Estimating Types in Binaries using Predictive Modeling

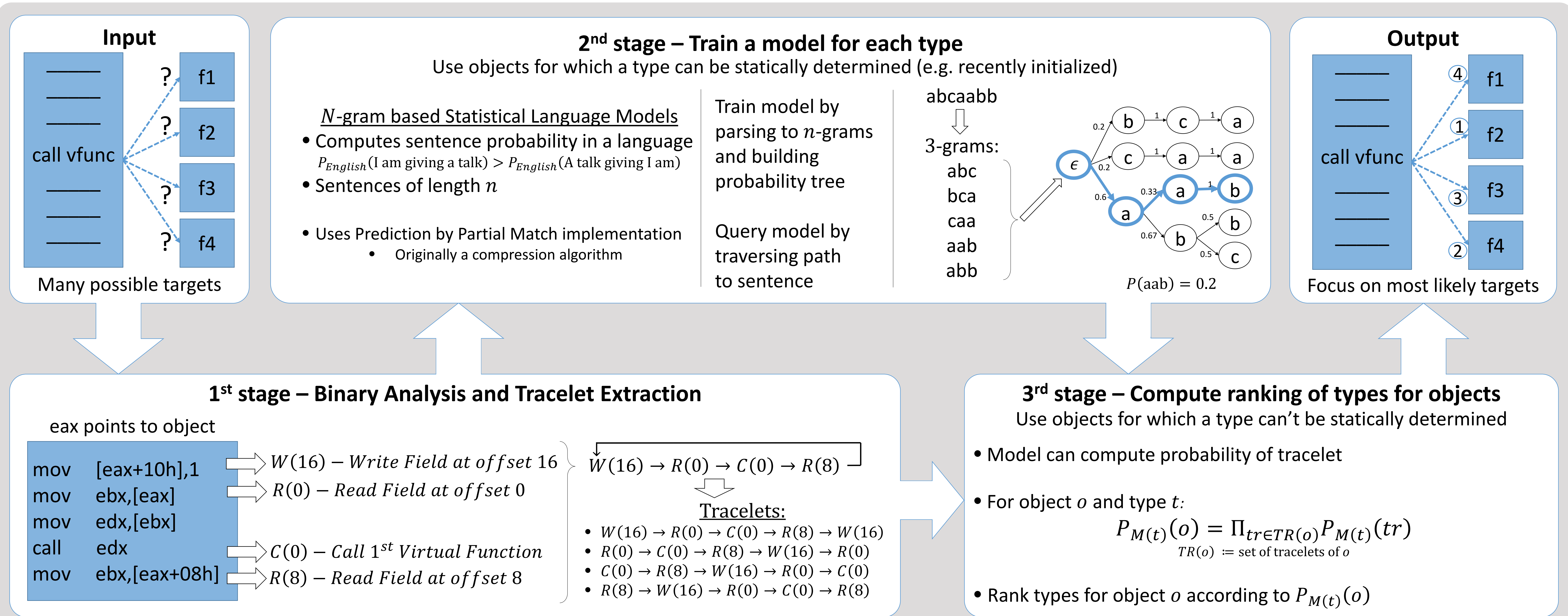Omer Katz   Ran El-Yaniv   Eran Yahav

<u>Problem:</u> Calls to virtual functions break the control flow of programs and hinder reverse engineering (RE) efforts
<u>Goal:</u>   Statically determine most likely targets of each virtual function call
<u>Solution:</u> Determine types of objects used in virtual function calls based on how they are used

Input

call vfunc
? f1
? f2
? f3
? f4

Many possible targets

2nd stage – Train a model for each type

Use objects for which a type can be statically determined (e.g. recently initialized)

<u>N-gram based Statistical Language Models</u>
- Computes sentence probability in a language
$P_{English}(\text{I am giving a talk}) > P_{English}(\text{A talk giving I am})$
- Sentences of length n

- Uses Prediction by Partial Match implementation
  - Originally a compression algorithm

Train model by parsing to n-grams and building probability tree

Query model by traversing path to sentence

abcaabb
⇓
3-grams:
abc
bca
caa
aab
abb

$P(\text{aab}) = 0.2$

Output

call vfunc
④ f1
① f2
③ f3
② f4

Focus on most likely targets

1st stage – Binary Analysis and Tracelet Extraction

eax points to object

```
mov   [eax+10h],1
mov   ebx,[eax]
mov   edx,[ebx]
call  edx
mov   ebx,[eax+08h]
```

$W(16) - Write\ Field\ at\ offset\ 16$
$R(0) - Read\ Field\ at\ offset\ 0$
$C(0) - Call\ 1^{st}\ Virtual\ Function$
$R(8) - Read\ Field\ at\ offset\ 8$

$W(16) \rightarrow R(0) \rightarrow C(0) \rightarrow R(8)$

⇓

Tracelets:
- $W(16) \rightarrow R(0) \rightarrow C(0) \rightarrow R(8) \rightarrow W(16)$
- $R(0) \rightarrow C(0) \rightarrow R(8) \rightarrow W(16) \rightarrow R(0)$
- $C(0) \rightarrow R(8) \rightarrow W(16) \rightarrow R(0) \rightarrow C(0)$
- $R(8) \rightarrow W(16) \rightarrow R(0) \rightarrow C(0) \rightarrow R(8)$

3rd stage – Compute ranking of types for objects

Use objects for which a type can't be statically determined

- Model can compute probability of tracelet

- For object o and type t:
$$P_{M(t)}(o) = \Pi_{tr \in TR(o)} P_{M(t)}(tr)$$
$TR(o) \coloneqq$ set of tracelets of o

- Rank types for object o according to $P_{M(t)}(o)$

Evaluation:
- Evaluated over 20 benchmarks
- Compared to ground truth from manual RE
- <u>Objective</u>: rank expected target highest
- Across all benchmarks, for over 80% of calls to virtual functions, expected target ranked in top 3

Result of *Smoothing.exe:*

- **X** axis – maximum rank
- **Y** axis – percentage of calls to virtual functions for which the expected target was ranked below the maximum rank

smoothing.exe