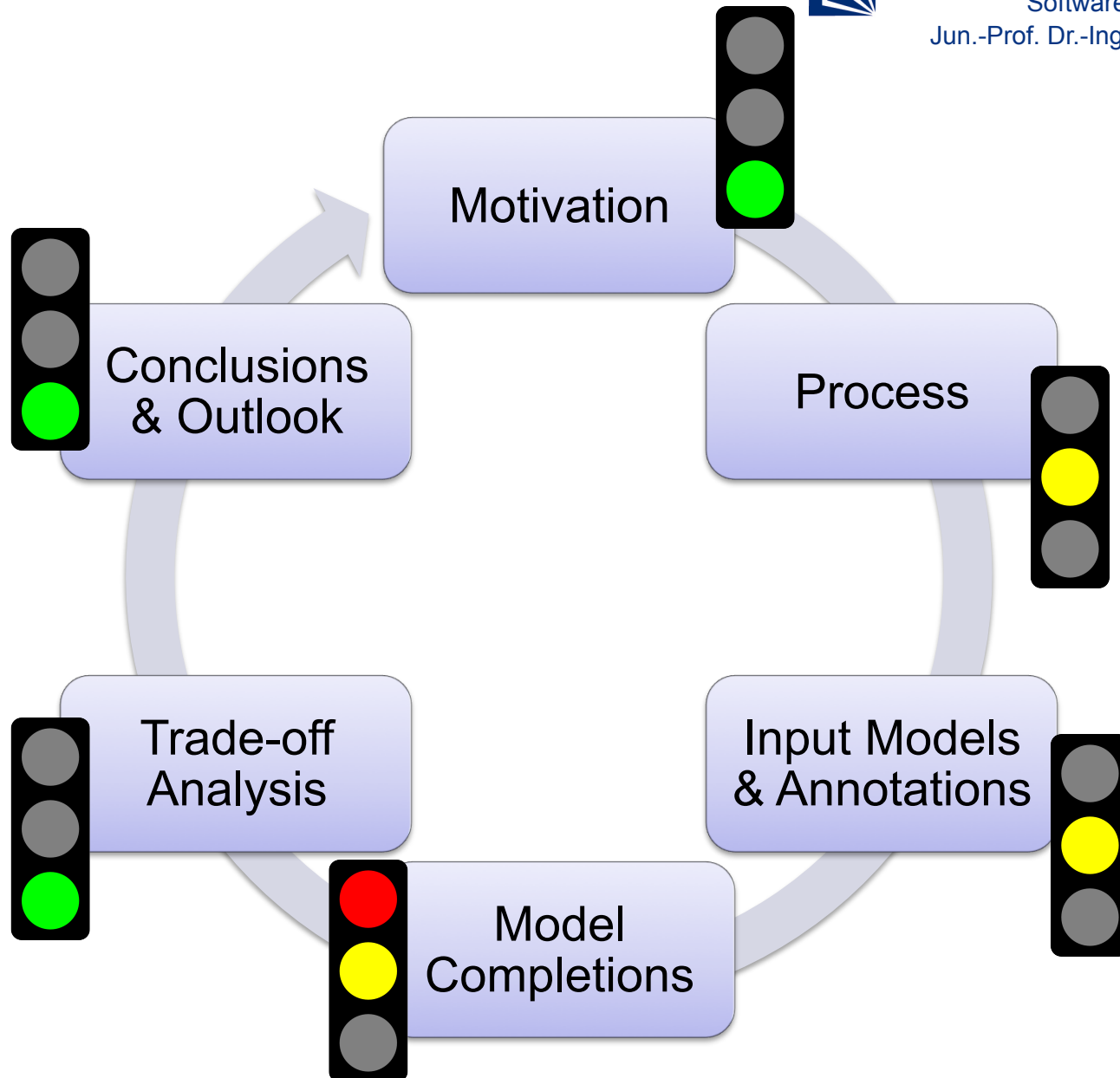


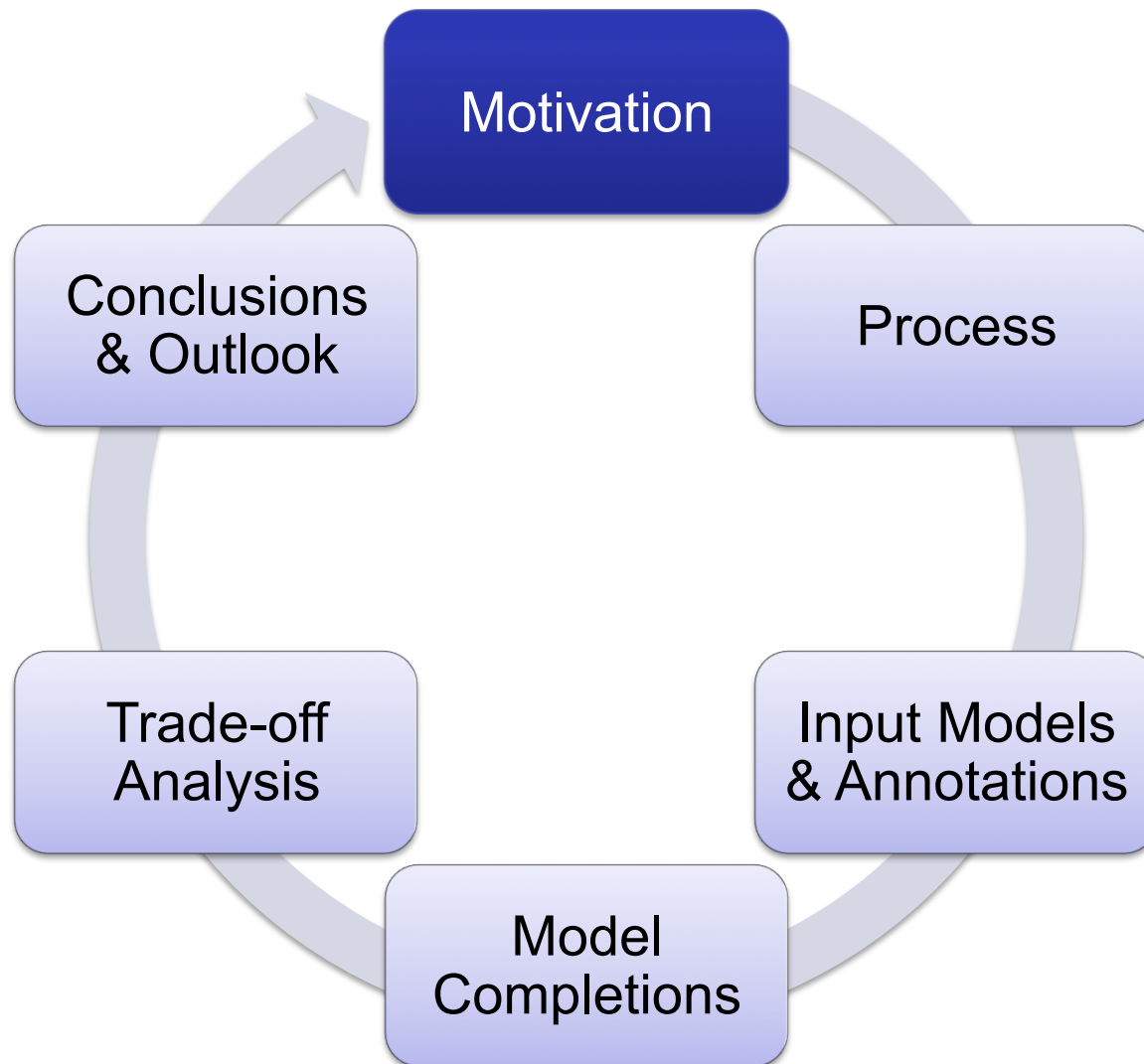
Assistant Prof. Dr.-Ing. Steffen Becker





- Studied Wirtschaftsinformatik in Darmstadt
 - Meta-Modelling Focus
 - Component Meta-Models and Marketplaces
- Research Assistant in Oldenburg
 - Palladio Component (Meta-)Model
 - Model-Driven Architecture-Based Quality Prediction
- Research Assistant in Karlsruhe
- Department Manager at FZI
- Disputation in Oldenburg to become Dr.-Ing. in a performance engineering context
- Since April 2010 Juniorprofessor at U Paderborn





Example: SAP Business By Design



leidet offenbar noch unter Kinderkrankheiten. Die Wirtschaftszeitung *Euro am Sonntag* berichtet in ihrer aktuellen Ausgabe von Performance-Problemen sowie einer drohenden Verschiebung des Starttermins und beruft sich dabei auf Insider. So laufe die Software derzeit noch deutlich langsamer als die Standardanwendung R/3 und verkrafte noch nicht einmal 10 gleichzeitige Nutzer. Von der Zielvorgabe, 1000 parallele Nutzer zu bedienen, sei das Produkt noch "Lichtjahre entfernt". Hauptproblem sei das Design des Systems, das Servern den Zugriff auf brachliegende Kapazitäten anderer Rechner nicht ermögliche. Dem Insider zufolge werde das zu einer Verzögerung führen, das Produkt sei frühestens in einem Jahr marktreif.

News unterwegs
Newsletter
English News
News anrufen

Telefontarife
Internettarife
Internetstörungen

Software/Download
IT-Magazin
heisetreff

Leserforum

Abos & Hef
Veranstaltungen
Kontakt
Mediadaten

wesentlichen Beitrag dazu leisten, den Anteil der Mittelständler an SAPs Umsatz bis 2010 von jetzt 30 auf 45 Prozent zu steigern. AIS soll bis zu einer Milliarde US-Dollar in die Kassen des Unternehmens spülen.

Doch der Hoffungsstrahl, in dessen Entwicklung während der nächsten Jahre dreistellig
leidet offenbar noch unter Kinderkrankheiten. Die Wirtschaftszeitung *Euro am Sonntag*
Ausgabe von Performance-Problemen sowie einer drohenden Verschiebung des Starttermins
Insider. So laufe die Software derzeit noch deutlich langsamer als die Standardanwendung R/3 und verkrafte noch nicht einmal 10 gleichzeitige Nutzer. Von der Zielvorgabe, 1000 parallele Nutzer zu bedienen, sei das Produkt noch "Lichtjahre entfernt". Hauptproblem sei das Design des Systems, das Servern den Zugriff auf brachliegende Kapazitäten anderer Rechner nicht ermögliche. Dem Insider zufolge werde das zu einer Verzögerung führen, das Produkt sei frühestens in einem Jahr marktreif.



SAP will von Verzögerungen und Problemen indes nichts wissen. "Alles im grünen Bereich", gab eine

Unternehmenssprecherin der Zeitung zu Protokoll. AIS werde wie geplant zum Jahreswechsel oder zum ersten Quartal 2008 starten. Dafür plant das Software-Haus unter anderem einen massiven Ausbau seiner Rechnerkapazitäten: In den nächsten Wochen wolle der Konzern Server im Wert von insgesamt 220 Millionen Euro bestellen, berichtet die *Euro am Sonntag*. Der Vertrag habe eine Laufzeit von fünf Jahren und umfasse auch Serviceleistungen, schreibt die Wirtschaftszeitung unter Berufung auf eine mit den Vorgängen vertraute Person.

• Cite: "Main issue is the system's design, which disallows server to access free capacities on other machines..."

System Type

- Web-based system
- Three-tier business information system

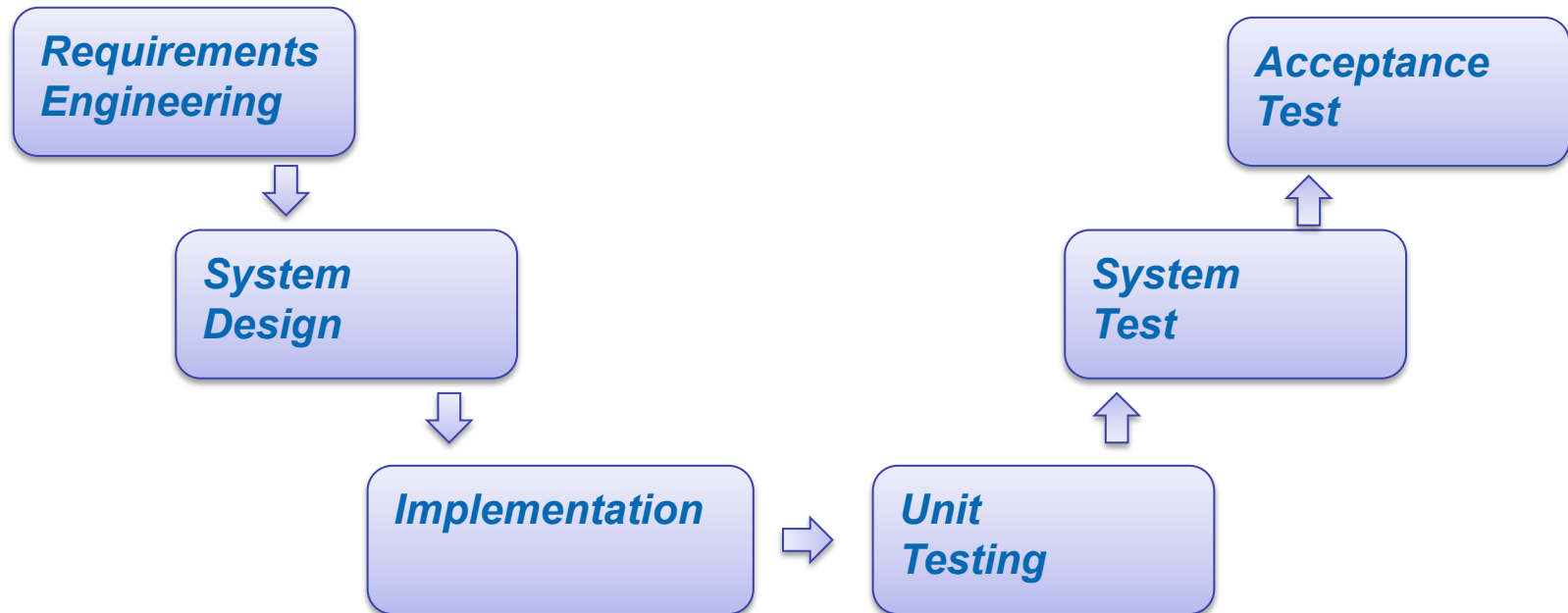
Characteristics

- Request-Response communication, often blocking
- Open world assumptions, users come whenever they like

Metrics of Interest

- Response time for requests, Utilization, Throughput
- PROFOD
- Costs

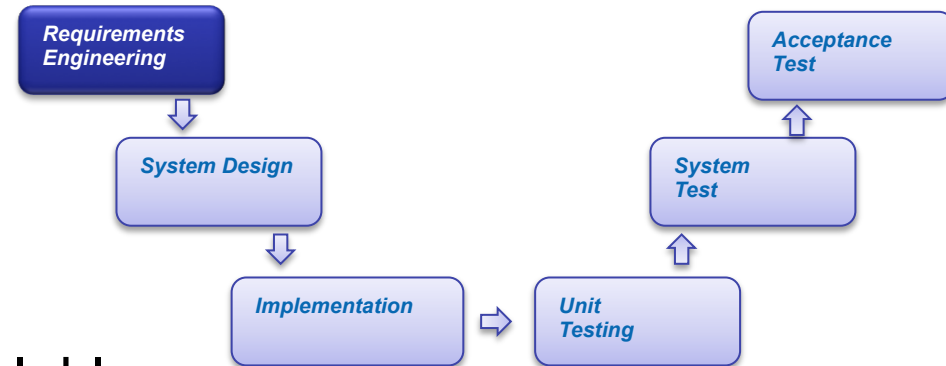
What might have happened?



What might have happened?



- Capture non-functional properties
- Typical issues
 - Imprecise
“The system has to be scalable, reliable, performant, ... and should not cost anything”
 - Ignore context
“The system should be unavailable only 3 min / year”
 - Overly strict
“The system should always react in 1sec”



Examples: HowTo do it better



Response time of service bookFlight is
1ms

Service fails 1h per year in the mean

Development of the system cost 10.000€

Average utilisation of server CPU is 80%

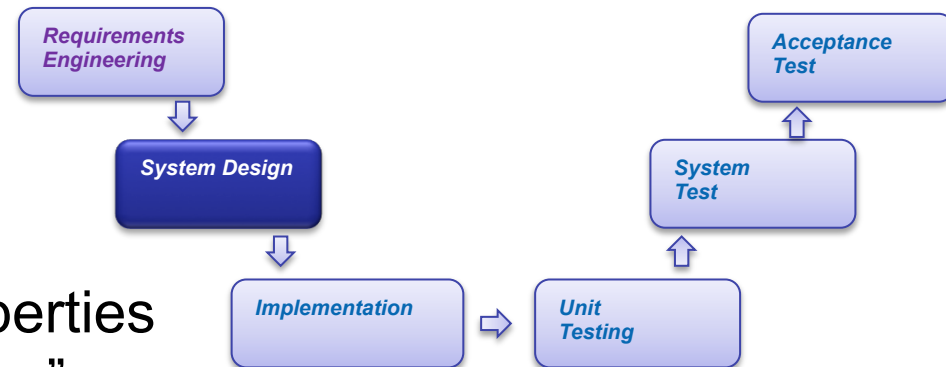
Mean repair time of the server is 1h

Throughput must at least be 5M
transactions per hour

What might have happened?



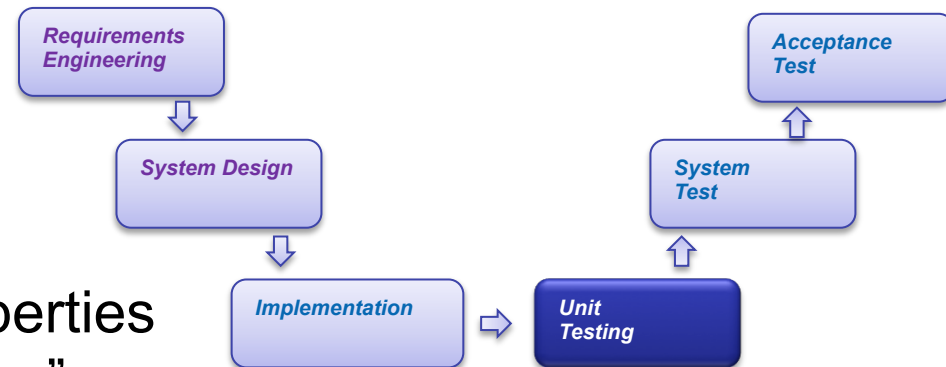
- Design architecture, classes, components, ...
- Typical issues
 - Ignore non-functional properties
“We can fix anything later...”
 - Reason on them
Informal (SAAM, ATAM), based on experience
 - Document non-functional rationales for decisions
Implicit in patterns or class designs
 - No context again
“A cache in front of a data access is always good...”



What might have happened?



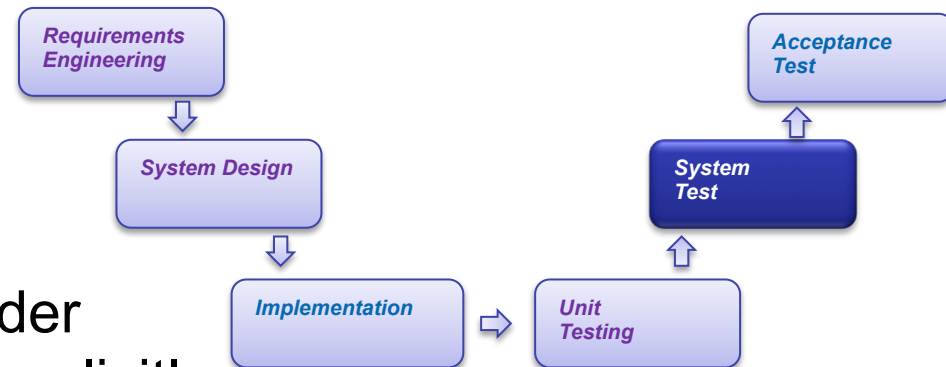
- Test single entities
- Typical issues
 - Ignore non-functional properties
“We can fix anything later...”
 - No context
“I do not know the context of my module, and here it performs fine!”
 - No explicit non-functional tests
Mainly test of module functionality



What might have happened?



- Test drive composed system
- Typical issues
 - For the first time we consider non-functional properties explicitly
 - Create context
“Target is one million users, can we test that in our lab?
What will it cost?”
- If issues arise
 - Re-Implement, Re-Design, Re-Negotiate
 - Project failures are likely
 - Most kinds of architecture rework is very costly



Compared to: What is Engineering?



“[...] creative application of scientific principles to design or develop structures, machines, apparatus, [...] to forecast their behavior under specific operating conditions; all as respects an intended function, economics of operation and safety to life and property.”

Systematic
design of
system

System model

Environment model

Requirements model

Forecast
of quality
aspects

Requirement fulfilment

Economic operation

Safety properties



Craftsmanship

- **Customer and developer often identical**
- **Talent and experience guide development**



Industrial production

- **Work division**
- **Specialised education**
- **Tools developed by third-parties**



Engineering

Optimized Quality of products and processes

requires

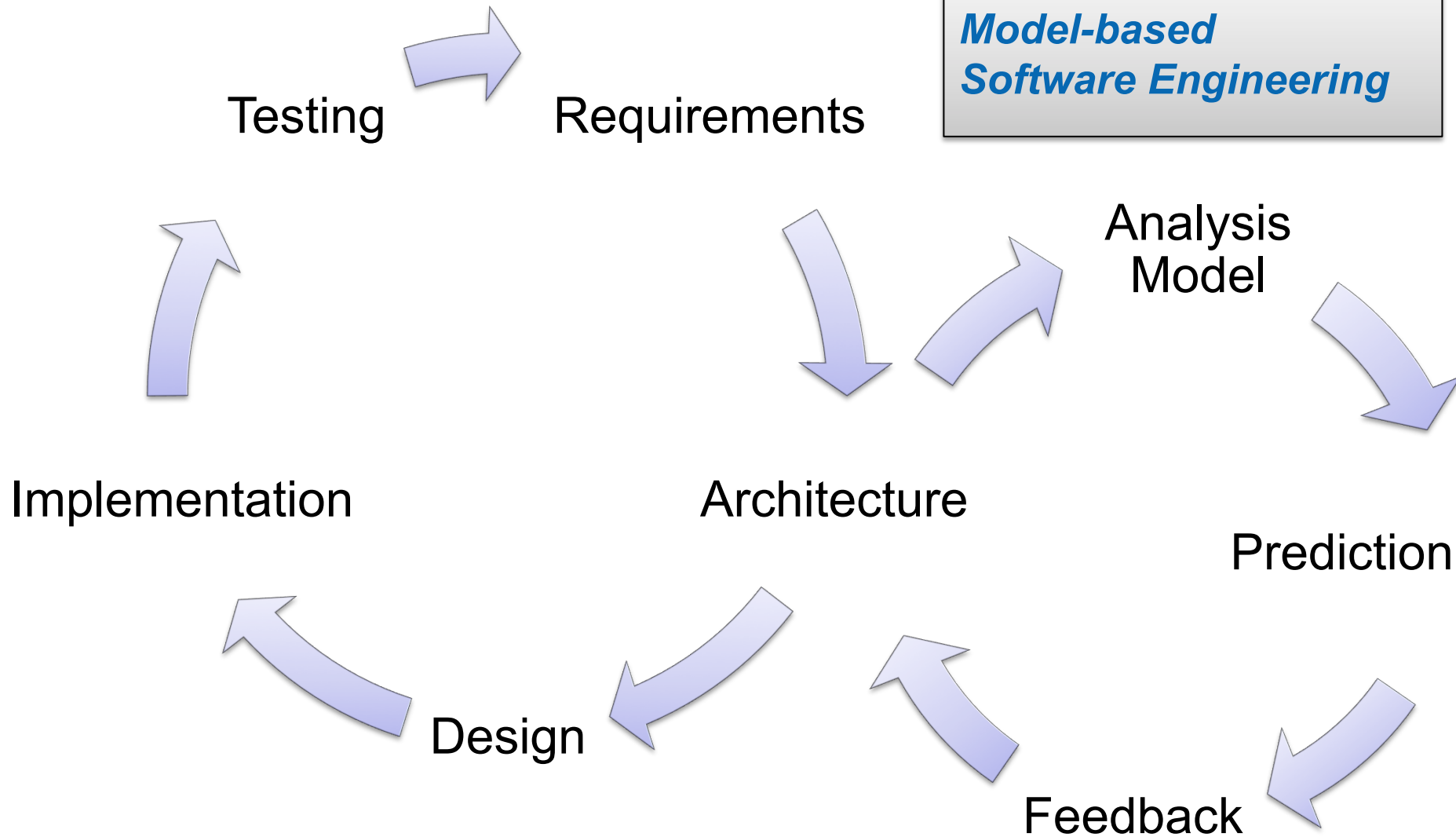
- **Scientific foundations / theory**
- **Guidelines to apply methods to real world problems**

based on [Shaw&Garlan95]

Development Cycles



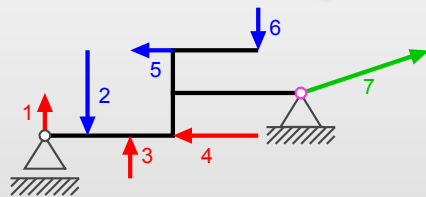
Model-based Software Engineering



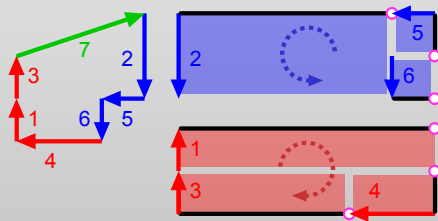
Model

Theory

Analysis Results



$$\sum_{(i)} \vec{F}_{(i)} = \vec{0} \quad \sum_{(i)} \vec{M}_{(i)} = \vec{0}$$



3.7 Spannungsnachweis

$$\begin{aligned} I_p &= 0,25 \\ \mu &= 0,80 \\ \eta &= 2,0 \\ Q_{zul} &= 0,7178 \text{ MN} \cdot 0,8 \cdot 0,5 \\ &= 0,287 \text{ MN} \\ &= 287 \text{ kN} \\ N &= 79,7 + 1,30^2 \cdot 1,30 \cdot 25 \\ &= 134,6 \text{ kN} \end{aligned}$$

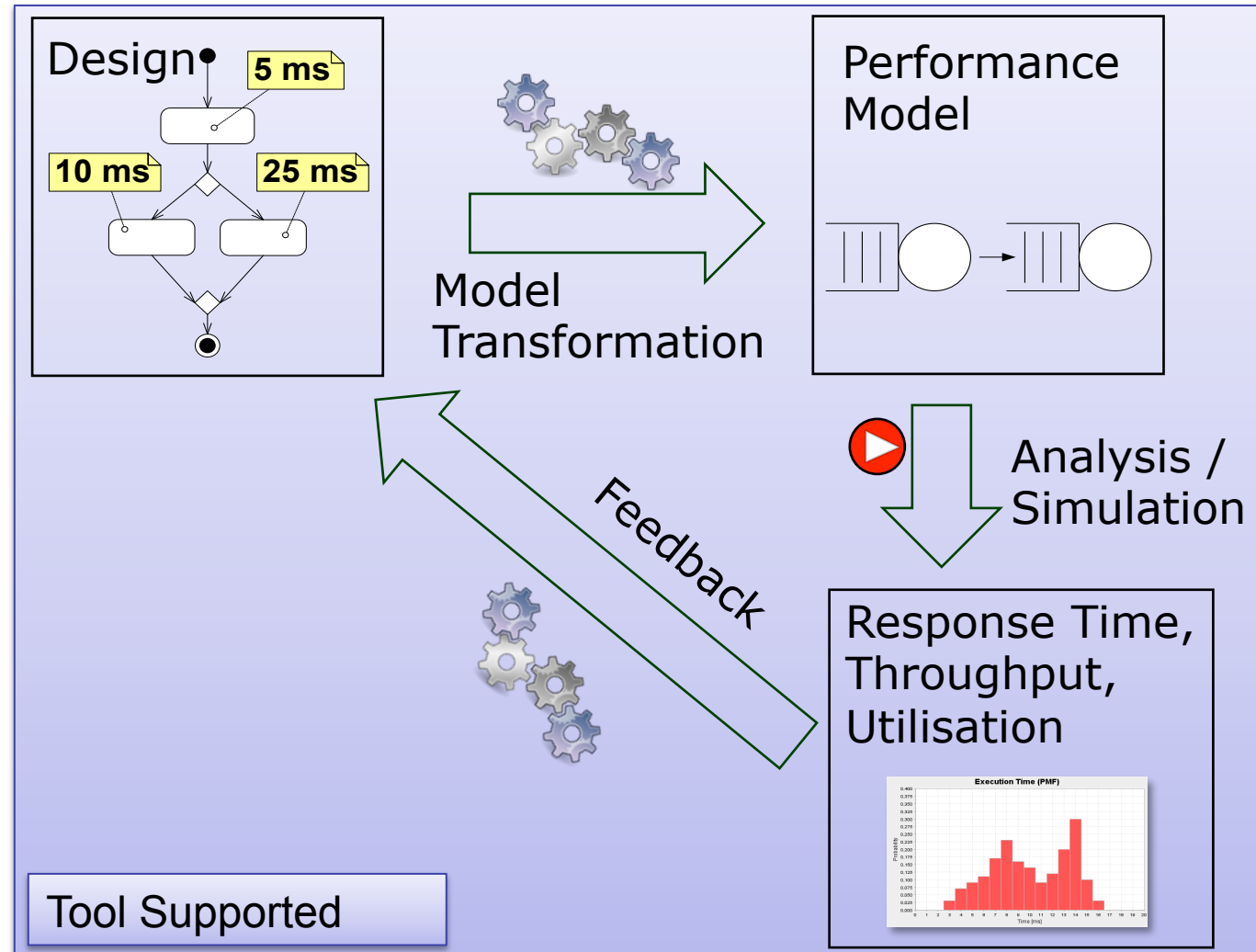
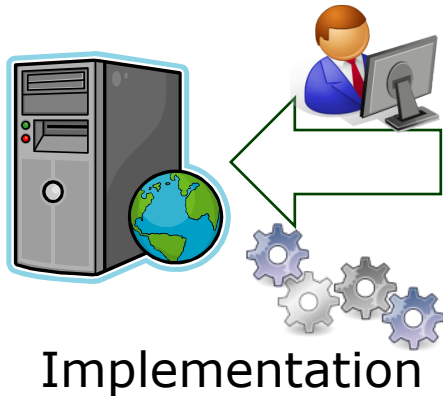
$$V_{\max} = N = 134,6 \text{ kN} < Q_{zul} = 287 \text{ kN}$$

Die vertikale Tragfähigkeit ist gewährleistet

An Instance is Model-Driven Performance Engineering

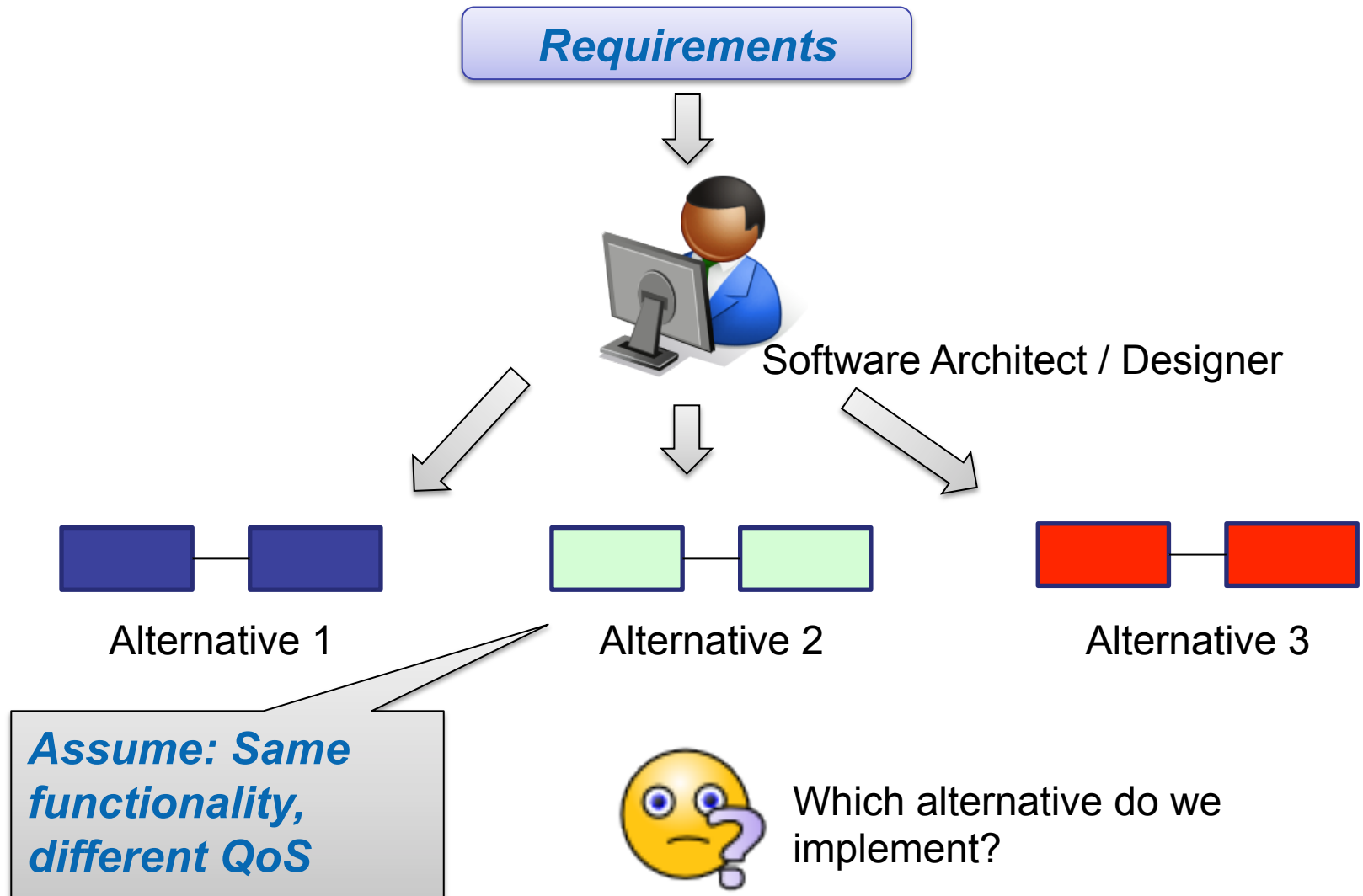


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[Koziolek et al., 2006]

Different alternative designs...

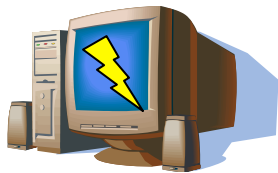


[SWA09]

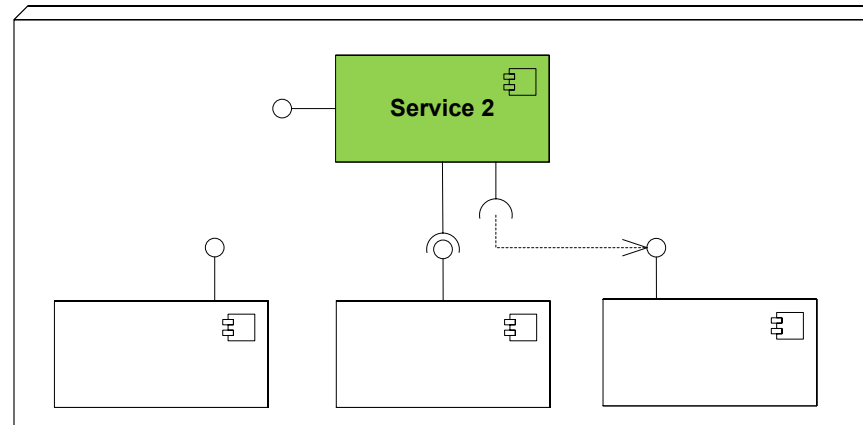
Example...



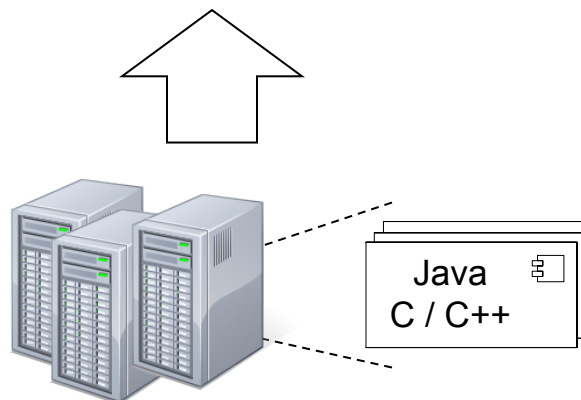
20.000 €
25.000 €



0,01%
0,10%



10 ms
5 ms

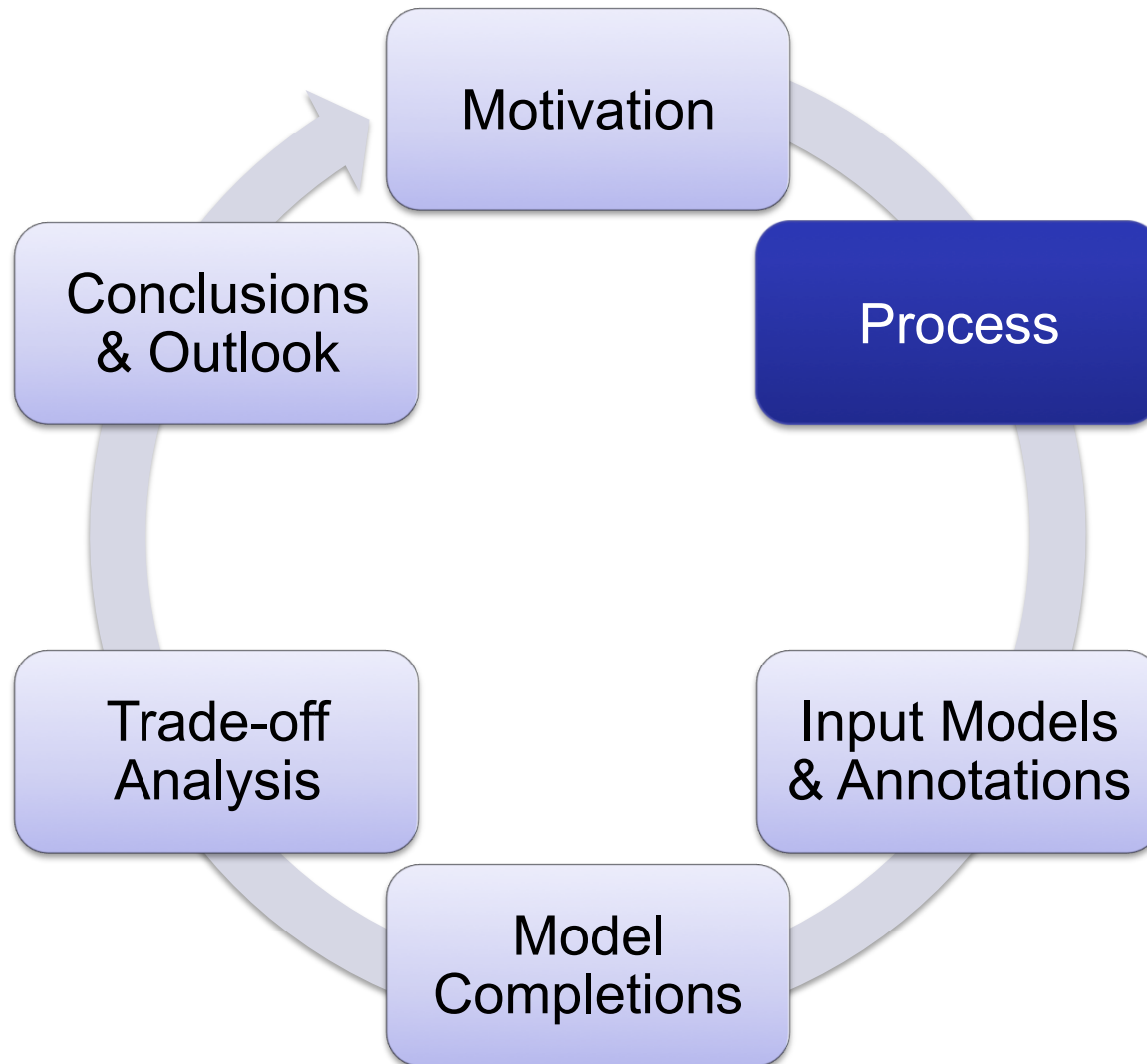


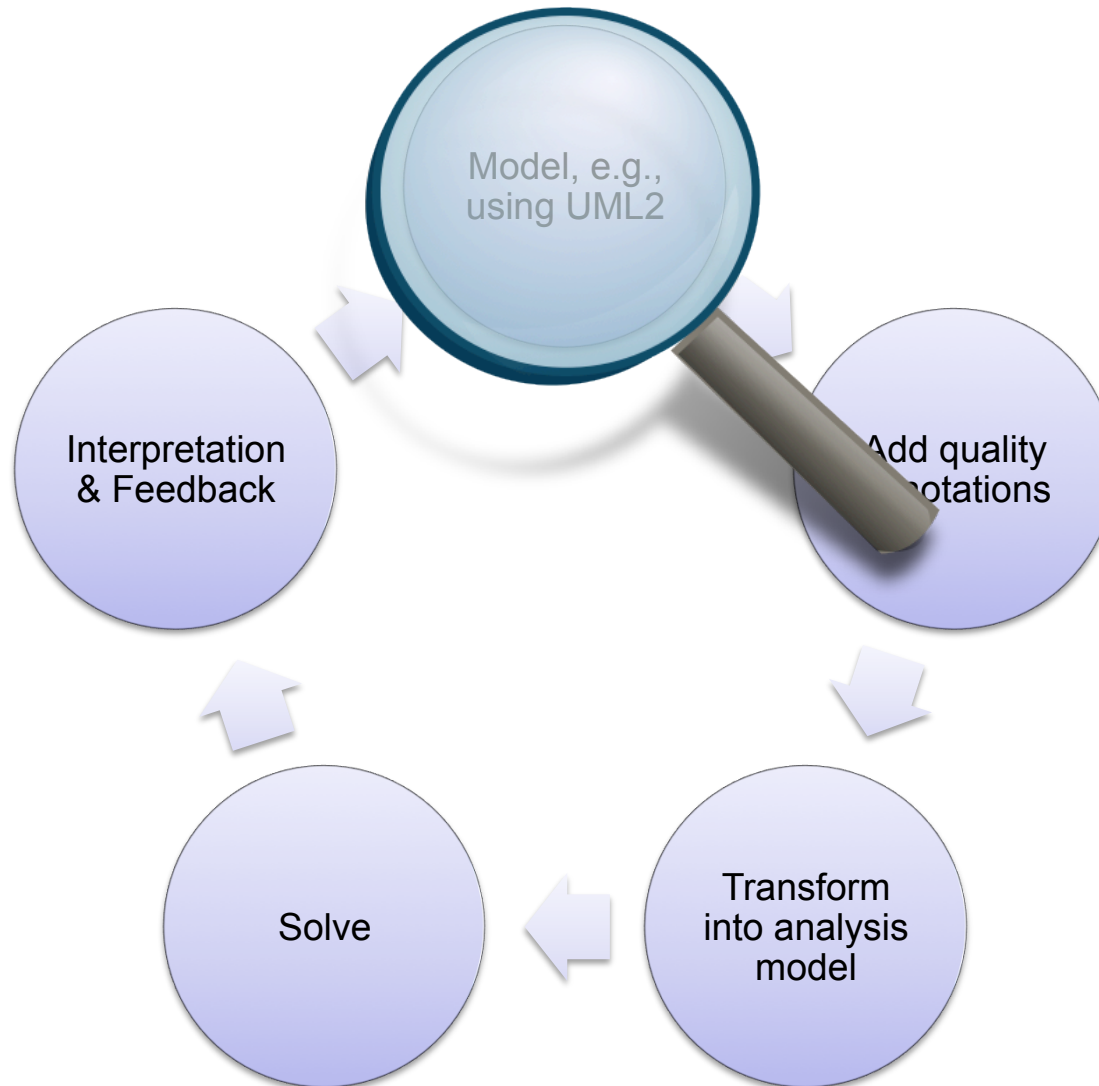
Legacy Application

Examples

- Encryption component: Length of the key
 - Security vs. performance
- Message formats: priority of message processing
 - Expressiveness / transmission security vs. performance (of the whole system)
- After such design alternatives are identified, they can be evaluated:
 - Detailed design
 - Application of analysis methods
 - Prototyping

- On site assignment:
 - Collect some alternative design or architectural patterns
 - List their variants?
 - What is their expected impact wrt. quality properties?
- Examples
 - MVC vs. its variants?
 - MVC vs PAC?
 - Cache
 - Pooling
 - ...





Software Architects create a model of the SuS

- SW Models primarily focus on software & hardware – not QoS issues
- Software architects create and maintain models
 - Can they do this?
 - A question for empirical Software Engineering

Many languages exist, e.g.,

- UML2 + MARTE
- PalladioCM
- PUMA
- ProgressCM

Models need QoS annotations, e.g.,

- Resource demands
- Failure rates

Requirements?

- Easy to specify
- Tool support to prevent mistakes
- Easy access from model transformations

State of the Art?

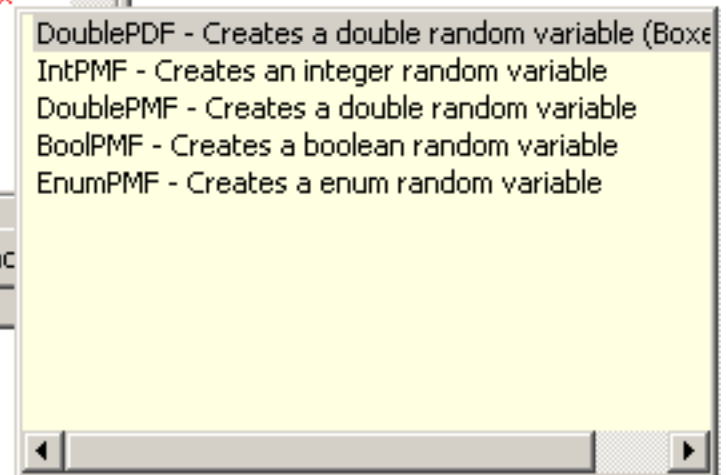
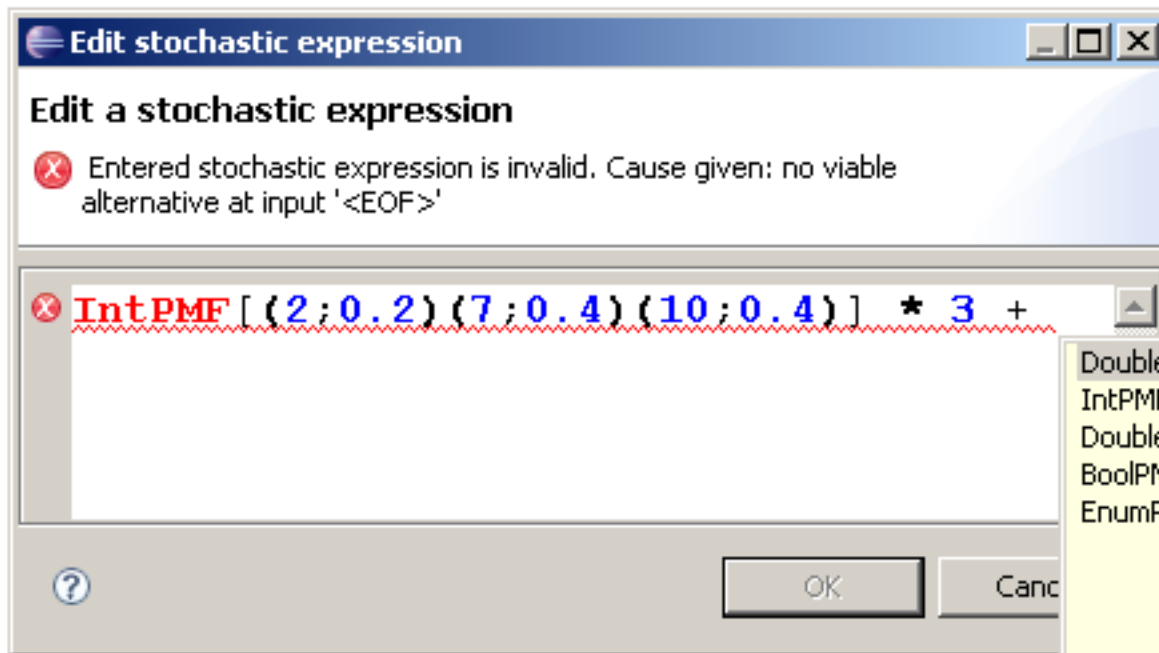
- MARTE
 - Extensive & complex standard
 - Parsers not well standardized
- Specialised languages
 - Commonly have precise syntax & semantics
 - Some accessible by model-transformations

Screenshot

PCM StoEx language



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Generates analysis model

- (L)QN
- Markov Chain

Requirements?

- Should be fully automated and easily accessible by software architects
 - Again, a question for empirical software engineering
 - In practice experiments not done often enough!
- Full automation implies all information is in the model

Development?

- Needs expert both for software models and analysis theory
- Additionally, expertise in MDD technologies required

Automated step to generate analysis results

- Throughput
- PROFOD

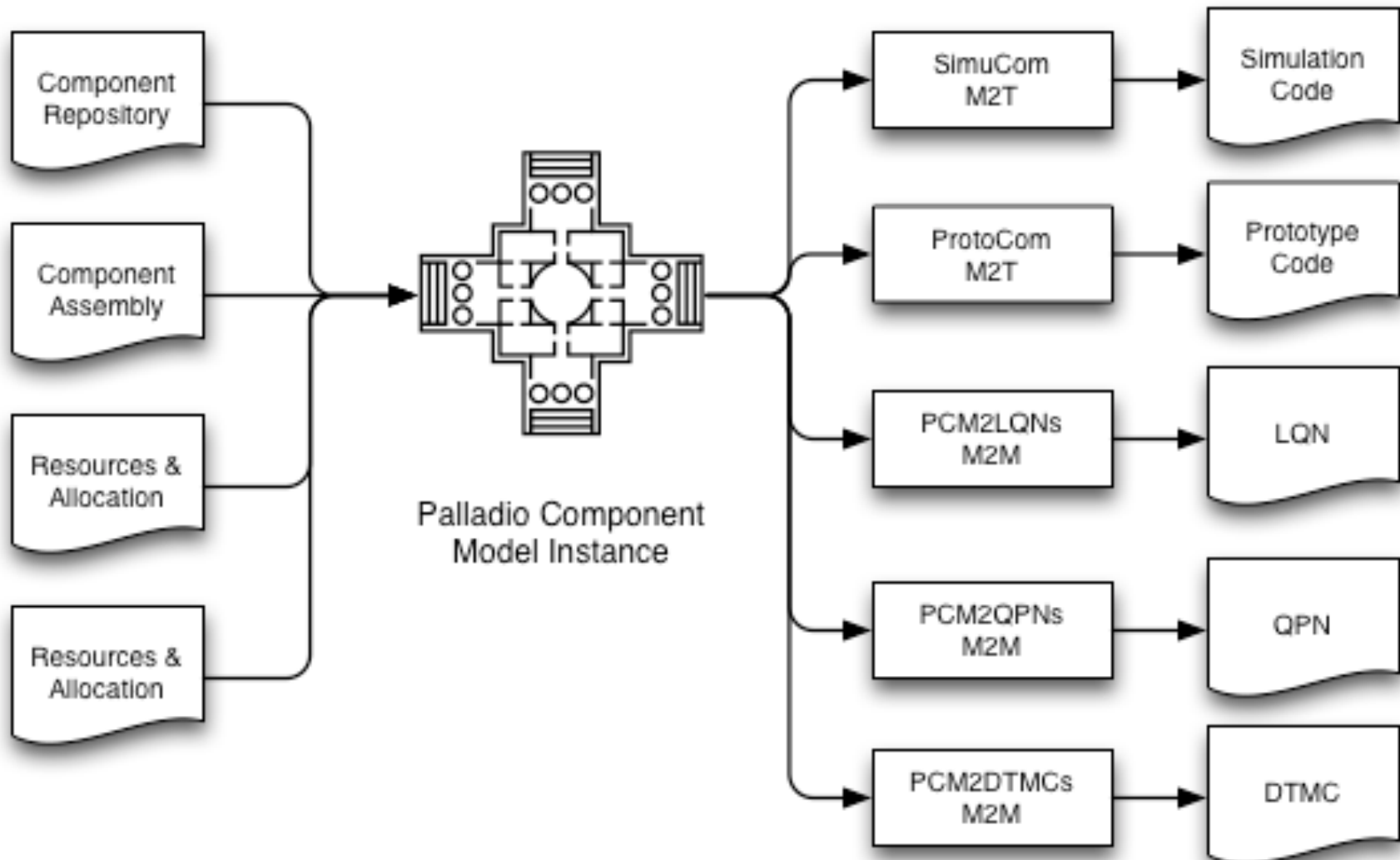
Usually done by running external solvers like

- PRISM
- Java Modelling Tools (QN tool)
- SimQPN (Petri Net based)
- CSP Checker (Process algebra)
- ...

Issues?

- Typical issue: Models and tools do not scale for arbitrary inputs
- → Transformations often need to abstract!

PCM: Example transformations & solvers...





Why so many solvers...?

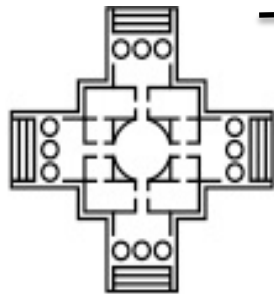
Disclaimer: This is joint work



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- Presentation of the results of a series of experiments
- Performed over 1 year duration
- Submitted to Transactions of Software Engineering (TSE), currently under review
- Results of joint work
 - Karlsruhe Institute of Technology
 - University of Zurich
 - University of Paderborn
 - Gameforge

R2: What is the runtime of each solver?



Palladio Component
Model Instance

Components/Services
Hardware Ressources
System Usage

Simulation



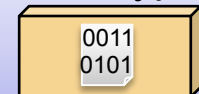
Layered QN



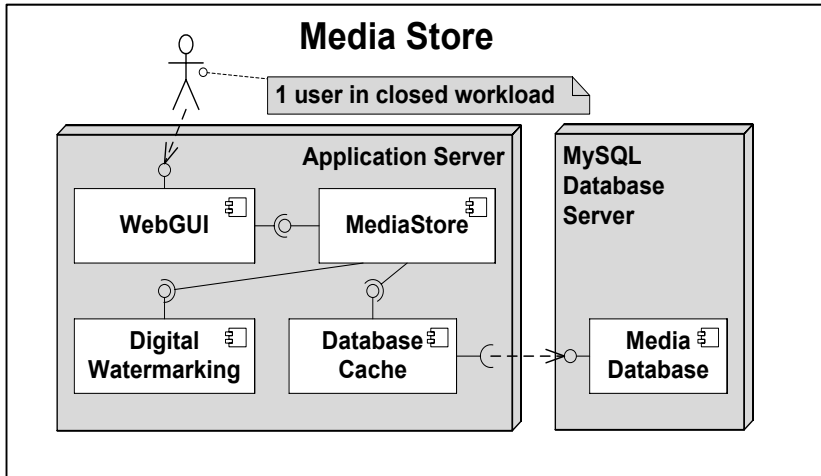
Queued PetriNets



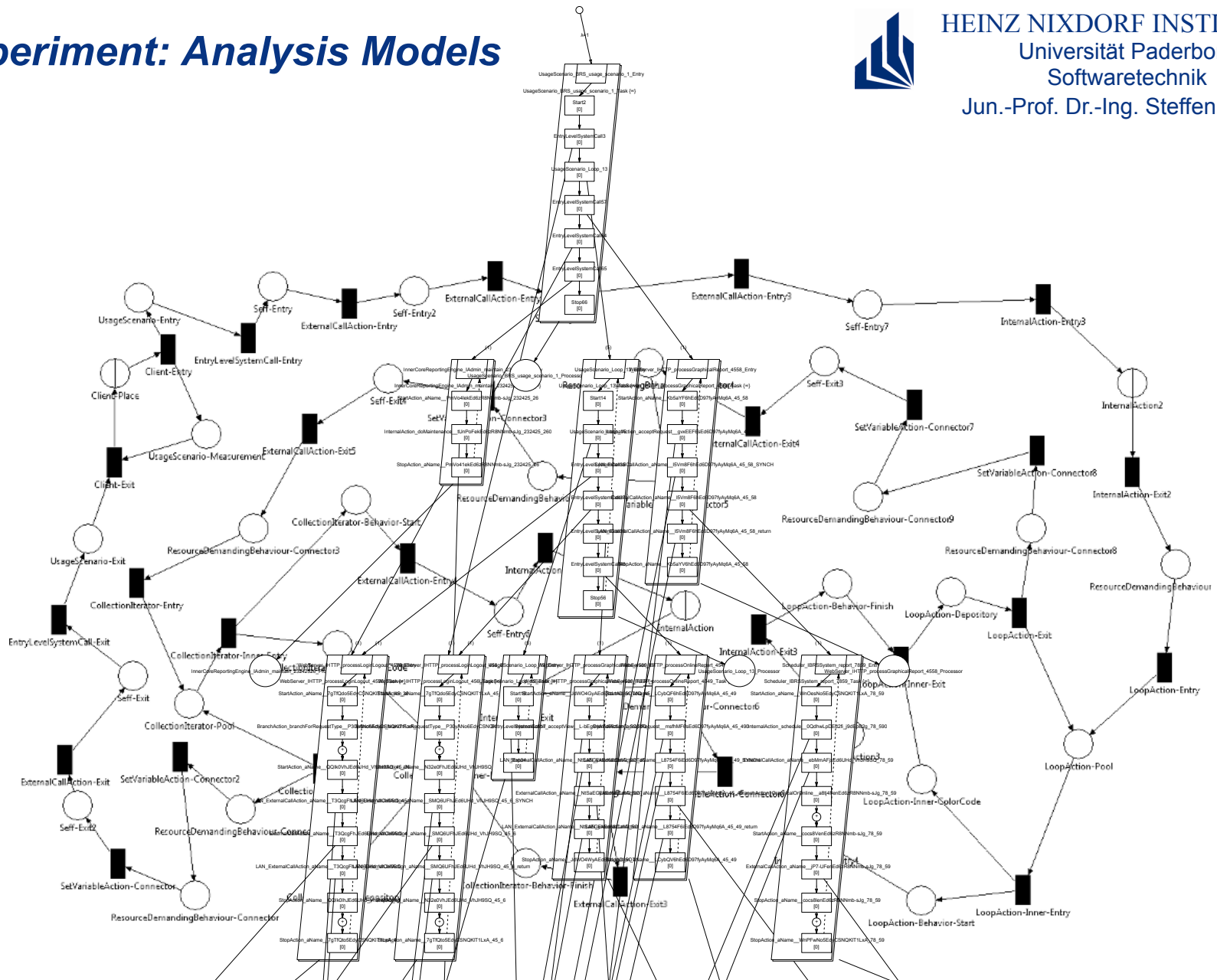
Prototype



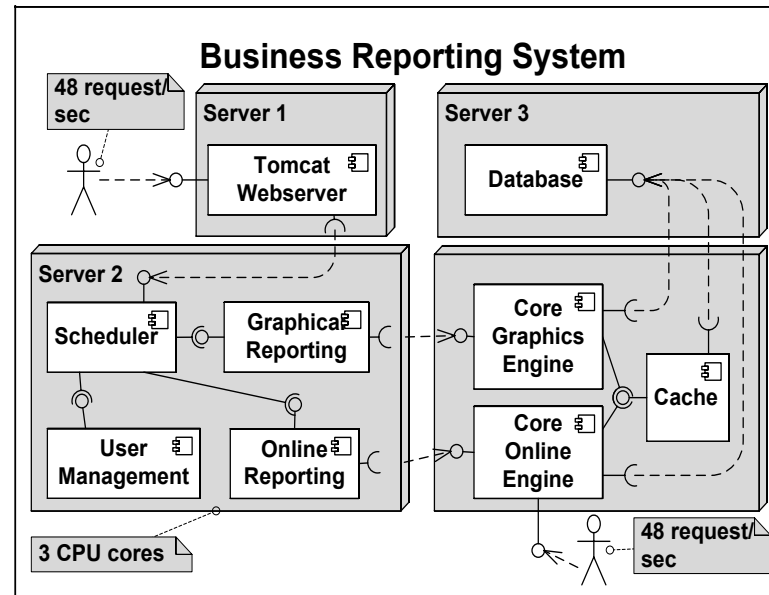
Experiment: Test Models



Experiment: Analysis Models

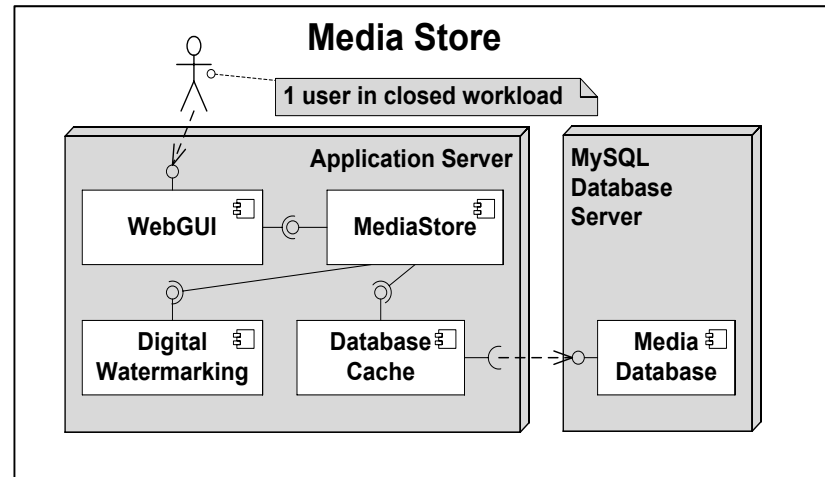


Experiment: Results excerpt



Solver	Mean RT pred.	Diff in %	Solver RT
Simulation	5,22 s	N/A	591,5 s
SimQPN	5,92 s	13,3%	74,5 s
LQN	7,39 s	41,5%	4,0 s
Prototype	6,53 s	25,0%	972,9 s

Experiment: Results excerpt



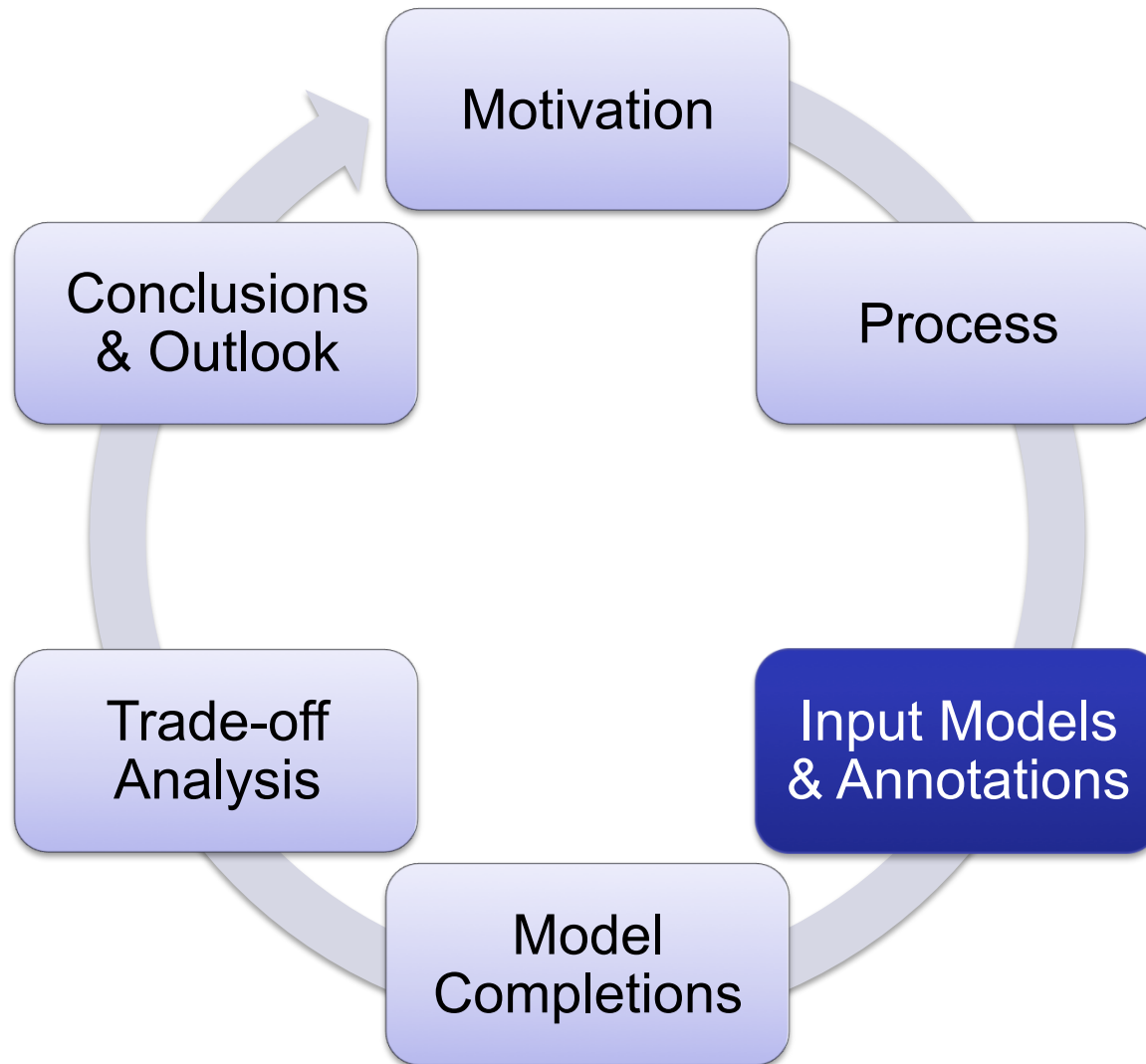
Solver	Mean RT pred.	Diff in %	Solver RT
Simulation	1,33 s	N/A	31,4 s
SimQPN	1,33 s	0%	6,4 s
LQN	1,28 s	-3,3%	1,3 s
Prototype	1,02 s	-22,8%	1034,7 s

Performing role: Skilled analysts, ...

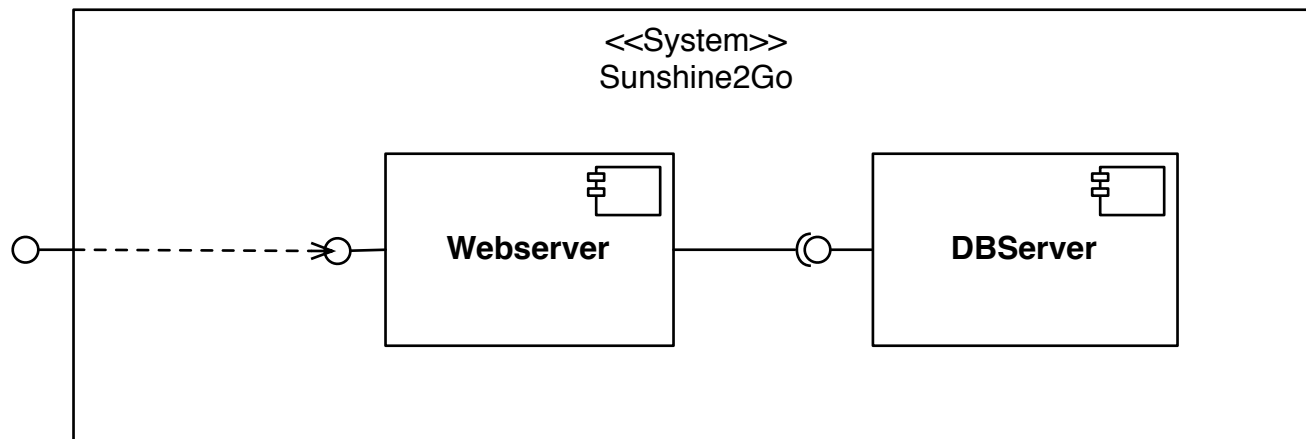
- Take analysis model results
- Translate them into statements about the SuS
- Suggest improved designs

Example:

- Analysis model: Service failure probability $> 10\%$
- Software model: Analyse single failure probabilities
- Countermeasures
 - Introduce redundancy
 - Replication
 - Voting algorithms
 - ...



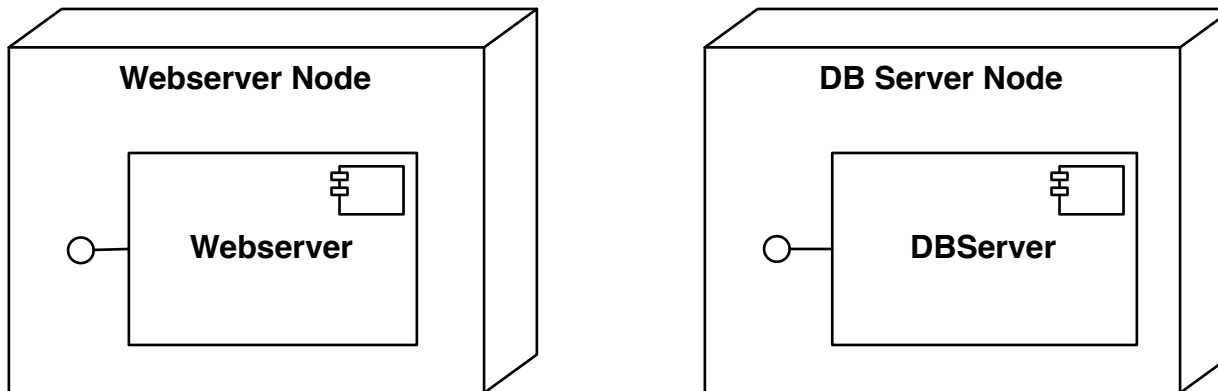
- Dynamic web server example
 - Dynamic web service for querying the weather forecast of the next 7 days “Sunshine2Go”
 - Reports weather conditions of next 7 days for given location in the world



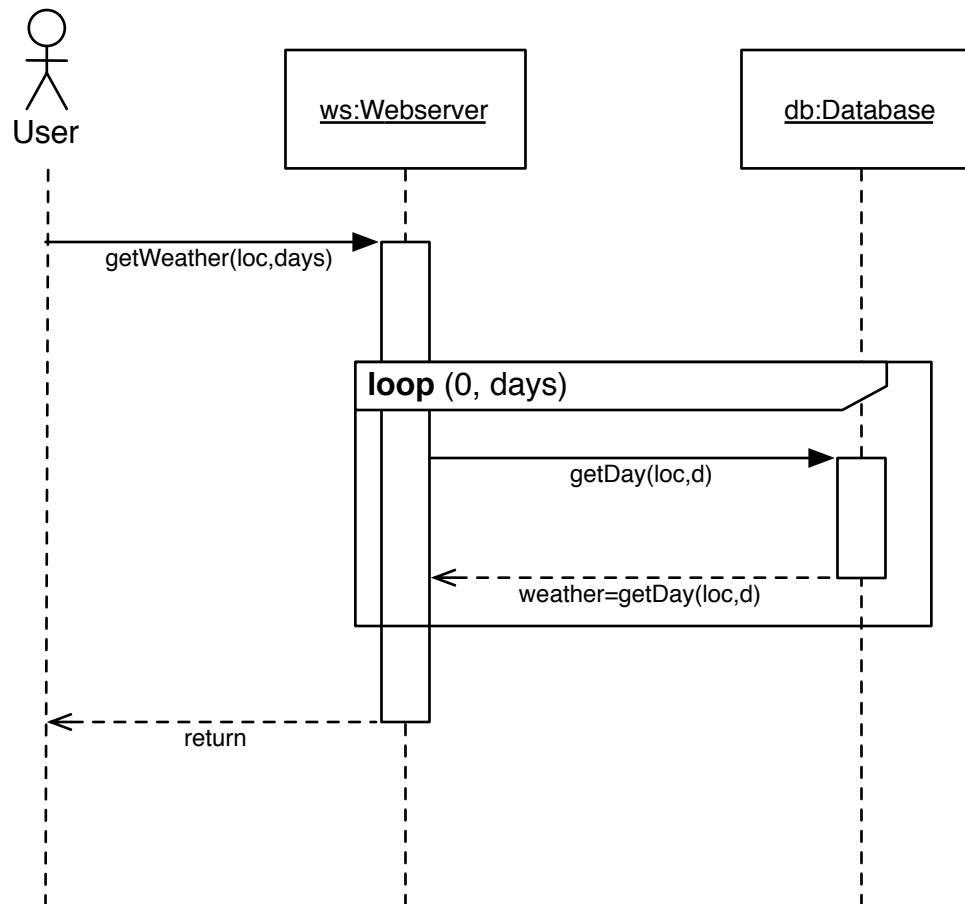
Allocation of “Sunshine2Go”



- Deployment is on local servers per component
- Web server runs the web server component, e.g., Apache
- Database server runs the DB, e.g., MySQL



- Users query for the weather of a certain location and the amount of days in the future



- Initial use case
 - At the main business hours, users arrive with an mean interarrival time of 3 sec and exponential distribution (Poisson arrival process)
 - The mean response time of each call should not exceed 1sec
 - The utilisation of all resources should be below 80%
- Additional use cases are interesting, but skipped here for time reasons



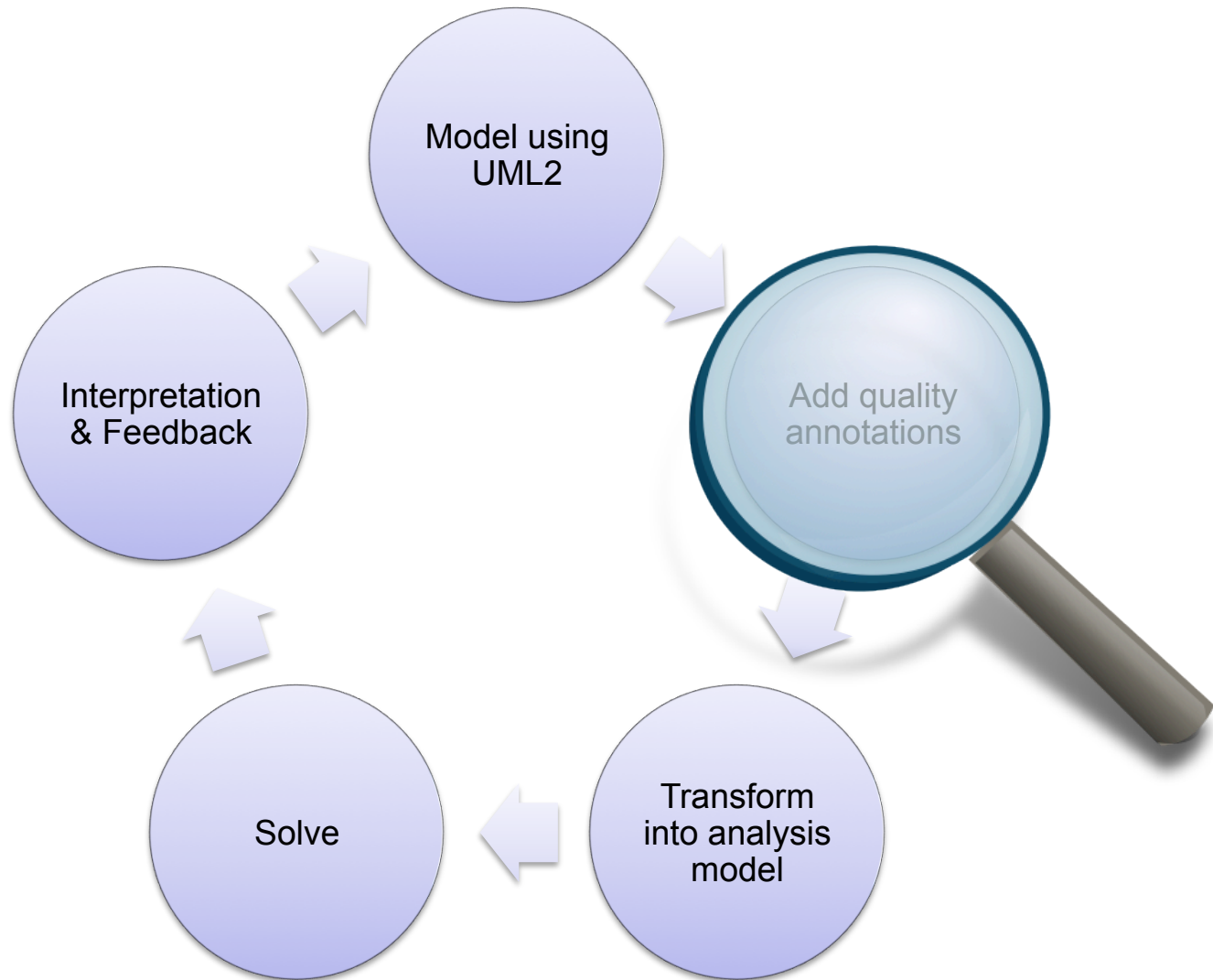
- Service time at webserver CPU is exponentially distributed with mean of 1WU
- At the database for each request the CPU has to perform 2WU and the HDD has to execute 1Read
- 1WU of Webserver CPU = 0.01 sec
- 1WU of DB Server CPU = 0.01 sec
- 1WU of DB HDD = 0.03 sec
- All CPU act approx. with processor sharing
- All HDDs approx. with FCFS scheduling
- Measurements indicate each step can fail with a probability of failure of 0.001





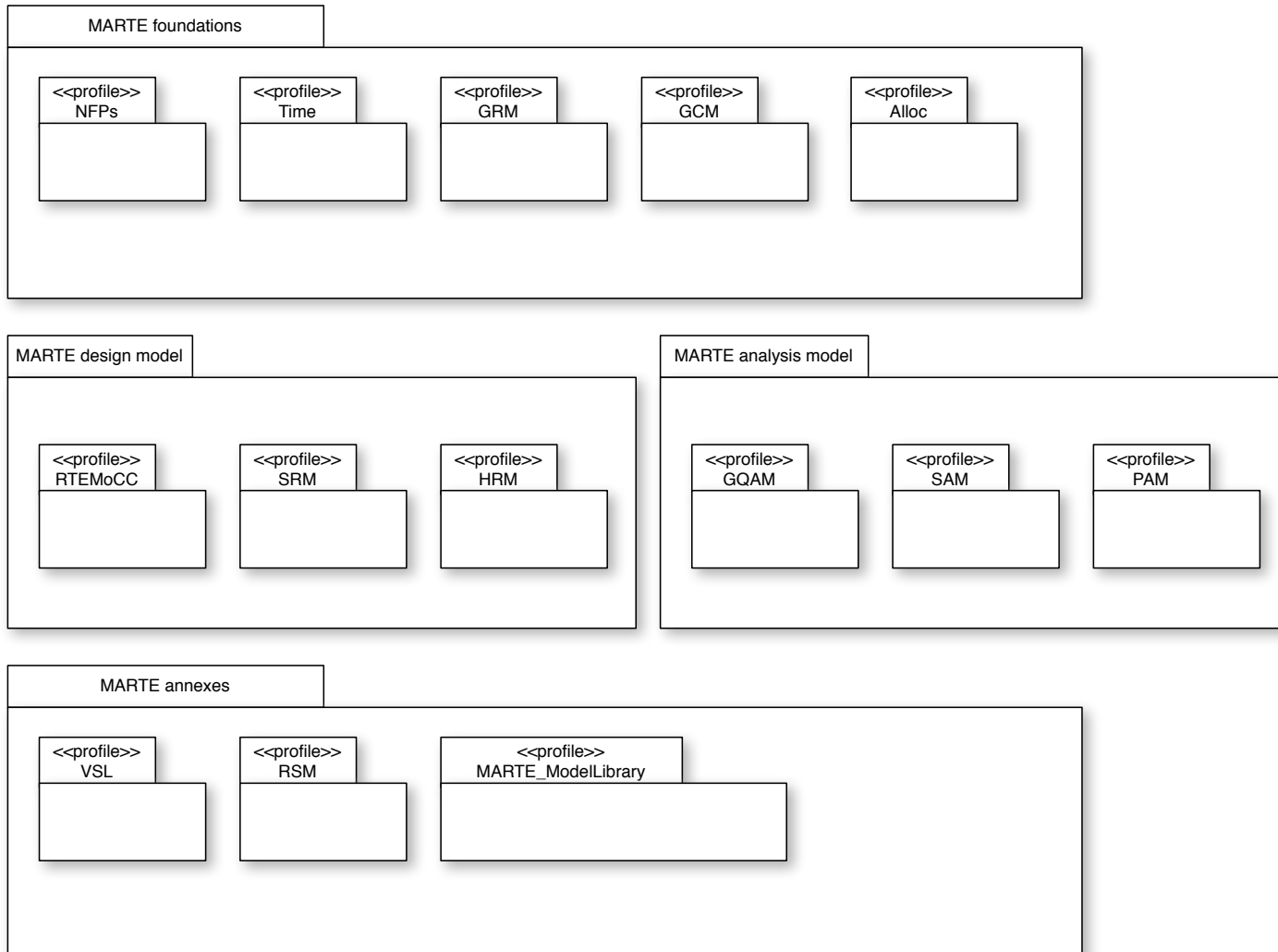
Enhancing the model using UML MARTE

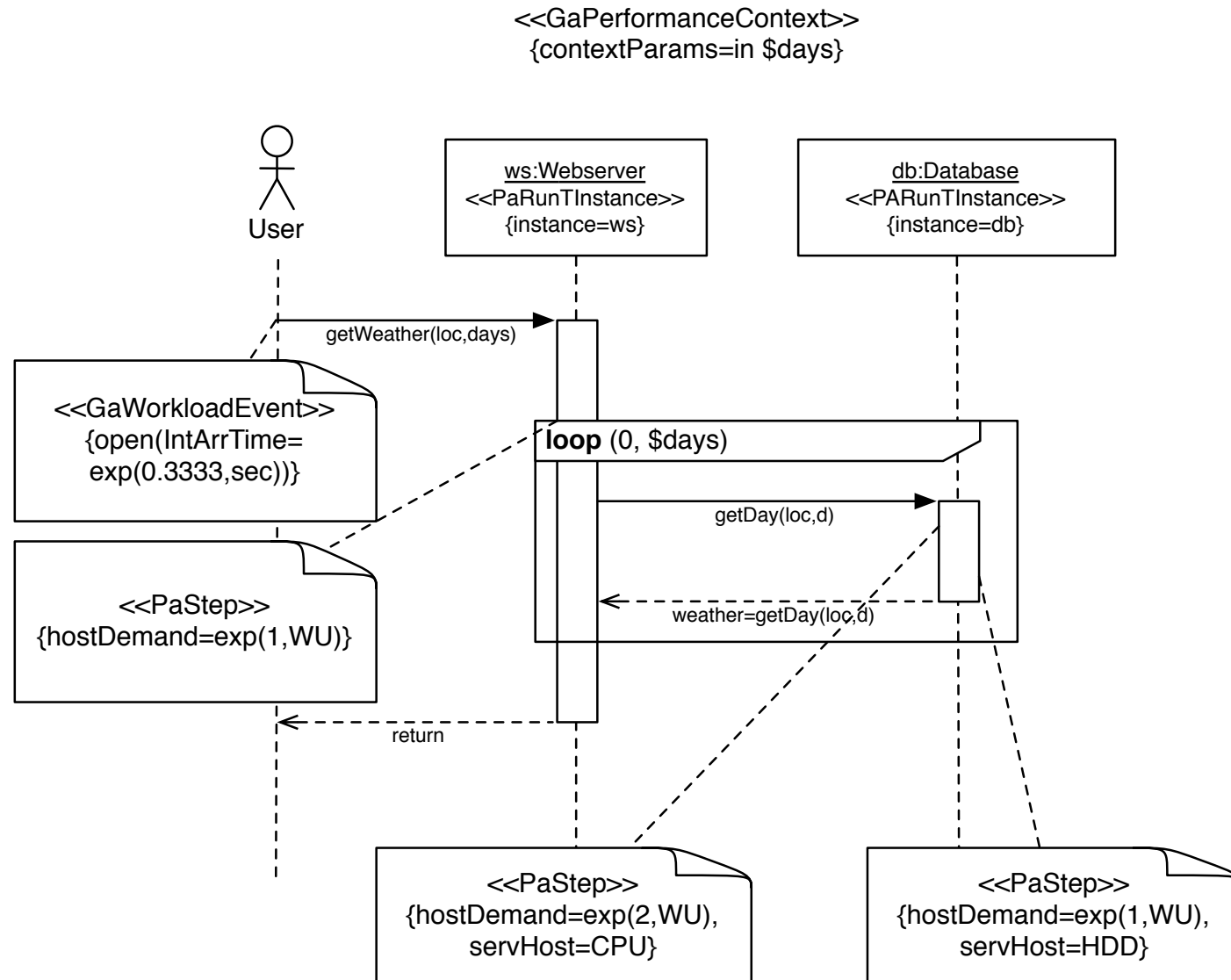
Using UML MARTE



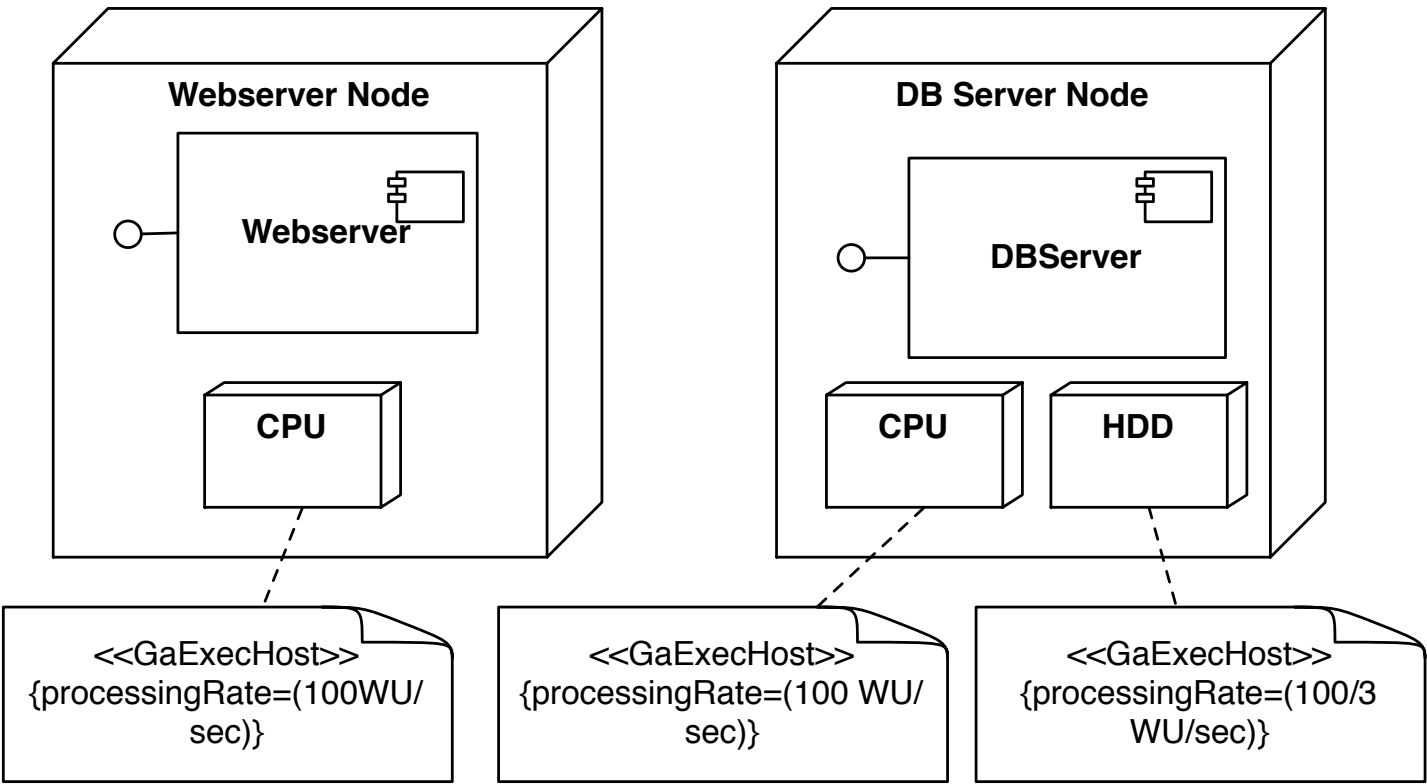
- UML Profile for MARTE
Modelling and Analysis of RT Embedded Systems
- Current Version: 1.0
- Released in 2009
- Maintained by OMG
- Successor of UML SPT which it is supposed to replace
- Uses UML QoS & FT to define quality characteristics
- Slight overlap with SysML, supposed to be aligned
- Extensive Standard, >700 pages
- Defines several profile packages





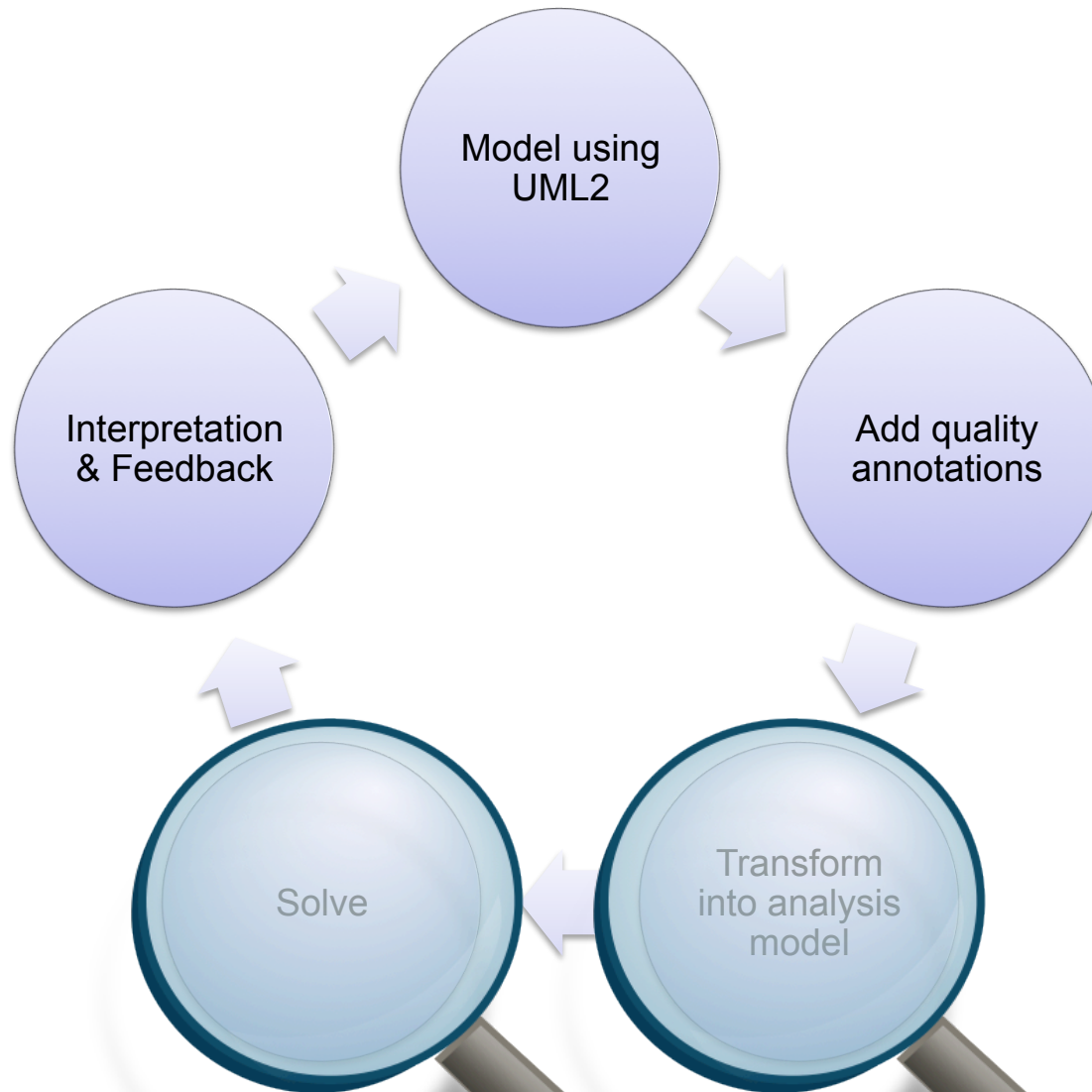


<<GaPerformanceContext>>

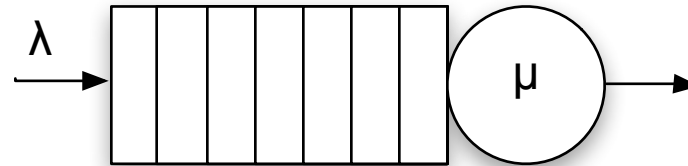




Analysis Model



- Mature analysis model for computer system performance
- Idea: Represent **active resources** as **waiting queues**
- Graphical notation:

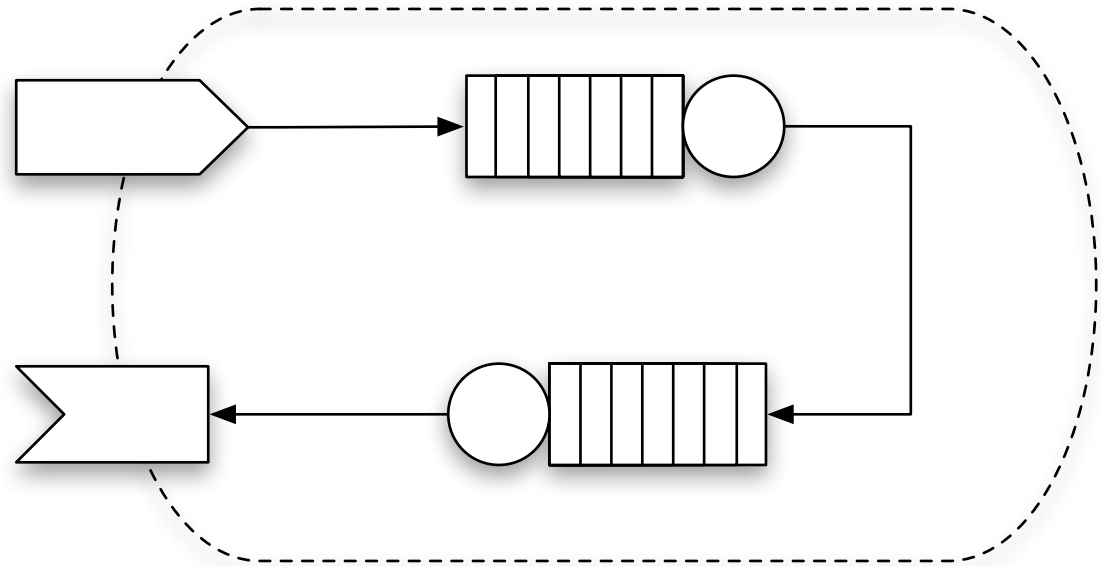


E.g. queues for

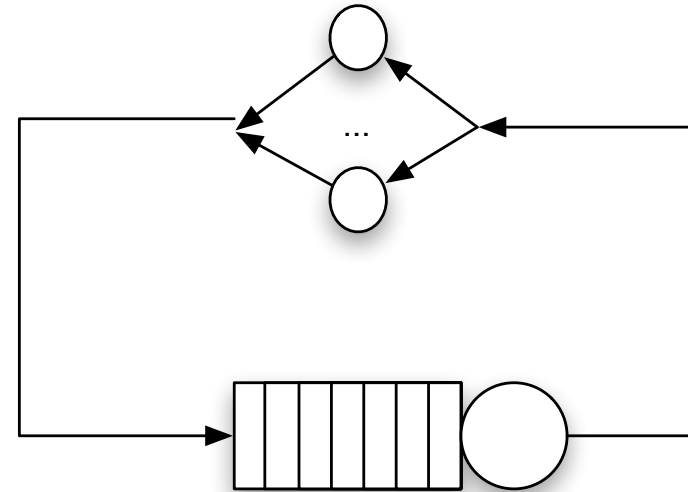
- CPUs
- Disks
- Network
- Reflects waiting times due to **contention**
- Underlying formalism is **Continuous Time Markov Chains (CTMCs)**

- Queuing network
 - Directed graph
 - Nodes are service centre
 - Edges represent potential paths of jobs
 - Multiple job classes
 - Each having homogeneous service demands
 - Homogeneous routing probabilities
 - I.e., jobs in a class cannot be distinguished
- Widely used
 - Offer decent performance prediction accuracy
 - Good modelling paradigm and usability

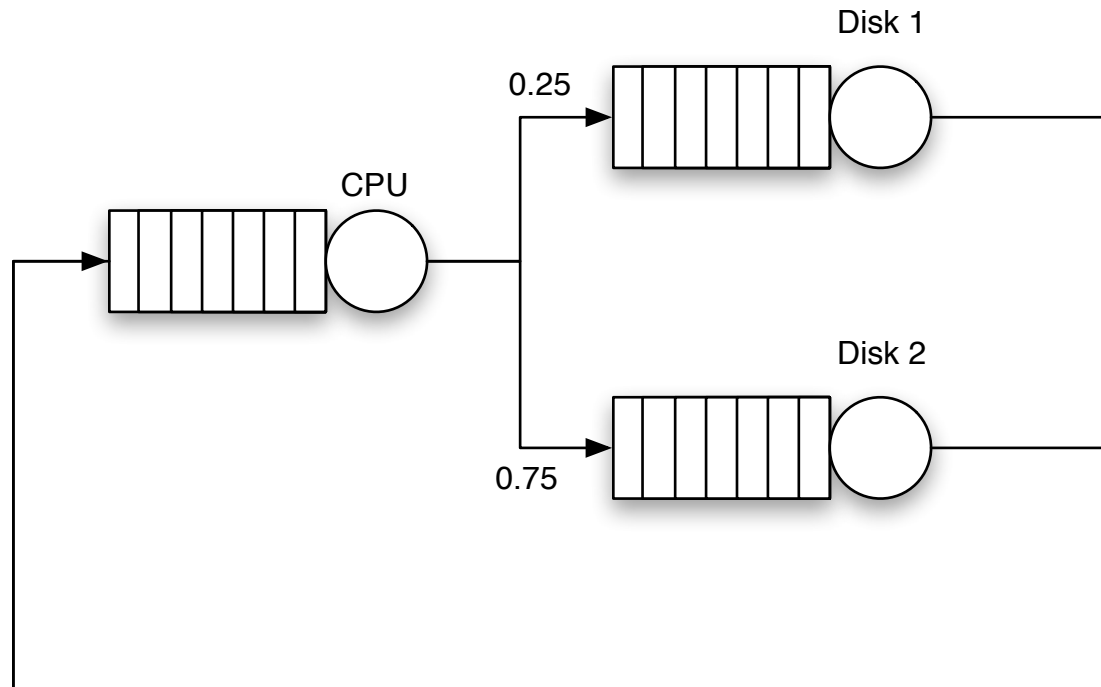
- Jobs enter net at source nodes
- Jobs leave net at sink nodes
- I.e., number of jobs not defined upfront
- Arrival process characterised by inter-arrival time
- Each queue is characterised in Kendall notation



- Network of a fixed number of jobs
- Contains a set of terminals
- Jobs circulate in network
- Jobs delay in terminals for a given think-time interval
- Sometimes also modelled by IN and OUT ports which are connected in a loop



- Jobs take probabilistic routes
- Route specified via transitions probabilities
- Given per class of jobs for multiclass networks





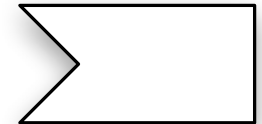
QN for our example...

Highlighting the core ideas of the transformation step

Performance: Derive QN



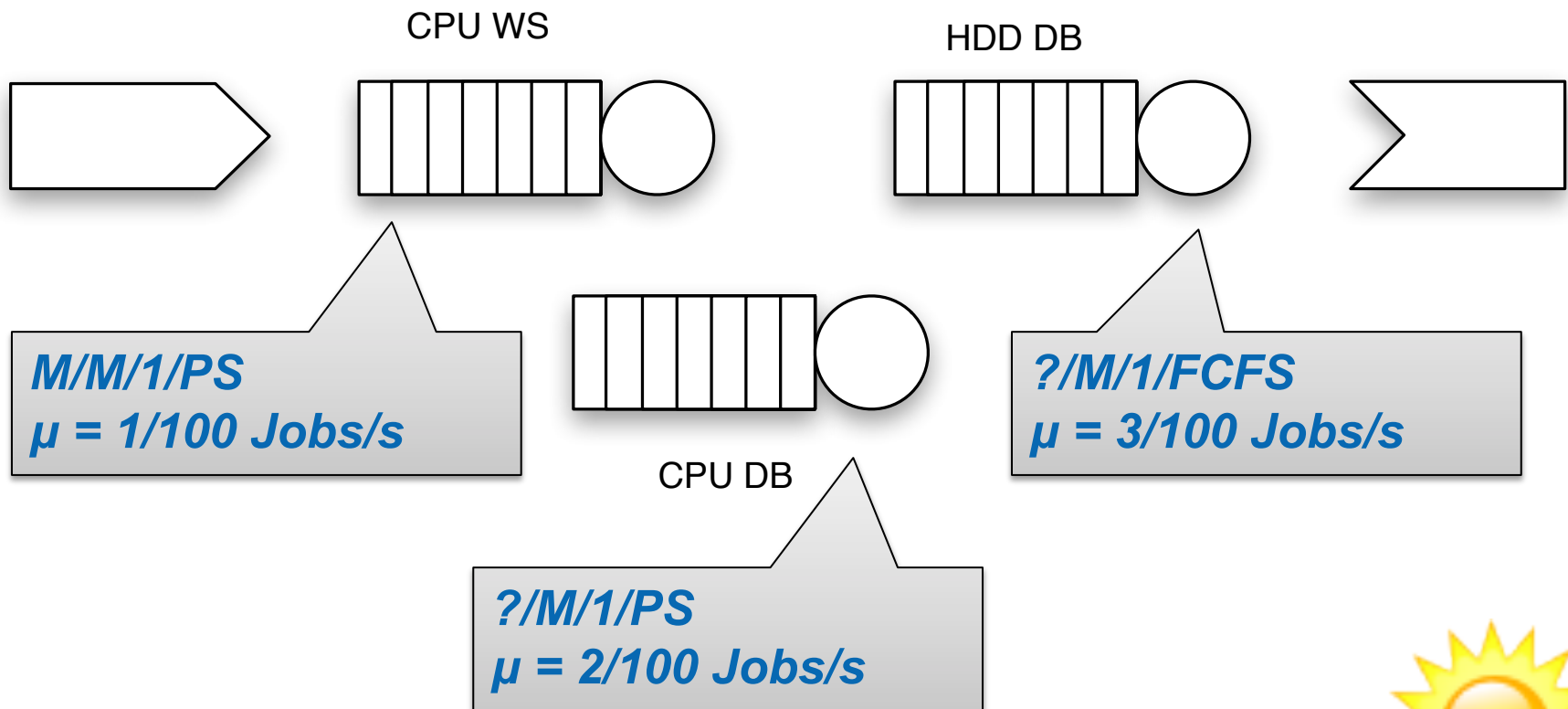
Source
Arrival Rate=1/3 Arrivals/s
Exponential distribution



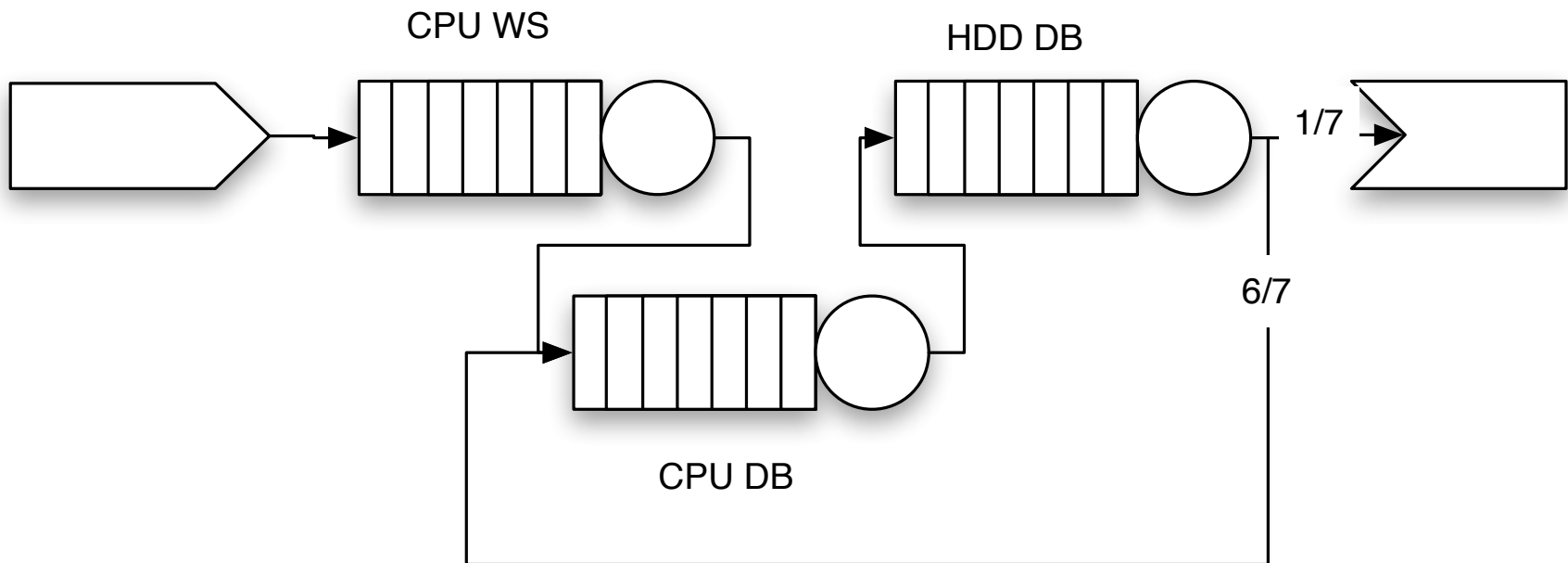
Sink



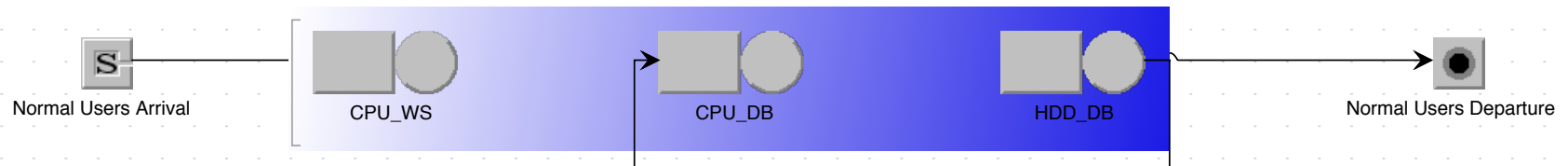
**Add a queue per GaExecHost
and their parameters**



Add routes and their probabilities

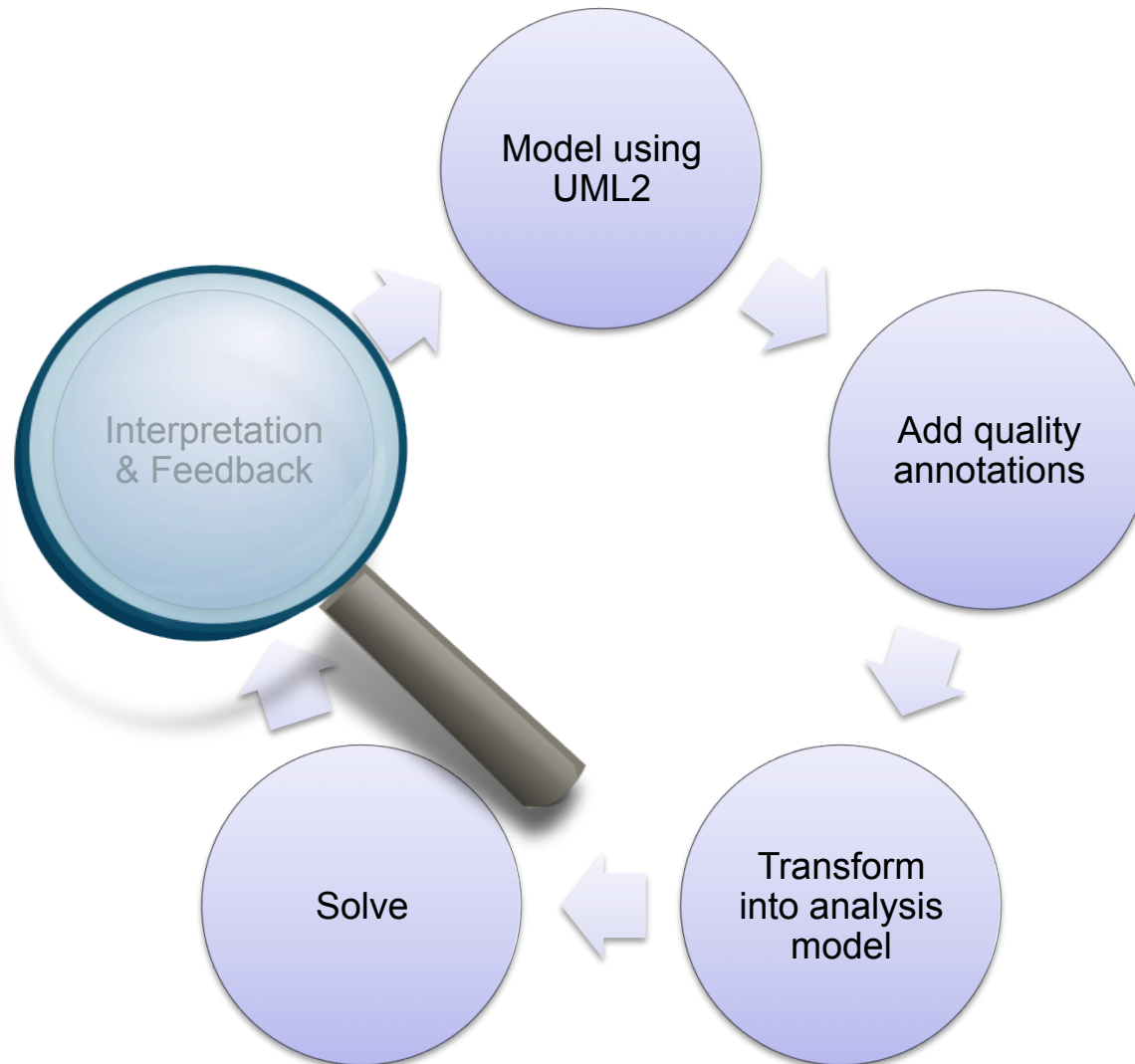


JSimGraph Model

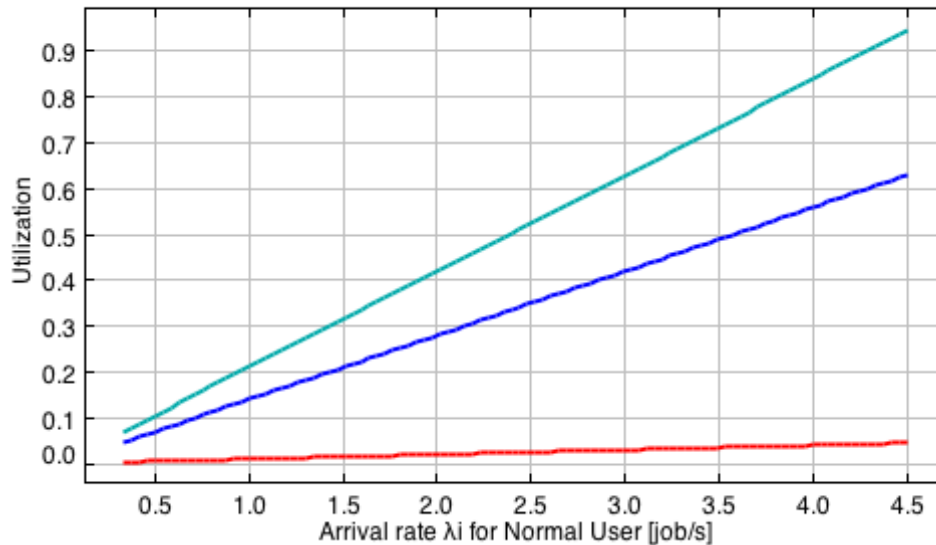


- Results (according to jMVA)
 - Mean System RT = 0.5502 sec
 - Util CPU_WS = 0.33%
 - Util CPU_DB = 2.33 %
 - Util HDD_DB = 6.99 %



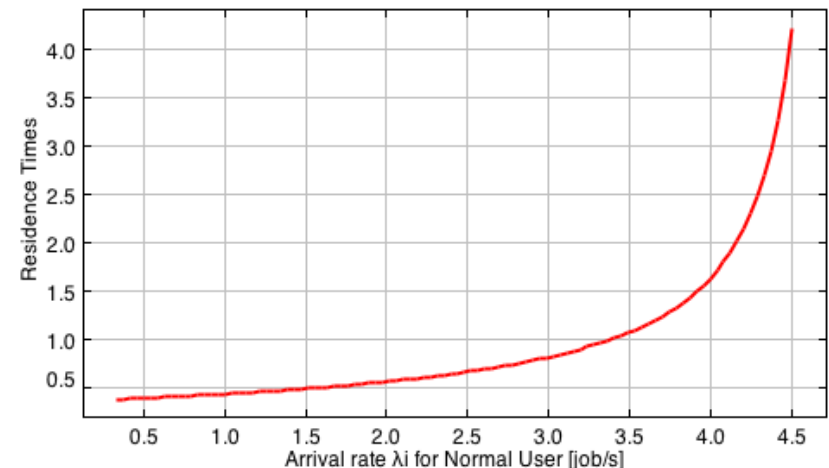


What-if analysis for arrival rate



- At arrival rate 4.5 the DB HDD (cyan) becomes the bottleneck
- The HDD queue starts to overload

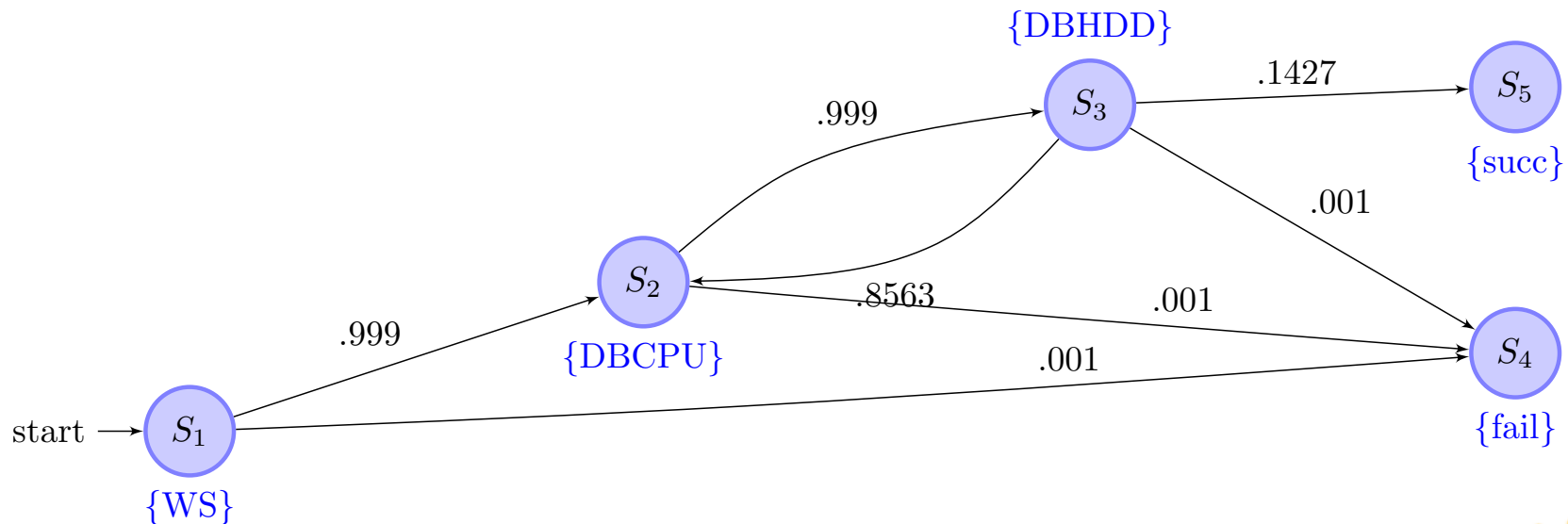
- RT constraint from our requirements is violated at arrival rate of > 3.5 job/s
- Starting from a rate of 2.5 jobs/s the system shows overload effects



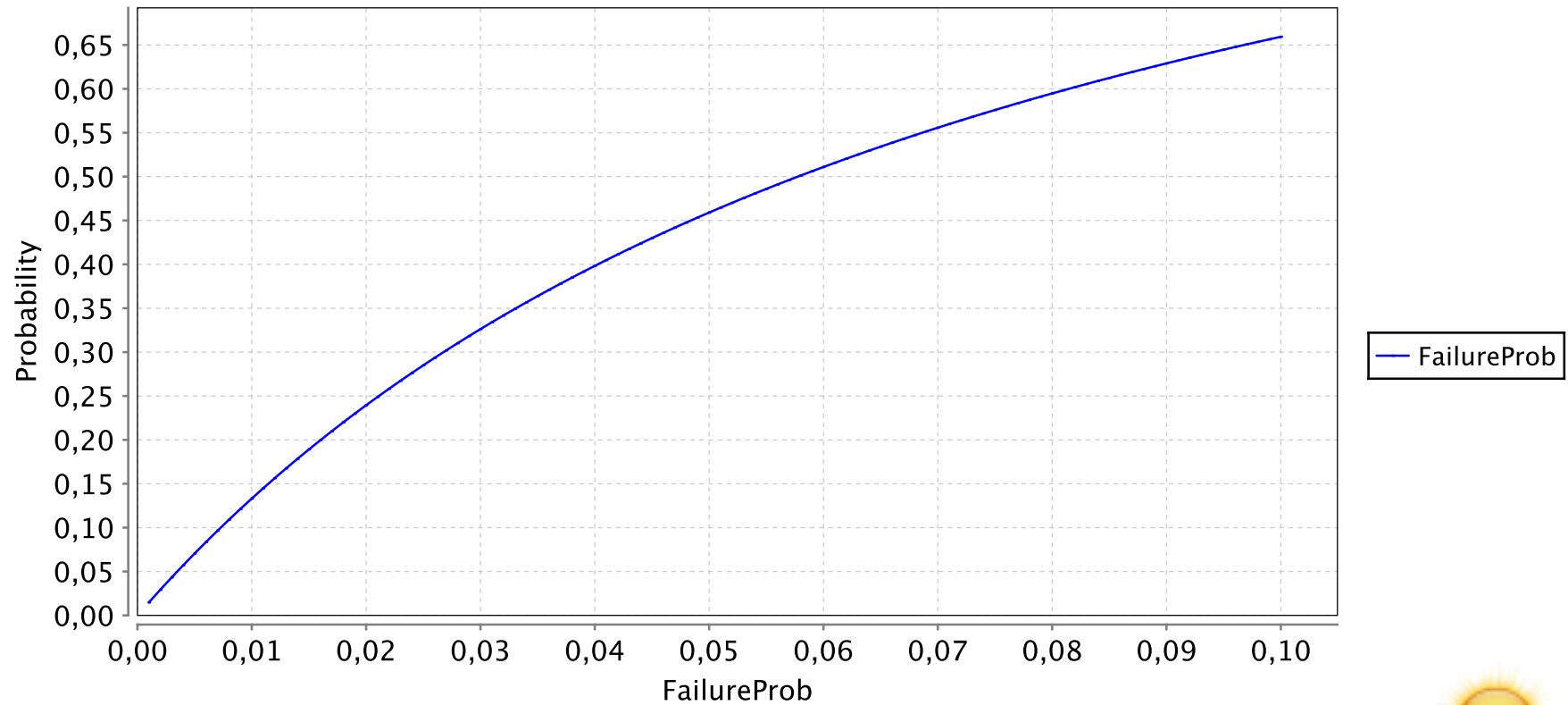
- Common method is to create a Discrete Time Markov Chain (DTMC), i.e., disregard time
- Each step of the system becomes a state of the DTMC
- In each state, system can fail according to a failure probability. It reaches an absorbing failure state in case of failure
- Loop can be either unrolled or approximated by a geometric distribution
- PROFOD is probability of reaching the success state, i.e., the state after the last system action

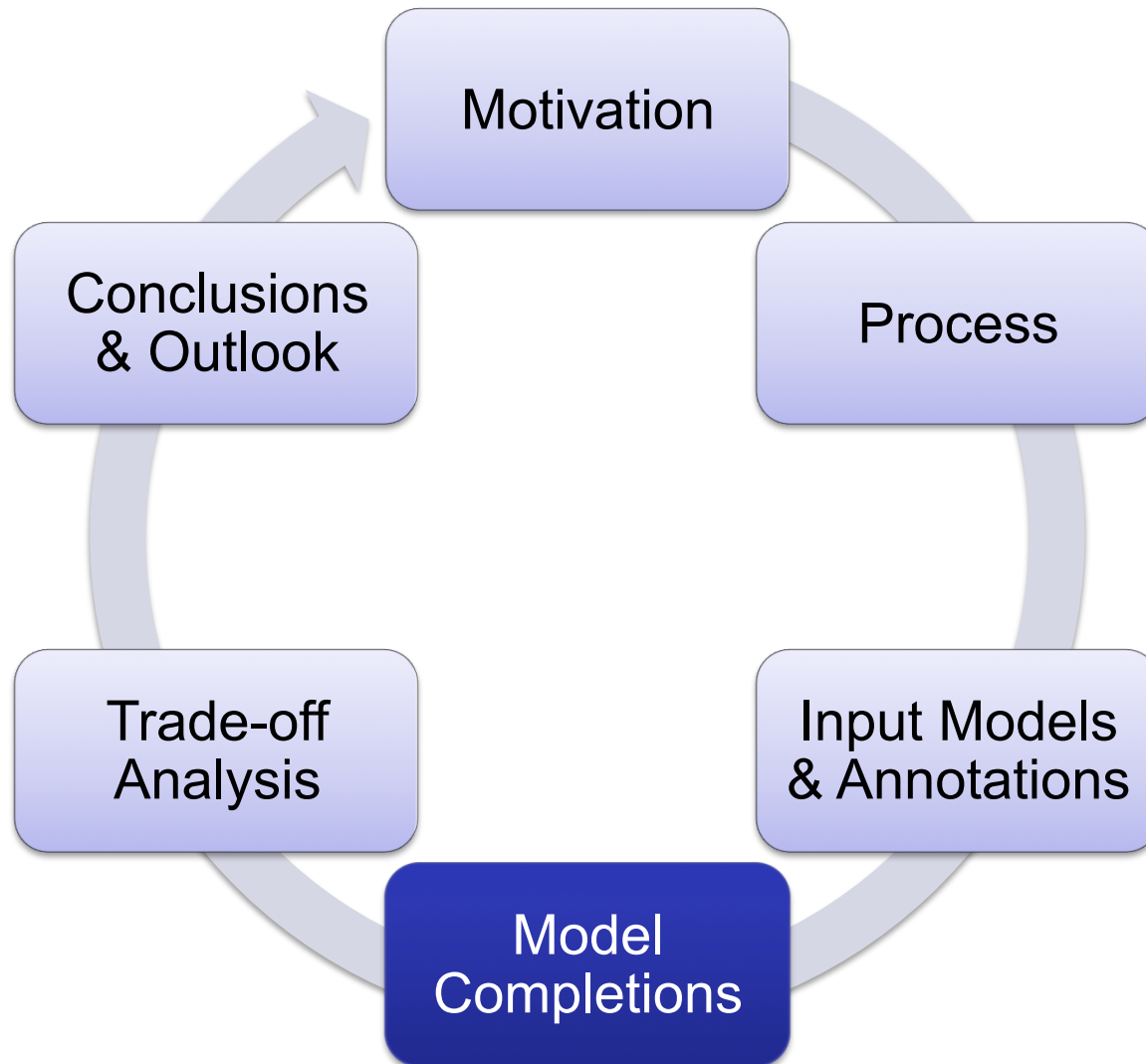


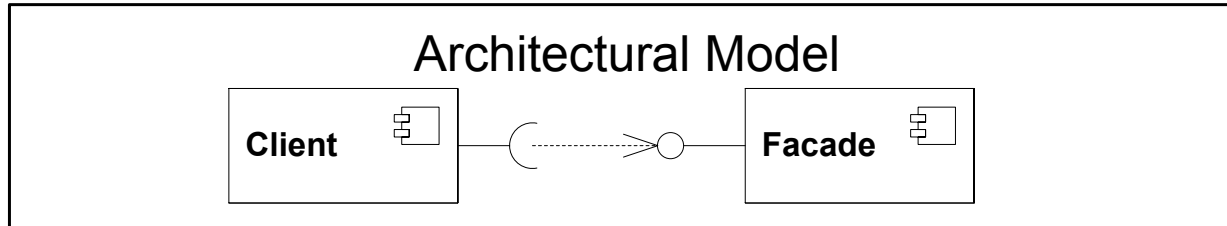
- Create a DTMC for our SuS. Here approx. of loop counts
- PROFOD approx. 1,48% according to PRISM



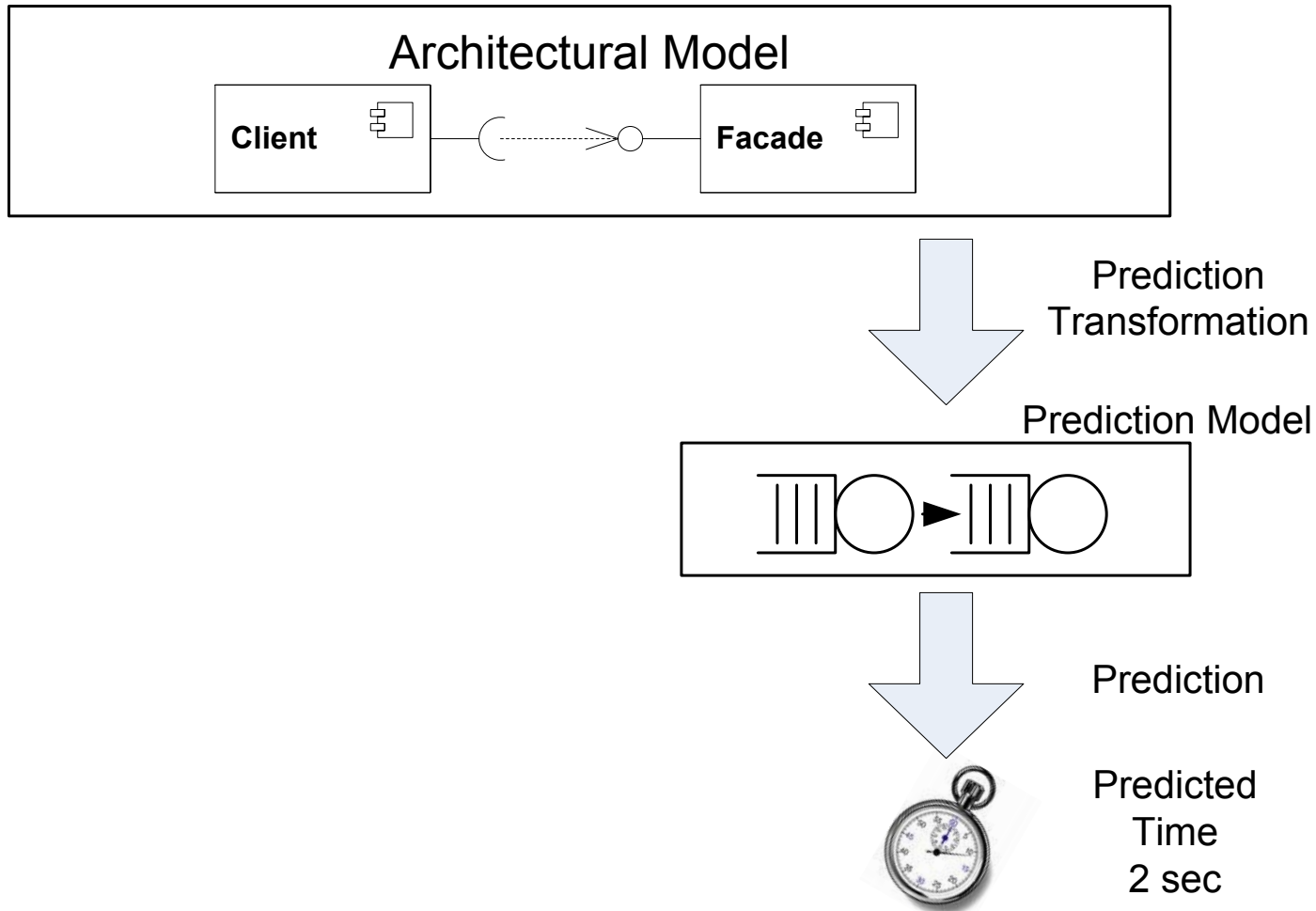
What if analysis



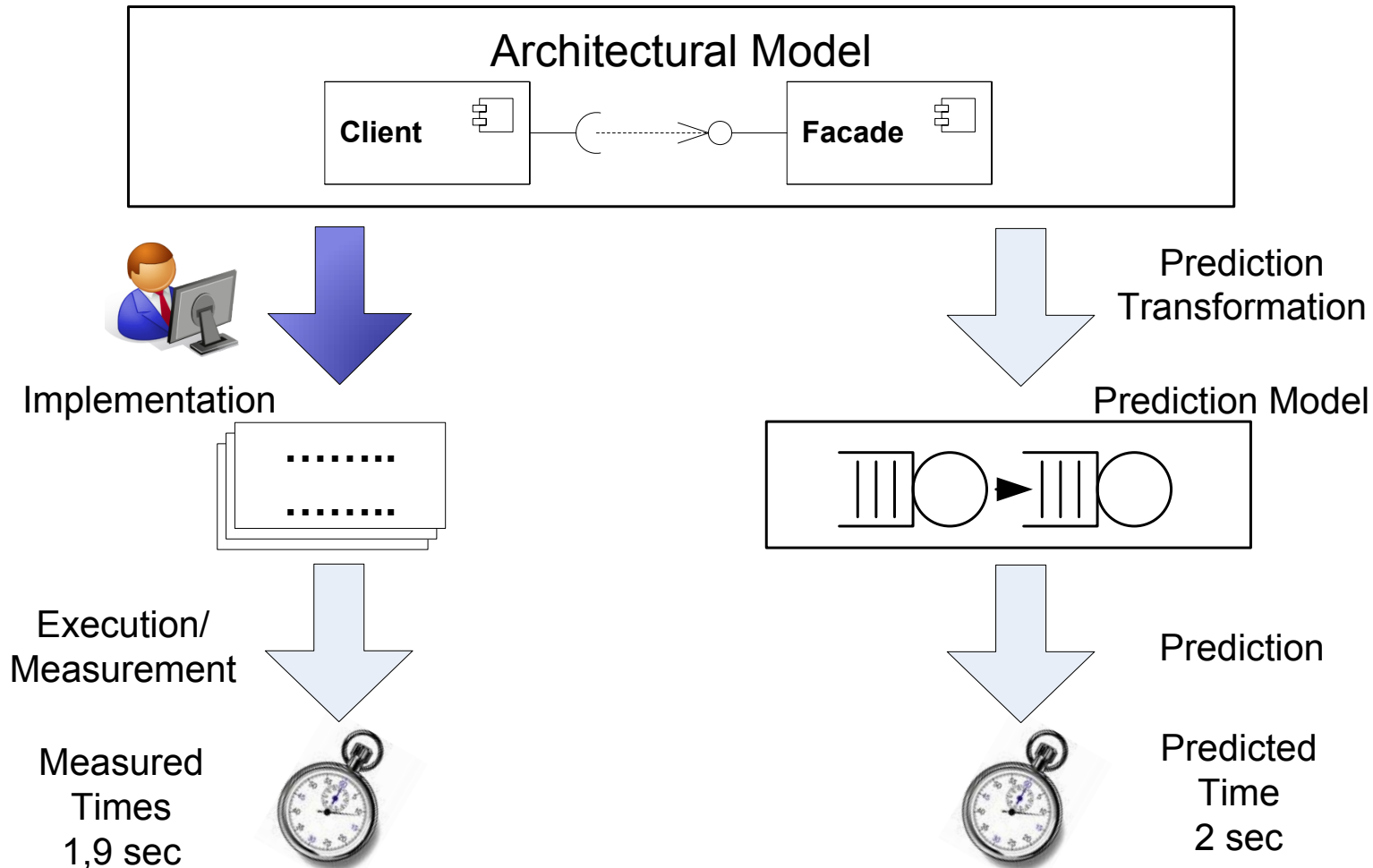




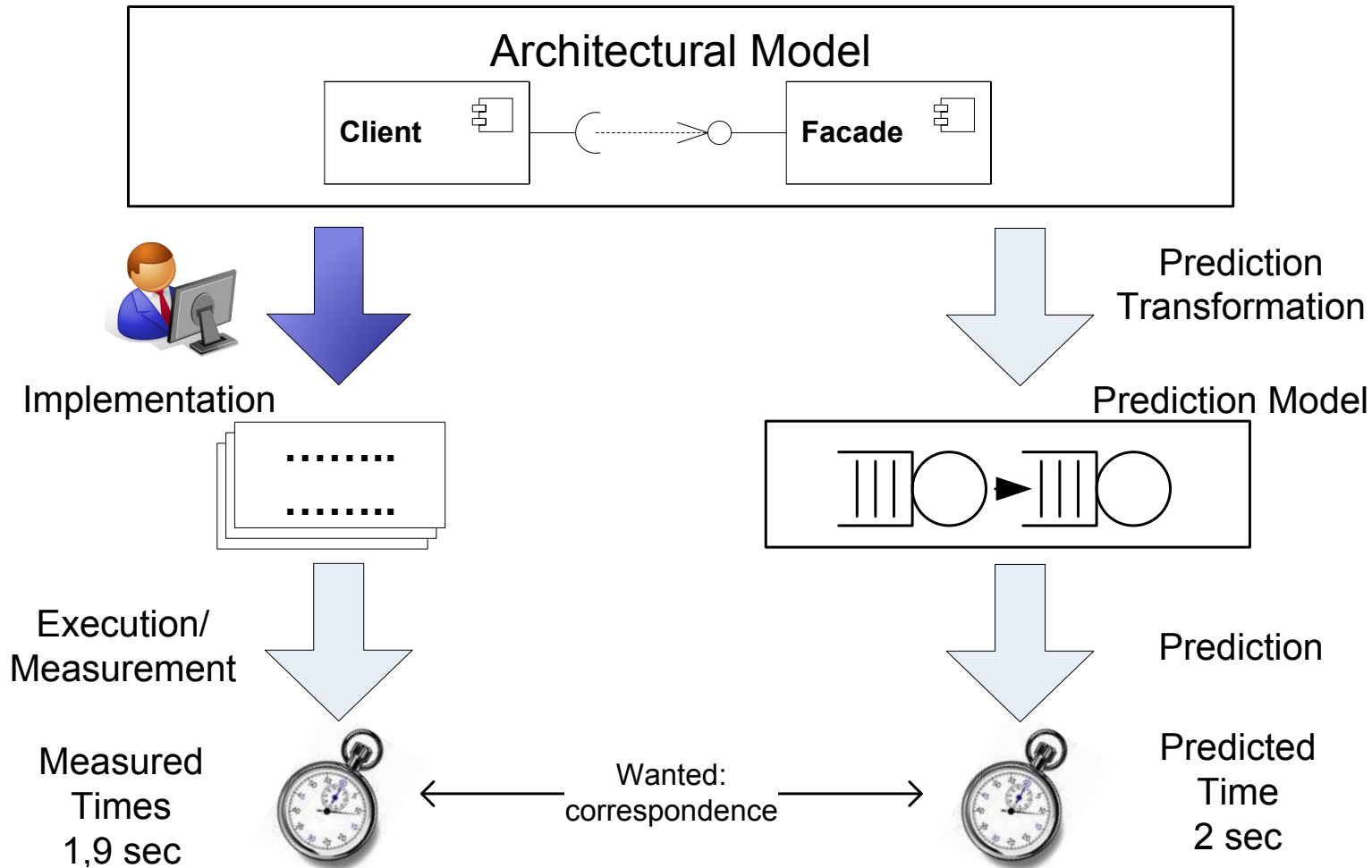
[Becker, WOSP, 2008]



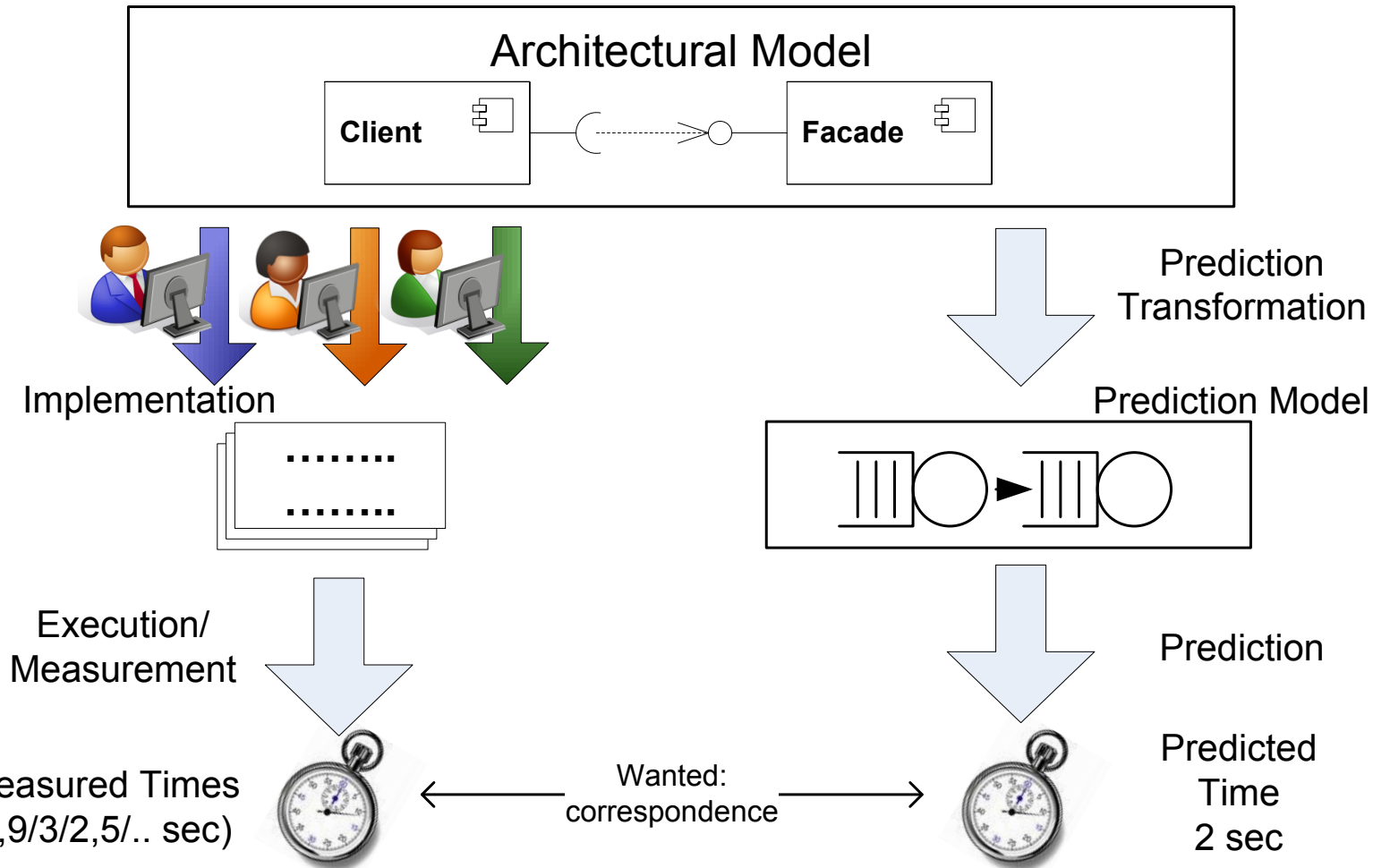
[Becker, WOSP, 2008]



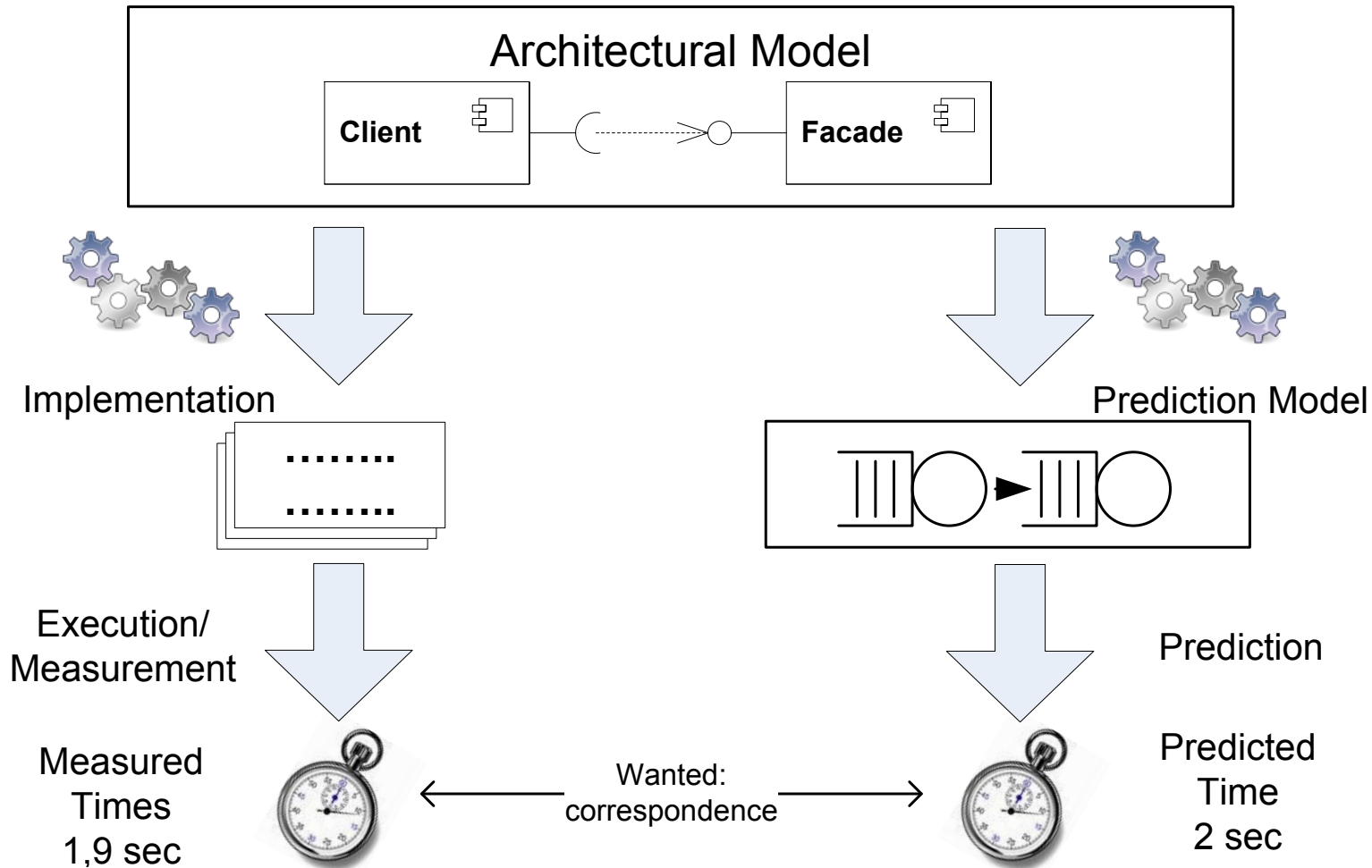
[Becker, WOSP, 2008]



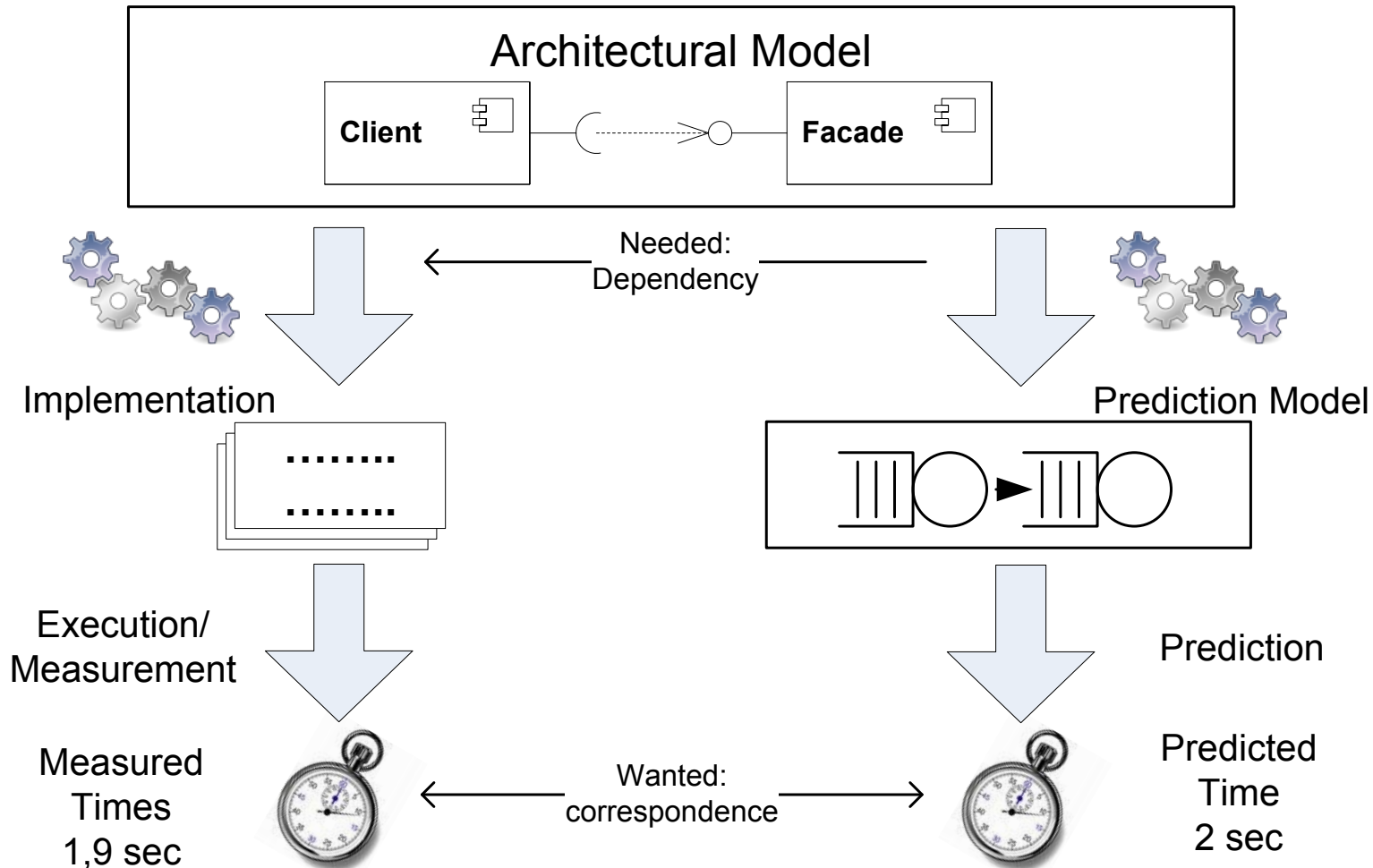
[Becker, WOSP, 2008]



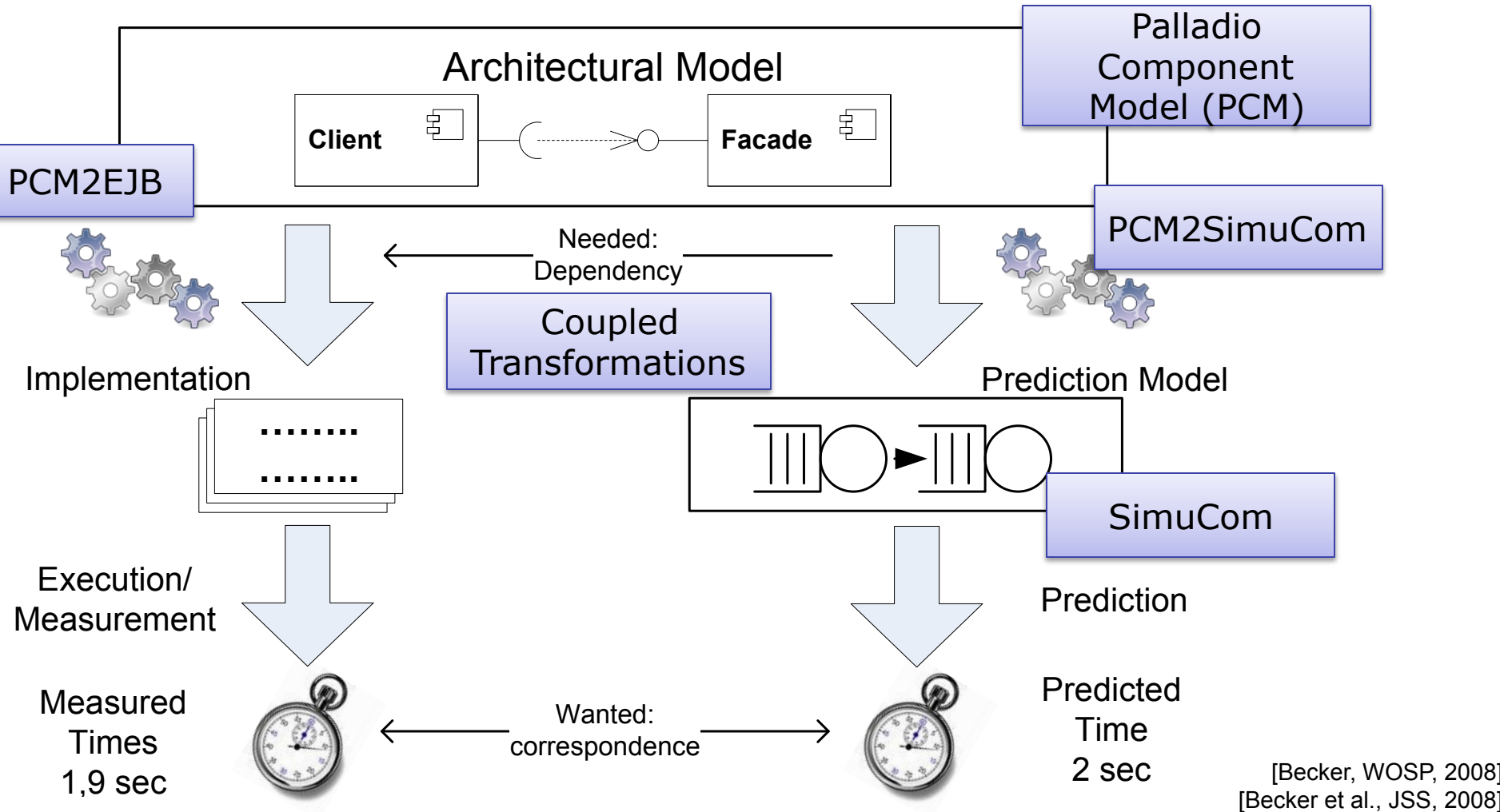
[Becker, WOSP, 2008]



[Becker, WOSP, 2008]

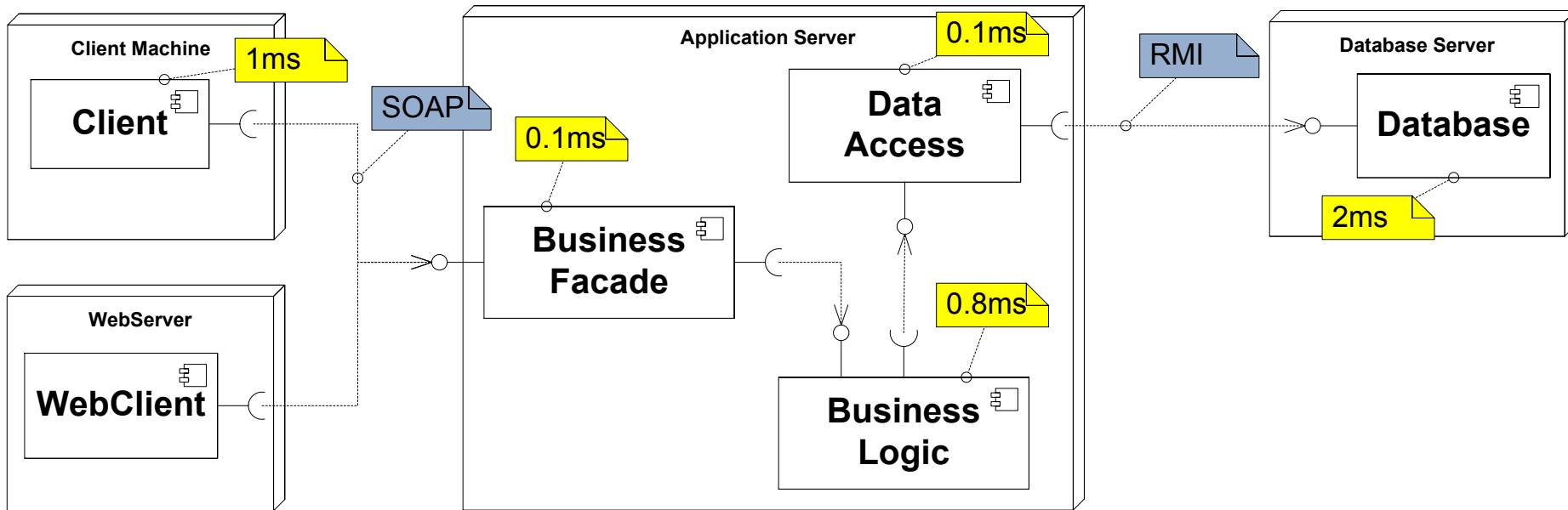


[Becker, WOSP, 2008]

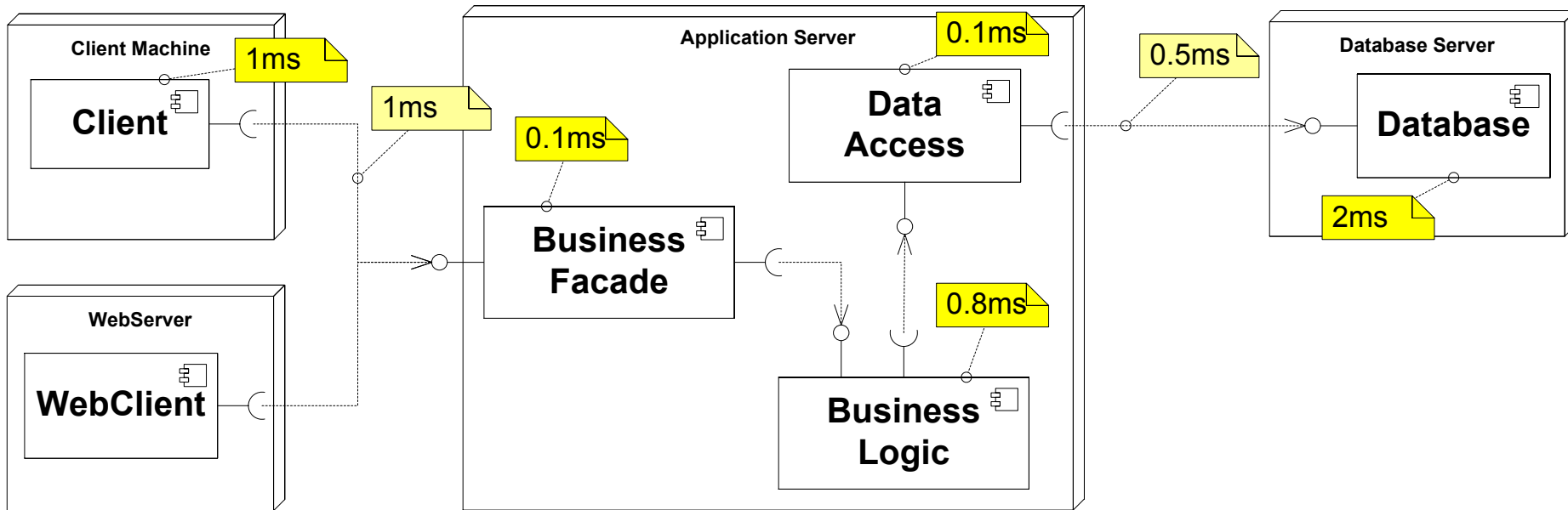


[Becker, WOSP, 2008]
[Becker et al., JSS, 2008]

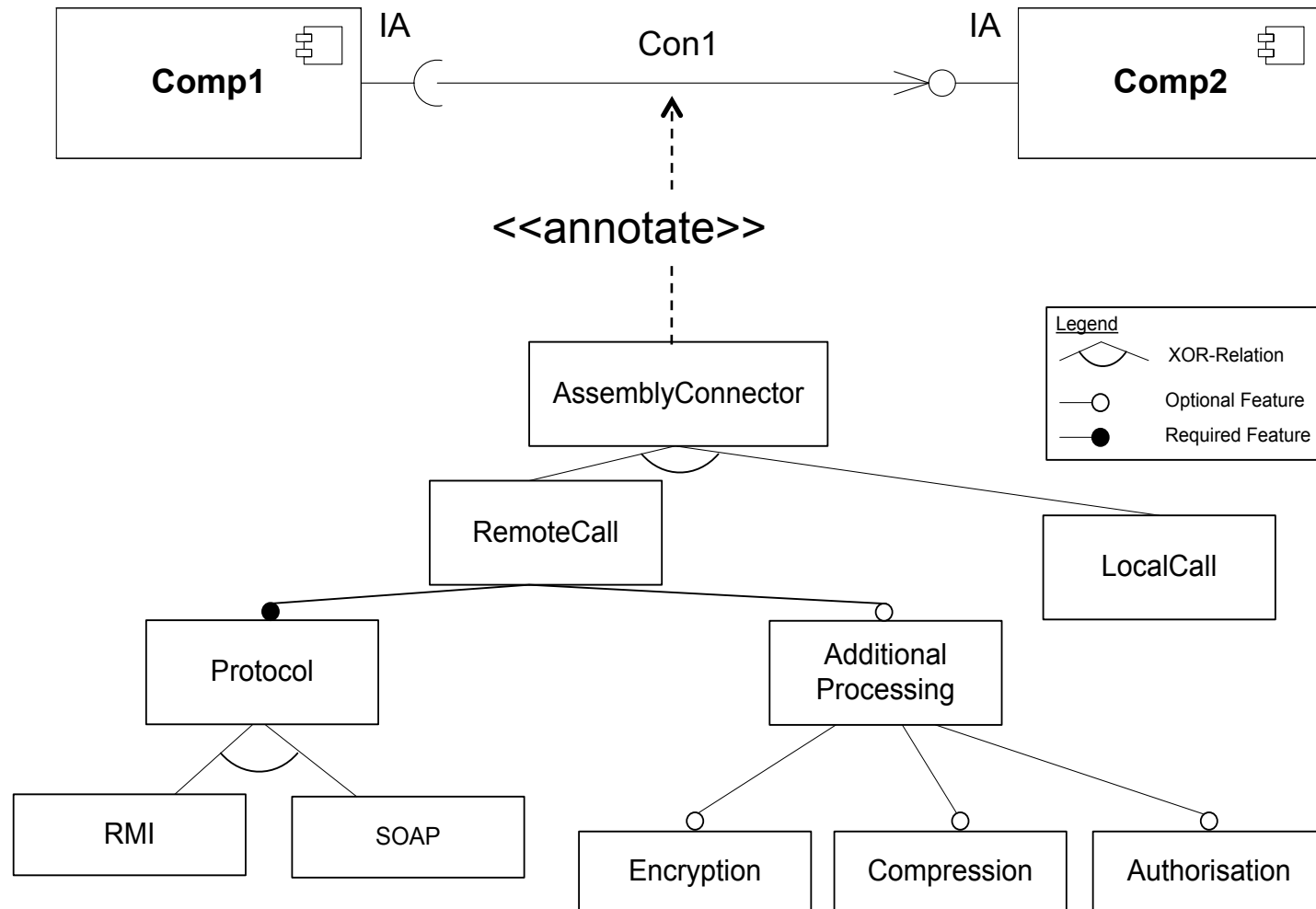
Example cont.



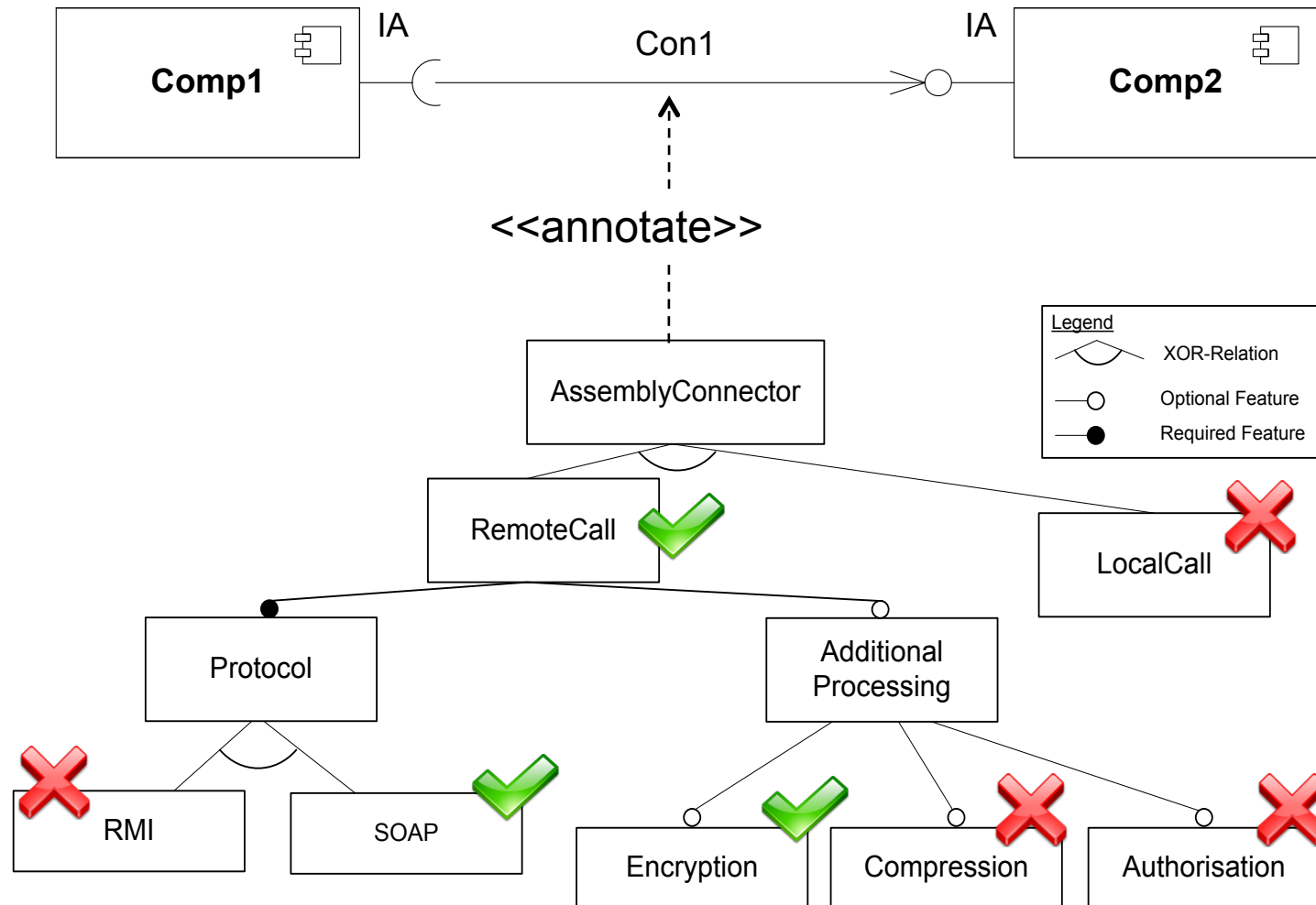
Example cont.



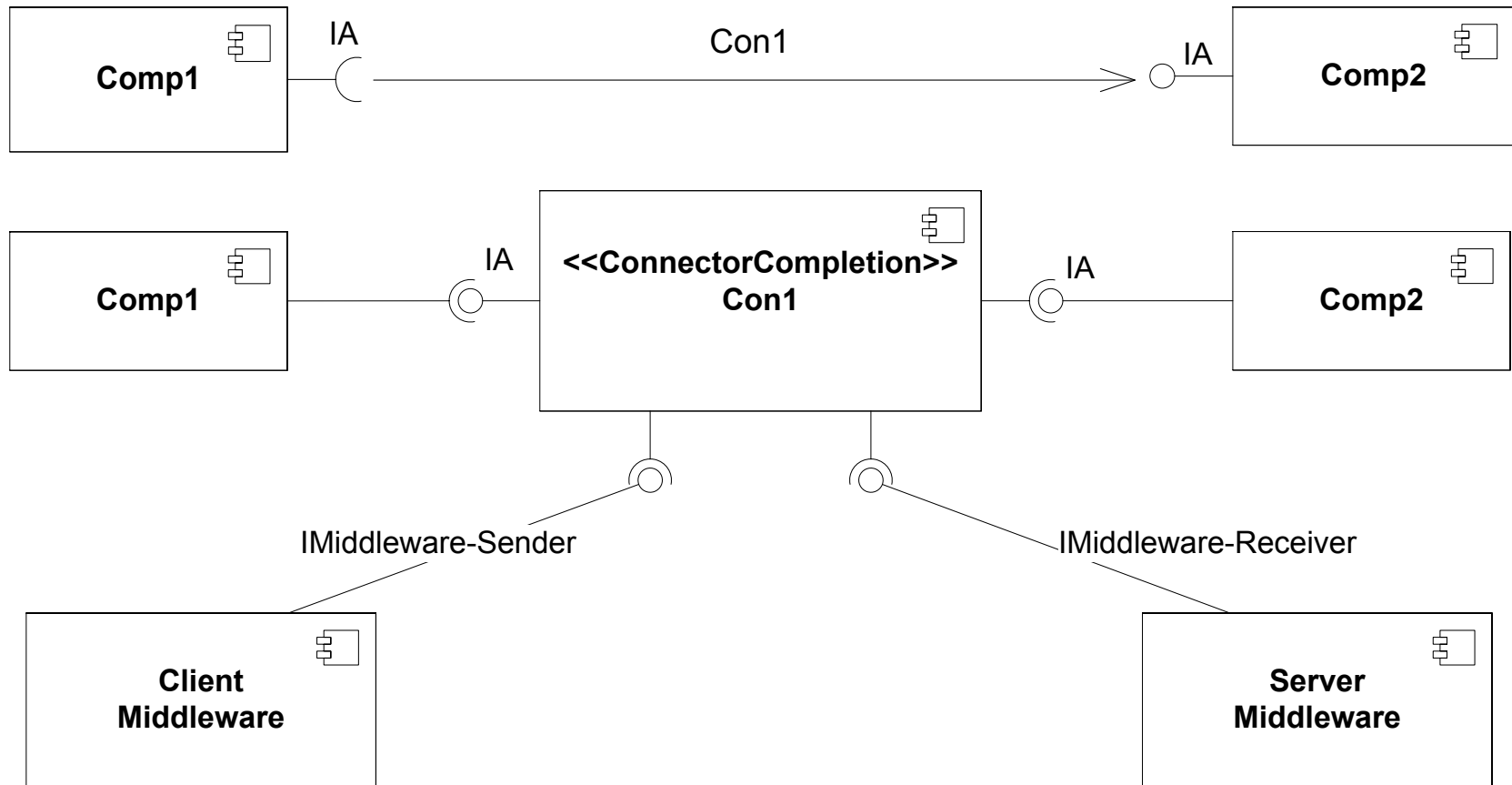
Connector Completion



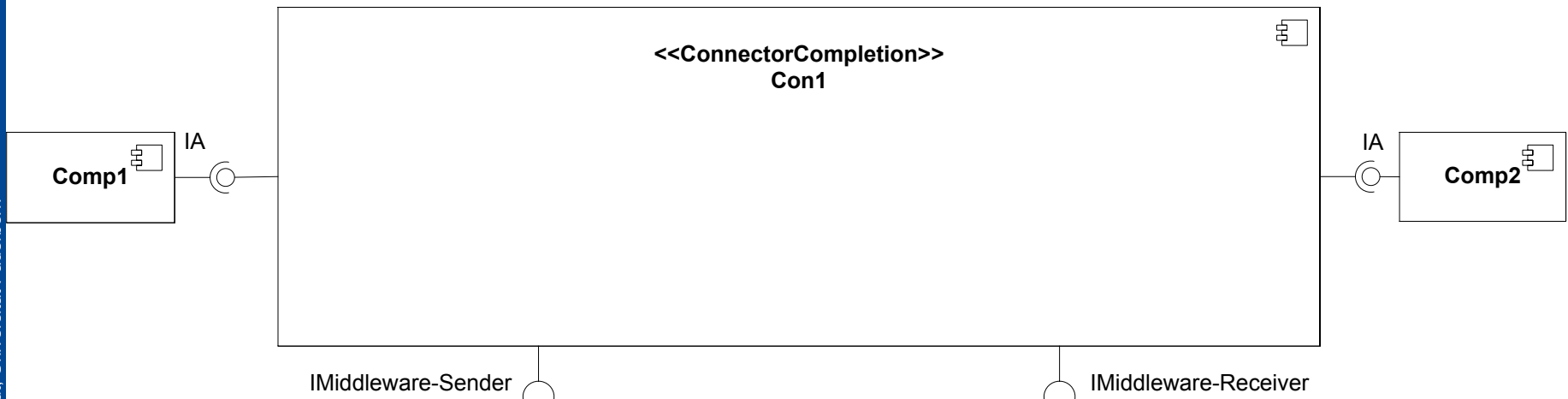
Connector Completion



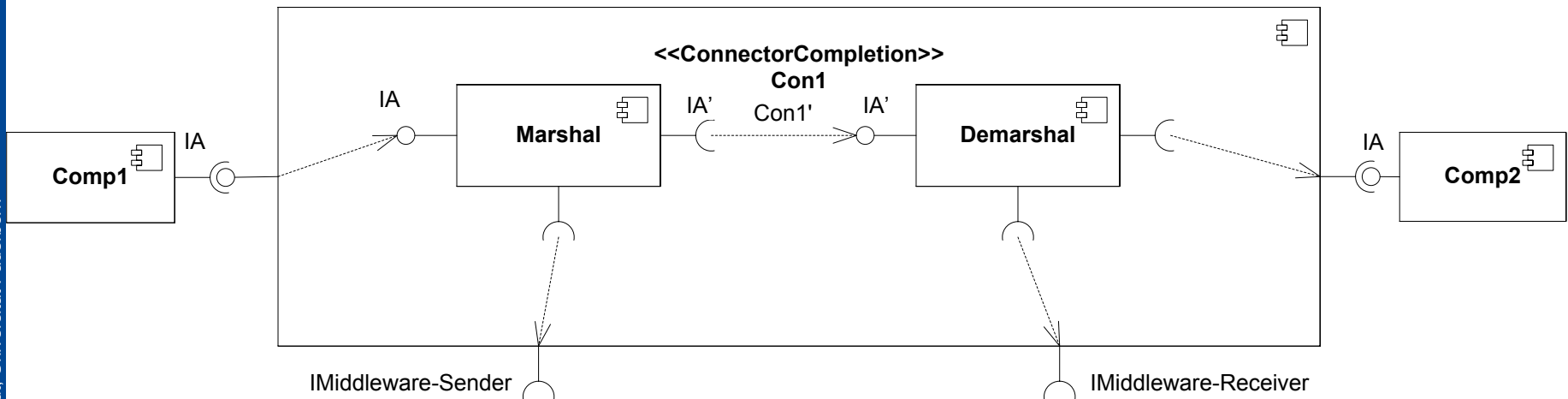
Connector Completion



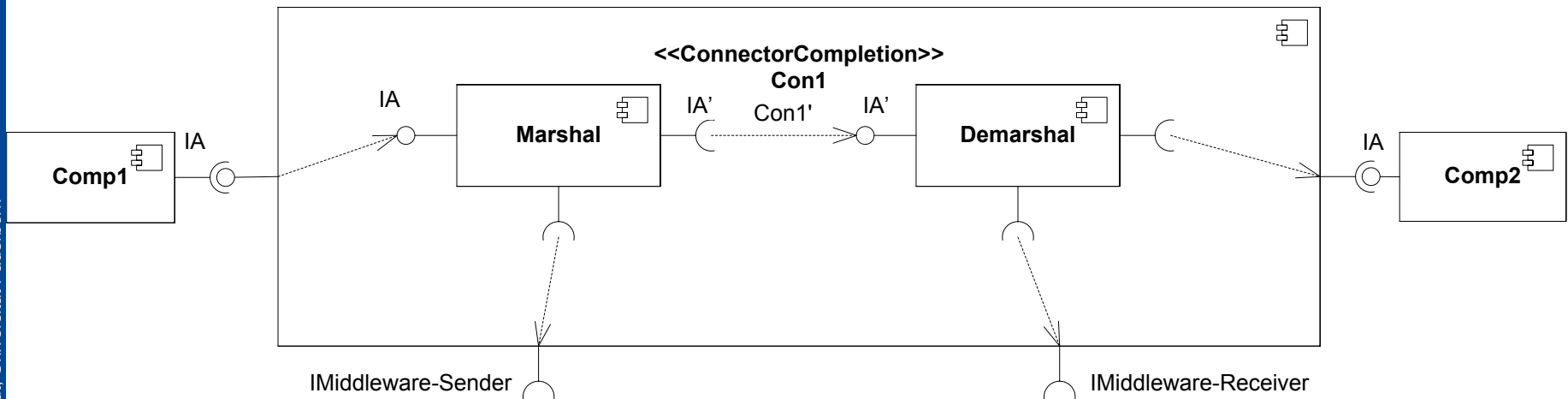
Connector Completion

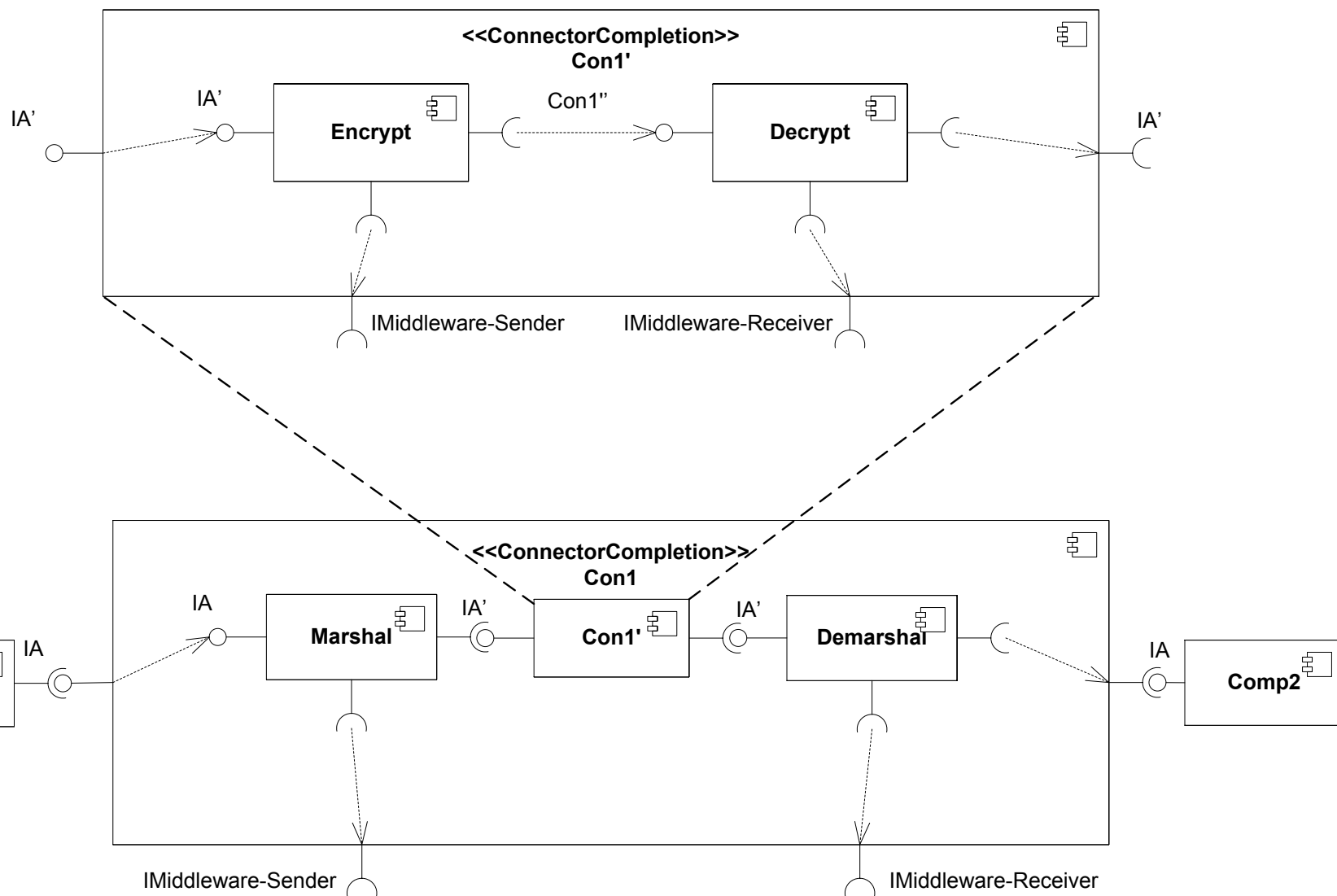


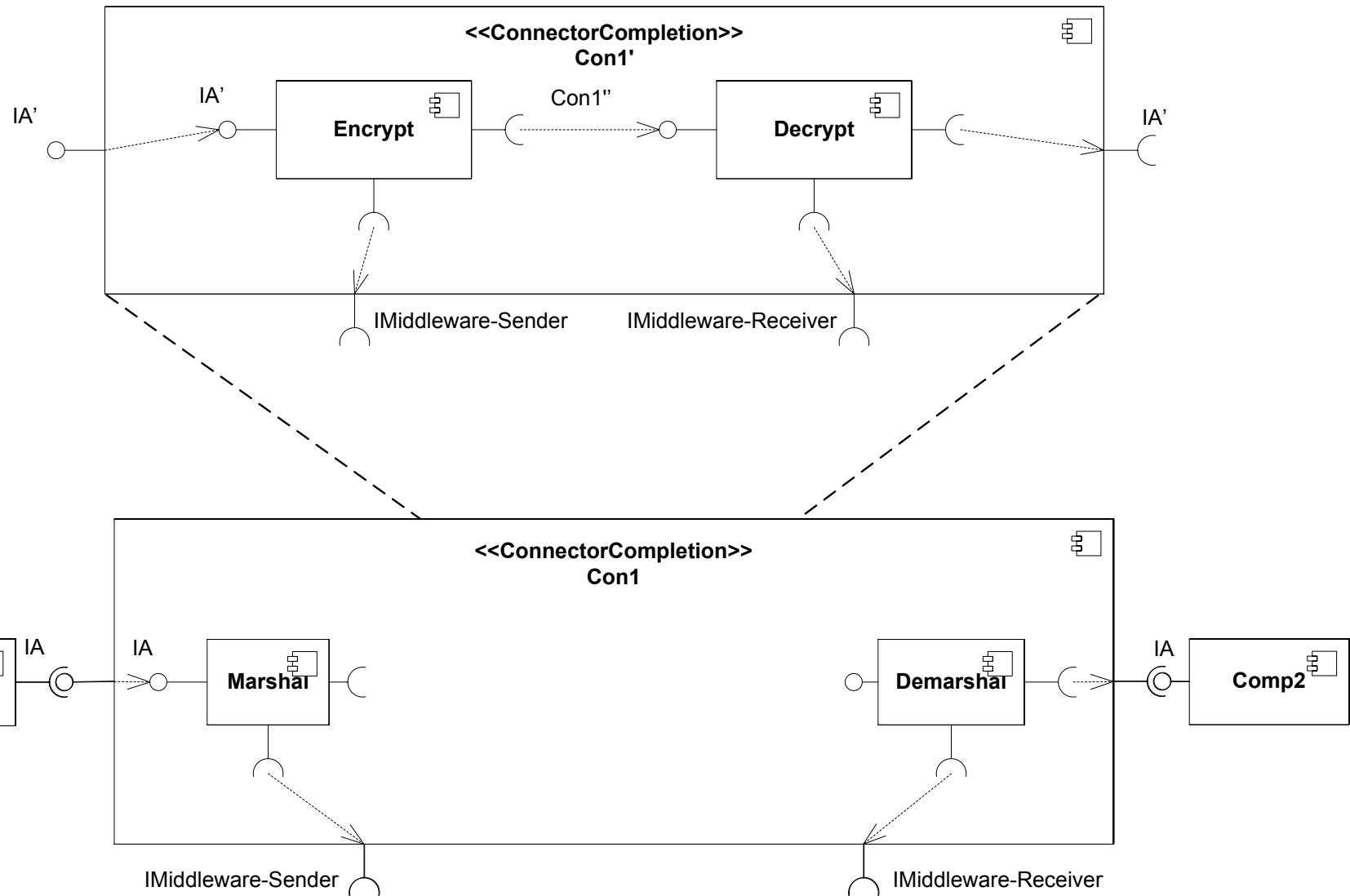
Connector Completion

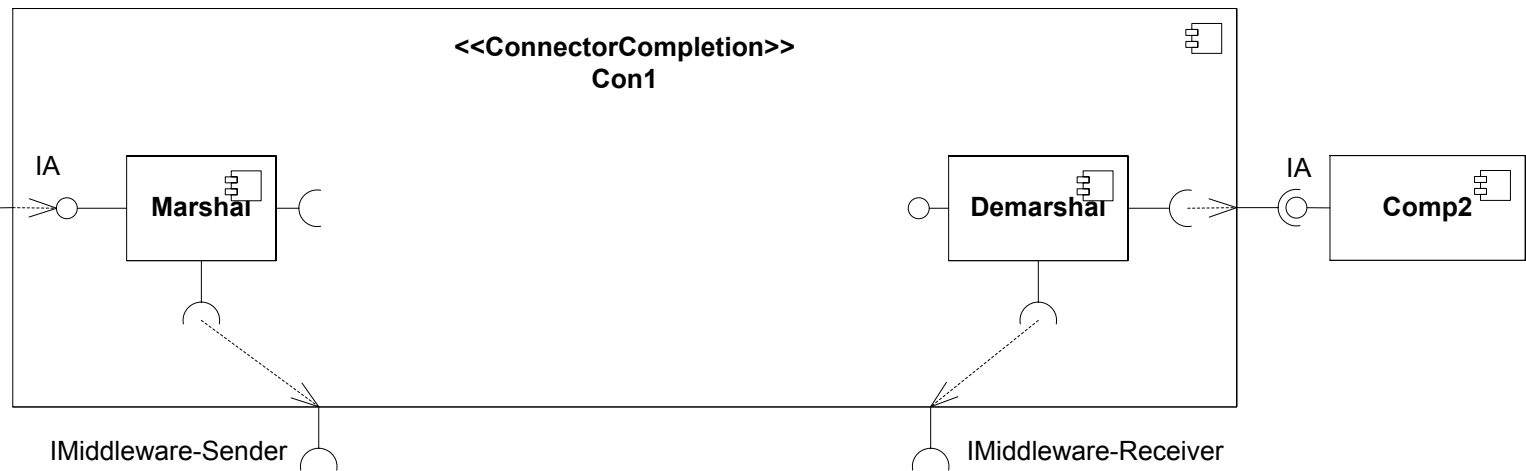
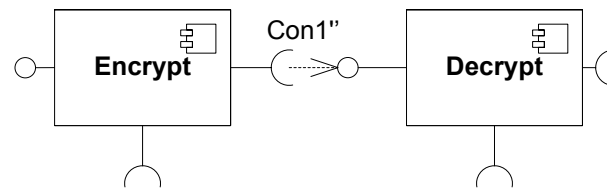


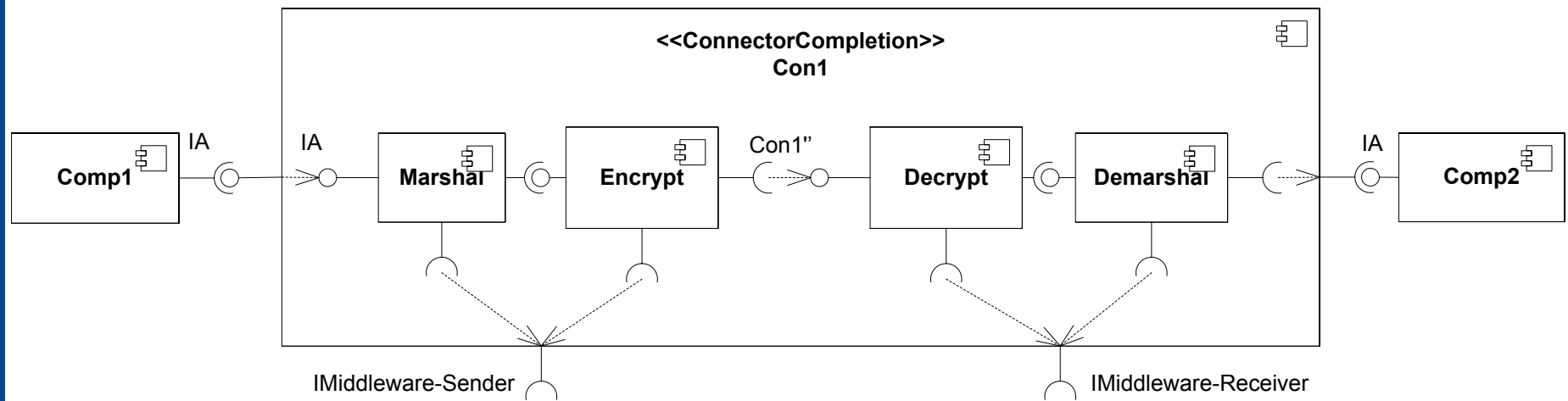
Connector Completion



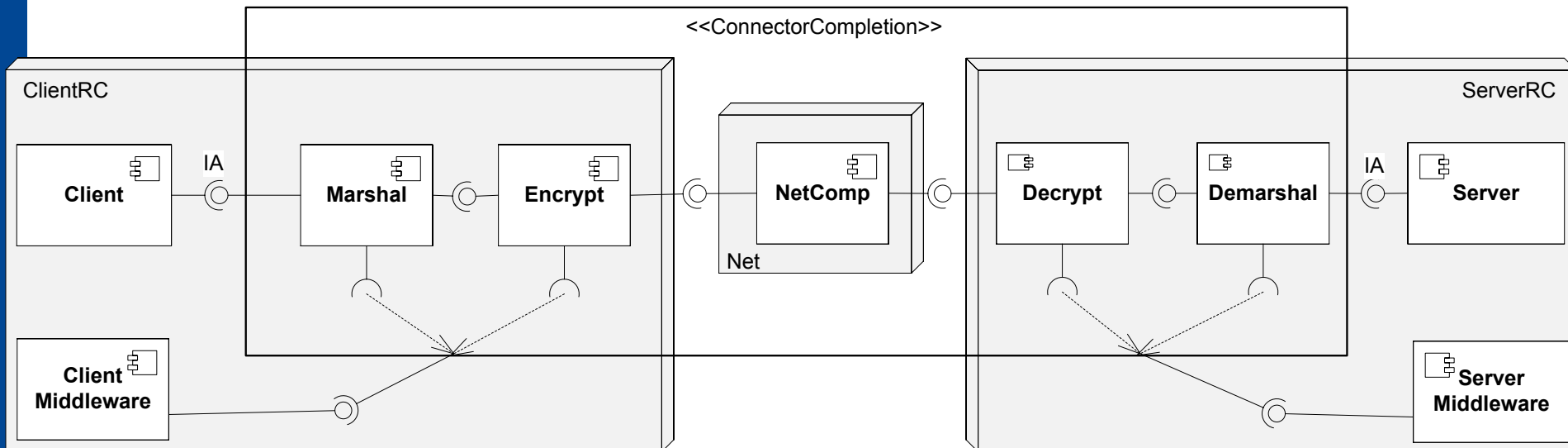


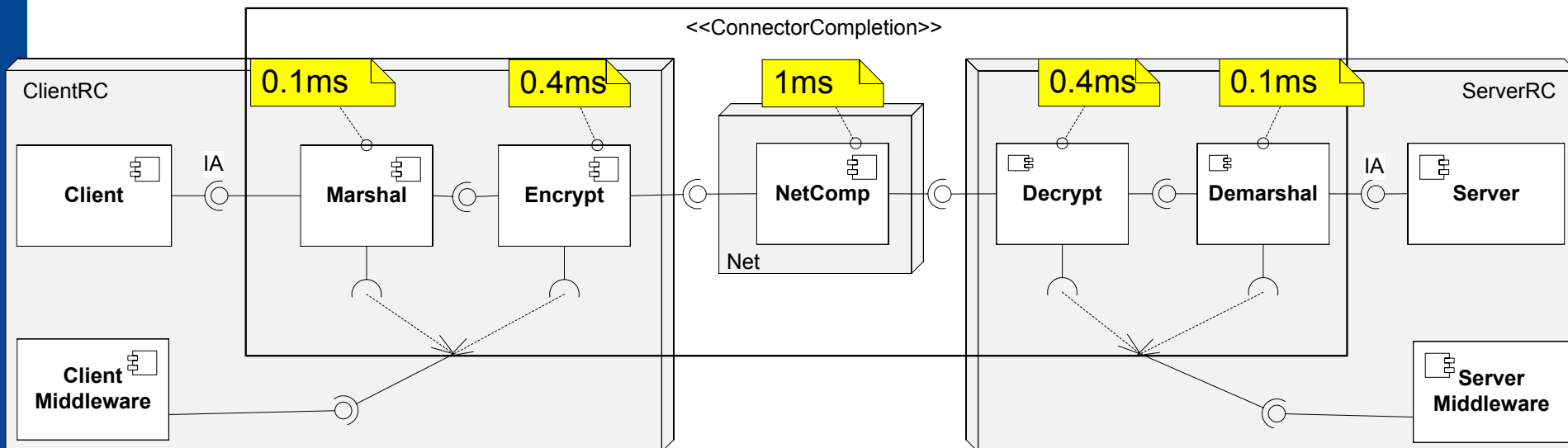




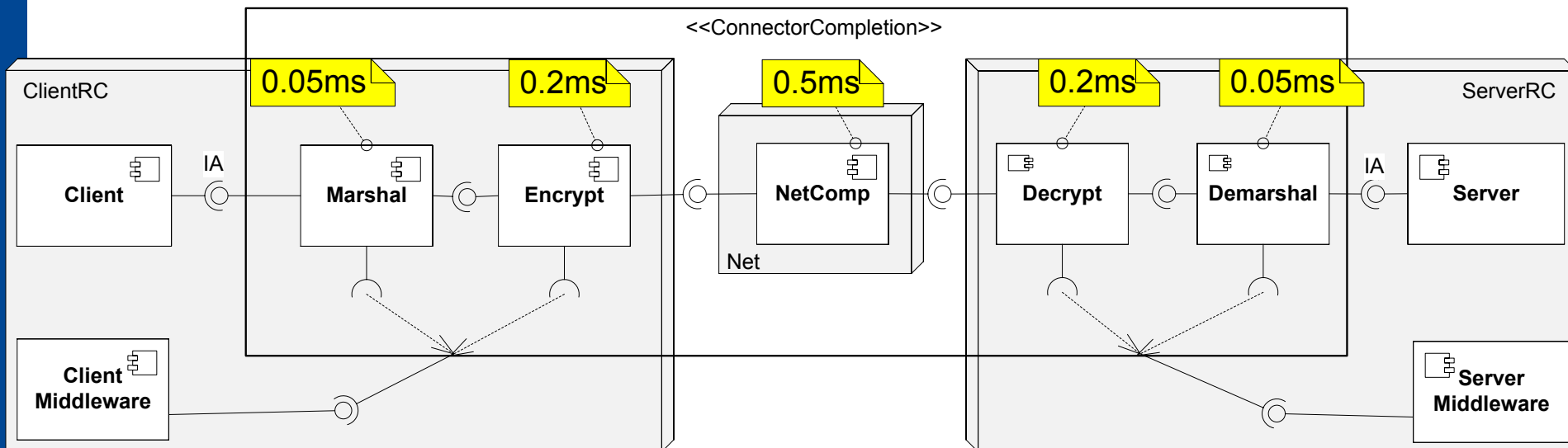


Deployed Completion





SOAP & Encryption

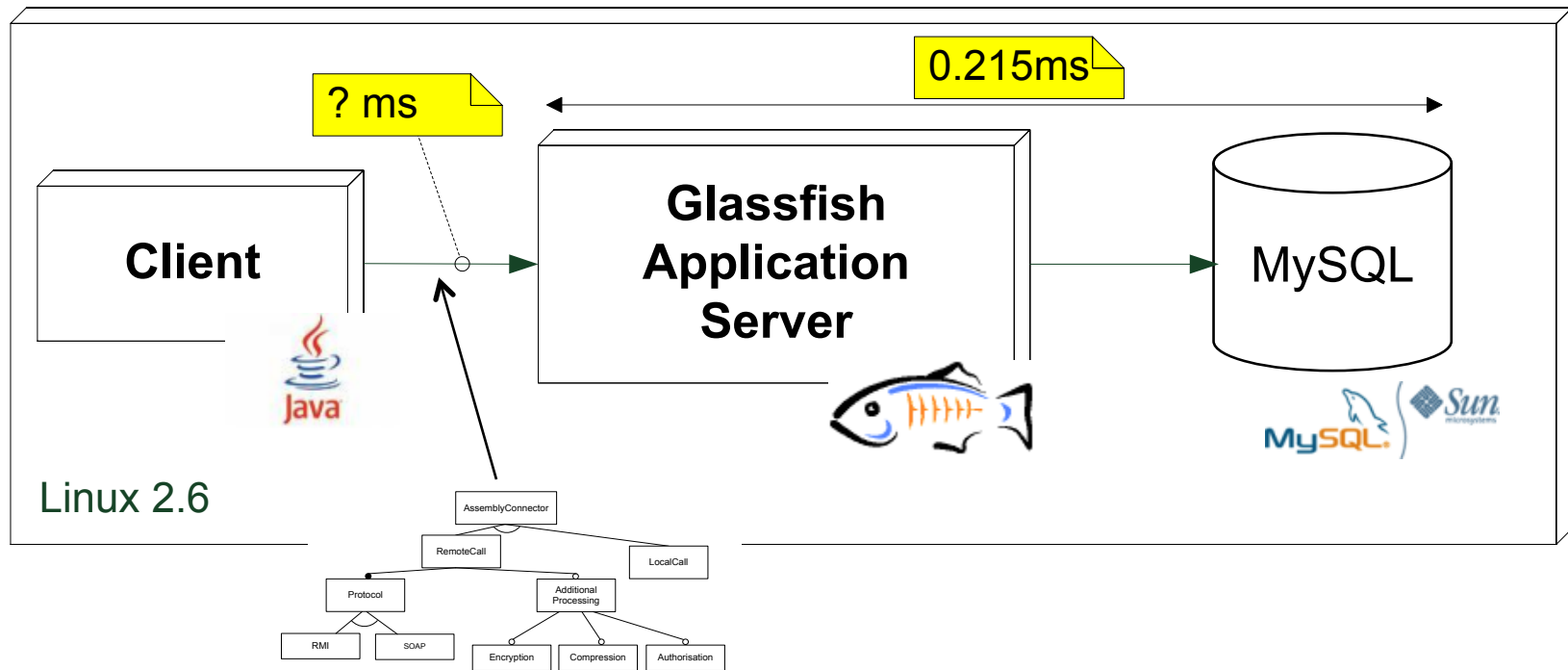


RMI & Encryption



Model-Driven Completions: Evaluation

Measurement Setting



Protocol	Auth	Enc	E(Meas) [ms]	E(Pred) [ms]	Diff. [ms]	Diff. [%]
None	✗	✗	n/a	0.215	n/a	n/a

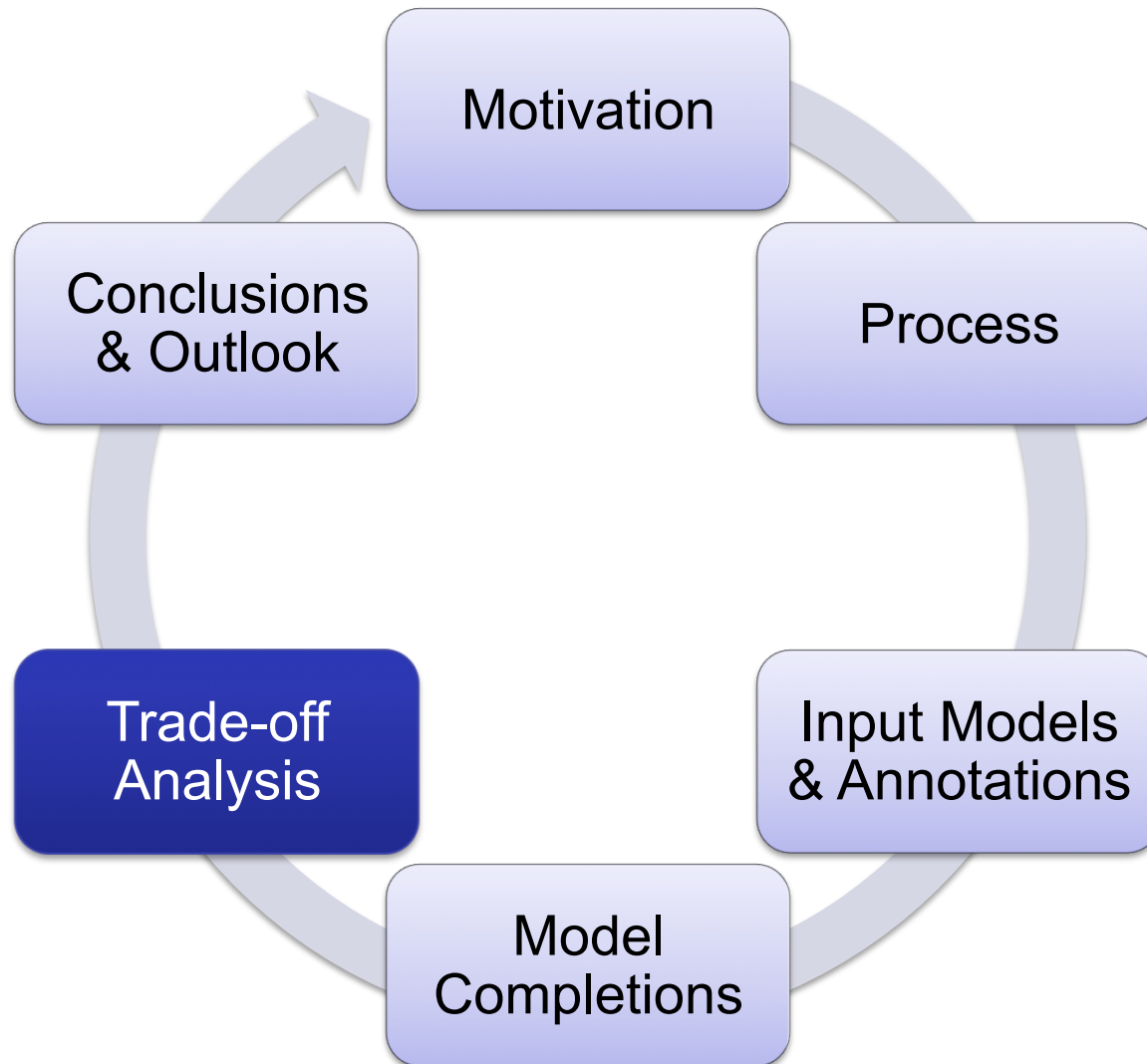
Prediction Error > 400%

Results



Protocol	Auth	Enc	E(Meas) [ms]	E(Pred) [ms]	Diff. [ms]	Diff. [%]
None			n/a	0.215	n/a	n/a
RMI			0.988	0.971	0.017	1.7
RMI			1.941	1.871	0.070	3.6
RMI			1.113	1.111	0.002	0.2
RMI			2.060	2.011	0.049	2.4
SOAP			1.329	1.283	0.046	3.5
SOAP			1.498	1.463	0.035	2.3

Prediction Error < 3.6%

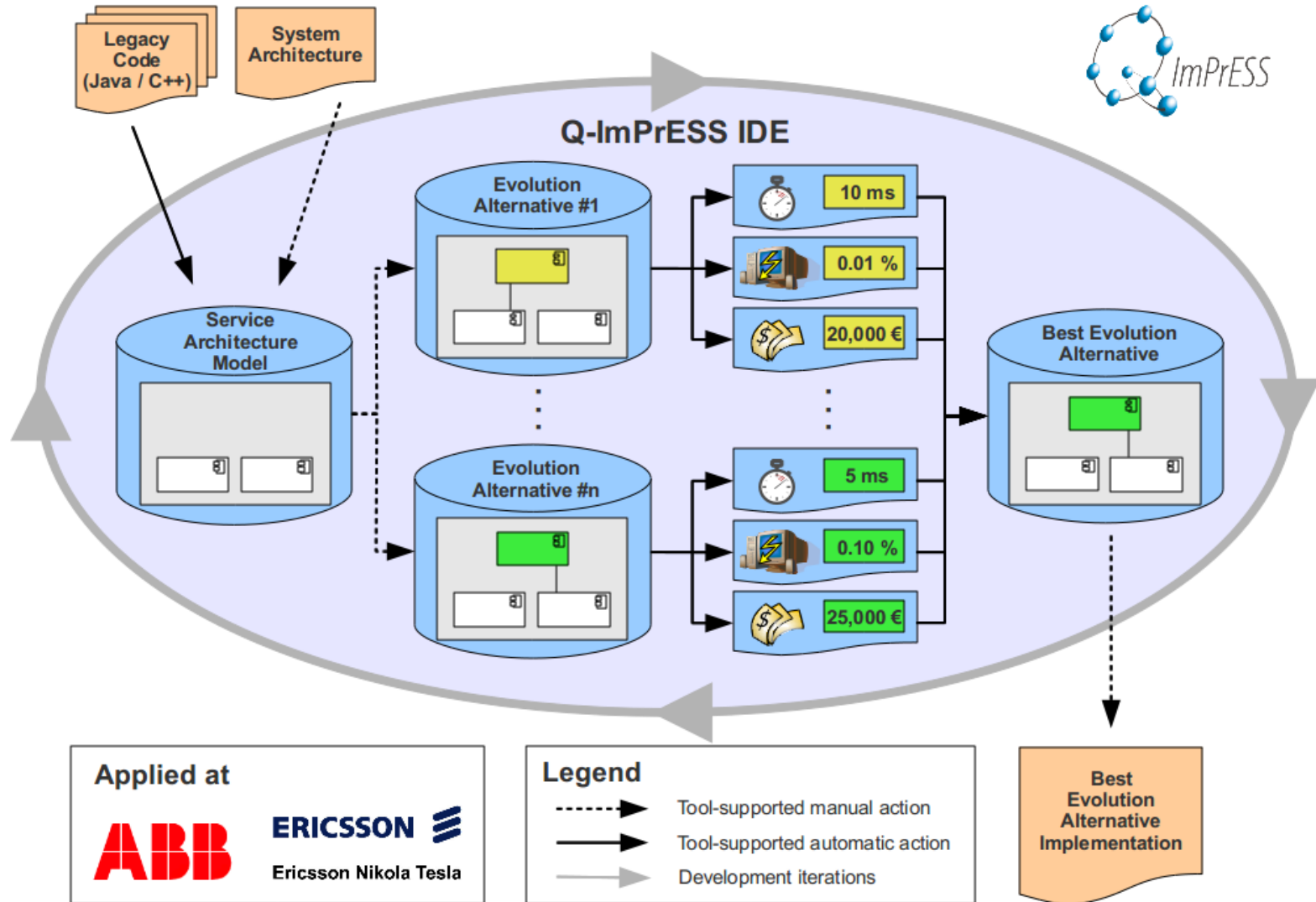


Trade-off Analysis

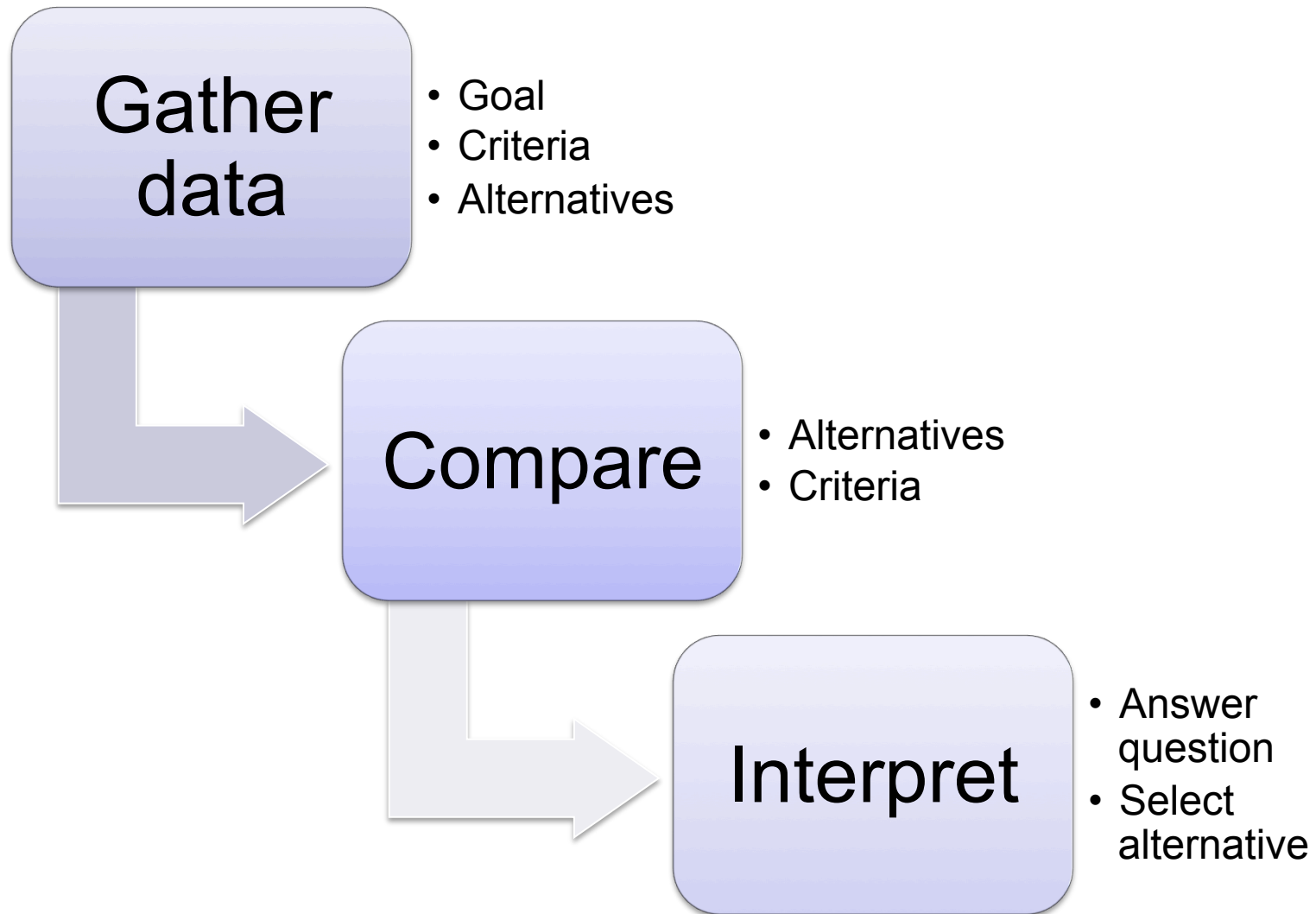
Example: Q-ImPrESS



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- Decision support method developed by the mathematician Thomas Saaty in the 1970s
- General method for multi-criteria decision making (not only software, but, e.g., also politics)
- Works quantitatively with qualitative inputs
- Goals
 - Make decisions rationally
 - Make decision preferences explicit and understandable
 - Support group/team decisions
 - Discover inconsistent decisions/preferences



1st Step: Gather Data



- Goal (here): „Which architectural alternative offers the best trade-off among the quantitative properties?“
- Criteria
 - Quantitative measurements/predictions on architecture metrics
 - We can also include non-quantitative criteria if we like
 - E.g., response time, PROFOD, etc.
 - Exclude direct alternative costs, they are normally included in step 3
- Alternatives
 - Alternative architectures

Alternatives and criteria



	Avg. Job / s = 1 / Avg. RT	1 - PROFOD	Ease of impl. [5 = easy, 1 = hard]
Alternative 1	1 / 1s	0.99	3
Alternative 2	1 / 2s	0.9	2
Alternative 3	2 / 3s	0.9	5
Alternative 4	1 / 3s	0.9999	1

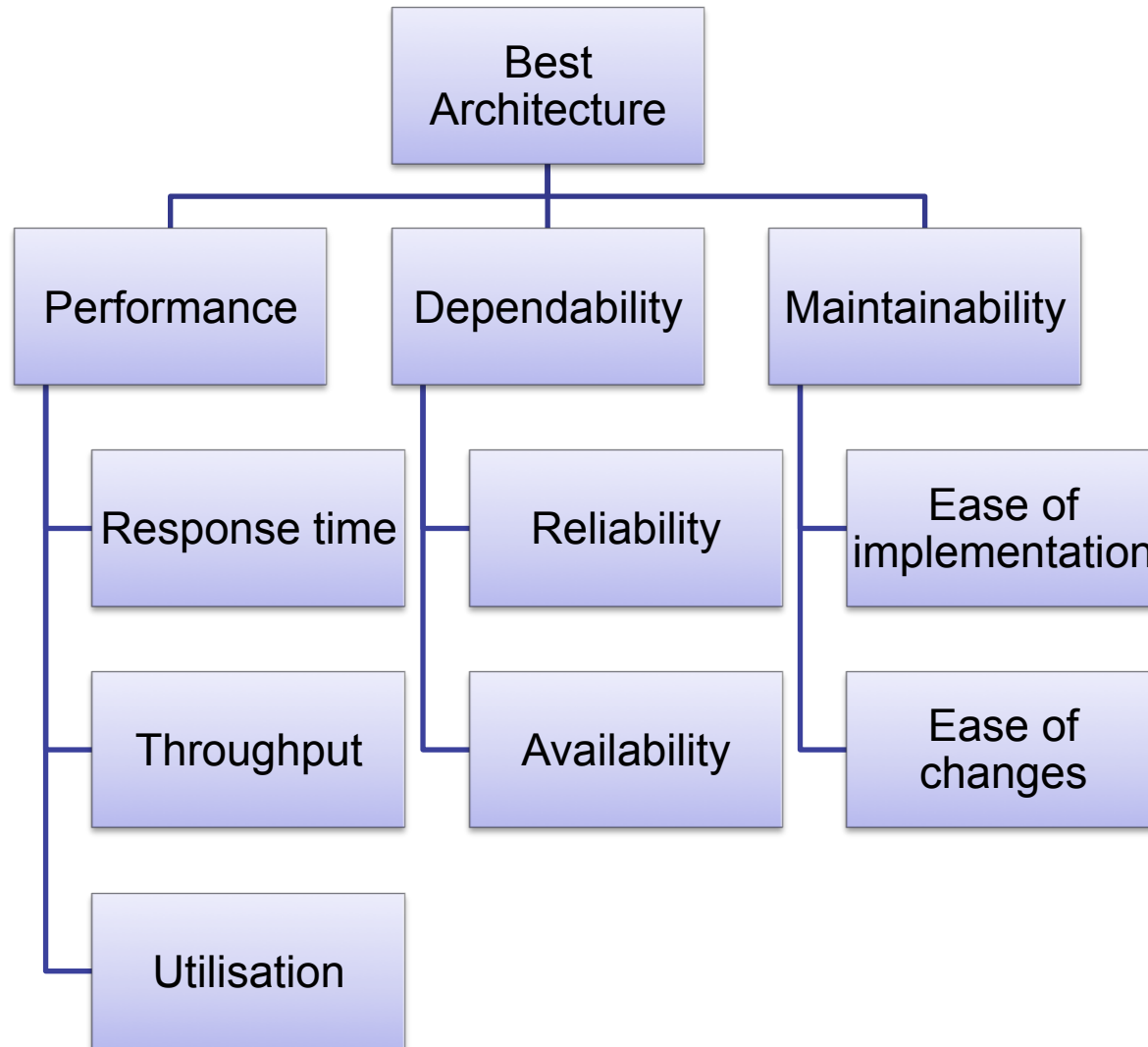
*Values e.g.
from a QN*

*Values e.g.
from a DTMC*

*Manual
input*

- If an alternative A is better in *all* criteria values than an alternative B, A is said to dominate B $\rightarrow$ B can be removed from the list of alternatives
 - E.g. Alternative 1 dominates Alternative 2
- The set of alternative which are not dominated by any other alternative is called the Pareto-optimal set or (if shown in figures) the Pareto-front

1st Step: Create a Hierarchy



- How to formalise priorities?
- Naive approach: Let stakeholders assign direct weights
- Problem
 - Decision theory research shows stakeholders give bad weights when asked to do it directly
 - Test yourself: Which weight is your preference for performance vs. reliability?
- Solution
 - AHP uses pair-comparisons
 - Compare two sub-goals of a given parent goal
 - Judge it quantitatively

- Use Scale from 1 to 9 (1-5 or 1-15 also used)
 - 1 = equally important
 - 3 = a bit more important
 - 5 = more important
 - 7 = much more important
 - 9 = extremely more important
 - 2,4,6,8 = intermediate values
 - Use 1/5 for „less important“ and so on
- Advantages
 - Easier to judge and express
 - Pairwise comparison limits scope of comparison

Priorities example



*Derive a matrix
from answers*

	Performance	Reliability	Ease of Impl.
Performance	1	3	1/3
Reliability	1/3	1	1/9
Ease of Impl.	3	9	1

*Matrix has “symmetry” if answers are
consistent, AHP can also deal with
some inconsistency*

- Can be used to check consistency in the answers of the decision makers
- Let v_{ij}^h denote matrix entry ij in a matrix of the parent goal h
- The comparison matrix is consistent if

$$v_{ik}^h = v_{ij}^h \cdot v_{jk}^h \quad \forall i, j, k \in U(h)$$

holds.

(with $U(h)$ contains the indices of the criteria or alternatives)

- For consistent matrices it is sufficient to determine the first row, i.e., we have to determine $|U(h)| - 1$ pair comparisons

- Let $\vec{w}^h$ denote the weights of subgoals used to determine the value of the parent goal
- $\vec{w}^h$ should reflect the preferences of the decision maker as given in the matrix
- That is

$$v_{ij} \approx \frac{w_i}{w_j}$$

i.e. the weights should reflect the relative preferences

- To ensure comparability with other goals normalise $\vec{w}^h$

$$\sum_{i=1}^{|U(h)|} w_i = 1$$

- If matrix is consistent, take arbitrary column vector and normalise

$$w_i = \frac{v_{ij}}{\sum_{k=1}^{|U(h)|} v_{ki}}$$

- Example: 2nd column = (3,1,9), i.e., it follows

$$\vec{w} = \left(\frac{3}{13}, \frac{1}{13}, \frac{9}{13} \right)$$

- Otherwise find a solution with as little deviation as possible
→ Heuristics exists

- Determine eigenvector belonging to the maximum eigenvalue showed to be a good heuristic
- Process
 - Solve characteristic equation $\det(V - I\mu) = 0$
 - Pick maximum eigenvalue μ_{max}
 - Determine the matching eigenvector by solving $(V - \mu_{max}I)x(\mu_{max}) = 0$
 - Let $\vec{w} = x(\mu_{max})$

- There is a inconsistency index telling us the inconsistency of the matrix

$$IK(V) = (\mu_{max} - |U(h)|) / (|U(h)| - 1)$$

- Problem $IK(V)$ depends on the size of V
- The larger V the more likely are violations of the consistency constraint
- Solution: Use randomly generated V 's as reference to normalise the metric. This is called $ZI(|U(h)|)$
- Heuristic for too inconsistent matrices: If

$$\frac{IK(V)}{ZI(|U(h)|)} > 0.1 \quad \text{then redo pair comparisons}$$

Determine utility values



- Numeric values (1 / RT, 1 – PROFOD)
 - Normalise values
 - Multiply normalised vector with weight
 - Ensure larger values correspond to more utility
- Qualitative values (e.g. ease of implementation)
 - Again use pair comparisons
 - Determine utility in the same way as weights
 - Use normalised vector as utility

Utility of our alternatives



	Avg. Job / s = 1 / Avg. RT	1 - PROFOD	Ease of impl. [5 = easy, 1 = hard]
Alternative 1	0.5	0.34	3/9
Alternative 3	0.33333	0.311	5/9
Alternative 4	0.16666	0.345	1/9

*Maybe a better
scaling is needed
here??*

Solution for our simple example



- Solve (for Alternatives 1,3,4, i.e., removing the dominated)

$$\begin{pmatrix} 0.5 & 0.34 & 0.333 \\ 0.333 & 0.311 & 0.555 \\ 0.166 & 0.345 & 0.111 \end{pmatrix} \begin{pmatrix} 0.23 \\ 0.076 \\ 0.694 \end{pmatrix} = \begin{pmatrix} 0.372 \\ 0.485 \\ 0.141 \end{pmatrix}$$

- Select Alternative with maximum weighted value
- In this case, it is Alternative 3 with a value of 0.485

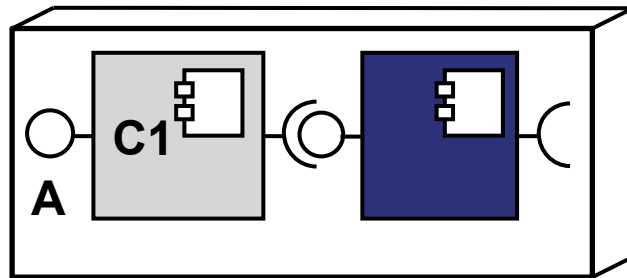
- Rank inversion
 - Adding alternatives may alter alternative ranking
 - Even for irrelevant alternatives
 - One reason is normalisation over the range of values
- Number of pair comparisons
 - $\min |U(h)|-1, \max |U(h)|(|U(h)|-1)/2$
 - More comparisons allow to judge inconsistency
 - However, people get tired answering pair comparisons
- Scale
 - Good scale for AHP determined in practice
 - However, no rationale for the scales used
- Nevertheless, helpful in practice for small numbers of alternatives



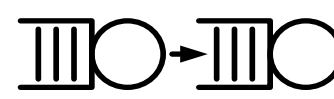
Automated Quantitative Approach

Using Meta-Heuristics

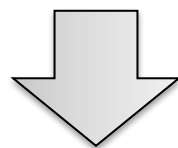
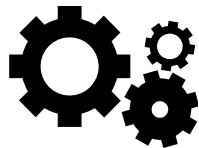
[Slides with kind permission from Anne Koziolk]



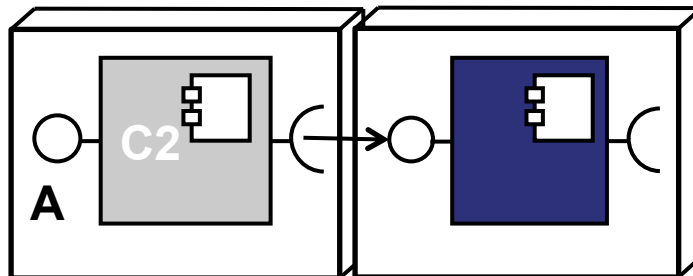
Transform



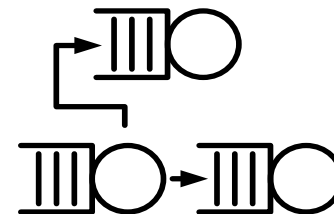
Solve 3 sec



Change component and deployment

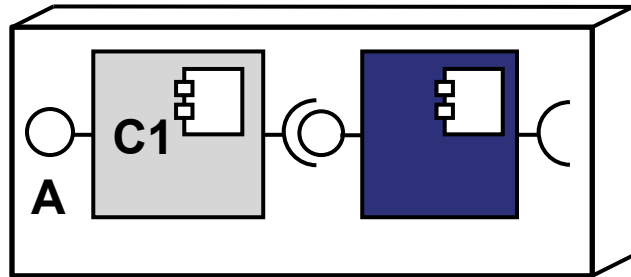


Transform

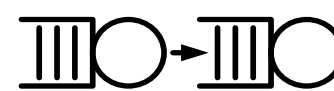


Solve 2.5 sec

[MKB10]

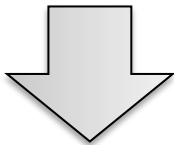
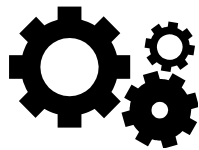


Transform

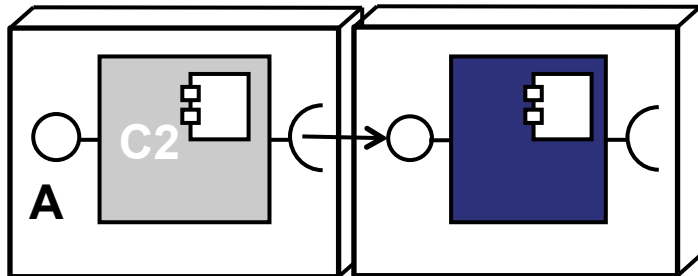


Solve

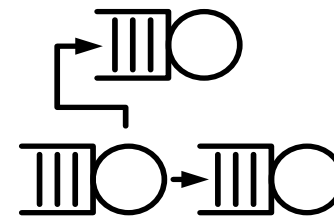
3 sec
p(fail) 0.01%
\$ 5700



Change component and deployment



Transform



Solve

2.5 sec
p(fail) 0.02%
\$ 12000



➔ Optimise multiple criteria at once

[MKB10]

Multi-criteria optimisation



Time
5s

Architectural Candidate

A

\$40K

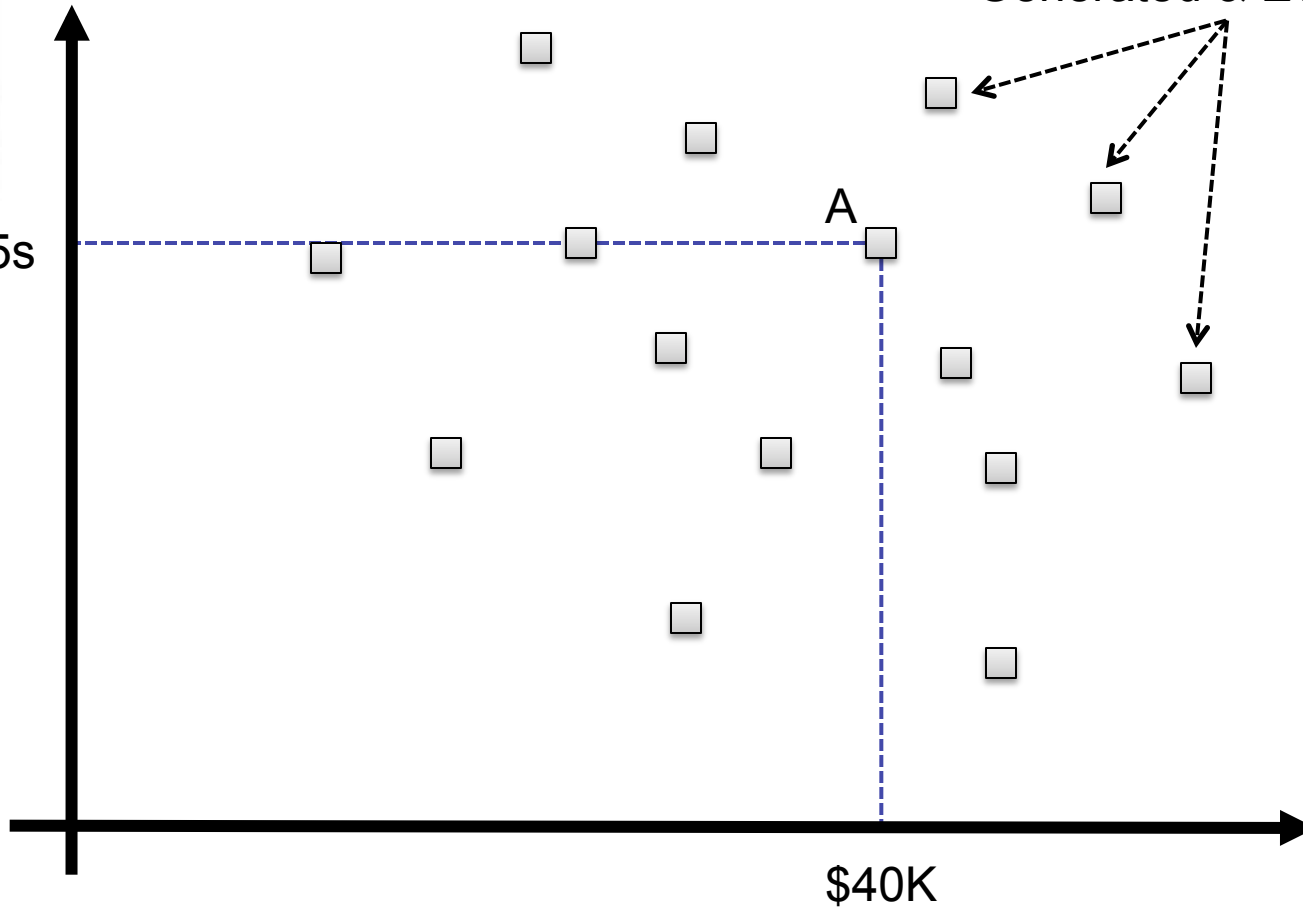


Costs
[MKB10]

Multi-criteria optimisation



Time
5s



Generated & Evaluated



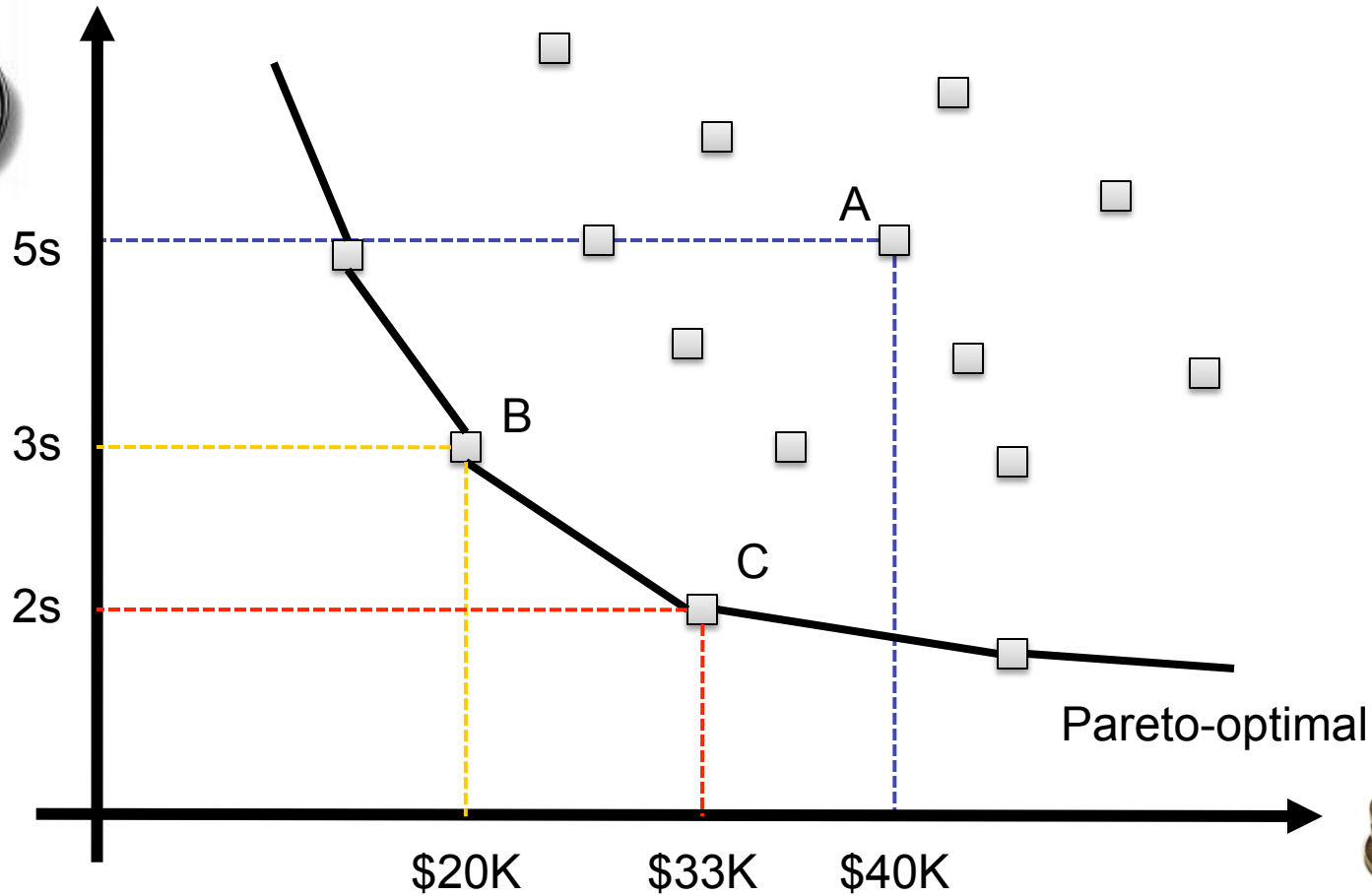
Costs

[MKB10]

Pareto front

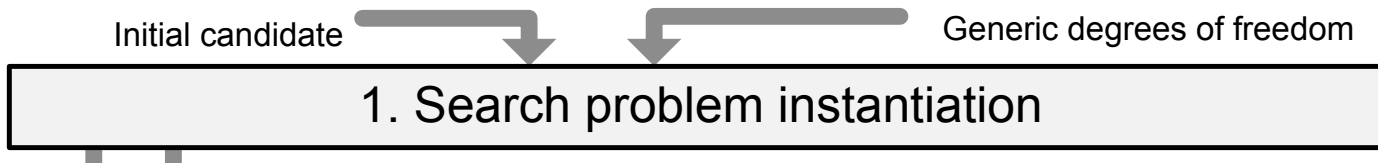


Time



Costs

[MKB10]



[MKB10]

Software

Component selection

Middleware selection

Component replication

Software configuration

Deployment

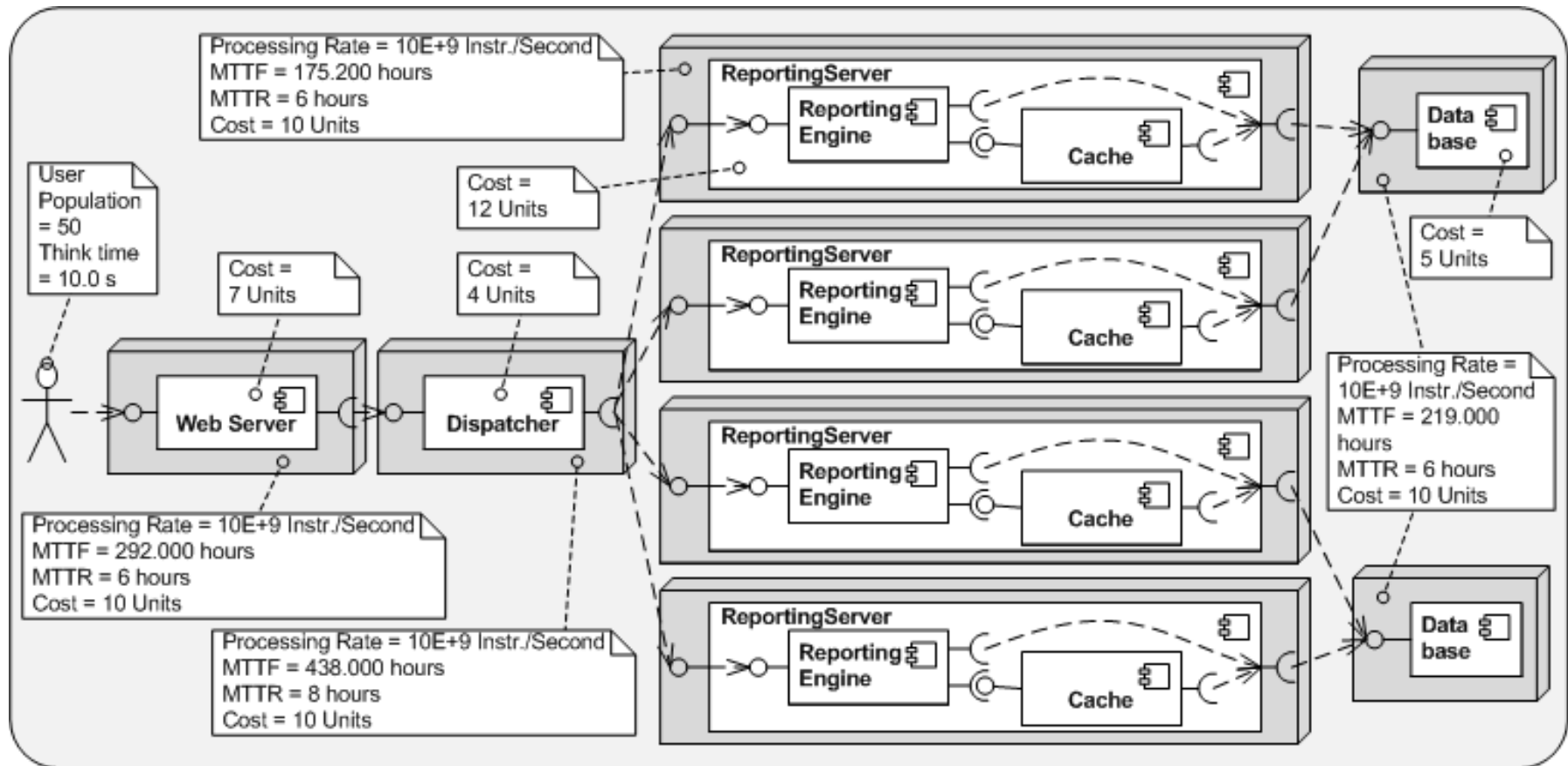
Allocation

Processing Rate

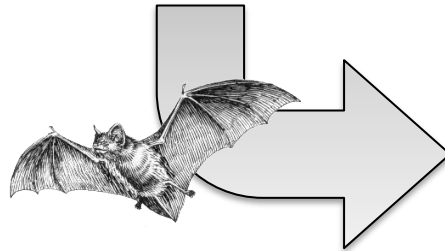
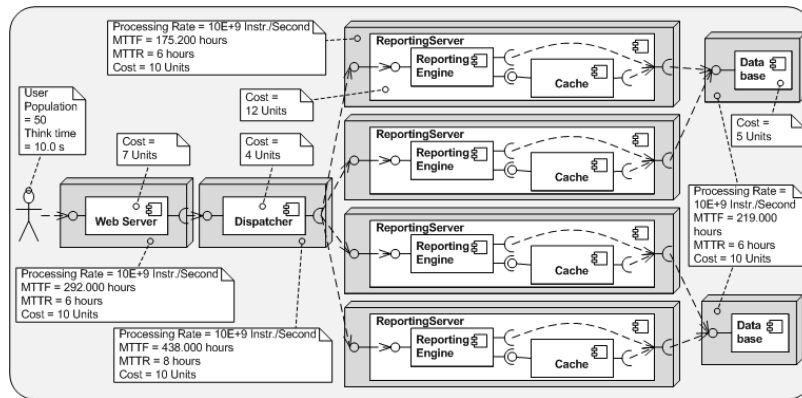
Number of Servers

[MKB10]

Case Study

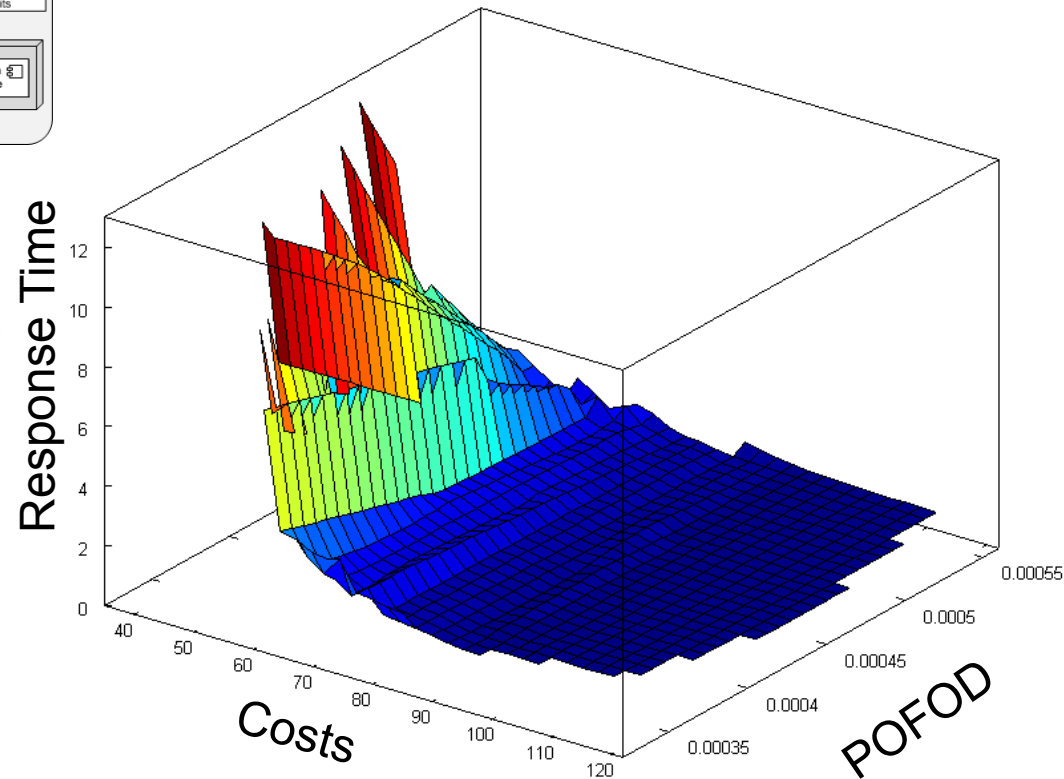


[MKB10]

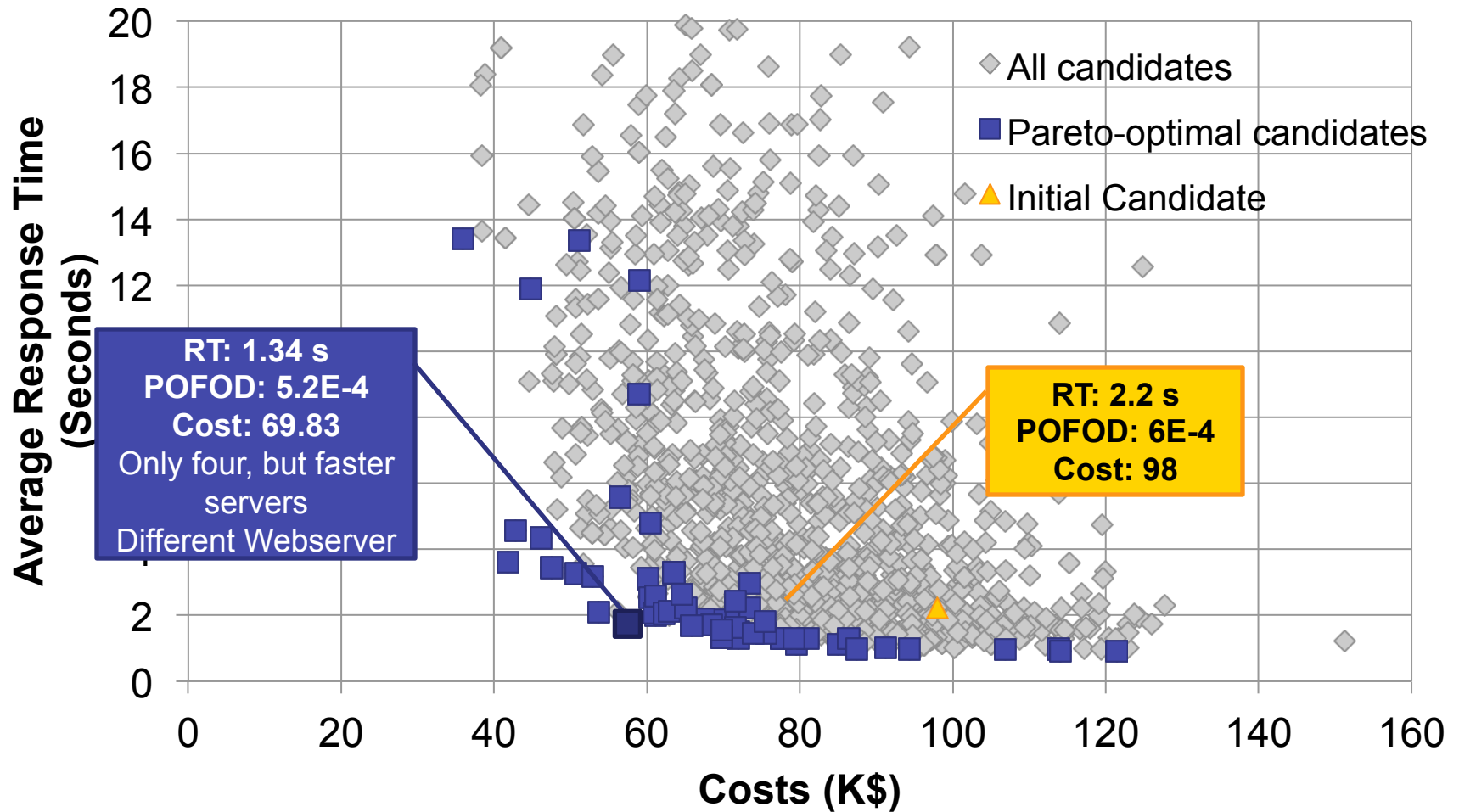


- 1235 candidates
- 58 Pareto optimal
- 8h running time

- Component allocation
- Processing rates
- Component selection



[MKB10]



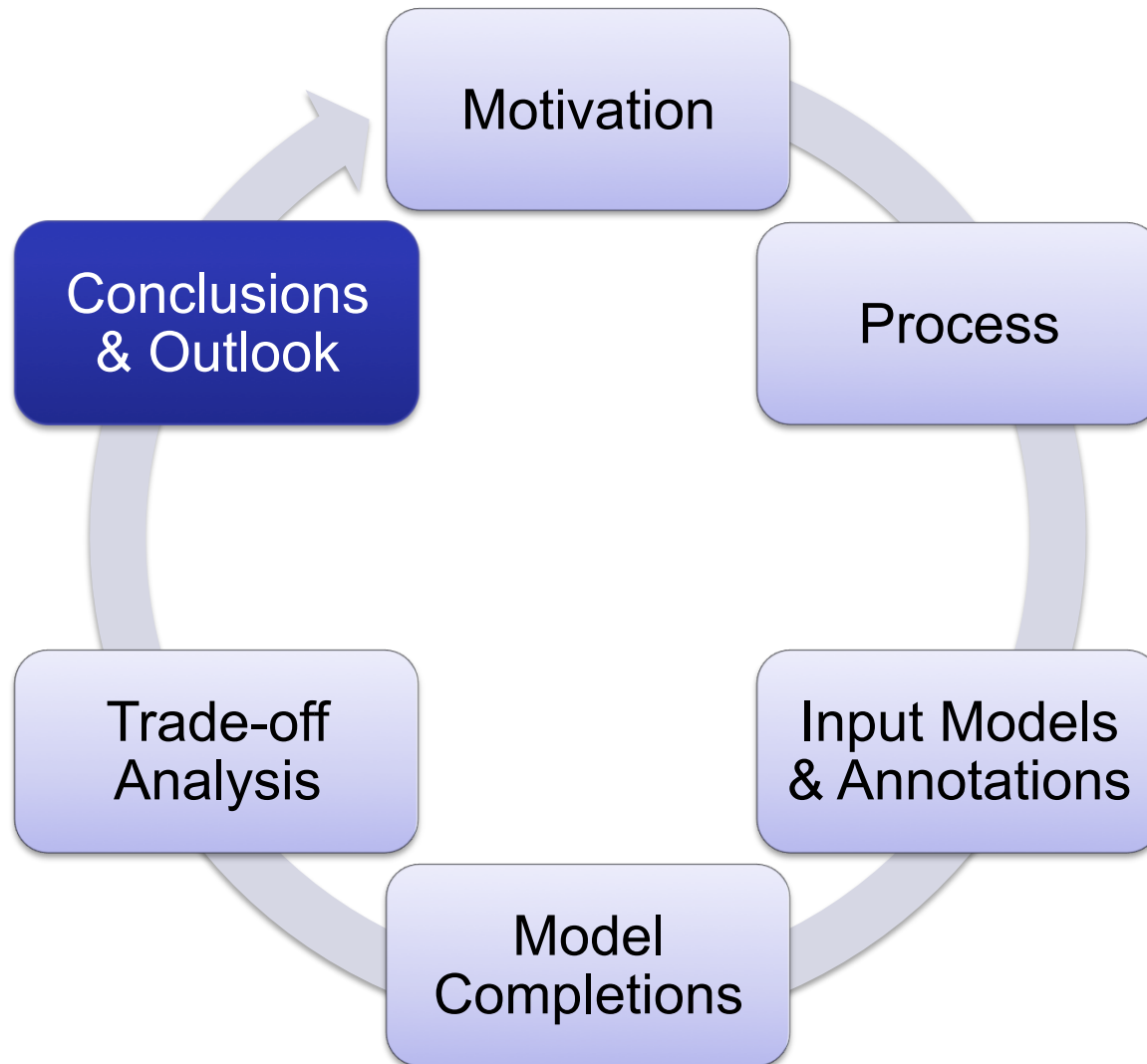
[MKB10]

ArcheOpteryx

- E.g., Allocation of Embedded Components
- Reliability and Cost

Deep Compass

- Robocop Component
- Schedulability and costs



Lessons Learned

- Motivation for Model-Driven QoS analysis
- Process for model-driven analysis
- Transformations & Refinements
- Trade-off Analysis

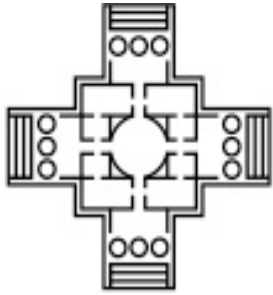
Outlook

- New input models and system types
 - Mechatronic systems
 - Self-adaptive systems
- Automated selection of right abstraction level

Questions, Comments, Feedback?



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Palladio
Component Model



SFB 901
ON - THE - FLY COMPUTING

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- Model-Based Software Performance Analysis, Vittorio Cortellessa, Antinisca Di Marco, Paola Inverardi
- Performance Solutions: A Practical Guide to Creating Responsive, Scalable Software, Connie Smith, Lloyd G. Williams
- The Art of Computer Systems Performance Analysis: Techniques for Experimental Design, Measurement, Simulation, and Modelling: Techniques for Experimental Design, Measurement, Simulation and Modelling, Raj Jain
- Queuing Networks and Markov Chains: Modeling and Performance Evaluation with Computer Science Applications, Gunter Bolch, Stefan Greiner, Hermann de Meer