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# An Expert System for Automatic Software Protection

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XXXI cycle

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# Why is software security needed?

- software is used in (almost) every aspect of everyday life
  - e-banking, entertainment, e-government and many more
- attacks on weakly or non-protected software have a great impact on software companies
  - loss of intellectual property
  - loss of revenues: 46 billions \$ in 2018<sup>1</sup>
- using unlicensed software is dangerous
  - malware usually contained in pirated software
  - disclosure of sensitive data and/or identity theft

<sup>1</sup>2018 BSA Global Security Survey: <https://gss.bsa.org/>


# Software protection techniques

- objective: safeguard *security requirements* of software *assets*
  - assets: algorithms IP, license schemes, users' data...
  - security requirements: confidentiality, integrity
- Man At The End (MATE) scenario
  - attacker has white-box access to application
- no perfect software protection exists
  - but protections can defer attacks

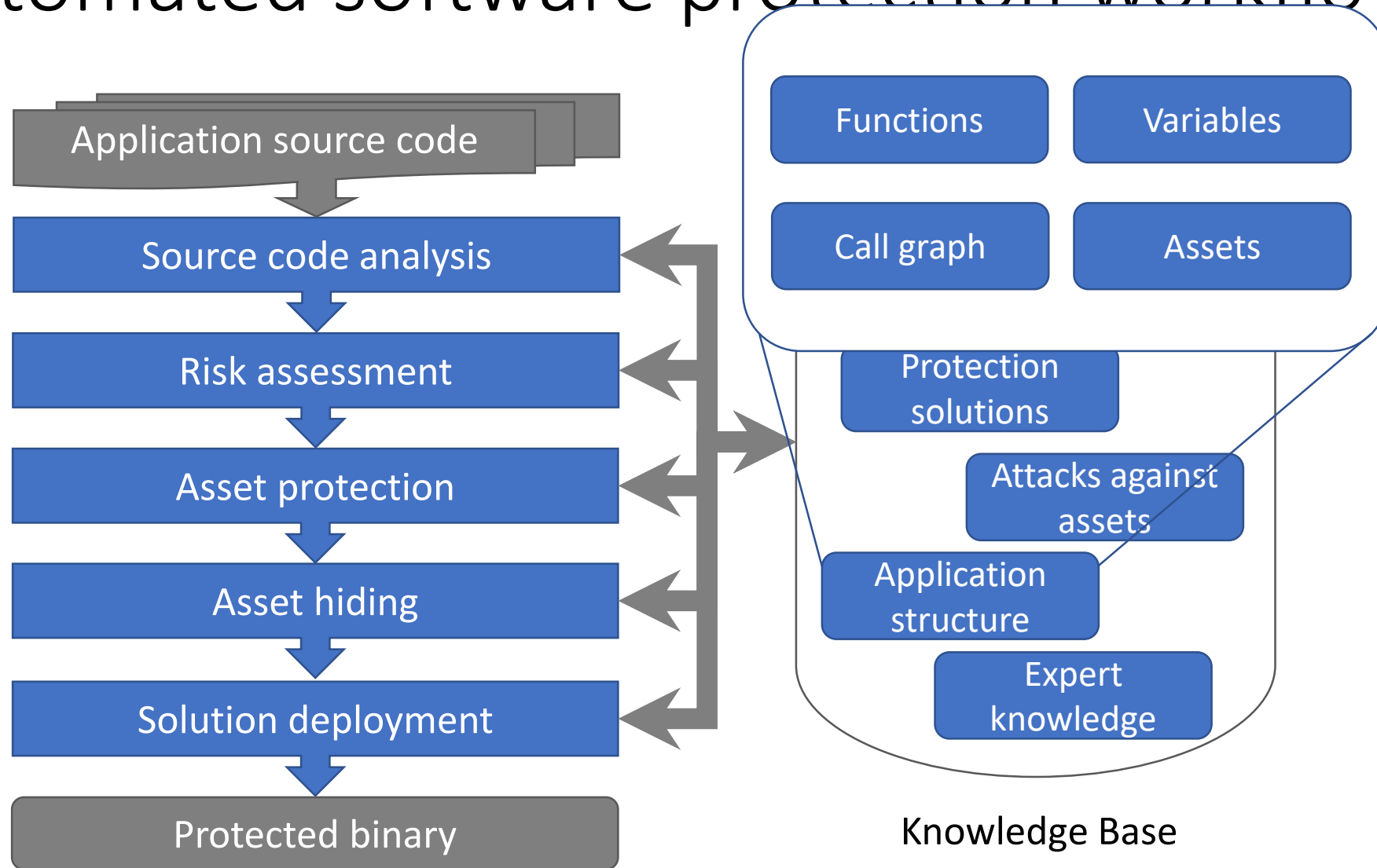
# How to protect the software?

- protections decided and applied manually/empirically:  
several issues
  - long and complex vulnerability analysis
  - high expertise needed to choose the best protections
  - different platform+OS require different analysis
- an automatic approach? desirable
  - for the expert: can provide a good starting point
  - for the beginner: one click and do everything

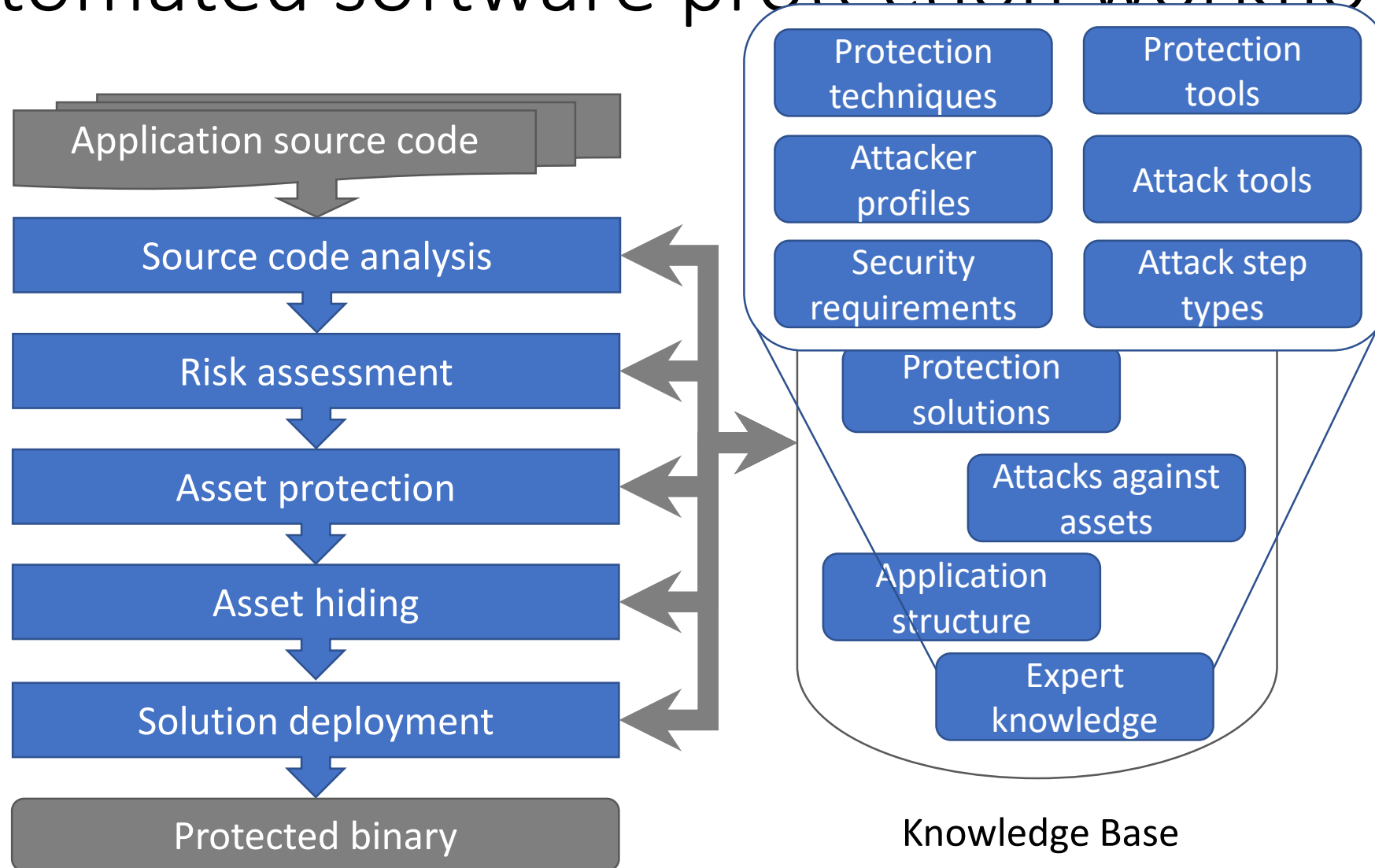
# Expert system for Software Protection (ESP)

- objective: provide an optimal *protection solution* for a given application
  - decide protections best able to safeguard the application assets
  - preserving the user experience
- can drive automatic protection tools
  - for a fully automated protection workflow
- implemented as a set of Eclipse plug-ins 

# Automated software protection workflow

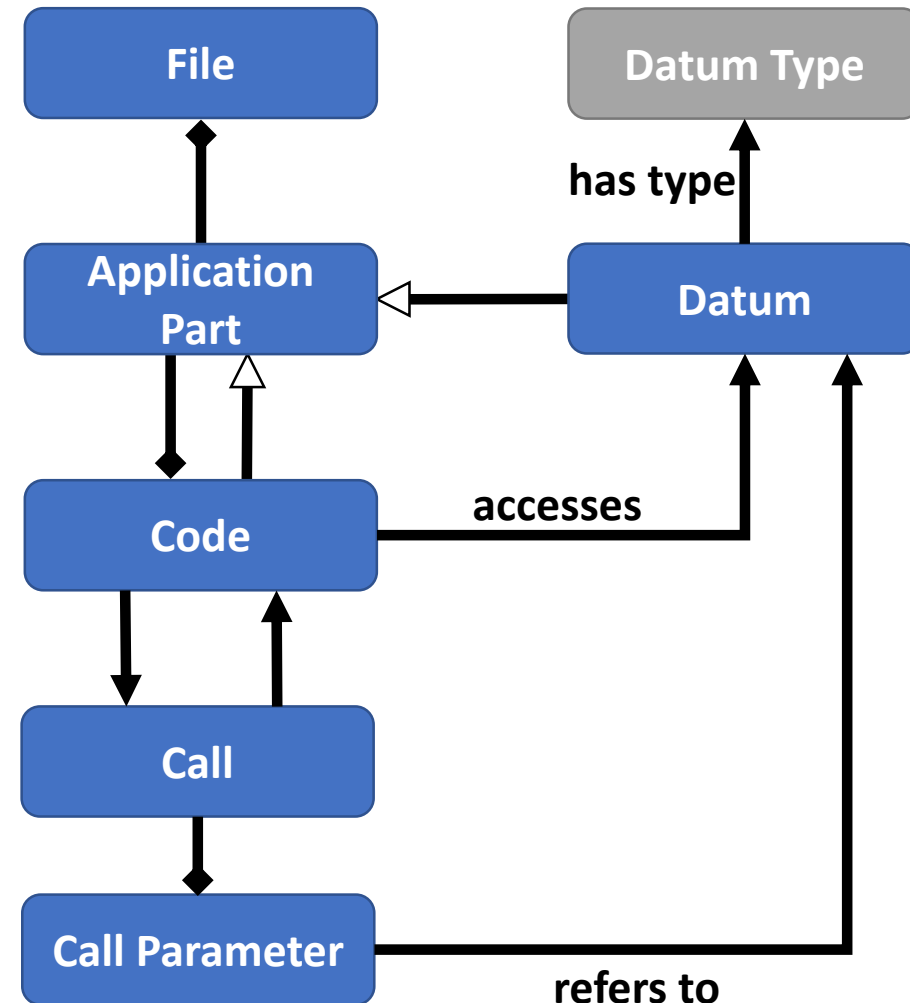


# Automated software protection workflow



# Software security meta-model<sup>4</sup>

- formalizes all data handled by expert system
  - software security experts' general knowledge
  - application-specific data
  - results of expert system
- OWL2 ontology
- classes and associations to describe:
  - application structure
  - assets and security requirements
  - attacks against assets
  - protections

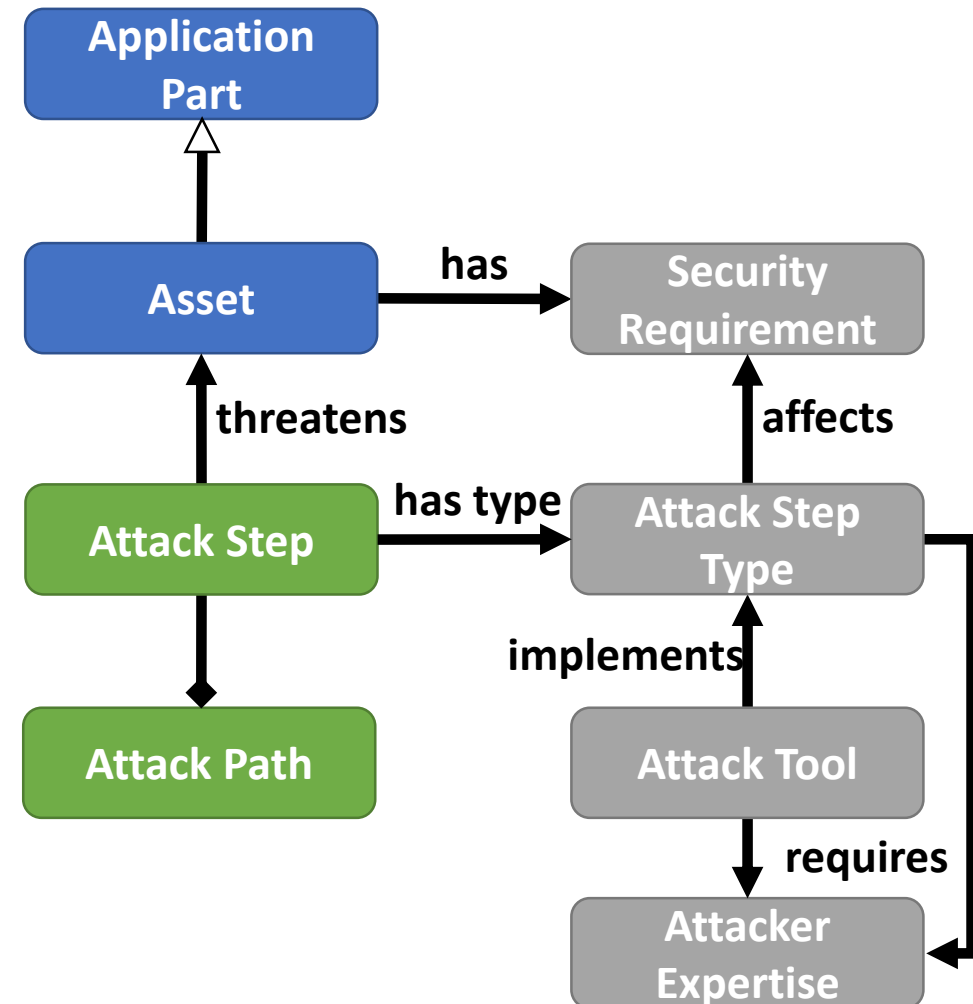


<sup>4</sup>C. Basile, D. Canavese, L. Regano, P. Falcarin, B. De Sutter, A meta-model for software protections and reverse engineering attacks, *Journal of Systems and Software*, Volume 150, 2019



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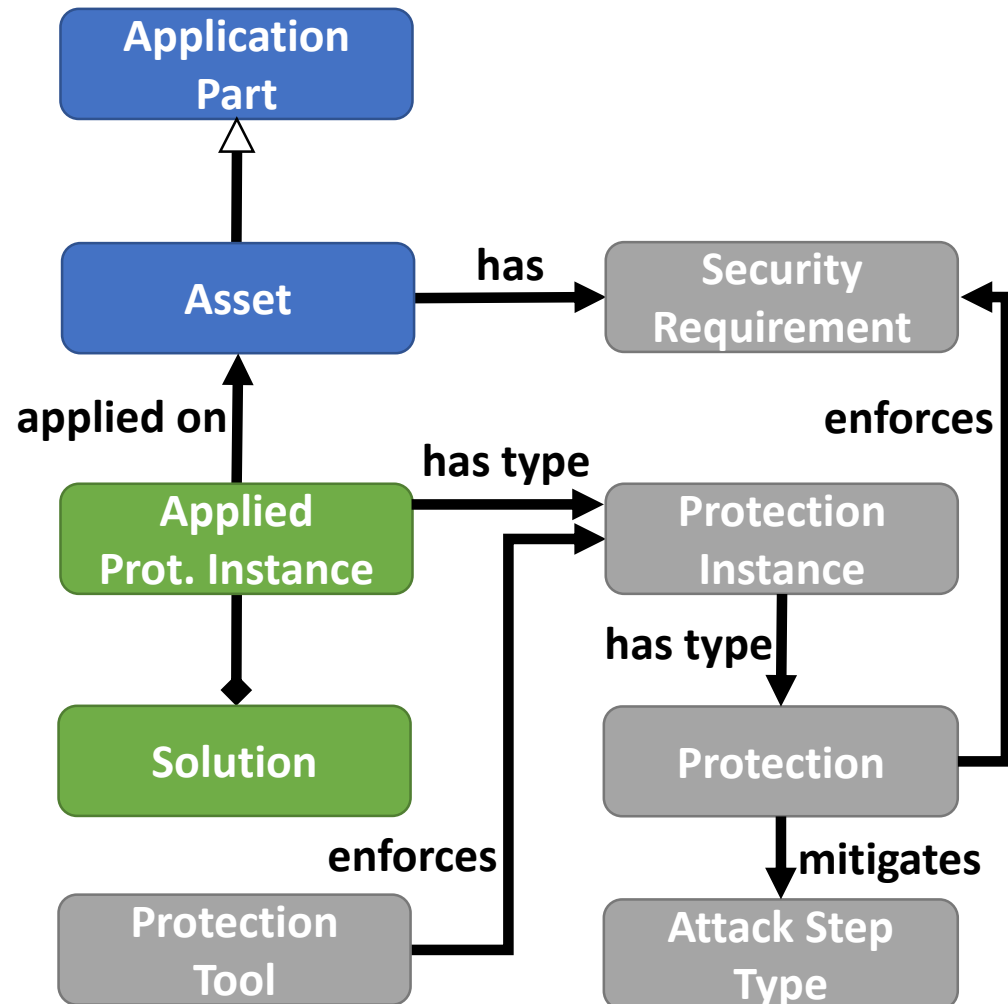
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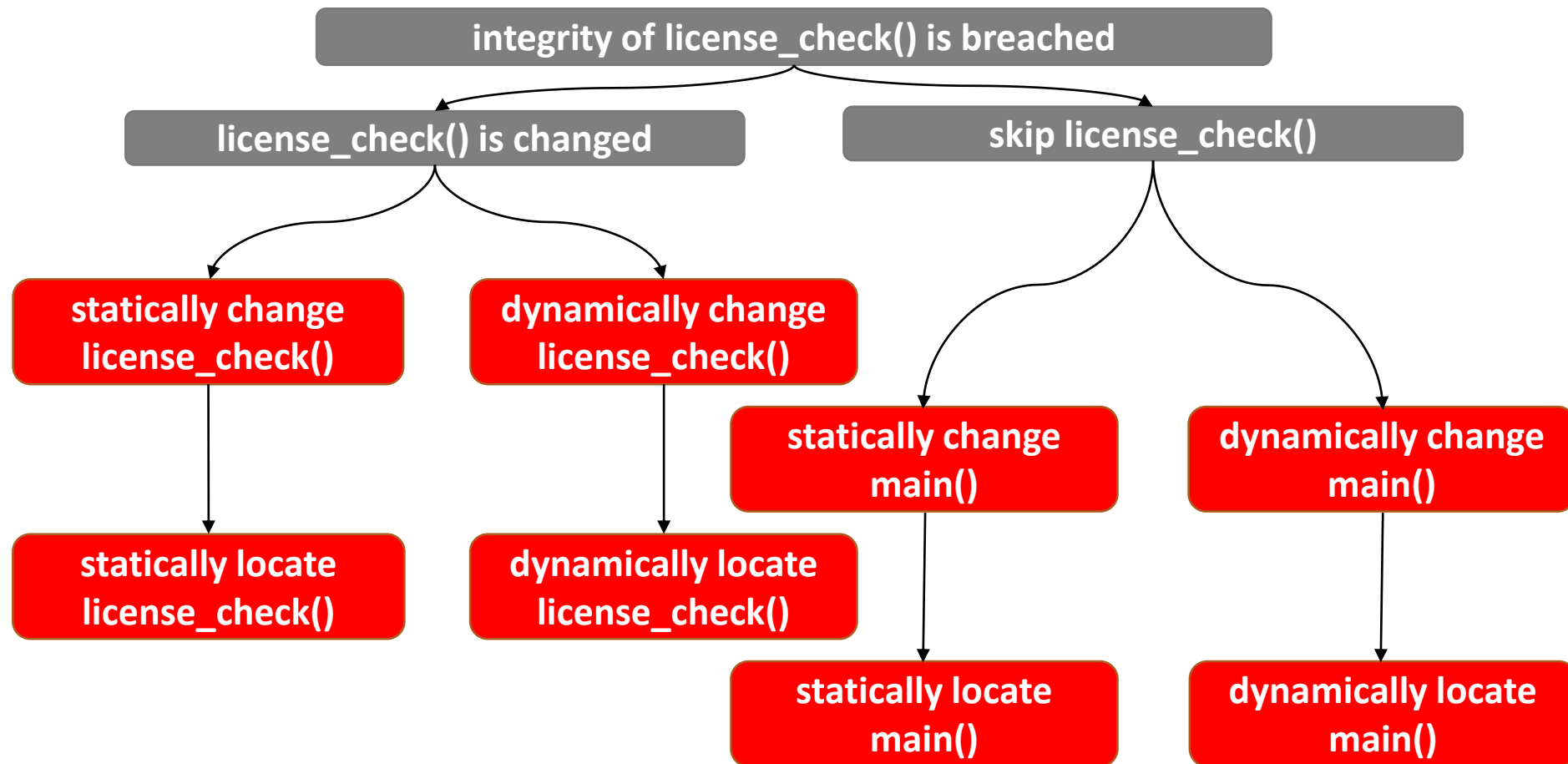
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# Risk assessment phase<sup>5</sup>

- infers possible attacks
  - on the unprotected application
  - able to breach assets' security requirements
- attack steps = simple attacker actions
  - expressed as Prolog inference rules
- attack paths = ordered sequences of attack steps
  - against actual assets

<sup>5</sup>L. Regano, D. Canavese, C. Basile, A. Viticchié, A. Lioy, Towards Automatic Risk Analysis and Mitigation of Software Applications, *2016 Workshop in Information Security Theory and Practice (WISTP)*, 2016

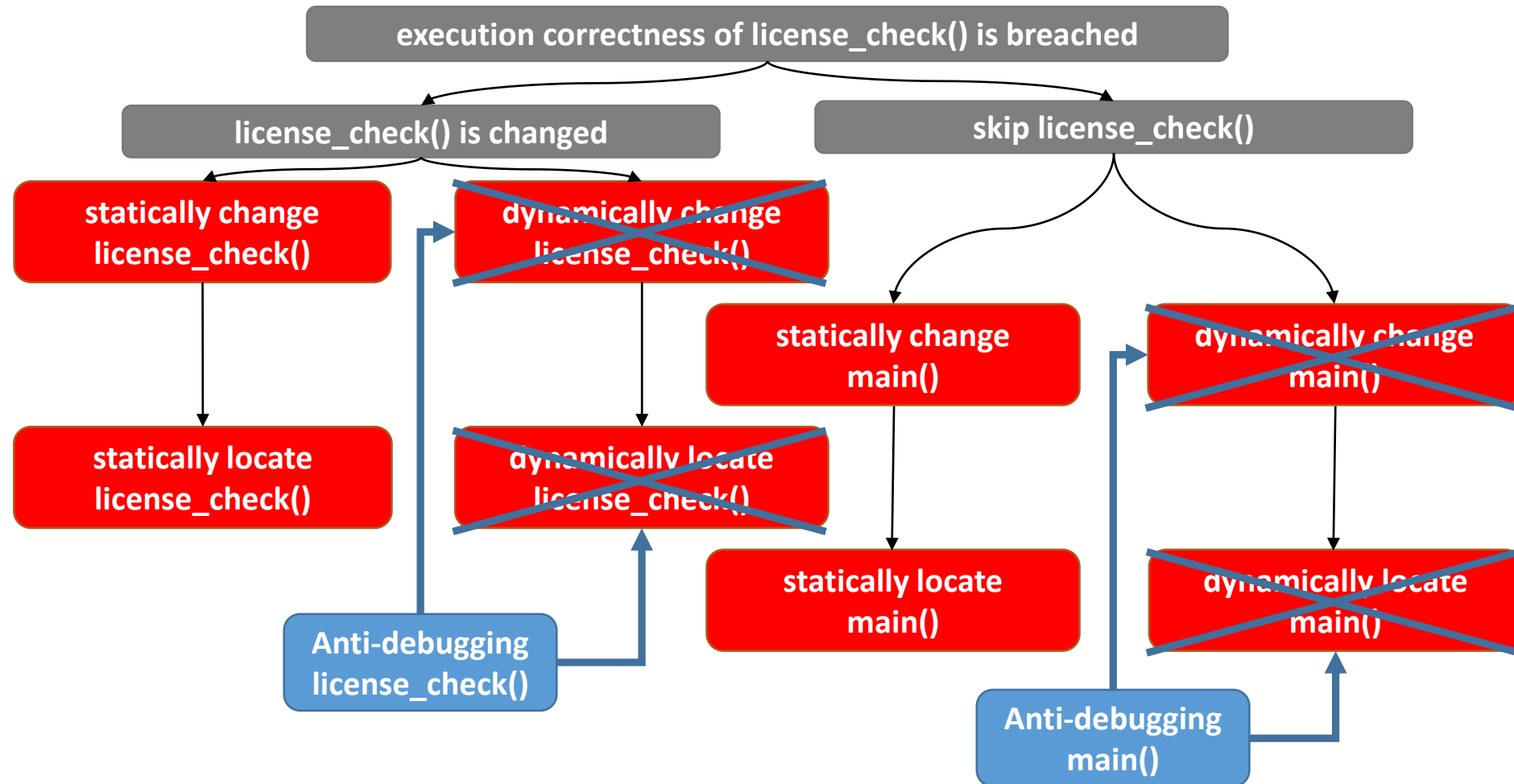
# Risk assessment phase: attack paths



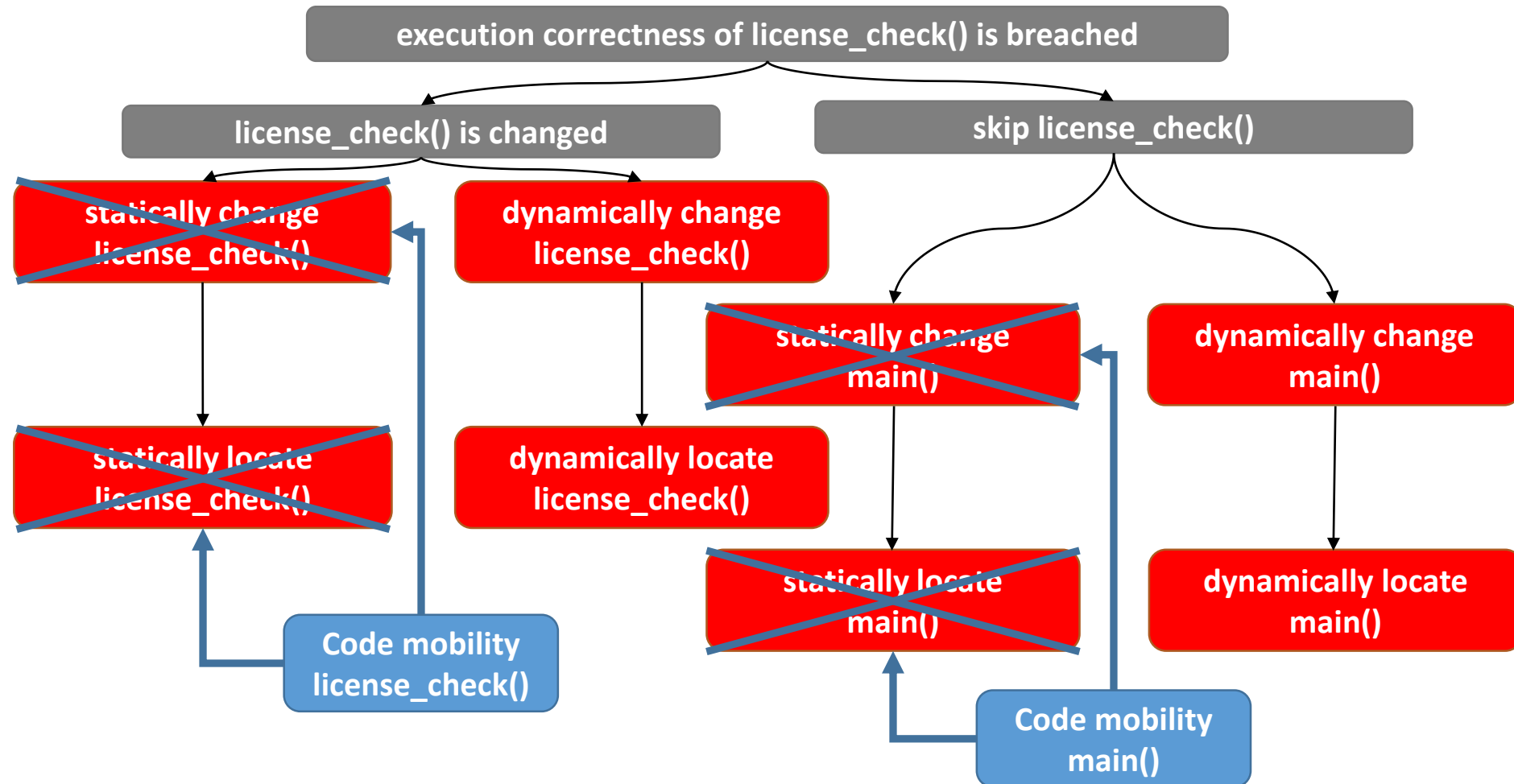
# Asset protection phase

- infers the optimal protection solution best able to defer attack paths
- takes into account:
  - structure of application
  - assets+security requirements
  - attack paths from risk assessment phase
  - interactions among protection techniques
  - protected application slow-down
- decision based on
  - experts knowledge
  - quantitative asset metrics (e.g. cyclomatic complexity)

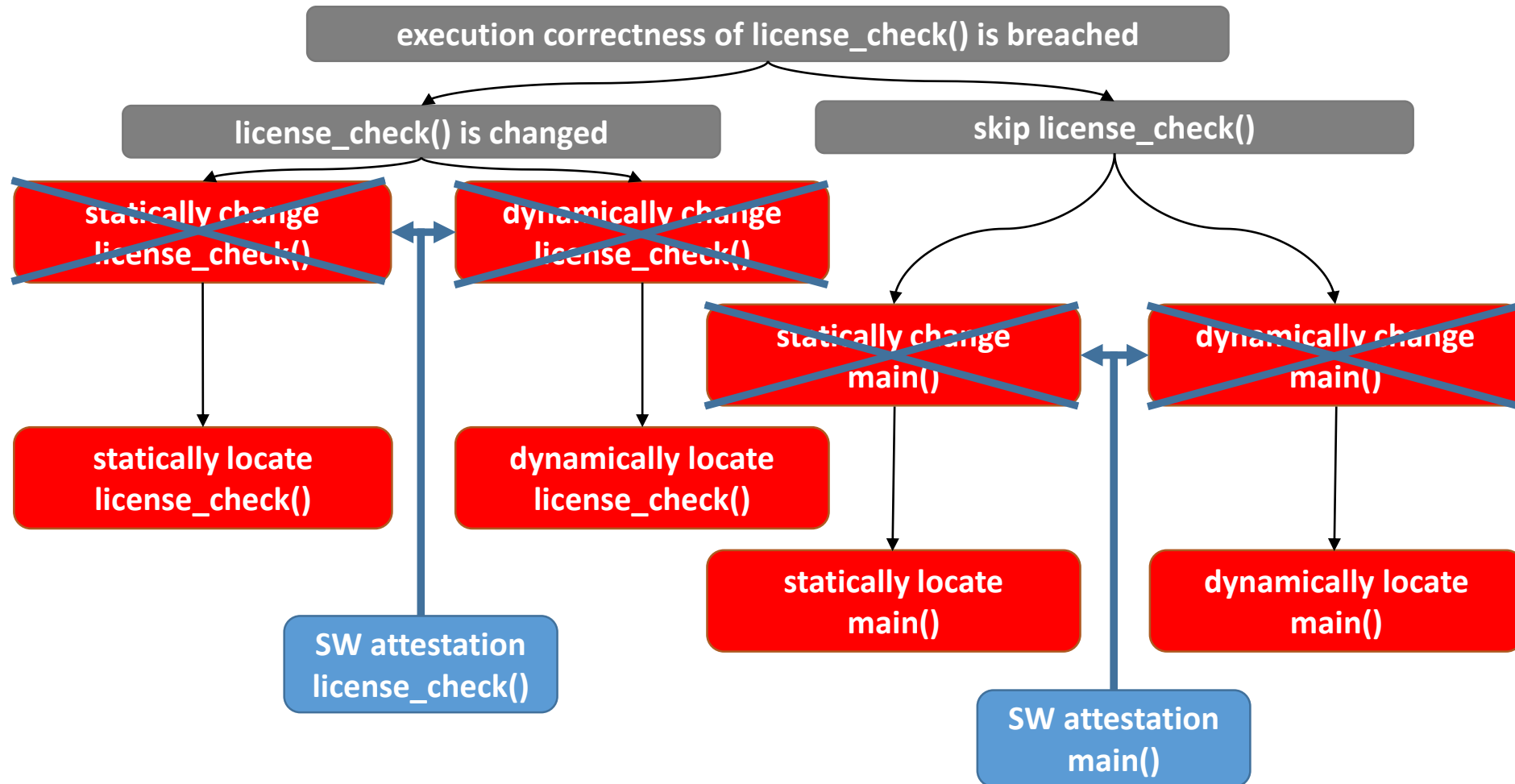
# Asset protection phase: protections vs. attacks



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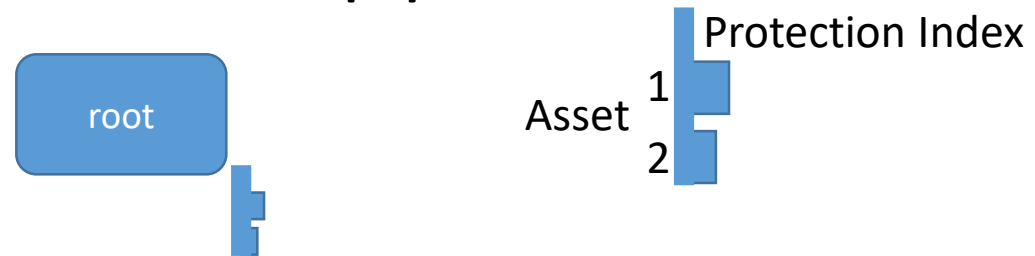




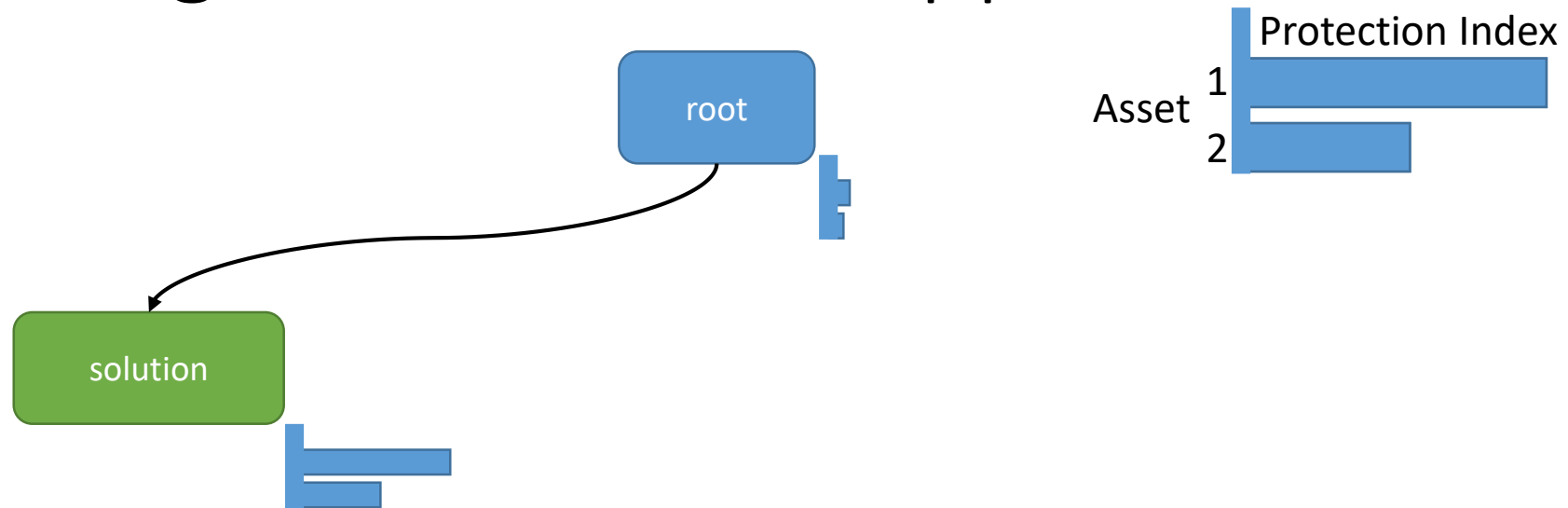
# Asset protection phase: valid protection solutions

- must be able to defer all attack paths
- business logic of the application must remain unaltered
- ordering among protections applied on the same asset is important
- protected application slow-down must be below user-defined limits

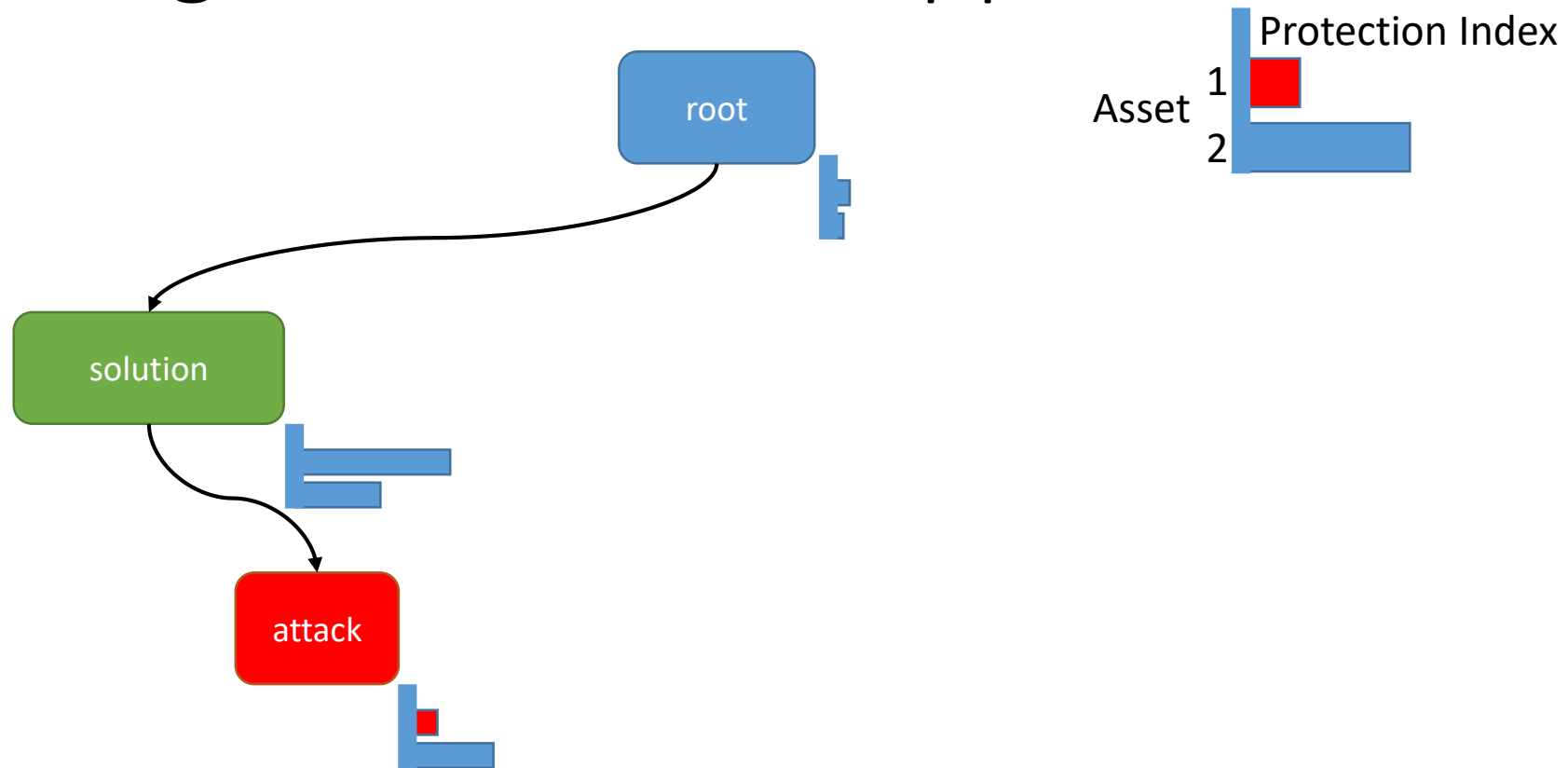
# Asset protection phase: game-theoretic approach



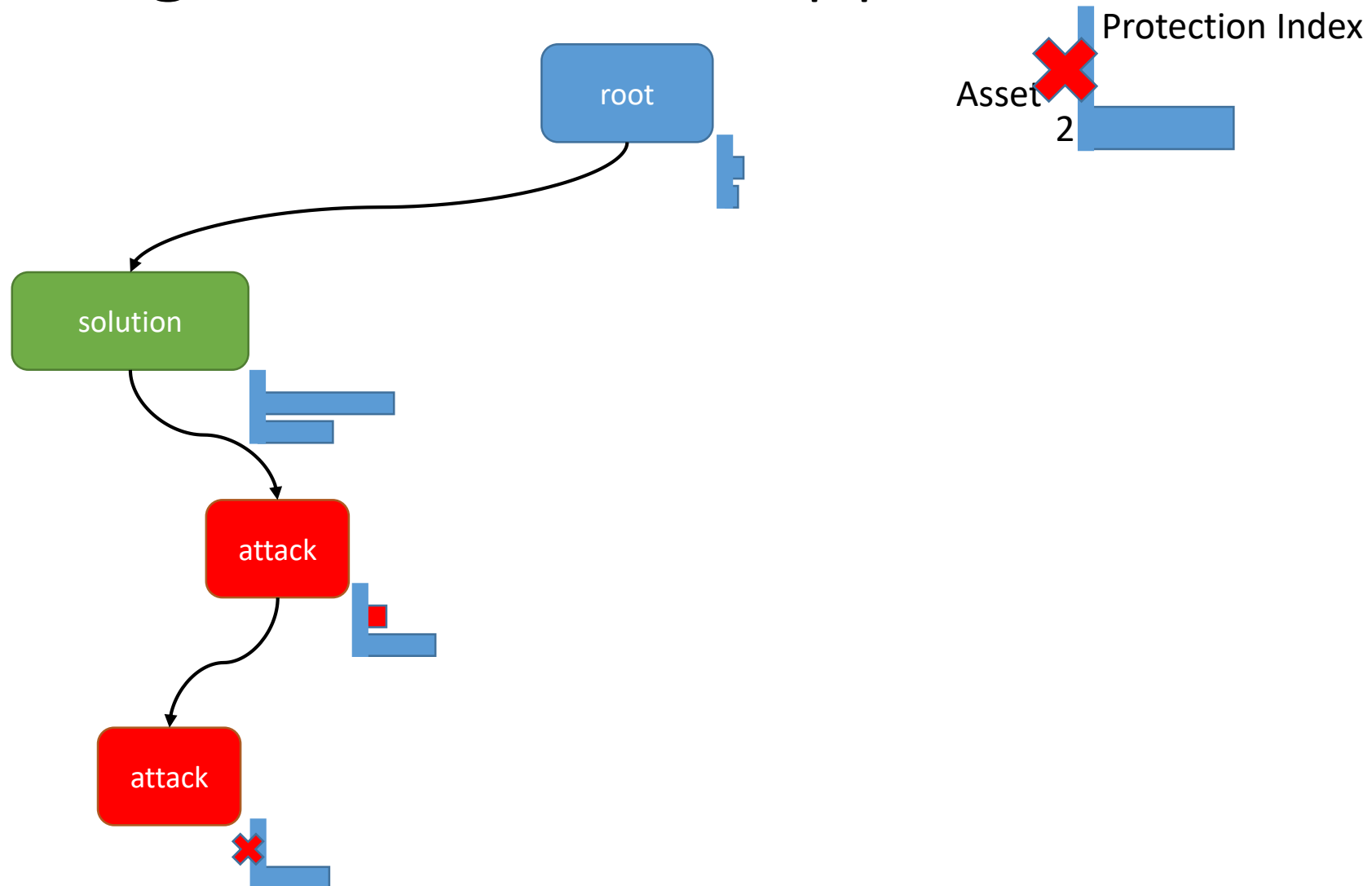
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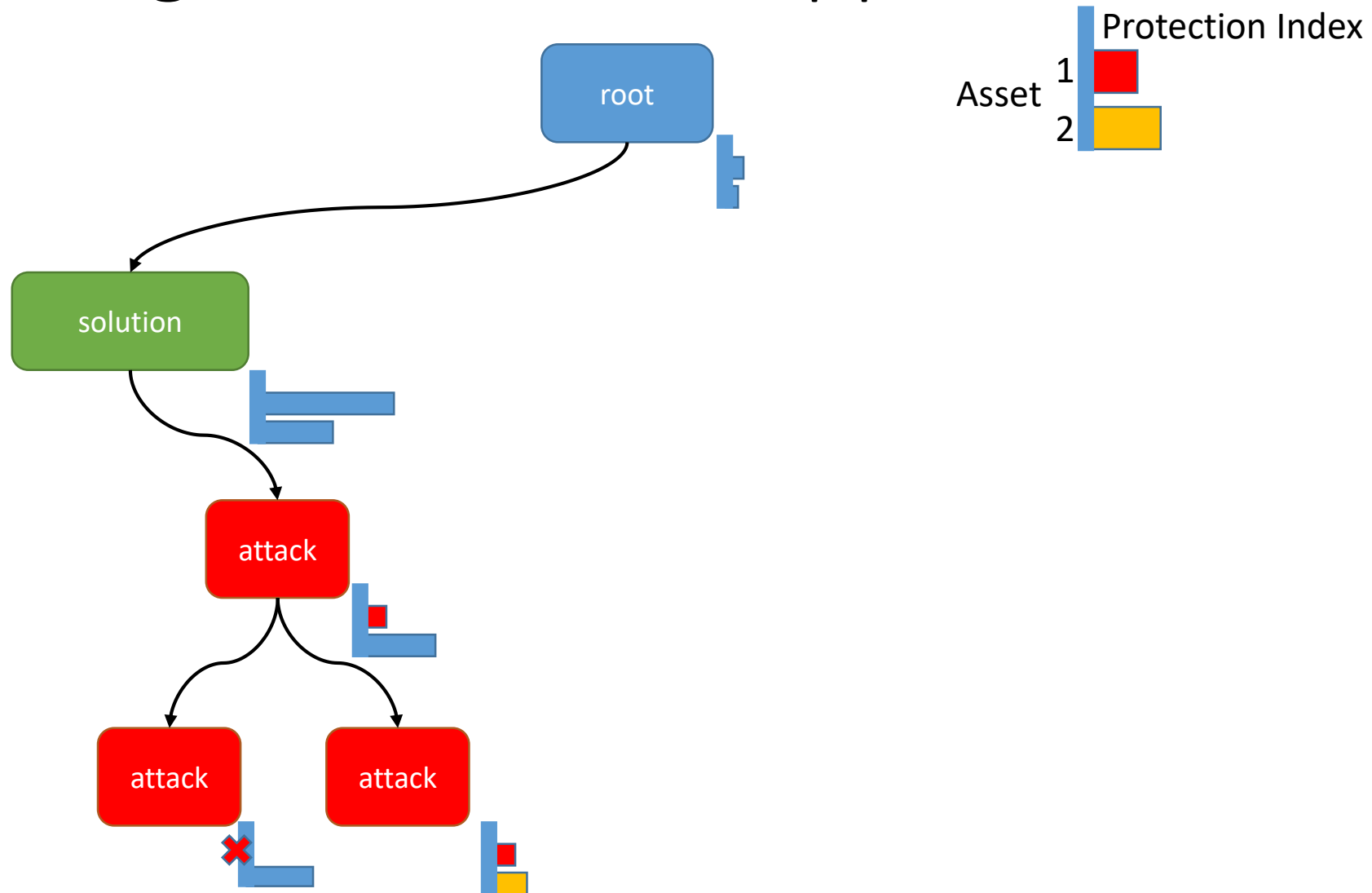
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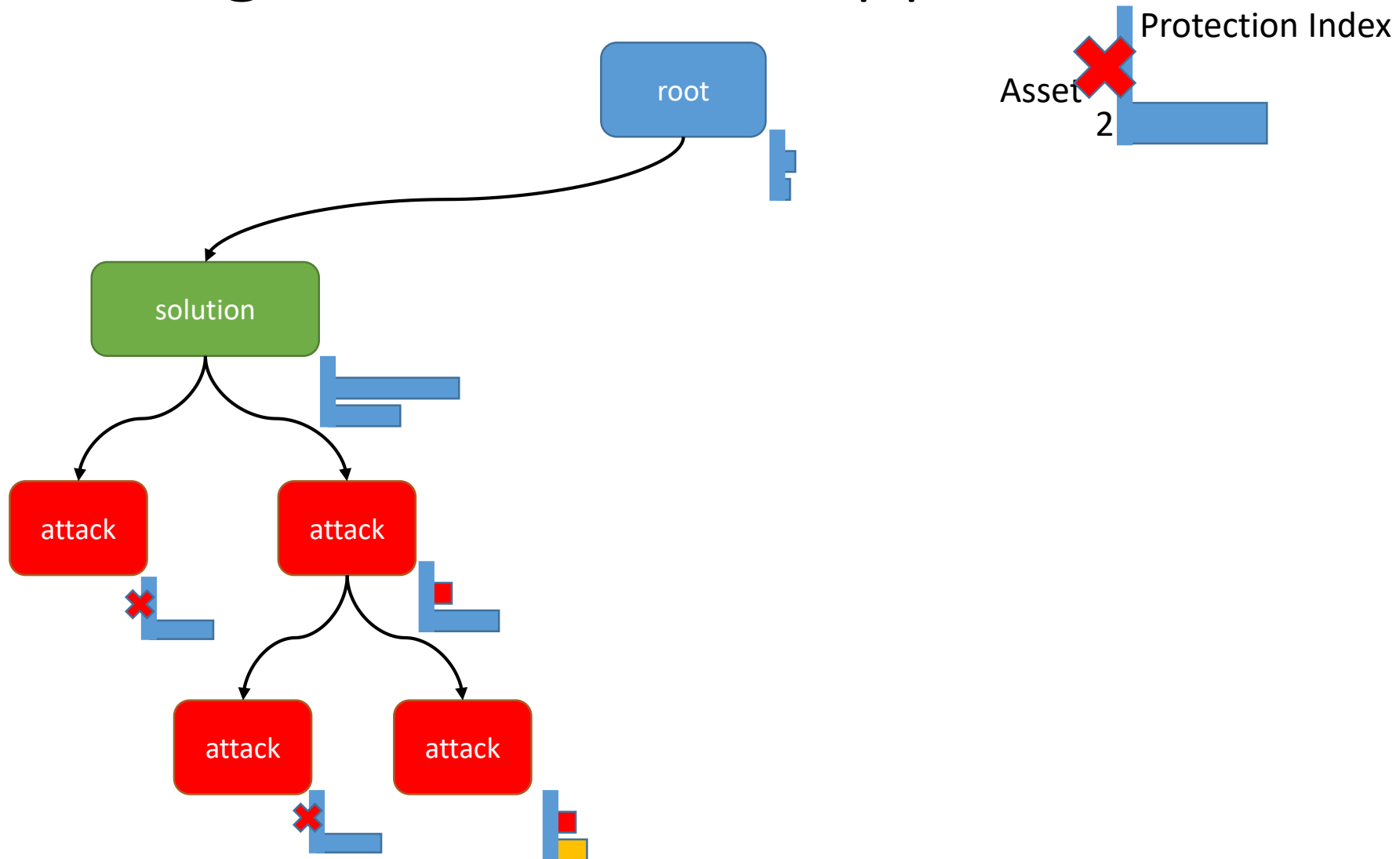
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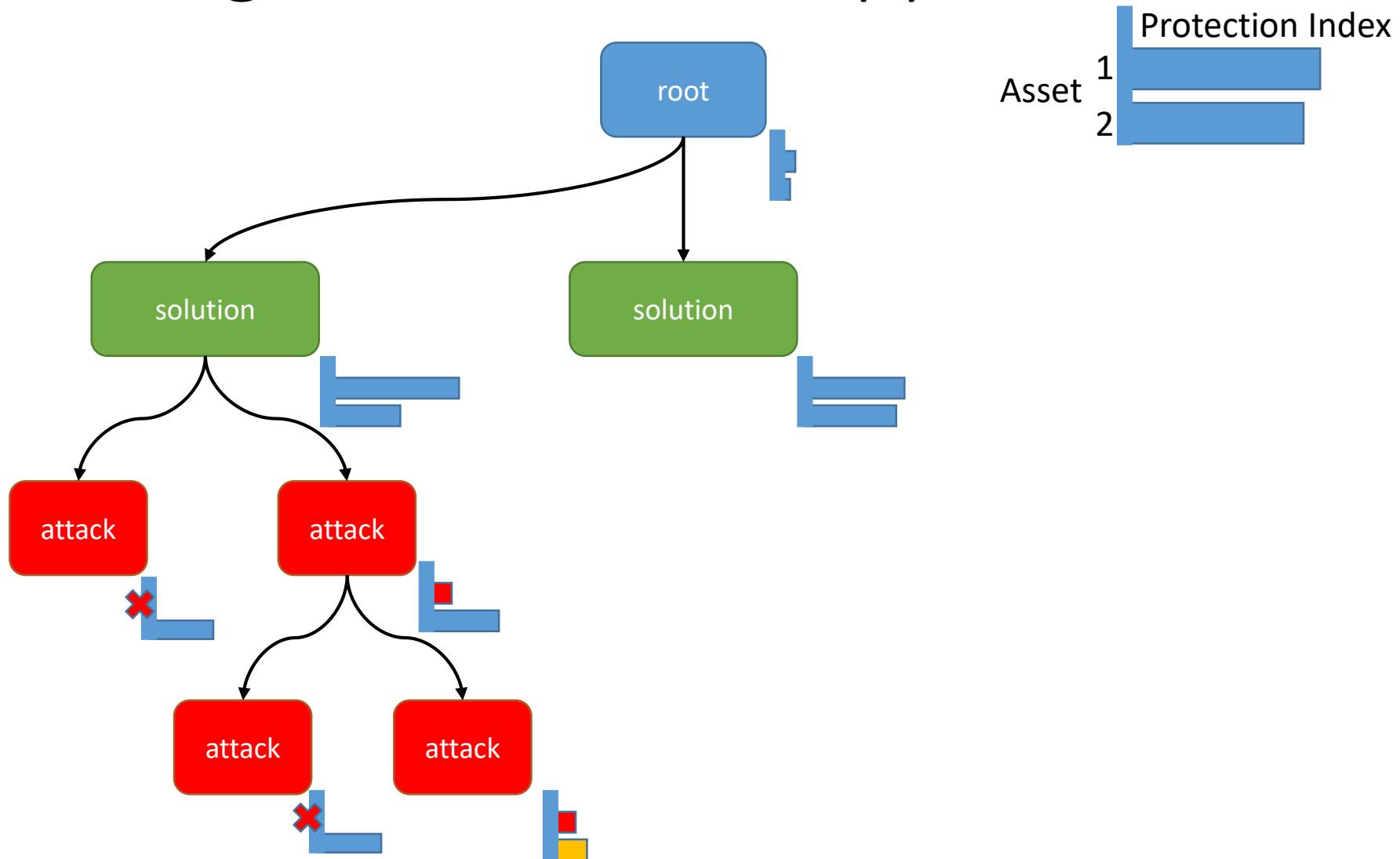
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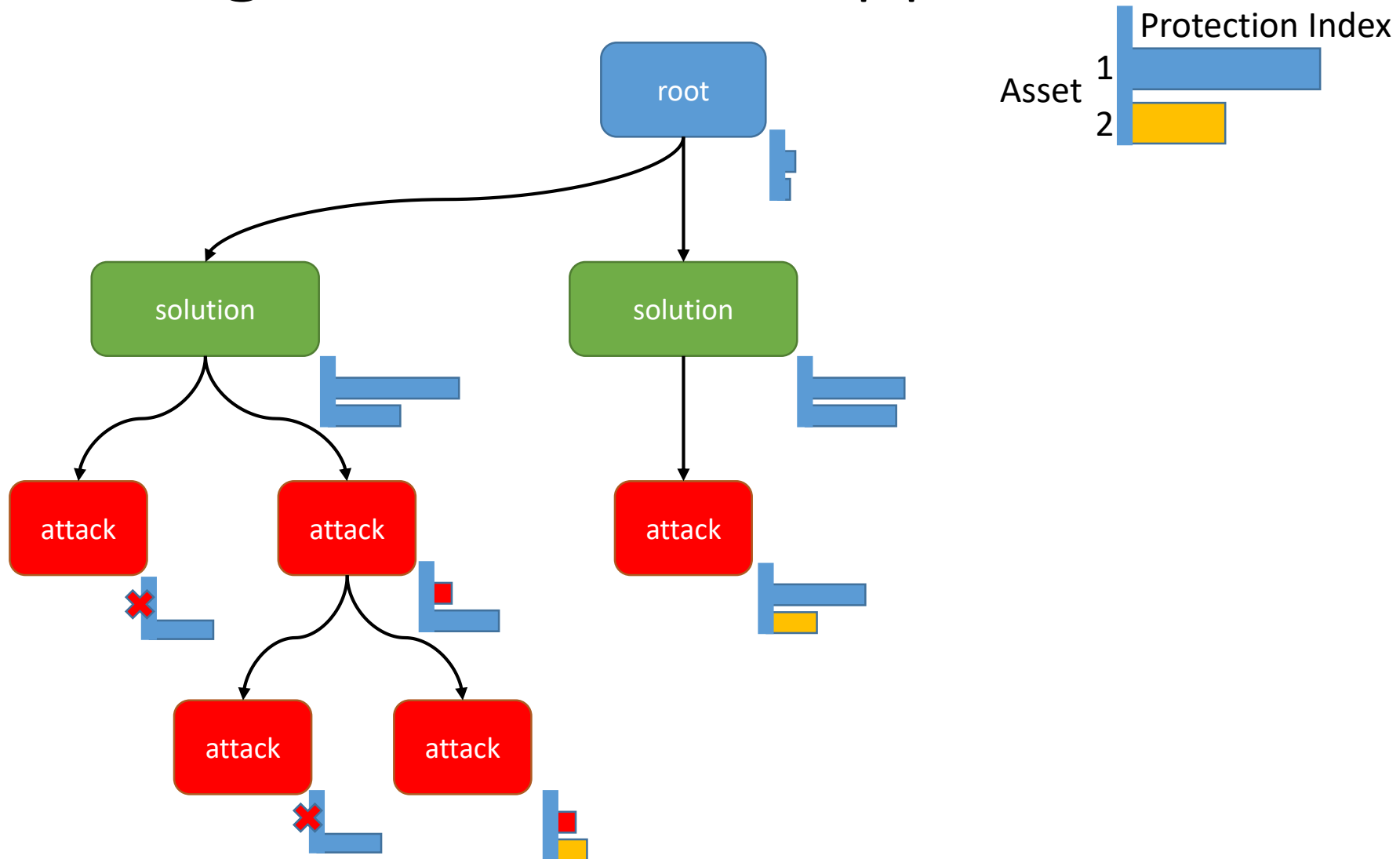


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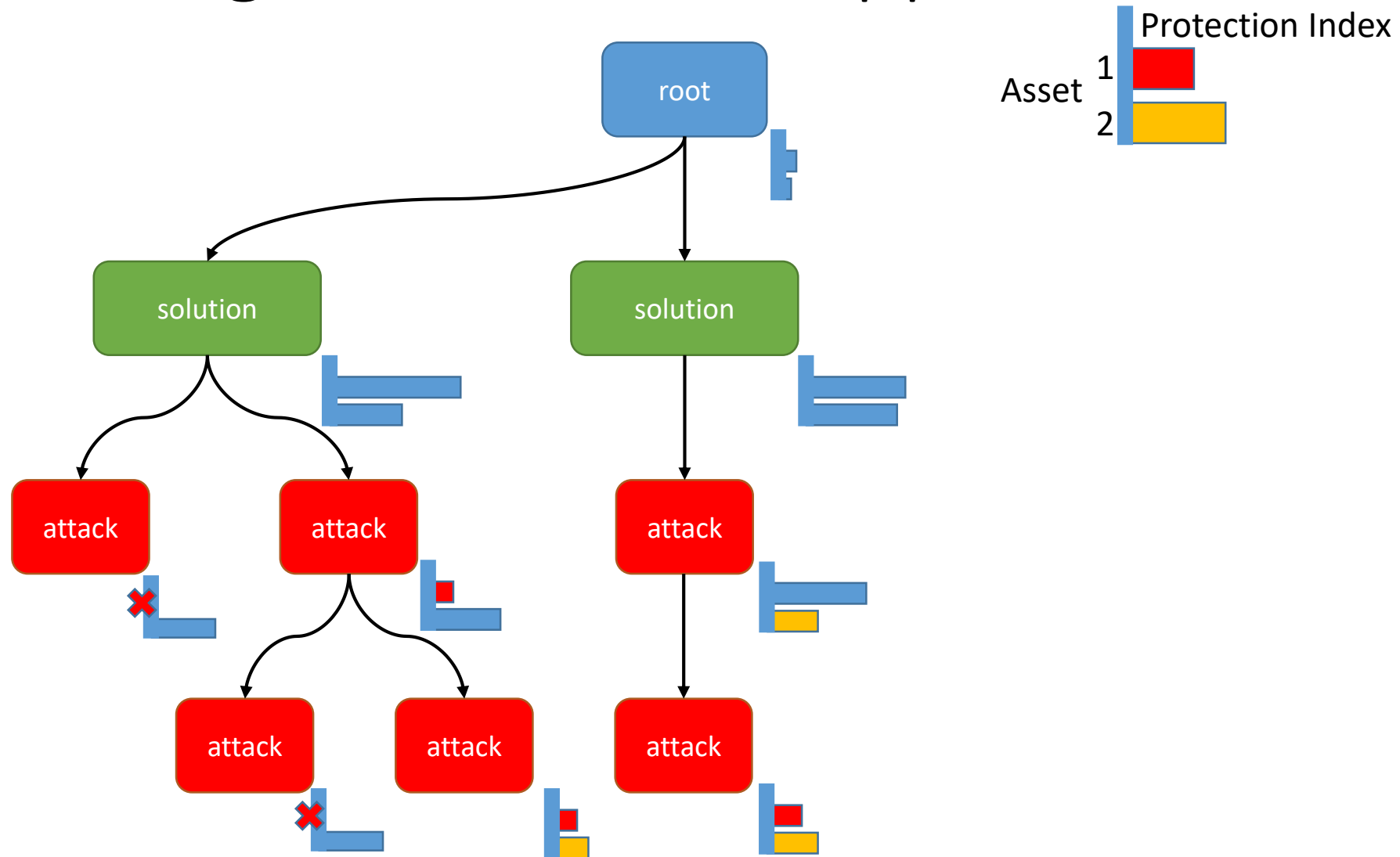




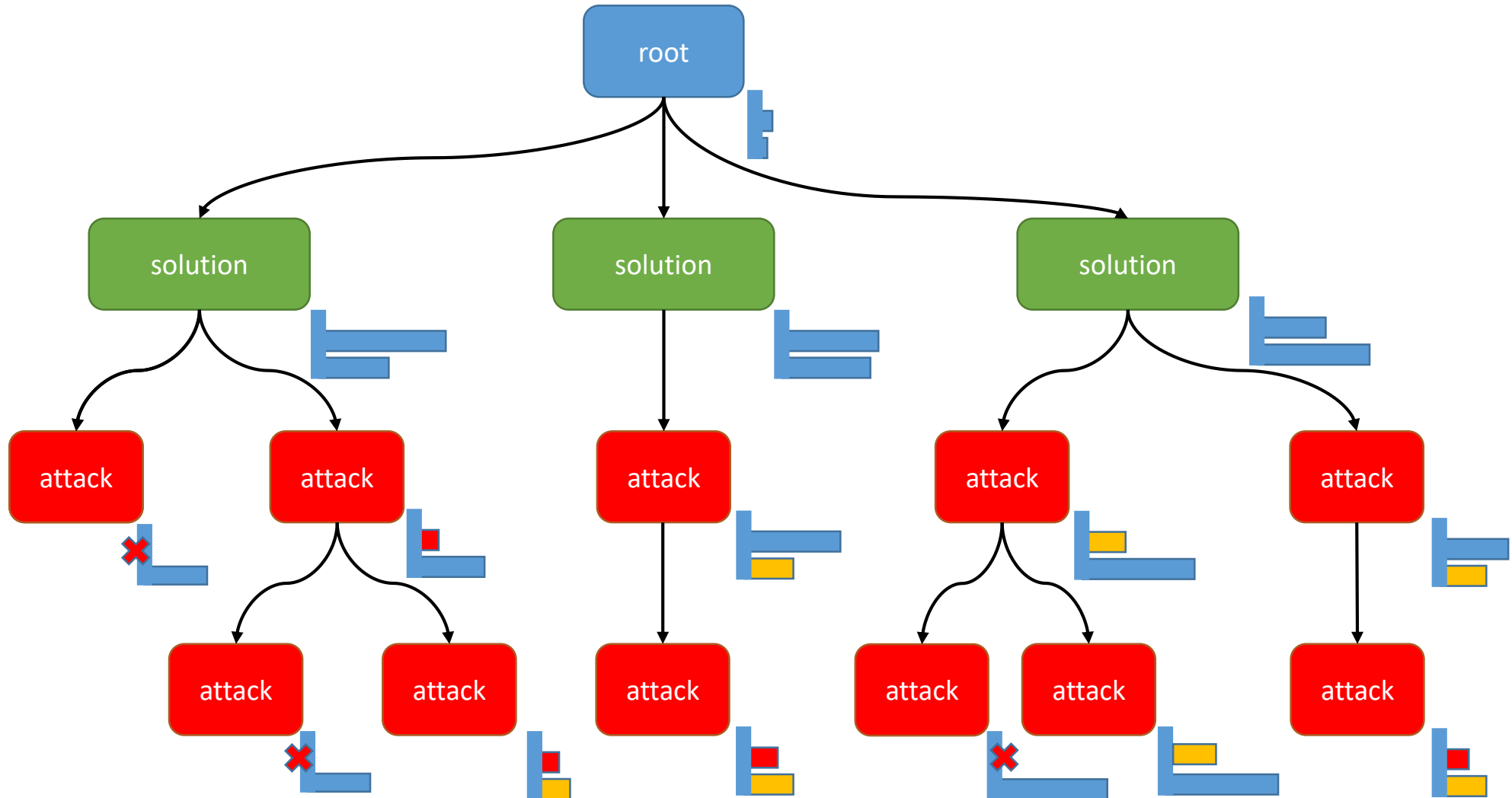
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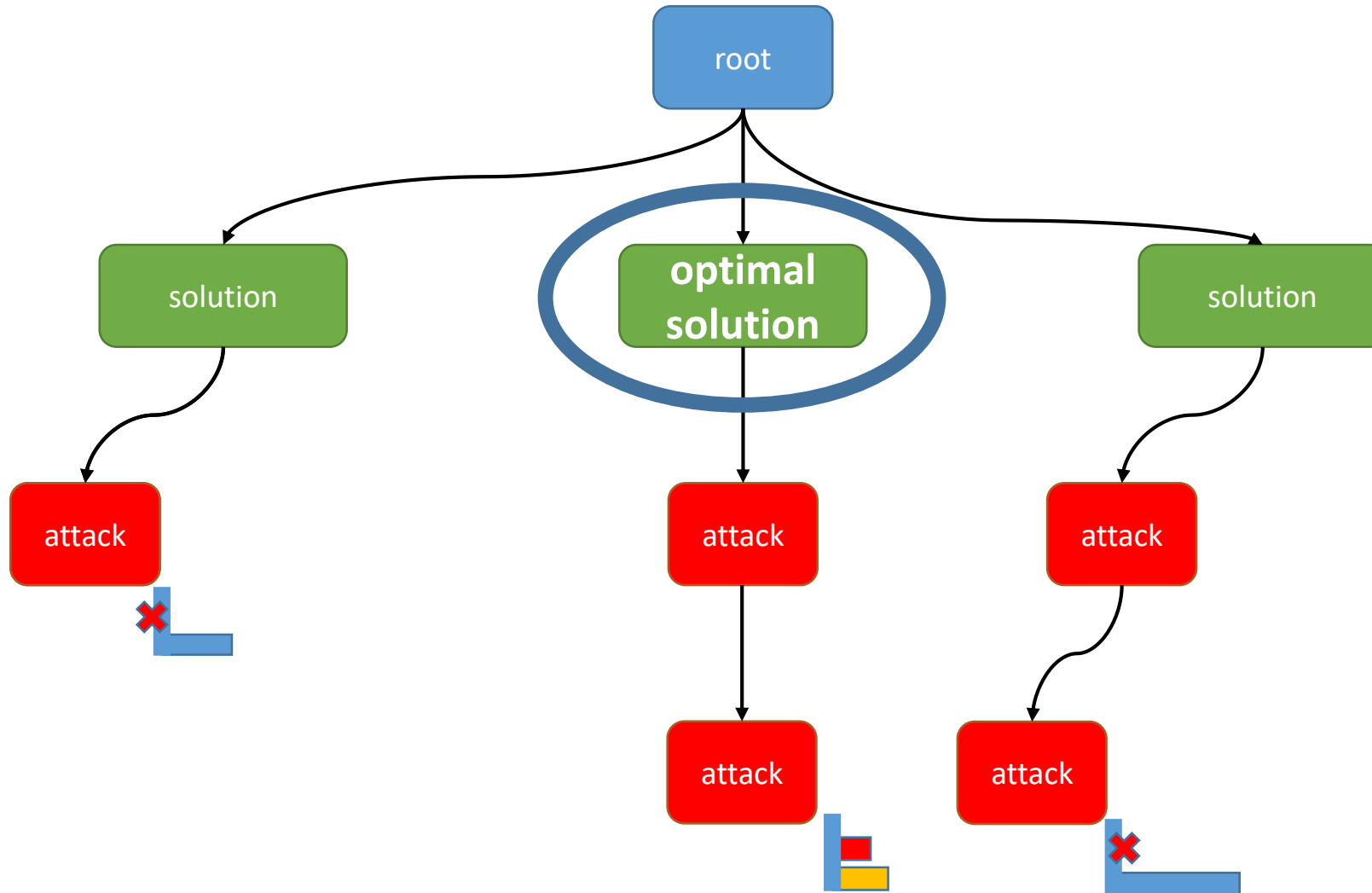
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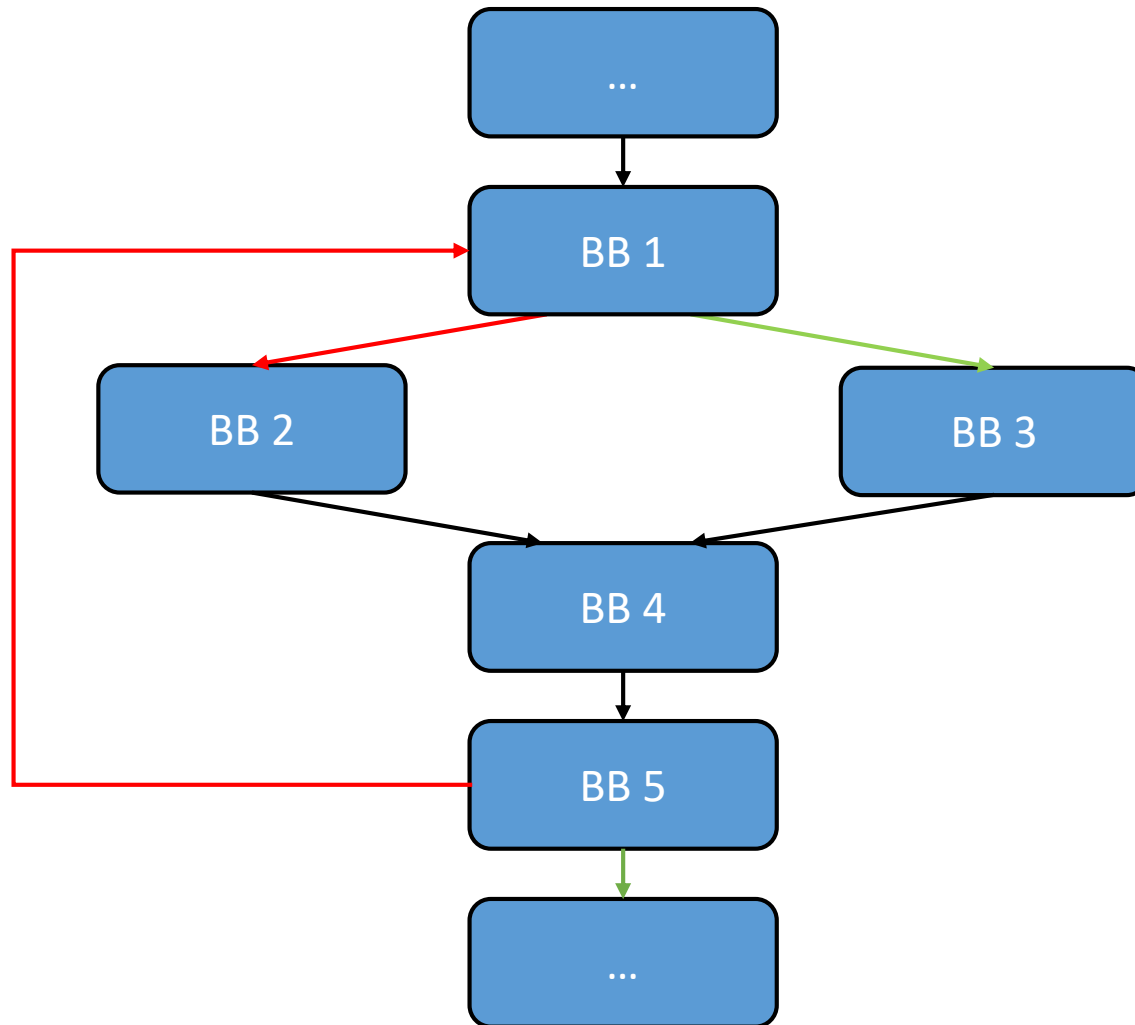
# Asset hiding phase<sup>6</sup>

- problem: software protections might expose a "fingerprint"
  - fingerprints: code patterns, peculiar behaviors, etc.
  - attackers locate assets looking for protection fingerprints
- solution: Asset Hiding (AH) phase
  - apply protections to hide fingerprints
  - trade-off between fingerprint hiding and overhead
  - state of the art: manually obfuscate as much code as possible

<sup>6</sup>L. Regano, D. Canavese, C. Basile, A. Lioy, Towards Optimally Hiding Protected Assets in Software Applications, *2017 IEEE International Conference on Software Quality, Reliability and Security (QRS)*, 2017

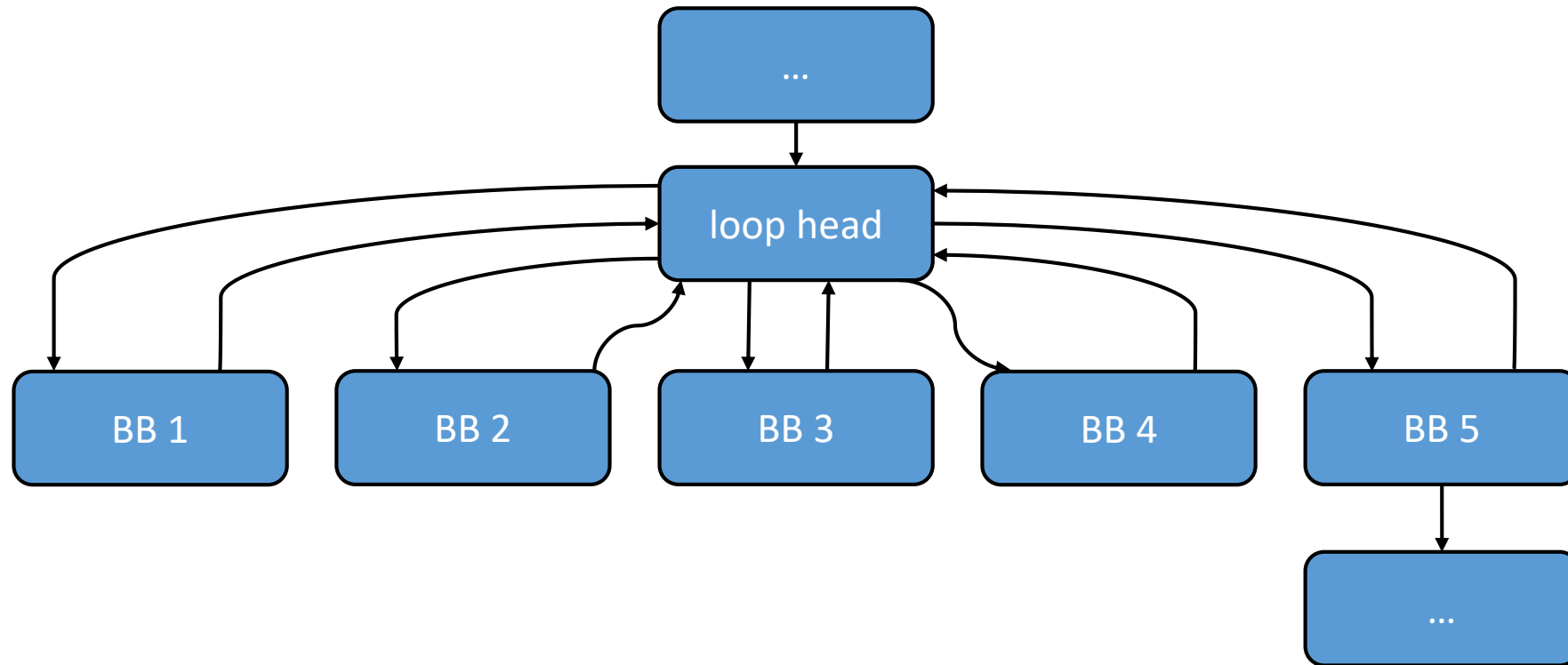
# Fingerprint example:

## Control Flow Flattening



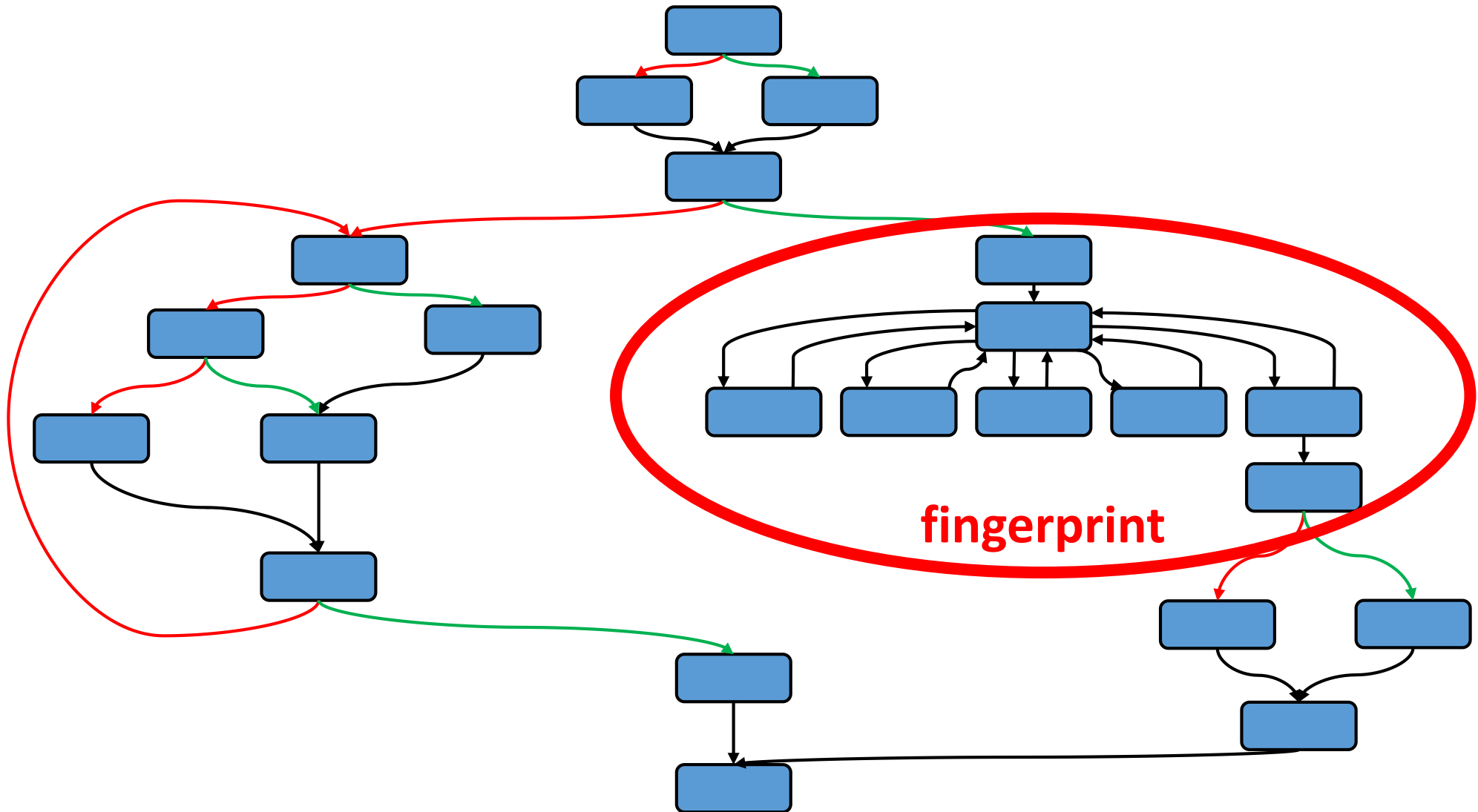
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## Control Flow Flattening



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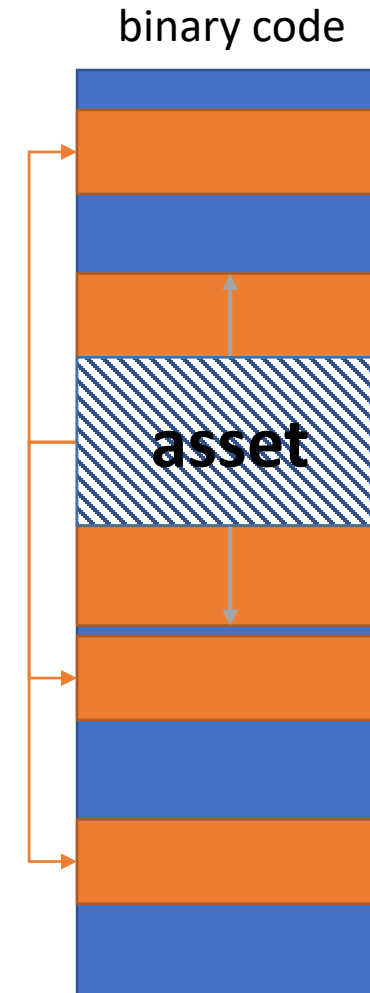
## Control Flow Flattening





# Asset hiding phase: strategies

- Asset Hiding strategies:
  - fingerprint replication
  - protected area enlargement
  - fingerprint shadowing
- deciding AH protections is difficult:
  - not all strategies are useful to hide all protections
  - some strategies may lower AP protections security
  - overhead must be taken into account



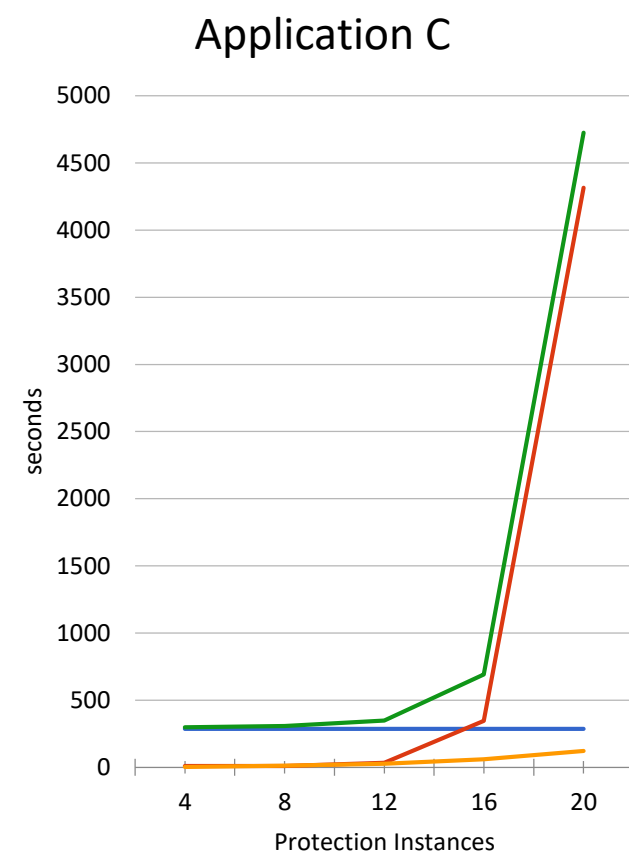
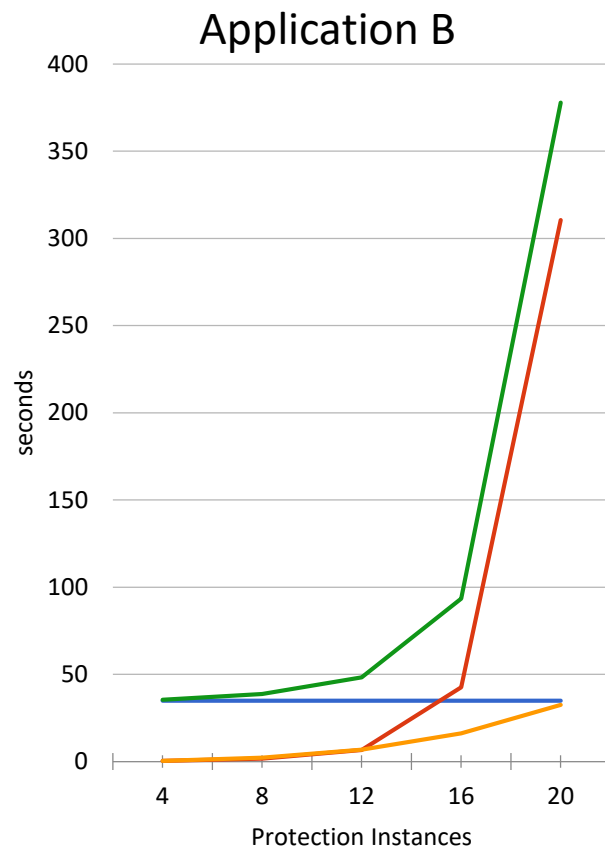
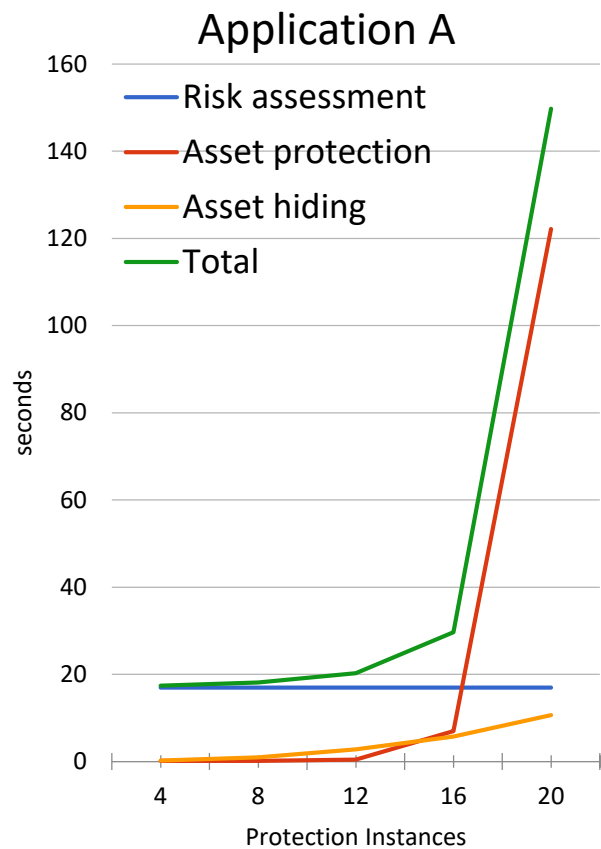
# Asset hiding phase: approach

- objective: maximize the confusion index
  - confusion index: how much the attacker is expected to be delayed by the AH in finding the assets
  - applying an AH protection increases the confusion index
- custom Mixed Integer-Linear problem
  - based on the well-known Knapsack Problem
  - capacity constraints: overhead limits (e.g. CPU time, memory)

# Validation by experts

- ESP tested on three real-life use-cases
  - OTP generator, application licensing scheme, DRM video player
- ESP results validated by software security experts
  - attack paths cover real attacks by tiger teams
  - protection solutions effectively block attacks
  - protection solutions leave applications business logic unaltered
  - protection solutions introduce limited overhead

# Experimental results



Application	SLOC	Functions	Assets
A	443	18	4
B	1029	47	15
C	3749	178	39

# Conclusions and future work

- completely automated workflow for software protection
  - user must only identify assets and security requirements
  - infers attacks against assets
  - decides best protection to defer attacks
  - deploys protections by driving automatic protection tools
- results validated by software security experts
- future work: empirical assessment of software protections
  - master students asked to attack protected applications...
  - ...to assess how much attackers are deferred by protections
  - useful data to drive ESP reasoning processes

Thank you  
for your attention!

Questions?