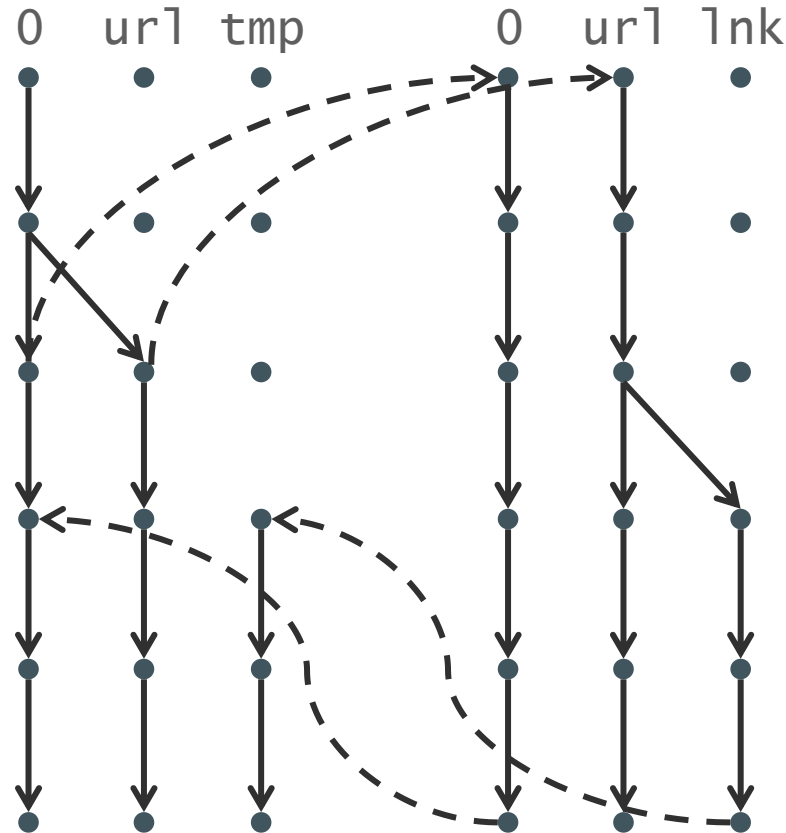
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```
out.print(%tmp);
```

```
end genForm()
```



```
start getLink(String url)
```

```
String tmp = "<a href=";
```

```
tmp += url;
```

```
tmp += ">Click here</a>";
```

```
return tmp;
```

```
end getLink(String url)
```

# Reachability Analysis

```
start genForm()
```

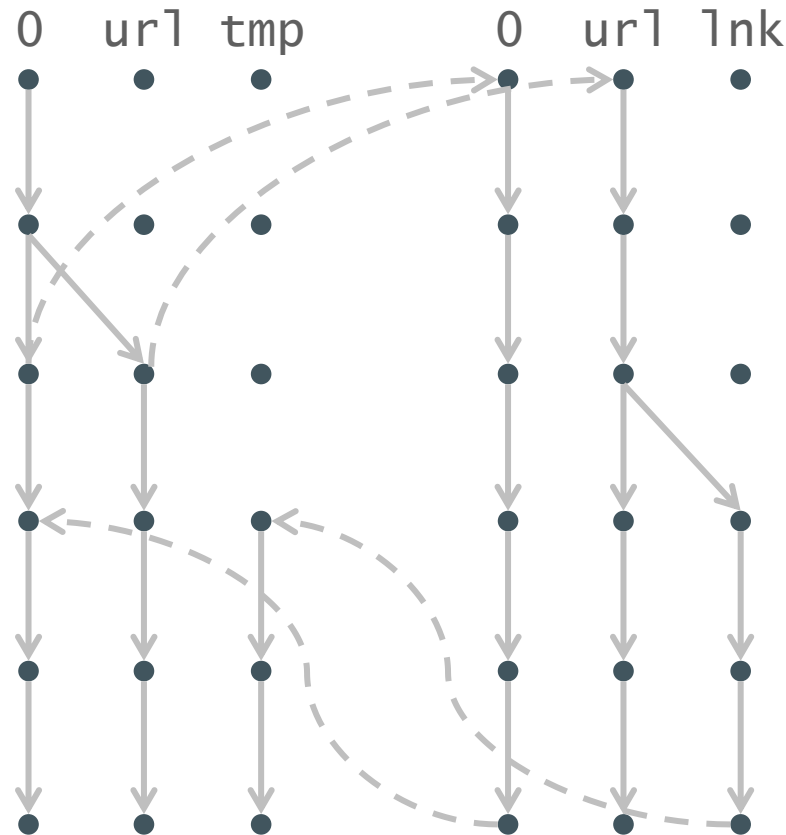
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start getLink(String url)
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```
String lnk = "<a href=";
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lnk += url;
```

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lnk += ">Click here</a>";
```

```
return lnk;
```

```
end getLink(String url)
```



# Reachability Analysis

```
start genForm()
```

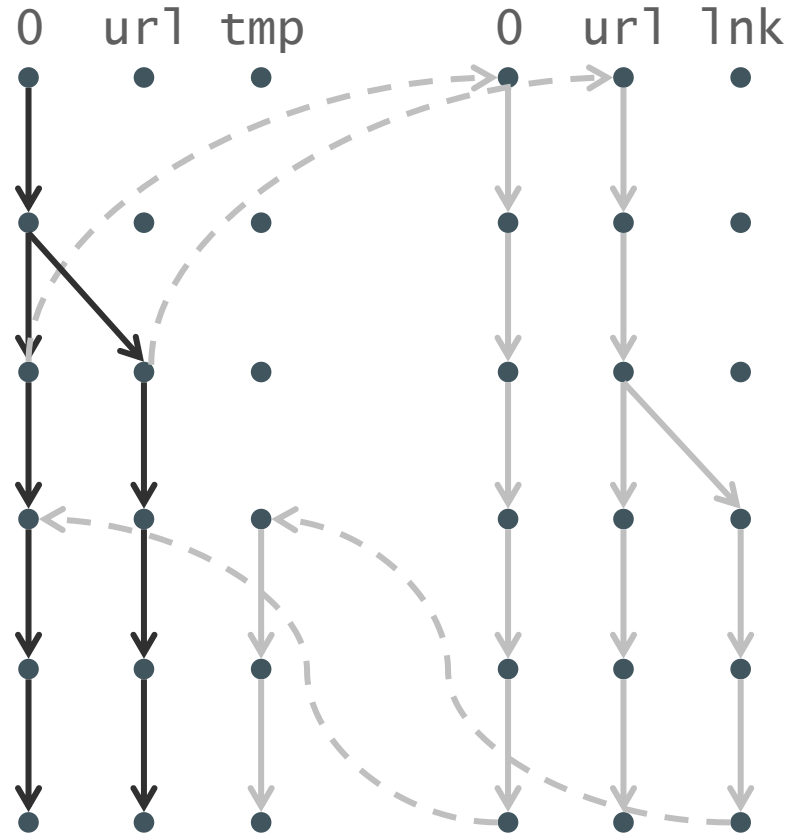
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start getLink(String url)
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lnk += url;
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return lnk;
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# Reachability Analysis

```
start genForm()
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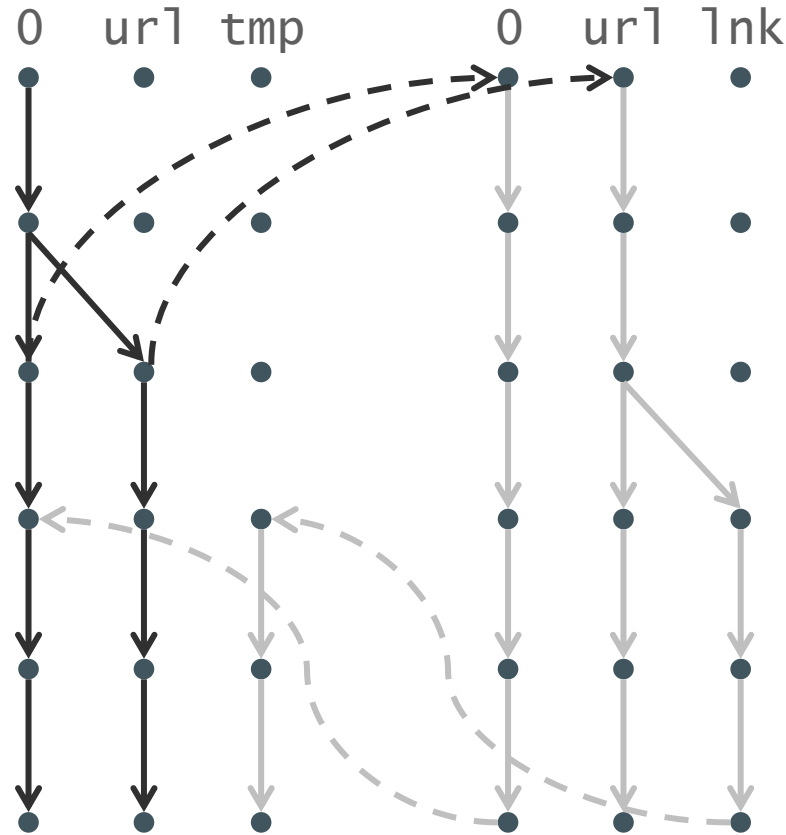
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return lnk;
```

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end getLink(String url)
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# Reachability Analysis

```
start genForm()
```

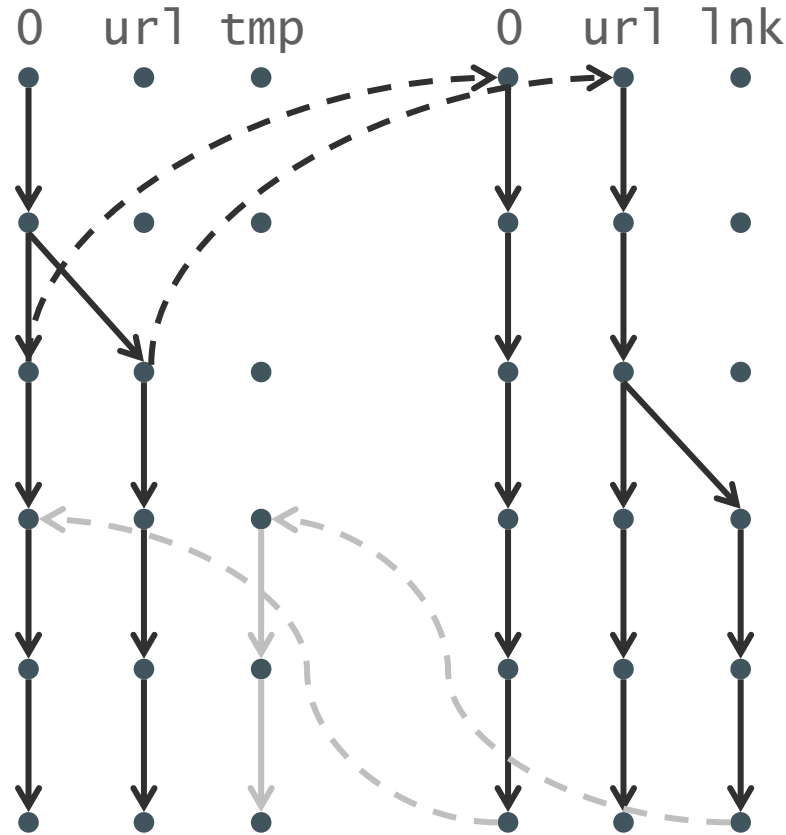
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```
start getLink(String url)
```

```
String link = "<a href=";
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```
link += url;
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link += ">Click here</a>";
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```
return link;
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```
end getLink(String url)
```

# Reachability Analysis

```
start genForm()
```

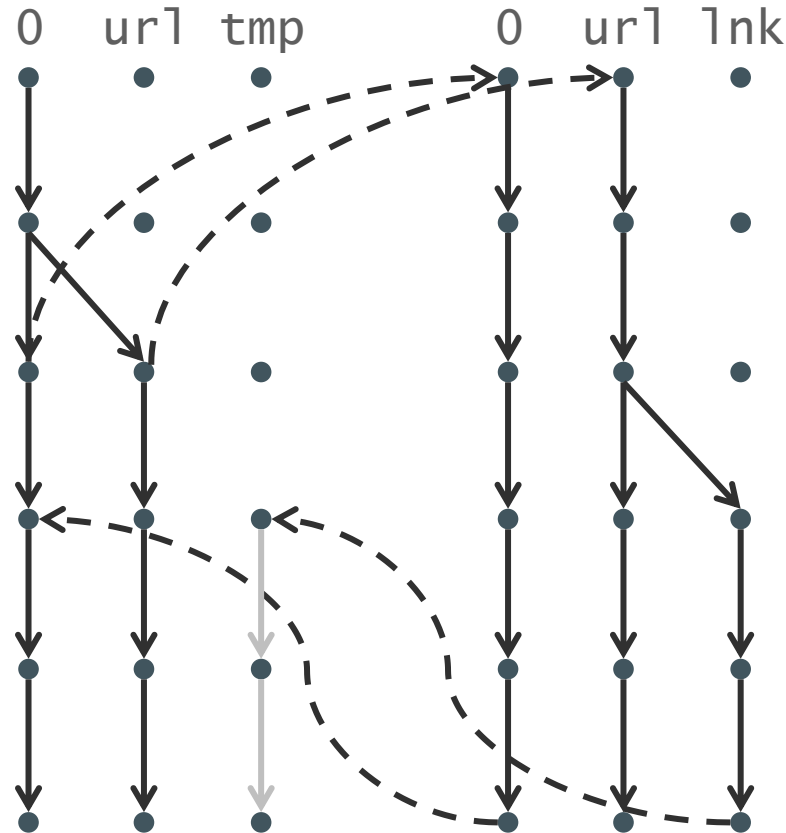
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```
start getLink(String url)
```

```
String link = "<a href=";
```

```
link += url;
```

```
link += ">Click here</a>;
```

```
return link;
```

```
end getLink(String url)
```

# Function Summary Computation

```
start genForm()
```

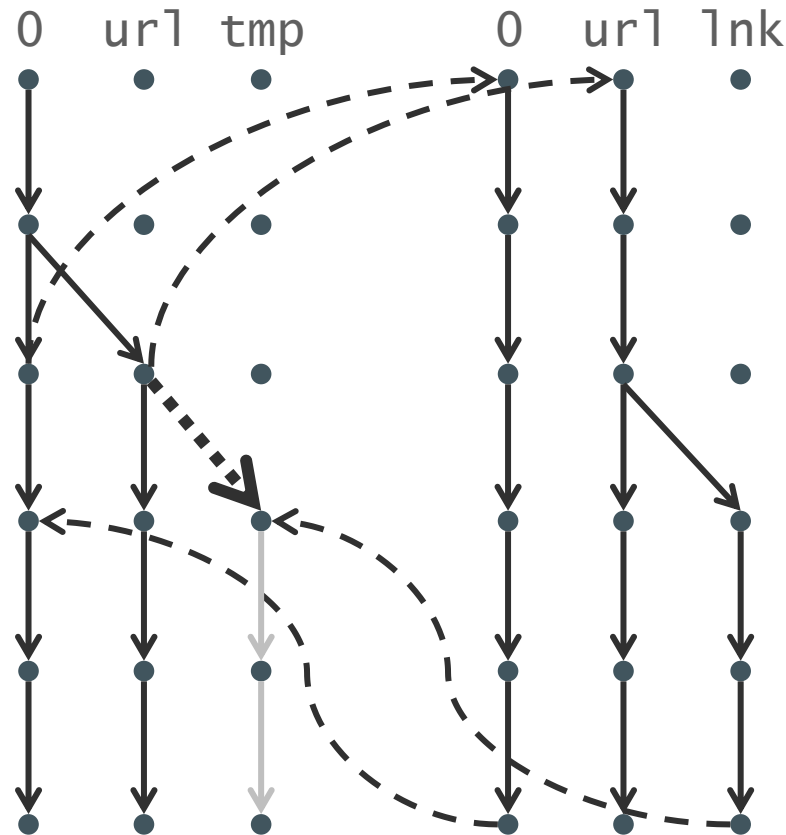
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```
start getLink(String url)
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String lnk = "<a href=";
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lnk += url;
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lnk += ">Click here</a>";
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return lnk;
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```
end getLink(String url)
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# Reachability Analysis

```
start genForm()
```

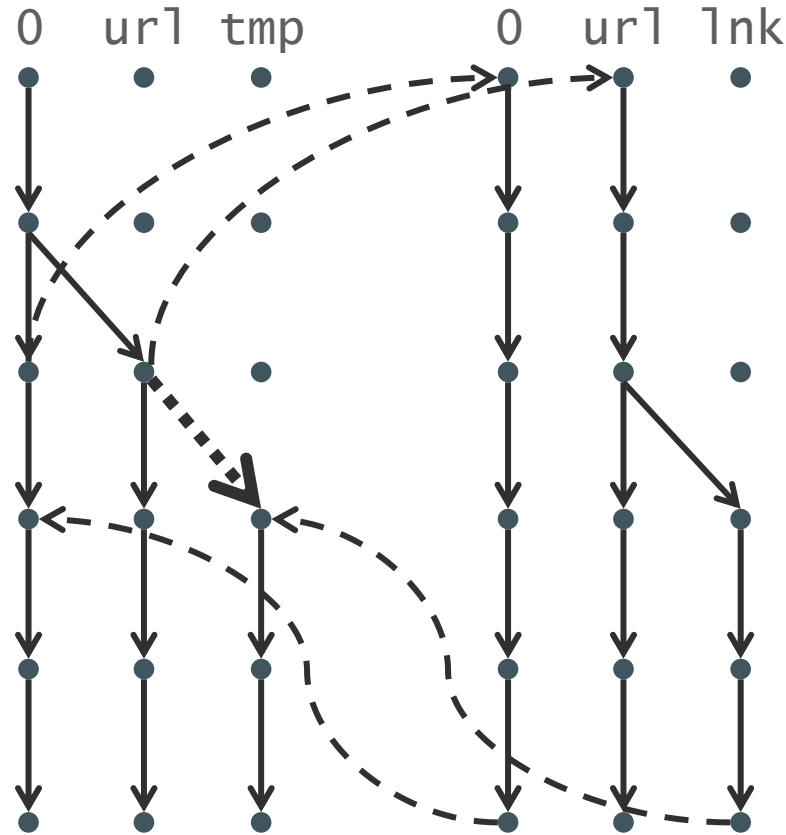
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start getLink(String url)
```

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String link = "<a href=";
```

```
link += url;
```

```
link += ">Click here</a>";
```

```
return link;
```

```
end getLink(String url)
```

# Vulnerability Detection

```
start genForm()
```

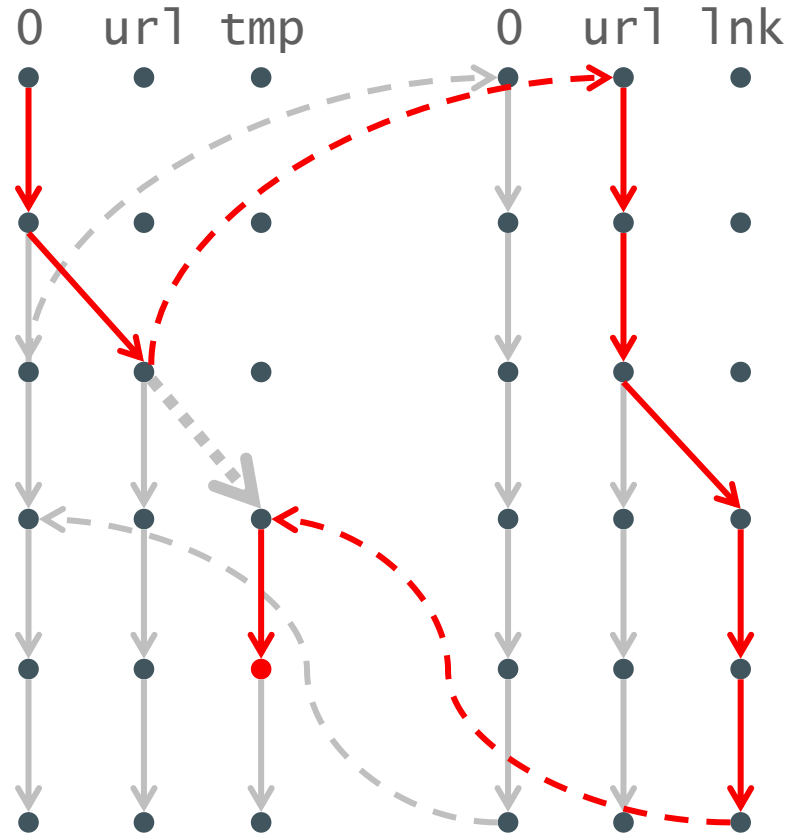
```
url = getParam("url");
```

```
call %tmp = getLink(url);
```

```
call-ret %tmp = getLink(url);
```

```
out.print(%tmp);
```

```
end genForm()
```



```
start getLink(String url)
```

```
String lnk = "<a href=";
```

```
lnk += url;
```

```
lnk += ">Click here</a>";
```

```
return lnk;
```

```
end getLink(String url)
```

# Vulnerability Mitigation Through Sanitization

```
public void genForm() {  
    ...  
    url = getParam("url");  
    out.print(getLink(url));  
    ...  
}
```

```
public String getLink(String url) {  
    ...  
    String link = "<a href=";  
    link += htmlEncode(url);  
    link += ">Click here</a>";  
    return link;  
}
```



# Before Sanitization

```
start genForm()
```

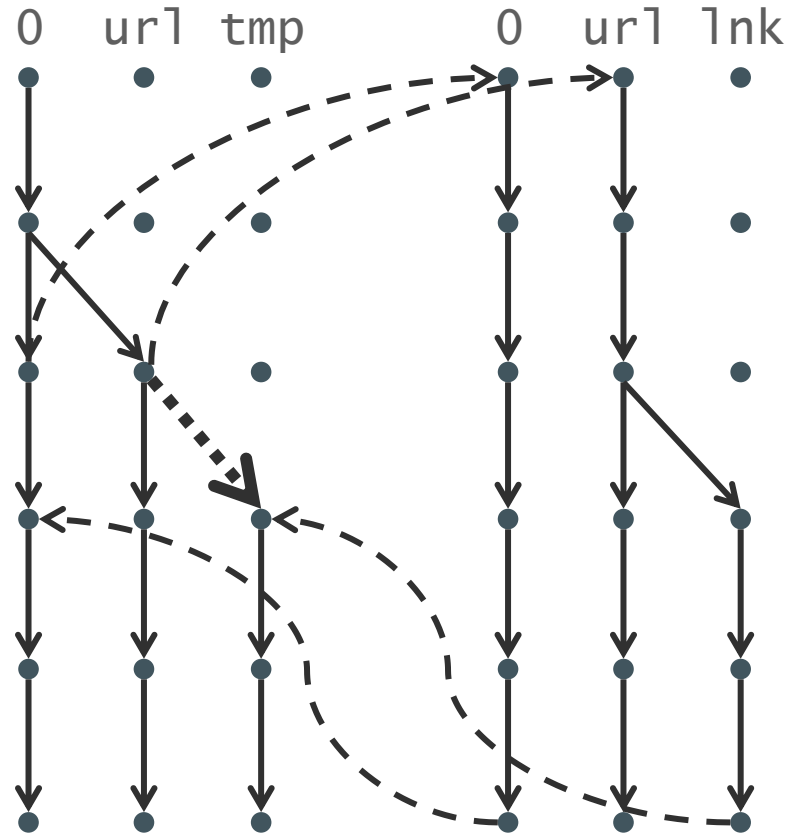
```
url = getParam("url");
```

```
call %tmp = getLink(url);
```

```
call-ret %tmp = getLink(url);
```

```
out.print(%tmp);
```

```
end genForm()
```



```
start getLink(String url)
```

```
String lnk = "<a href=";
```

```
lnk += url;
```

```
lnk += ">Click here</a>";
```

```
return lnk;
```

```
end getLink(String url)
```

# After Sanitization

```
start genForm()
```

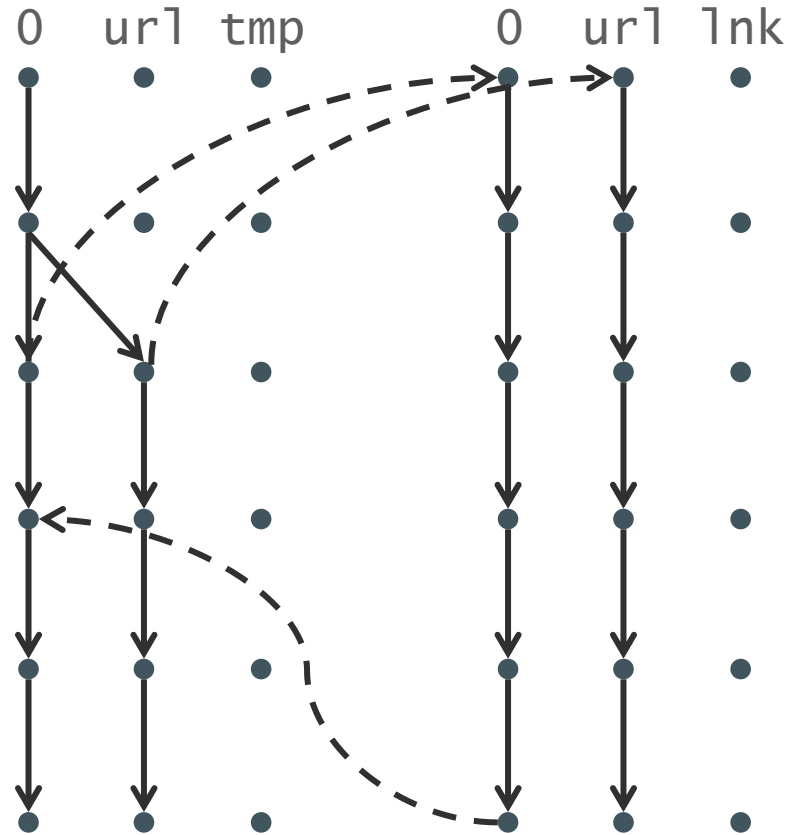
```
url = getParam("url");
```

```
call %tmp = getLink(url);
```

```
call-ret %tmp = getLink(url);
```

```
out.print(%tmp);
```

```
end genForm()
```



```
start getLink(String url)
```

```
String link = "<a href=";
```

```
link += htmlEncode(url);
```

```
link += ">Click here</a>";
```

```
return link;
```

```
end getLink(String url)
```

# Adding Points-To Analysis to the Mix

```
public void genForm() {  
    ...  
    f.url = getParam("url");  
    out.print(getLink(f));  
    ...  
}
```

```
public String getLink(Form form) {  
    ...  
    String link = "<a href=";  
    link += form.url;  
    link += ">Click here</a>";  
    return link;  
}
```

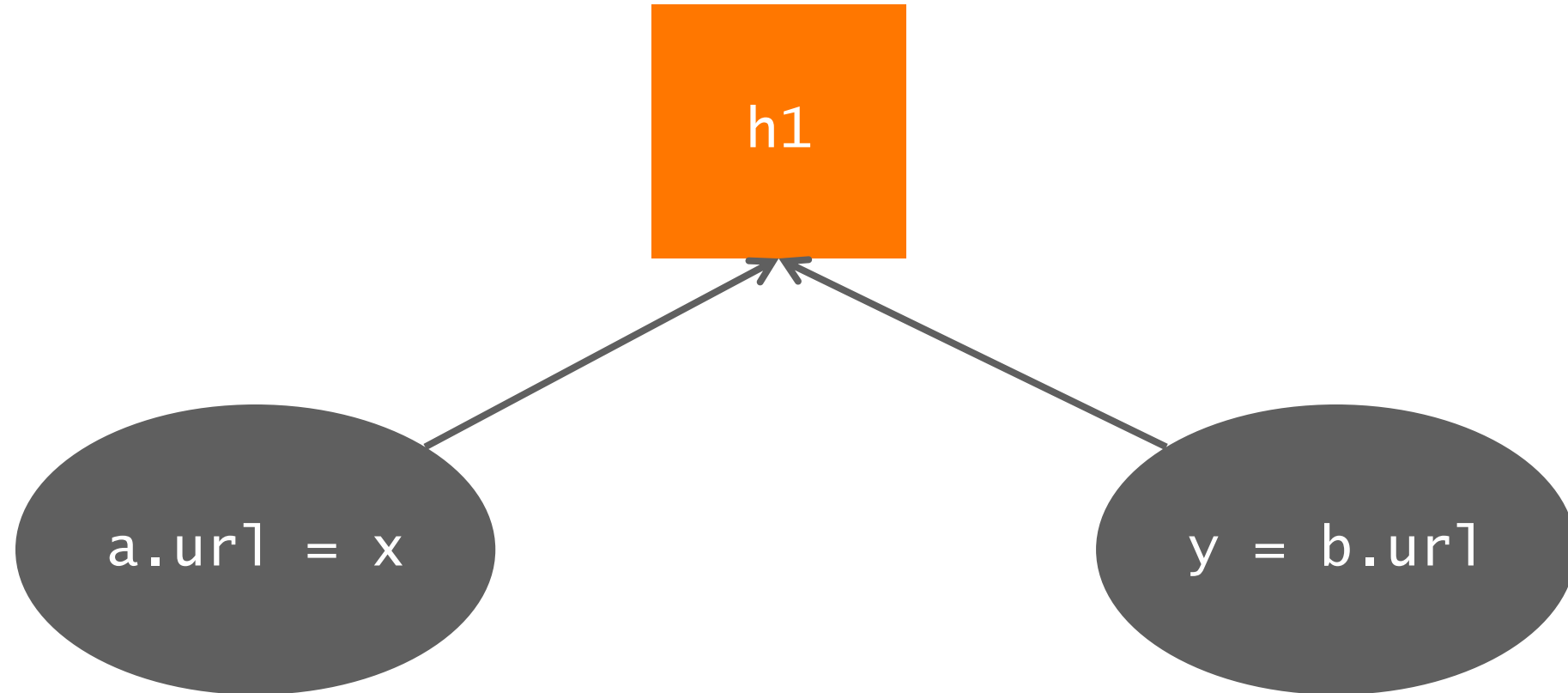
# Points-To Analysis in Soufflé

OpenJDK7-b147

Context-insensitive points-to	8m	6.7Gb
Context-sensitive points-to (minus swing)	34m	26.8Gb
Context-sensitive points-to (full)	7h	874Gb

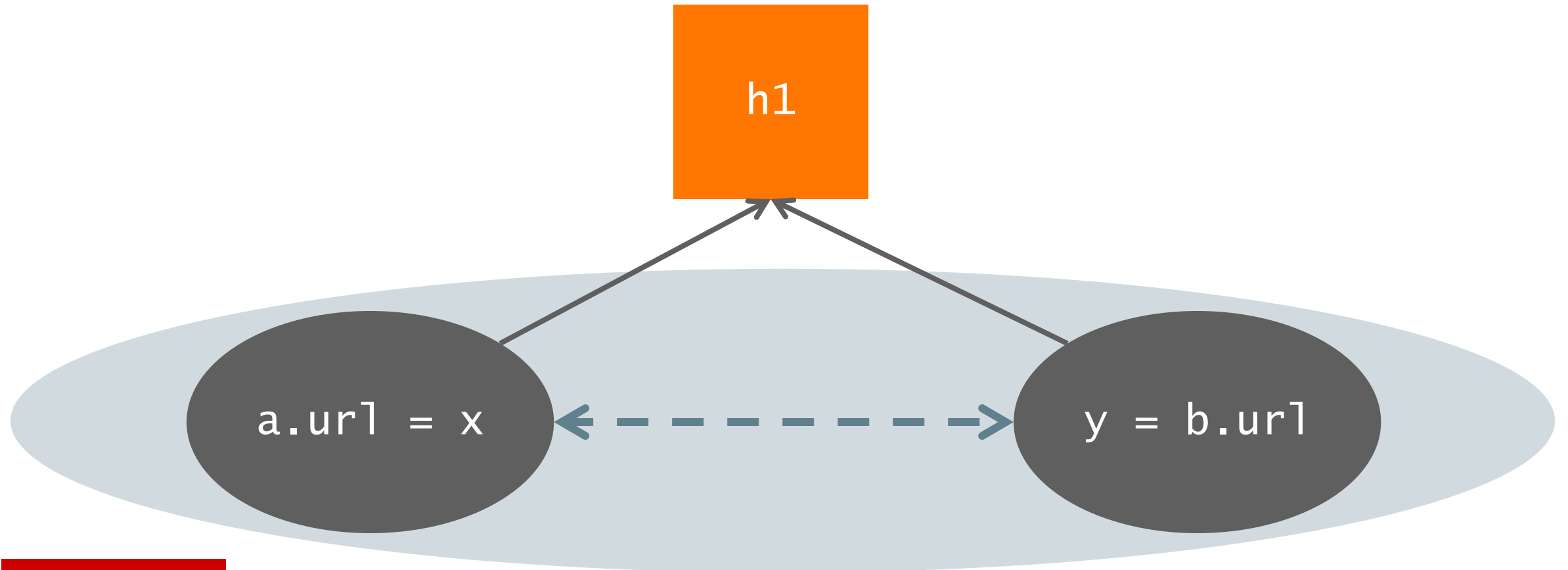
# Matching Loads and Stores

Eliminating heap abstraction in points-to analysis



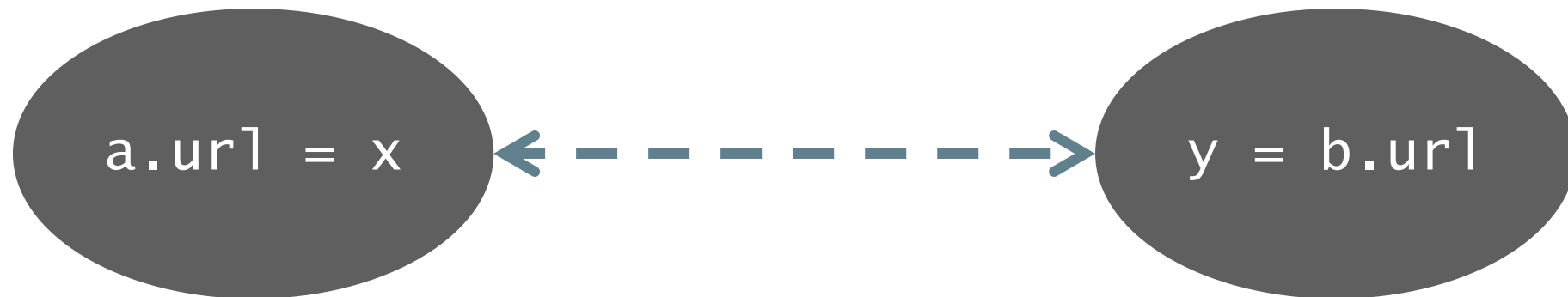
# Matching Loads and Stores

Eliminating heap abstraction in points-to analysis



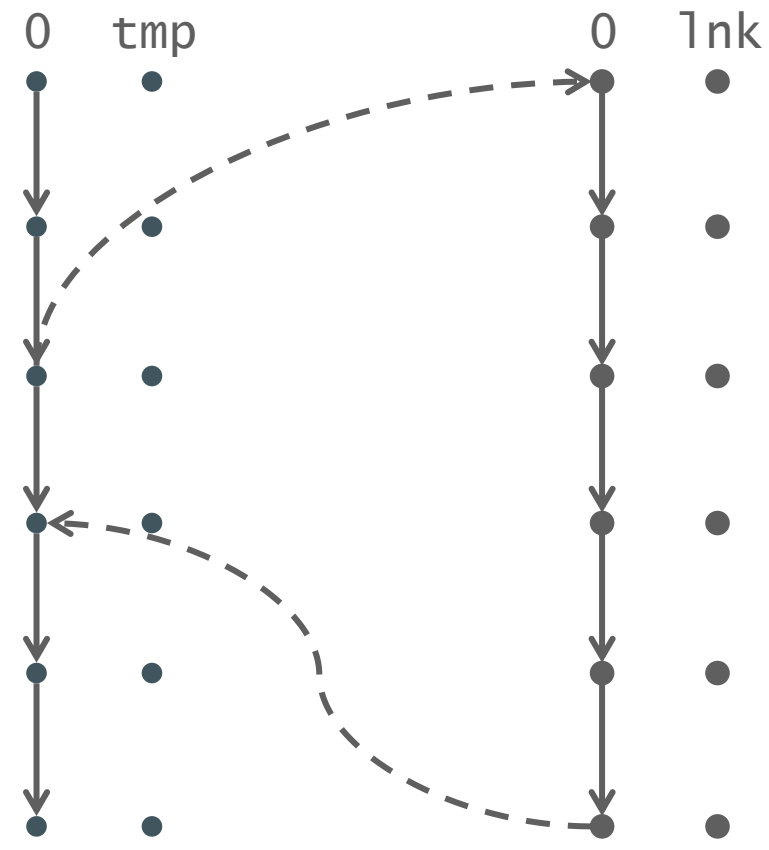
# Matching Loads and Stores

Eliminating heap abstraction in points-to analysis



# IFDS + Points-to

```
start genForm()  
f.url = getParam("url");  
call %tmp = getLink(f);  
call-ret %tmp = getLink(f);  
out.print(%tmp);  
end genForm()
```



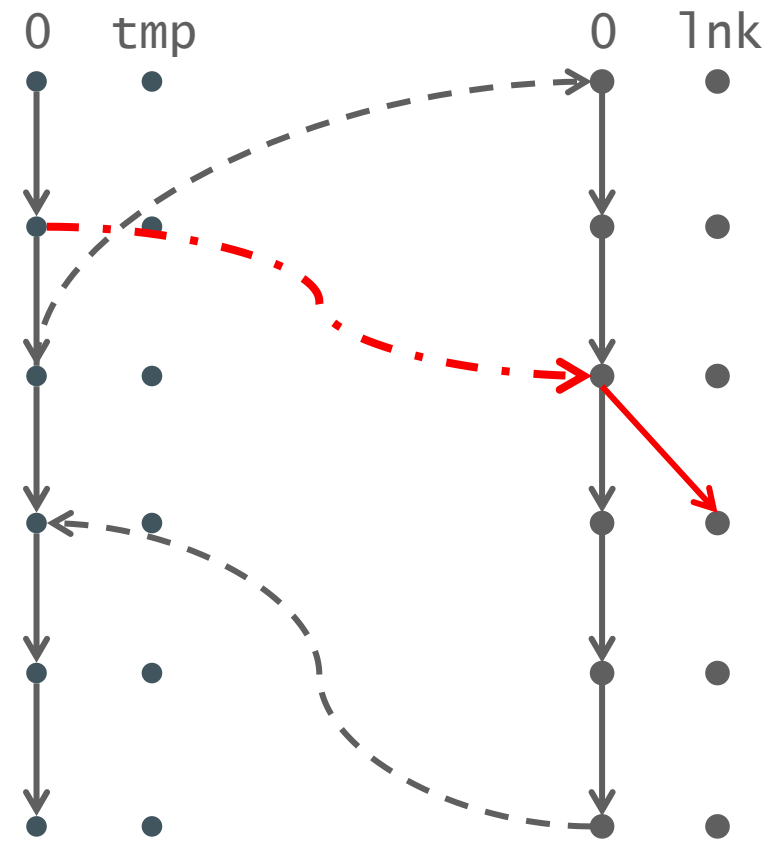
```
start getLink(Form form)  
String lnk = "<a href=";  
lnk += form.url;  
lnk += ">Click here</a>";  
return lnk;  
end getLink(Form form)
```





# IFDS + Points-to

```
start genForm()  
f.url = getParam("url");  
call %tmp = getLink(f);  
call-ret %tmp = getLink(f);  
out.print(%tmp);  
end genForm()
```



```
start getLink(Form form)  
String lnk = "<a href="";  
lnk += form.url;  
lnk += ">Click here</a>";  
return lnk;  
end getLink(Form form)
```



# IFDS + Points-to

```
start genForm()
```

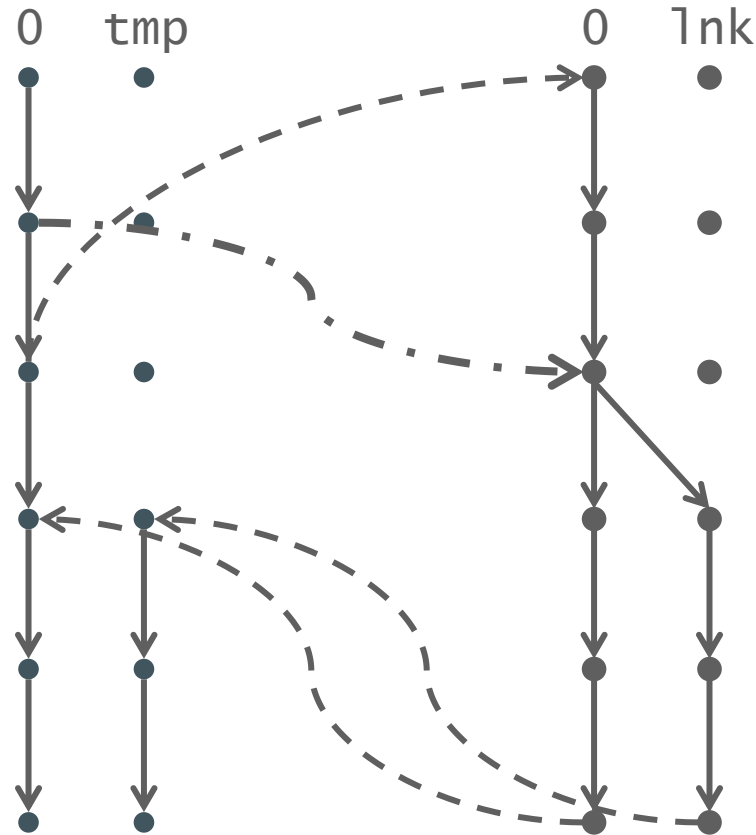
```
f.url = getParam("url");
```

```
call %tmp = getLink(f);
```

```
call-ret %tmp = getLink(f);
```

```
out.print(%tmp);
```

```
end genForm()
```



```
start getLink(Form form)
```

```
String lnk = "<a href=";
```

```
lnk += form.url;
```

```
lnk += ">Click here</a>";
```

```
return lnk;
```

```
end getLink(Form form)
```

# IFDS + Points-to

```
start genForm()
```

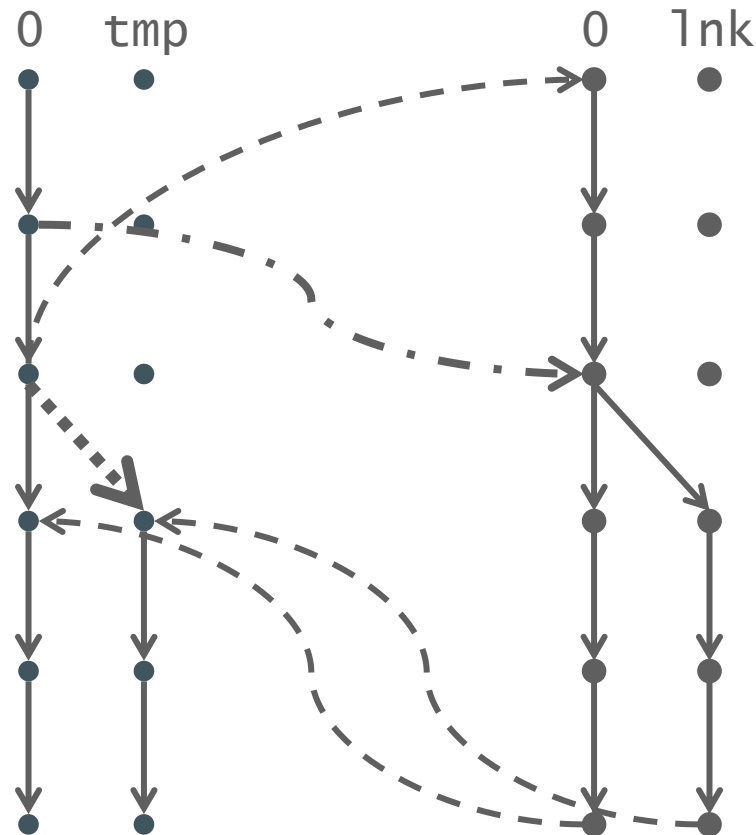
```
f.url = getParam("url");
```

```
call %tmp = getLink(f);
```

```
call-ret %tmp = getLink(f);
```

```
out.print(%tmp);
```

```
end genForm()
```



```
start getLink(Form form)
```

```
String link = "<a href=";
```

```
link += form.url;
```

```
link += ">Click here</a>";
```

```
return link;
```

```
end getLink(Form form)
```

# IFDS + Points-to

```
start genForm()
```

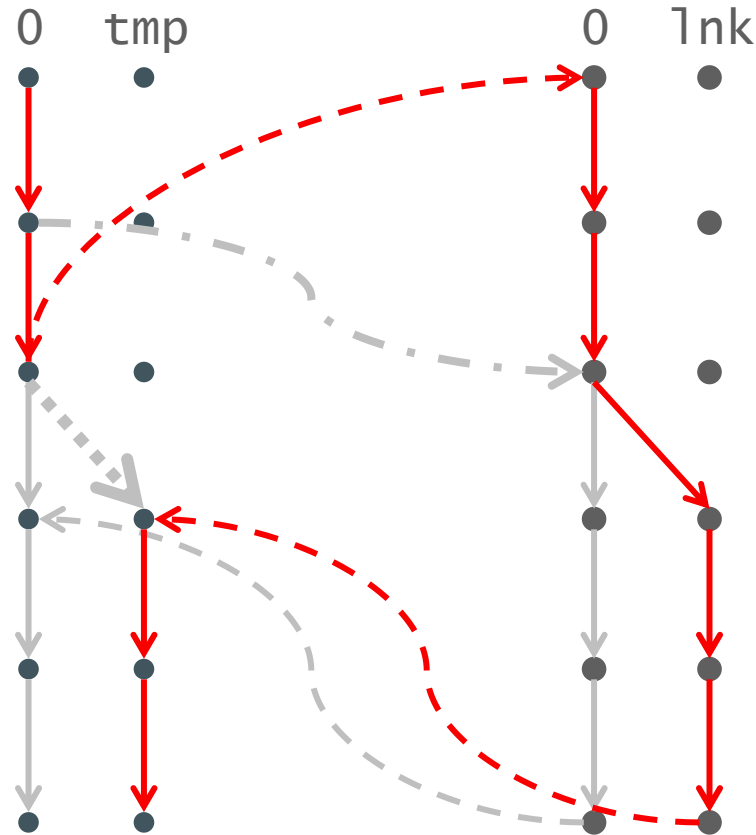
```
f.url = getParam("url");
```

```
call %tmp = getLink(f);
```

```
call-ret %tmp = getLink(f);
```

```
out.print(%tmp);
```

```
end genForm()
```



```
start getLink(Form form)
```

```
String link = "<a href=";
```

```
link += form.url;
```

```
link += ">Click here</a>";
```

```
return link;
```

```
end getLink(Form form)
```

# Implementation

- Implemented in Datalog, using the Soufflé engine.
- Pre-computed control-flow graph + CHA call graph.
- 2obj + 1heap points-to analysis.
- On-demand computation of flow edges.

# Current Limitations

- IFDS is call-site sensitive
  - The analysis distinguishes between different calling contexts.
- Points-to analysis is object sensitive (2obj + 1heap).
  - **2 object:** On method calls, keep track of the allocation site of the receiver object and the allocation site of the object that allocated the receiver object.
  - **1 heap:** On allocation, keep track of the allocation site and the allocation site of the current object (this).
- Current implementation doesn't connect IFDS and points-to contexts.
  - Load-to-store aliases are **context-insensitive**.

# Research Questions

**RQ1:** How does modelling of dynamic web application features impact precision and recall?

**RQ2:** How does points-to and context-sensitivity impact precision and recall?

**RQ3:** How does our approach compares to state-of-the-art?

# Results — Don't Panic, I'll Walk You Through...

Applications	Without JEE support						With JEE support					
	No points-to		Context-insensitive points-to		Context-sensitive points-to		No points-to		Context-insensitive points-to		Context-sensitive points-to	
	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision
blojsom	2	100%	3	50%	3	50%	2	100%	3	50%	3	50%
blueblog	1	16%	3	30%	3	37%	1	16%	3	30%	3	37%
firingrange	4	100%	4	100%	4	100%	4	100%	4	100%	4	100%
gestcv	3	50%	3	50%	3	50%	3	50%	3	42%	3	50%
ginp	18	90%	19	57%	19	73%	18	90%	159	67%	159	69%
photov	42	100%	47	44%	48	100%	42	100%	53	44%	53	85%
securibench	86	91%	126	85%	125	86%	86	91%	126	85%	125	86%
webgoat	13	35%	239	55%	229	68%	13	35%	239	55%	230	68%



# RQ1: Impact of Modelling

Applications	Without JEE support						With JEE support					
	No points-to		Context-insensitive points-to		Context-sensitive points-to		No points-to		Context-insensitive points-to		Context-sensitive points-to	
	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision
blojsom	2	100%	3	50%	3	50%	2	100%	3	50%	3	50%
blueblog	1	16%	3	30%	3	37%	1	16%	3	30%	3	37%
firingrange	4	100%	4	100%	4	100%	4	100%	4	100%	4	100%
gestcv	3	50%	3	50%	3	50%	3	50%	3	42%	3	50%
<b>ginp</b>	<b>18</b>	<b>90%</b>	19	57%	19	73%	<b>18</b>	<b>90%</b>	159	67%	159	69%
<b>photov</b>	<b>42</b>	<b>100%</b>	47	44%	48	100%	<b>42</b>	<b>100%</b>	53	44%	53	85%
securibench	86	91%	126	85%	125	86%	86	91%	126	85%	125	86%
webgoat	13	35%	239	55%	229	68%	13	35%	239	55%	230	68%

# RQ1: Impact of Modelling

Applications	Without JEE support						With JEE support					
	No points-to		Context-insensitive points-to		Context-sensitive points-to		No points-to		Context-insensitive points-to		Context-sensitive points-to	
	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision
blojsom	2	100%	3	50%	3	50%	2	100%	3	50%	3	50%
blueblog	1	16%	3	30%	3	37%	1	16%	3	30%	3	37%
firingrange	4	100%	4	100%	4	100%	4	100%	4	100%	4	100%
gestcv	3	50%	3	50%	3	50%	3	50%	3	42%	3	50%
<b>ginp</b>	18	90%	<b>19</b>	<b>57%</b>	19	73%	18	90%	<b>159</b>	<b>67%</b>	159	69%
<b>photov</b>	42	100%	<b>47</b>	<b>44%</b>	48	100%	42	100%	<b>53</b>	<b>44%</b>	53	85%
securibench	86	91%	126	85%	125	86%	86	91%	126	85%	125	86%
webgoat	13	35%	239	55%	229	68%	13	35%	239	55%	230	68%

# RQ1: Impact of Modelling

Applications	Without JEE support						With JEE support					
	No points-to		Context-insensitive points-to		Context-sensitive points-to		No points-to		Context-insensitive points-to		Context-sensitive points-to	
	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision
blojsom	2	100%	3	50%	3	50%	2	100%	3	50%	3	50%
blueblog	1	16%	3	30%	3	37%	1	16%	3	30%	3	37%
firingrange	4	100%	4	100%	4	100%	4	100%	4	100%	4	100%
gestcv	3	50%	3	50%	3	50%	3	50%	3	42%	3	50%
<b>ginp</b>	18	90%	19	57%	<b>19</b>	<b>73%</b>	18	90%	159	67%	<b>159</b>	<b>69%</b>
<b>photov</b>	42	100%	47	44%	<b>48</b>	<b>100%</b>	42	100%	53	44%	<b>53</b>	<b>85%</b>
securibench	86	91%	126	85%	125	86%	86	91%	126	85%	125	86%
webgoat	13	35%	239	55%	229	68%	13	35%	239	55%	230	68%

## RQ1: Summary

RQ1: How does modelling of dynamic web application features impact precision and recall?

**When used with points-to, our current modelling improves recall but might decrease precision.**

# RQ2: Impact of Points-To

Applications	Without JEE support						With JEE support					
	No points-to		Context-insensitive points-to		Context-sensitive points-to		No points-to		Context-insensitive points-to		Context-sensitive points-to	
	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision
blojsom	<b>2</b>	100%	3	50%	<b>3</b>	50%	2	100%	3	50%	3	50%
blueblog	<b>1</b>	16%	3	30%	<b>3</b>	37%	1	16%	3	30%	3	37%
firingrange	<b>4</b>	100%	4	100%	<b>4</b>	100%	4	100%	4	100%	4	100%
gestcv	<b>3</b>	50%	3	50%	<b>3</b>	50%	3	50%	3	42%	3	50%
ginp	<b>18</b>	90%	19	57%	<b>19</b>	73%	18	90%	159	67%	159	69%
photov	<b>42</b>	100%	47	44%	<b>48</b>	100%	42	100%	53	44%	53	85%
securibench	<b>86</b>	91%	126	85%	<b>125</b>	86%	86	91%	126	85%	125	86%
webgoat	<b>13</b>	35%	239	55%	<b>229</b>	68%	13	35%	239	55%	230	68%

# RQ2: Impact of Points-To

Applications	Without JEE support						With JEE support					
	No points-to		Context-insensitive points-to		Context-sensitive points-to		No points-to		Context-insensitive points-to		Context-sensitive points-to	
	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision
blojsom	2	<b>100%</b>	3	50%	3	<b>50%</b>	2	100%	3	50%	3	50%
blueblog	1	<b>16%</b>	3	30%	3	<b>37%</b>	1	16%	3	30%	3	37%
firingrange	4	<b>100%</b>	4	100%	4	<b>100%</b>	4	100%	4	100%	4	100%
gestcv	3	<b>50%</b>	3	50%	3	<b>50%</b>	3	50%	3	42%	3	50%
ginp	18	<b>90%</b>	19	57%	19	<b>73%</b>	18	90%	159	67%	159	69%
photov	42	<b>100%</b>	47	44%	48	<b>100%</b>	42	100%	53	44%	53	85%
securibench	86	<b>91%</b>	126	85%	125	<b>86%</b>	86	91%	126	85%	125	86%
webgoat	13	<b>35%</b>	239	55%	229	<b>68%</b>	13	35%	239	55%	230	68%

# RQ2: Impact of Context Sensitivity

Applications	Without JEE support						With JEE support					
	No points-to		Context-insensitive points-to		Context-sensitive points-to		No points-to		Context-insensitive points-to		Context-sensitive points-to	
	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision
blojsom	2	100%	<b>3</b>	50%	<b>3</b>	50%	2	100%	3	50%	3	50%
blueblog	1	16%	<b>3</b>	30%	<b>3</b>	37%	1	16%	3	30%	3	37%
firingrange	4	100%	<b>4</b>	100%	<b>4</b>	100%	4	100%	4	100%	4	100%
gestcv	3	50%	<b>3</b>	50%	<b>3</b>	50%	3	50%	3	42%	3	50%
ginp	18	90%	<b>19</b>	57%	<b>19</b>	73%	18	90%	159	67%	159	69%
photov	42	100%	<b>47</b>	44%	<b>48</b>	100%	42	100%	53	44%	53	85%
securibench	86	91%	<b>126</b>	85%	<b>125</b>	86%	86	91%	126	85%	125	86%
webgoat	13	35%	<b>239</b>	55%	<b>229</b>	68%	13	35%	239	55%	230	68%

# RQ2: Impact of Context Sensitivity

Applications	Without JEE support						With JEE support					
	No points-to		Context-insensitive points-to		Context-sensitive points-to		No points-to		Context-insensitive points-to		Context-sensitive points-to	
	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision	# TP	Precision
blojsom	2	100%	3	<b>50%</b>	3	<b>50%</b>	2	100%	3	50%	3	50%
blueblog	1	16%	3	<b>30%</b>	3	<b>37%</b>	1	16%	3	30%	3	37%
firingrange	4	100%	4	<b>100%</b>	4	<b>100%</b>	4	100%	4	100%	4	100%
gestcv	3	50%	3	<b>50%</b>	3	<b>50%</b>	3	50%	3	42%	3	50%
ginp	18	90%	19	<b>57%</b>	19	<b>73%</b>	18	90%	159	67%	159	69%
photov	42	100%	47	<b>44%</b>	48	<b>100%</b>	42	100%	53	44%	53	85%
securibench	86	91%	126	<b>85%</b>	125	<b>86%</b>	86	91%	126	85%	125	86%
webgoat	13	35%	239	<b>55%</b>	229	<b>68%</b>	13	35%	239	55%	230	68%



## RQ2: Summary

RQ2: How does points-to and context-sensitivity impact precision and recall?

**Adding points-to analysis definitely improves recall and usually improves precision.**

**Adding context-sensitivity definitely improves precision.**

# State-Of-The-Art

- **TAJ: Effective Taint Analysis of Web Applications (PLDI 2009)**
  - Hybrid thin slicing (IFDS on the value flow graph + context-insensitive points-to analysis).
- **Andromeda: Accurate and Scalable Security Analysis of Web Applications (FASE 2013)**
  - Data-flow taint analysis with on-demand access path computation.
- **FlowDroid: Precise Context, Flow, Field, Object-sensitive and Lifecycle-aware Taint Analysis for Android Apps (PLDI 2014)**
  - IFDS based taint analysis with on-demand access path computation.

# RQ3: Comparison with State-Of-The-Art

Applications	TAJ (2009)		Andromeda (2013)		Our approach	
	Context-insensitive points-to		On-demand access-path computation		Context-sensitive points-to	
	# TP	Precision	# TP	Precision	# TP	Precision
blojsom	—	—	<b>83</b>	<b>60%</b>	3	50%
blueblog	6	50%	<b>13</b>	<b>100%</b>	3	37%
gestcv	4	50%	<b>53</b>	<b>60%</b>	3	50%
ginp	—	—	49	40%	<b>159</b>	<b>69%</b>
photov	—	—	18	10%	<b>53</b>	<b>85%</b>
webgoat	35	90%	41	60%	<b>230</b>	<b>68%</b>

# Summary

- Taint analysis can detect several types of flaws in web applications.
- Modelling of dynamic features can dramatically improve recall.
- Context-sensitive points-to + modelling yields best results.

# Integrated Cloud

## Applications & Platform Services