

# Causal link matrix and AI planning:

## *A model for Web service composition*

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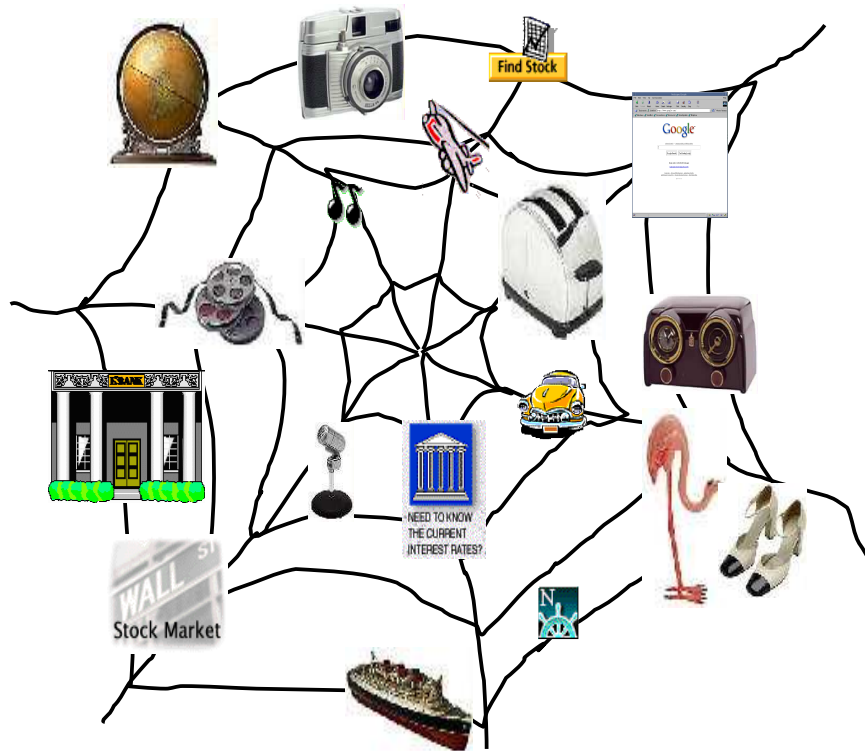


# Overview and Contents

- Introduction
- Background
- Web Service Composition Problem
- Causal link matrix: A formal model for Web service composition
- An AI planning-oriented composition through a *CLM*
- A *causal link*-based optimization
- Related Work
- Conclusion and Future Work



# Introduction



As Web services proliferate:

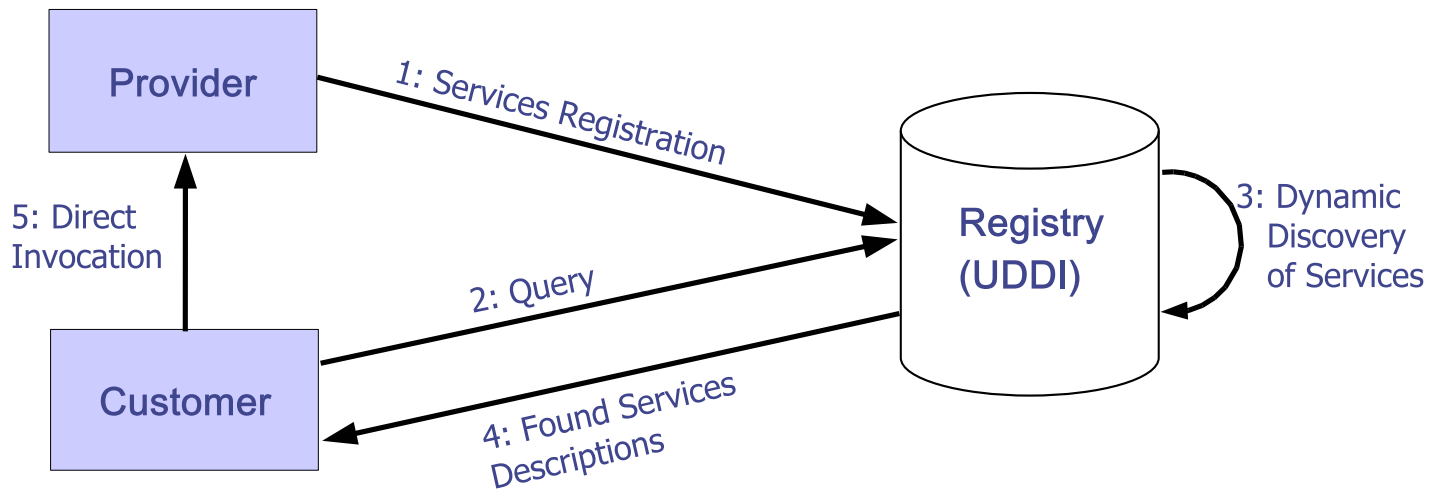
- It becomes difficult **to find** the specific service that can perform the task at hand;
- It becomes even more difficult when there is **no single service** capable of performing that task.
- But there are **combinations** of existing services that could.

- Ultimate goal: **Automated Web service composition** in a semantic context i.e., the Semantic Web.



# Web Services

- A **Web Service** is a **software application** identified by a **URI**, whose **interfaces** and binding are capable of being **defined**, **described** and **discovered** by XML artifacts and supports **direct interactions** with other software applications using XML based **messages** via **Internet-based protocols** (W3C definition).

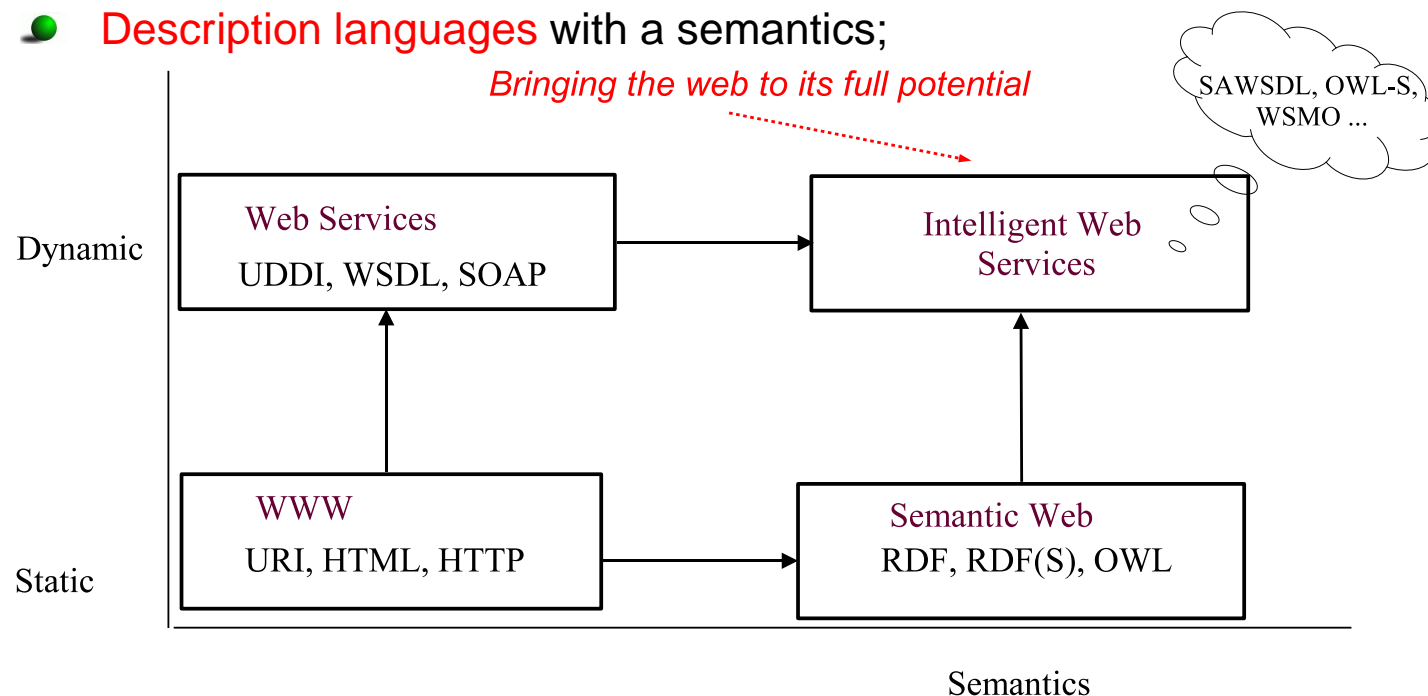


- A protocol communication.



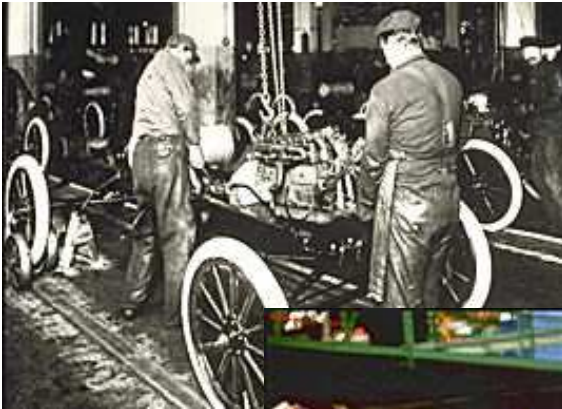
# Web service, Semantic Web and Semantic Web Services

- Nowadays Web: syntax-based Web.
- Semantic Web is an extension of current Web in which information is given well-defined meaning.
  - Ontology: a key enabling technology (RDF, OWL)
- **Semantic web** principles applied to **web services**
  - Give a **semantics** to **services description**;
  - **Description languages** with a semantics;



# Challenges for the Success of Semantic Web Services

From



To



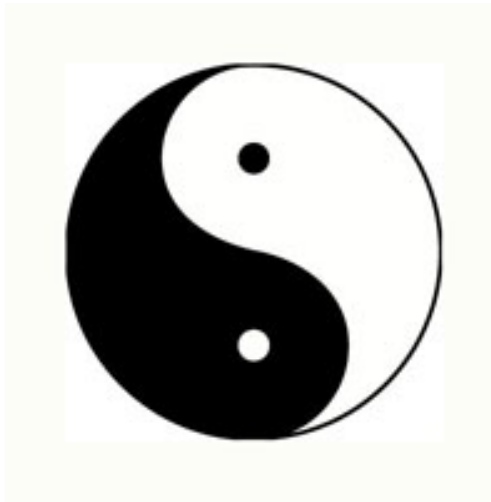
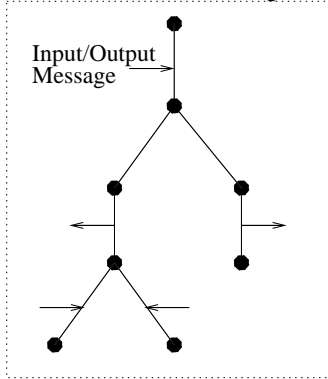
Sharing at best the skills of Human and Computer for:

- Better precision
- Repetitive tasks
- More creativity
- Time-to-product
- Time-to-market
- Lower price/better quality ...

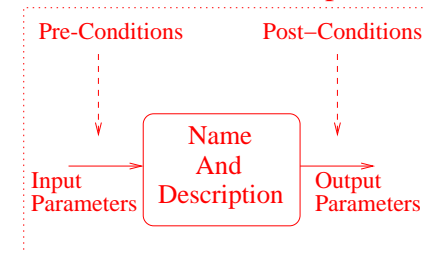


# Functional Level and Process Level Description/Composition

Behavioural Description



Functional Description

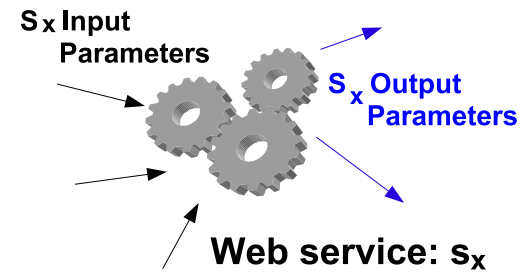
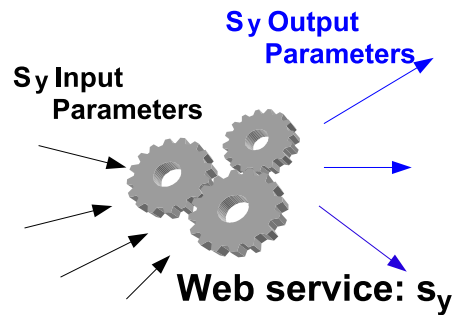


- Such as the Yin and the Yang, **FLC** and **PLC**
  - are **not opposite** but **complementary**;
  - are **interdependent** i.e., they are mutually dependent;
  - can be **further subdivided** (e.g., *FLC* is divided into Input/Output and Pre-Condition/Post-Condition composition);
  - **consume** and **support** each other (e.g., *PLC* consumes *FLC*);
  - can be **transformed** into one another (e.g., *FLC* is transformed into *PLC*);



# Causal link matrix: A formal model for Web service composition (1)

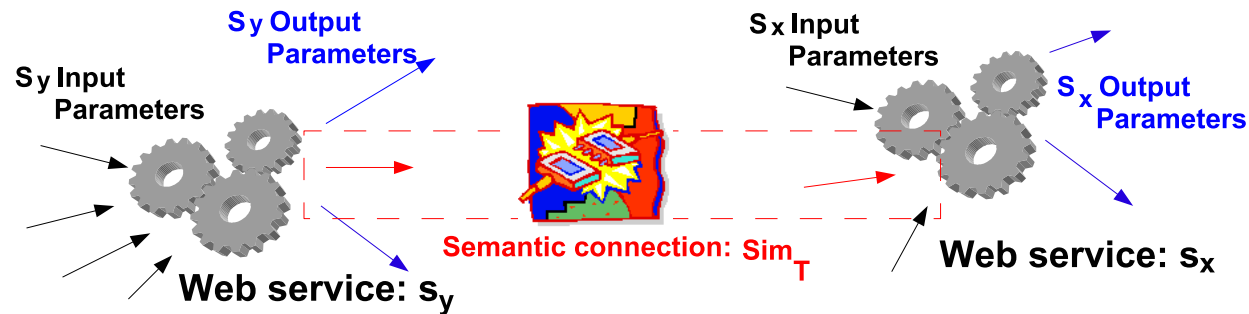
- **Semantic connection** between Web services is considered as essential to form new value-added Web services (Functional Level composition);





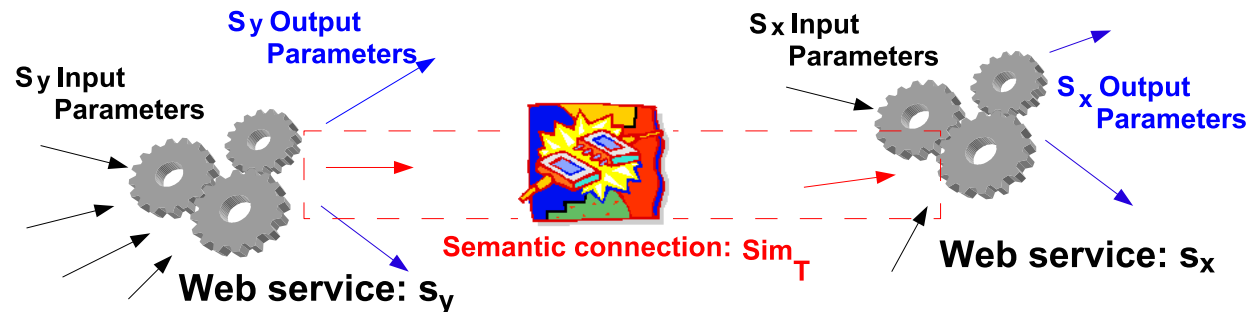
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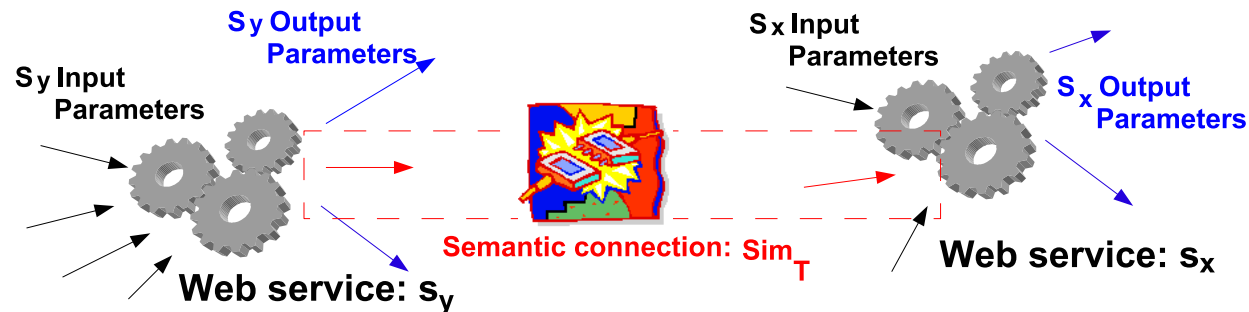
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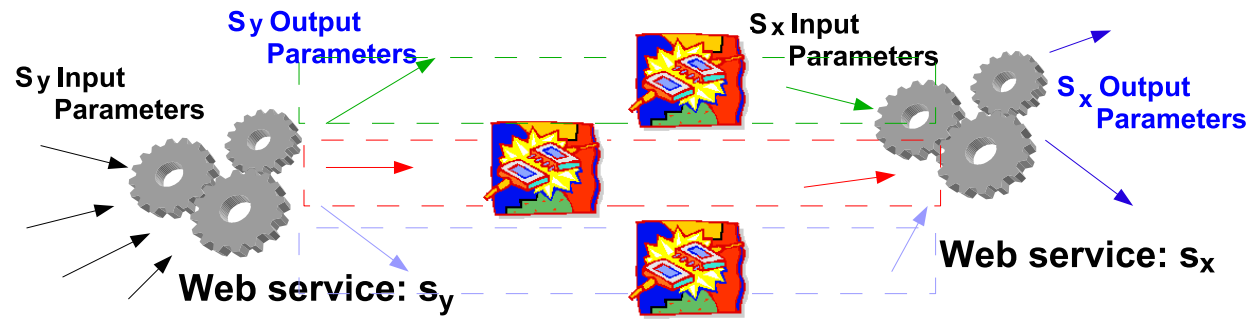


- So a **Causal link** is defined as a triple  $\langle s_y, Sim_{\mathcal{T}}(Out_{s_y}, In_{s_x}), s_x \rangle$ .



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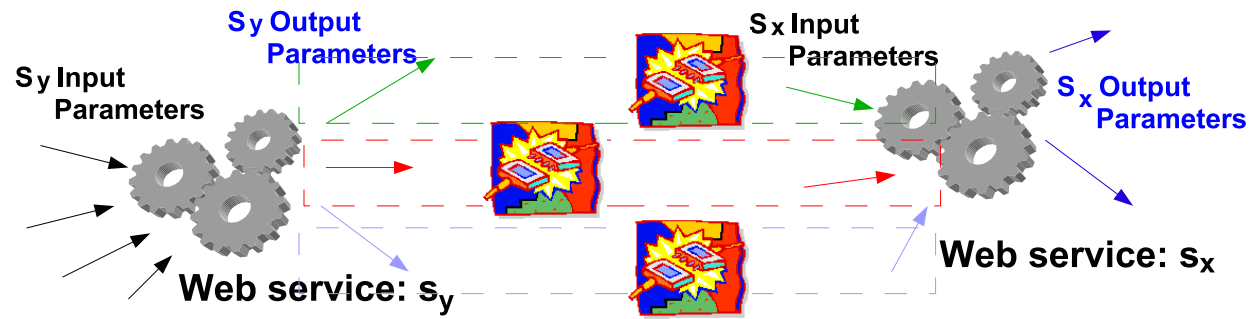


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- Composition as **sequences** of Web service is a necessary requirement to propose a solution plan.
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- Composition as **sequences** of Web service is a necessary requirement to propose a solution plan.
  - Such a composition is defined by the (trivial) **sequence-composability**  $s_x \circ s_y$ ;
- ... but not only e.g., **(parallel) disjunction**, and **non determinism** constructs.



# Causal link matrix: A formal model for Web service composition (2)

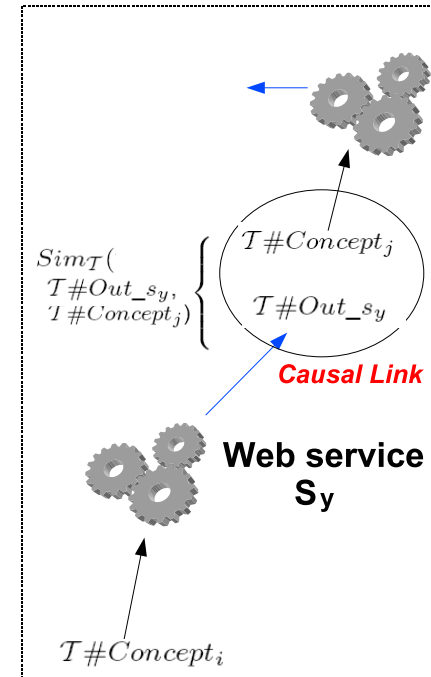
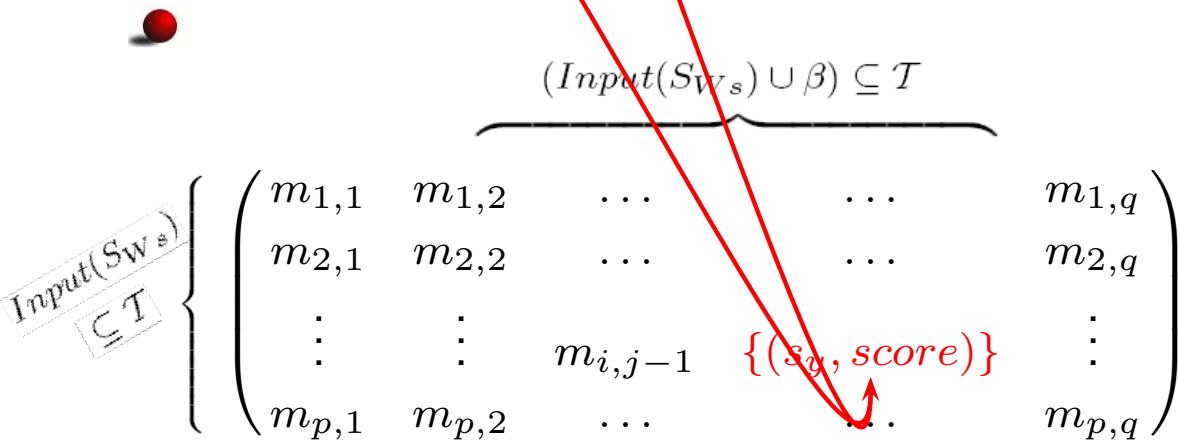
- Find an **appropriate** and **innovative** formal model for:
  - proposing a necessary **starting point** for the automation of WSC;
  - **improving** the way to store semantic links as Web service dependencies;
  - **easing** Web service composition and selection;
  - ... under the **Sequence-composability** constraints;
- The **key contribution** of the **Causal link matrix** is a **formal** and **semantic model** to **control a set of Web services** which are relevant for a Web service composition.
- The *CLM* aims at **storing** all those connections (i.e., **causal links**) by a pre-computation of Input and Output parameters matching: **Sequence-composability**.
- The *CLM* describes **all possible interactions** between all the known Web services in  $S_{W_s}$  as **semantic connections**.



# Causal link matrix: A formal model for Web service composition (3)

- A **Causal link matrix** is defined as  $M_{p,q}(\mathcal{P}((S_{W_s} \cup \mathcal{T}) \times (0, 1]))$ .
  - Rows  $r_i, i \in \{1, \dots, p\}$  are labelled by  $Input(S_{W_s}) \subseteq \mathcal{T}$ ;
  - Columns  $c_j, j \in \{1, \dots, q\}$  are labelled by  $(Input(S_{W_s}) \cup \beta) \subseteq \mathcal{T}$ ;
- Each entry  $m_{i,j}$  of a CLM  $\mathcal{M}$  is defined as a set of pairs  $(s_y, score)$  in  $(S_{W_s} \cup \mathcal{T}) \times (0, 1]$  such that

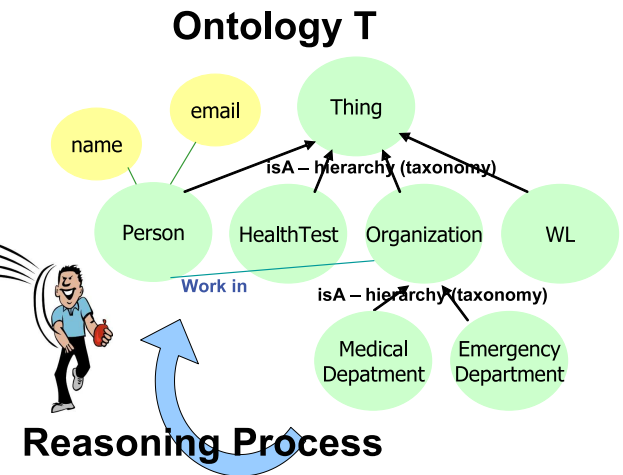
$$(s_y, score) = \begin{cases} (s_y, Sim_{\mathcal{T}}(Out_{s_y}, c_j)) & \text{if } s_y \in S_{W_s}, Out_{s_y} \in Out(s_y) \\ (s_y, 1) & \text{if } s_y \in \mathcal{T} \end{cases}$$



# AI planning and *CLMs*: A regression-based approach (1)

- Requirements:
  - An **ontology**  $\mathcal{T}$  to infer concepts Matching;

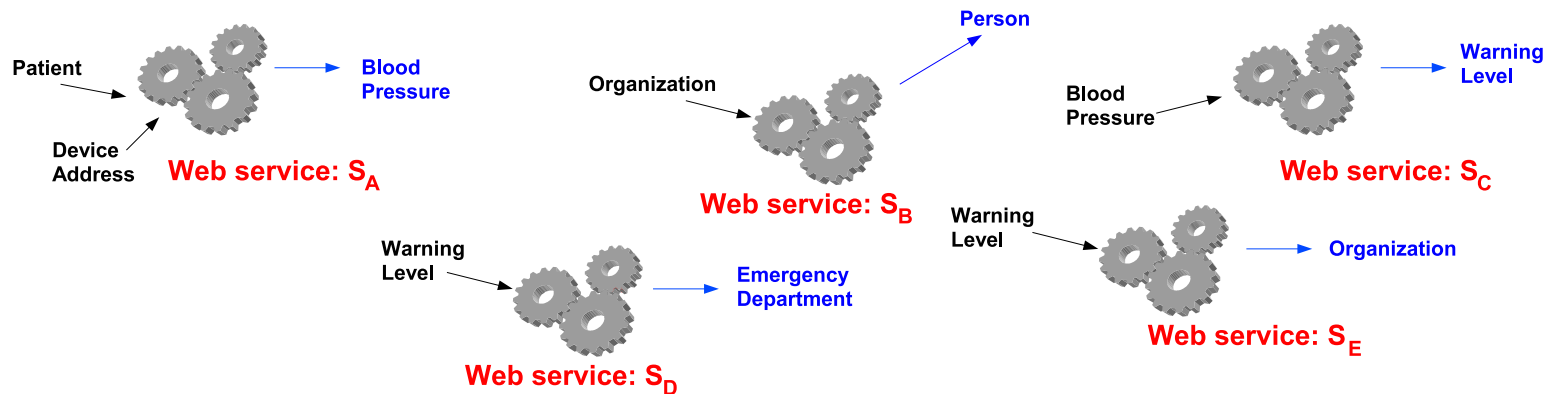
Output/Input Parameters		Input Parameters			
		$I_1$	$I_2$	<i>Organization</i>	$I_{\#\{Input\{SW_s\}\}}$
Output Parameters	$O_1$	$v_{1,1}$	$v_{1,2}$	$v_{1,i}$	$v_{1,n}$
	$O_2$	$v_{2,1}$	$v_{2,2}$	$v_{2,i}$	$v_{2,n}$
	<i>EmergencyDpt</i>	fail	fail	plug-in	fail
	$O_{\#\{Output\{SW_s\}\}}$	$v_{m,1}$	$v_{m,2}$	$v_{m,i}$	$v_{m,n}$





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  - $S_{W_s}$  refers to a set of possible state transitions;



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    - $\mathcal{KB}$  is the *Initial state*. **Individuals** e.g., an instance of the concept **Patient** and another of **Device Address**.

**Patient**

#Patient1234

**Device Address**

#http://localhost:50000/deviceBP



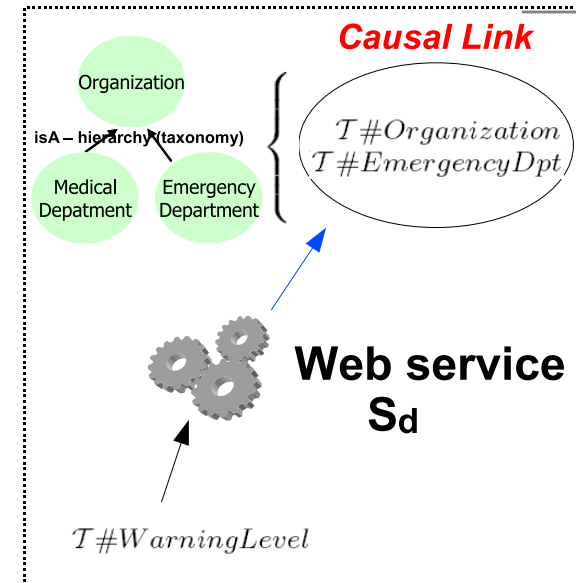
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    - $\beta \subseteq \mathcal{T}$  is an explicit goal representation. A **TBox element** e.g., the concept **Person**.



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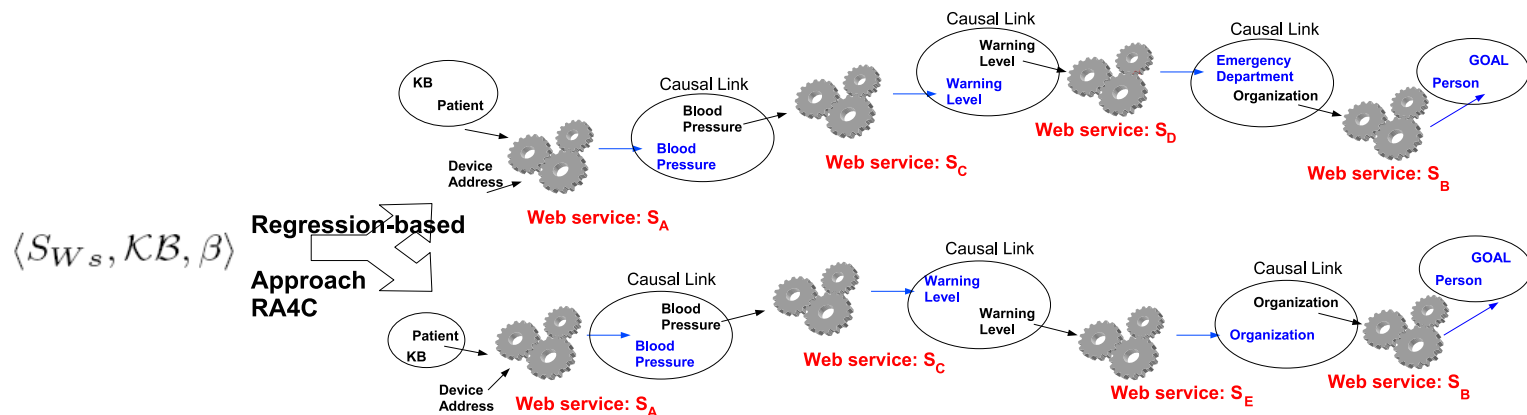
	Device Address	Blood Pressure	Organi- zation	Patient	Warning Level	Person
Device Address	$\emptyset$	$\{(S_a, 1)\}$	$\emptyset$	$\emptyset$	$\emptyset$	$\emptyset$
Blood Pressure	$\emptyset$	$\emptyset$	$\emptyset$	$\emptyset$	$\{(S_c, 1)\}$	$\emptyset$
Organization	$\emptyset$	$\emptyset$	$\emptyset$	$\{(S_b, \frac{1}{3})\}$	$\emptyset$	$\{(S_b, 1)\}$
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  - Computation of **consistent**, **correct** and **complete** solution plans of the Functional-level composition with the backward chaining technique: A plan of Web services is generated for finding an optimal plan among various compositions.



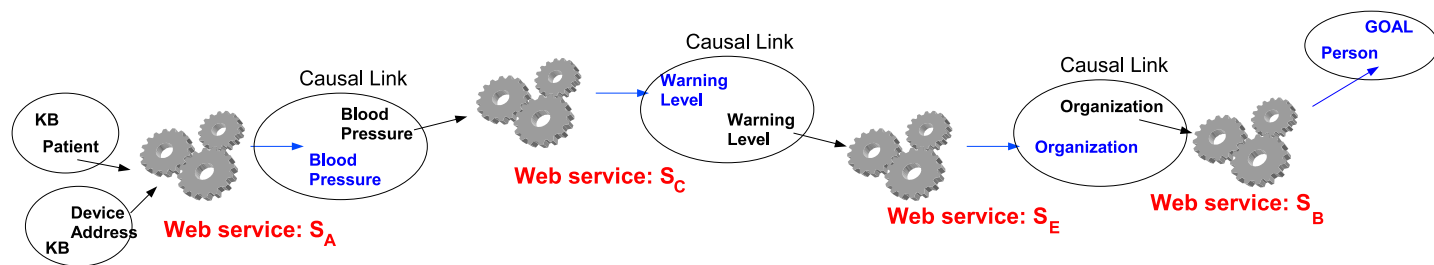
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  - Computation of the optimal solution plan by pruning of the plan solution space.
- Assumption:
  - The set of Web services  $S_{W_s}$  is closed.
  - **Non determinism, Implicit goal, Fuzzy Web service description and behaviour are out of scope.**



# AI planning and CLMs: A regression-based approach (2)

● Suppose a CLM  $\mathcal{M}$  and the planning problem  $\Pi = \langle S_{W_s}, \mathcal{KB}, \beta \rangle$ ;



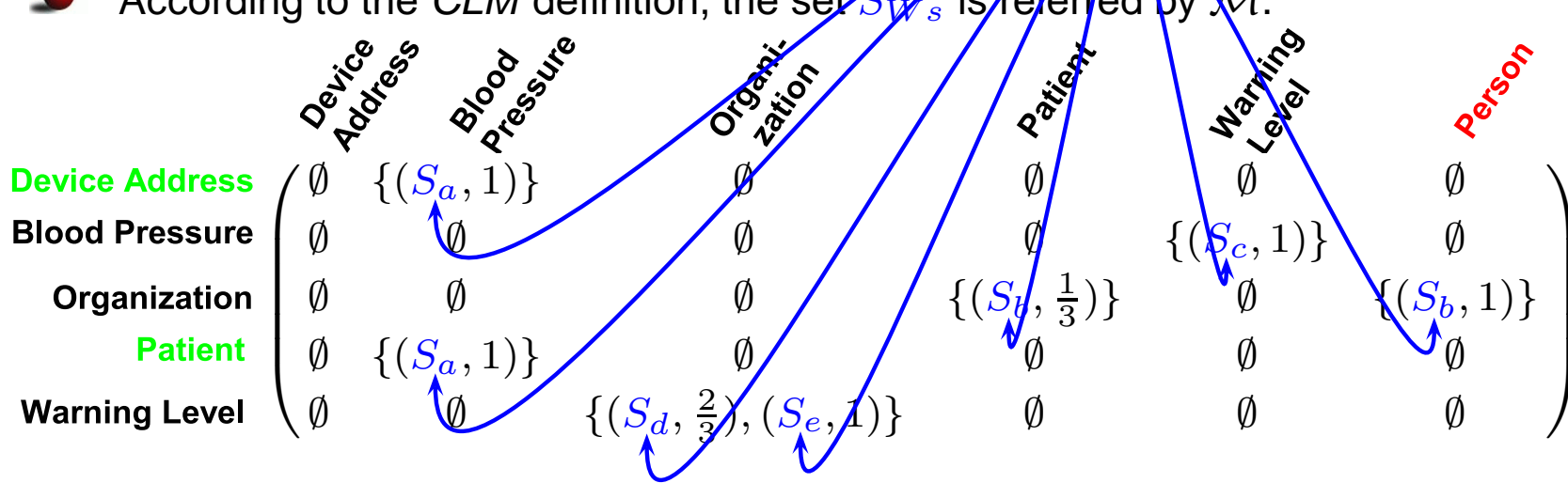
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- Suppose a CLM  $\mathcal{M}$  and the planning problem  $\Pi = \langle S_{W_s}, \mathcal{KB}, \beta \rangle$ ;
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- in case *DeviceAddress* and *Patient* are instantiated concepts.



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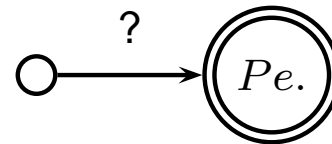


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- From the goal *Person*

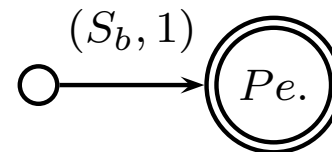


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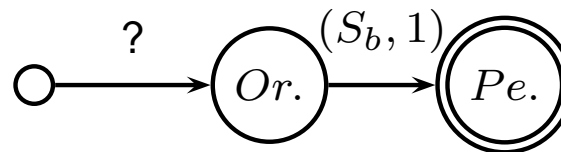
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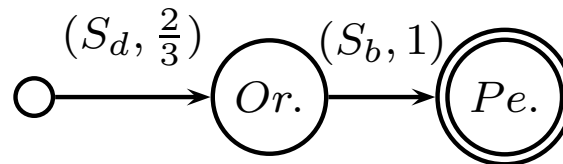
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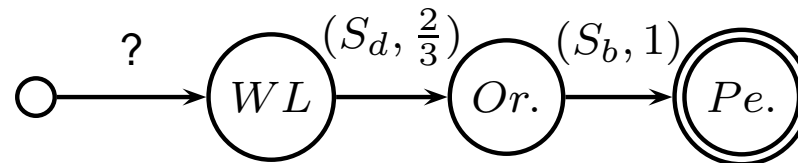
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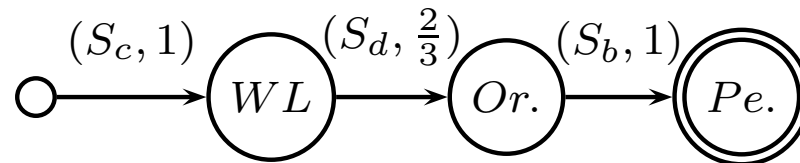
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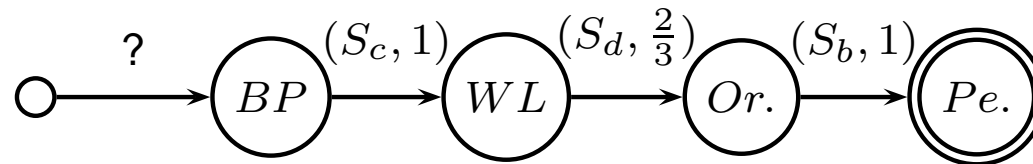
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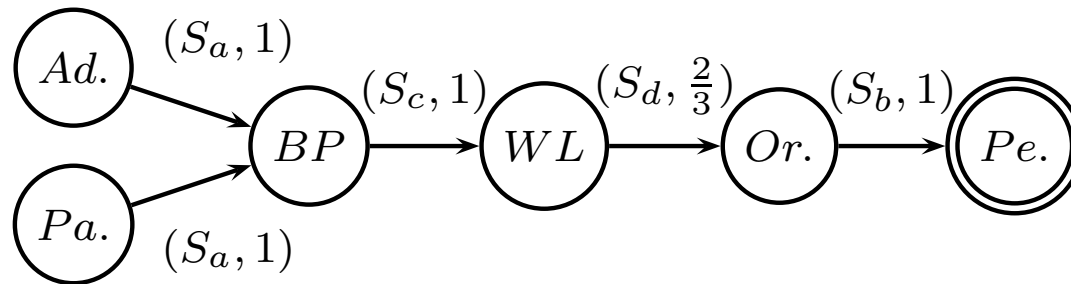
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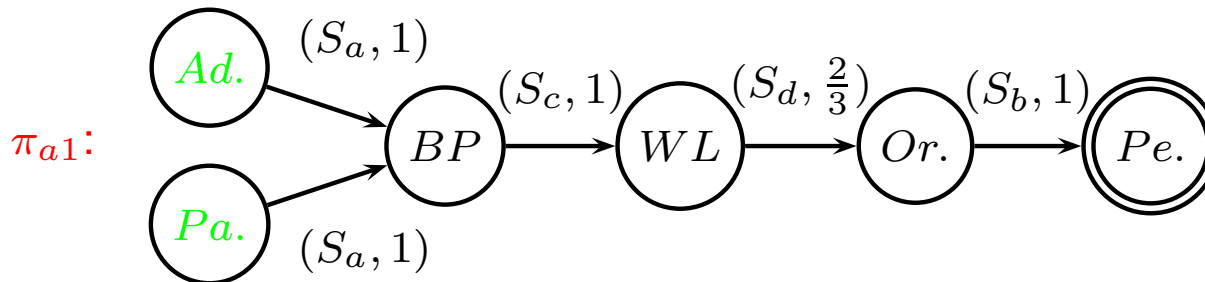
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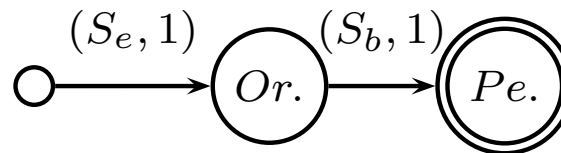


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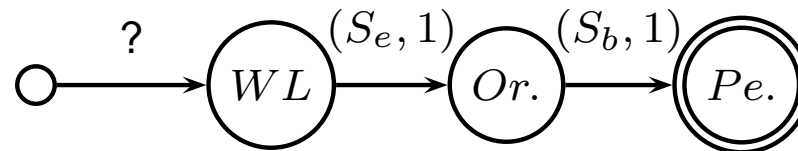
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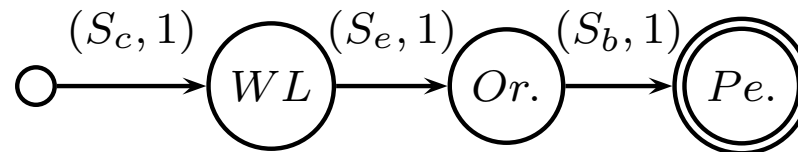
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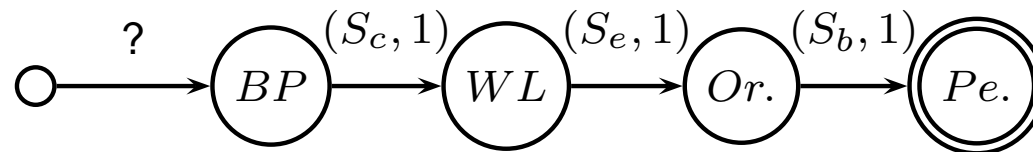
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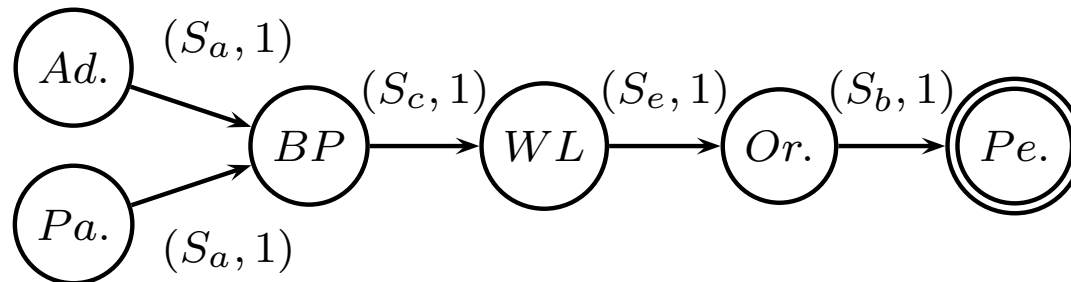
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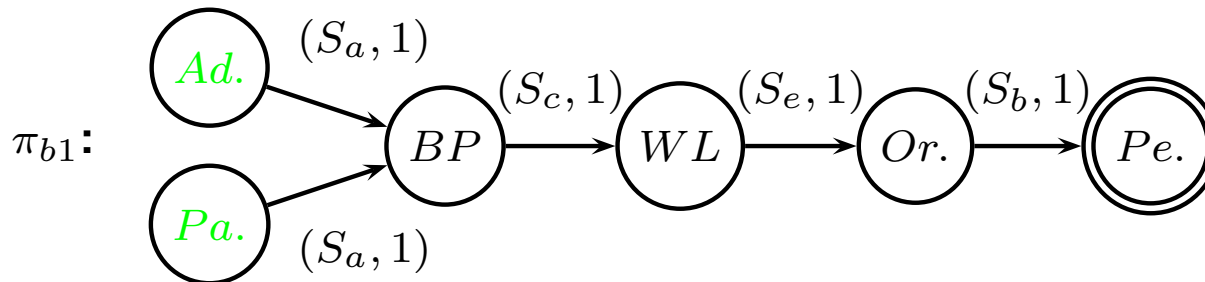
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# Formal results

- The algorithmic complexity for the *CLM* construction is:
  - $\theta(\#(Input(S_{W_s})) \times \#(Output(S_{W_s})))$ ;
  - i.e.,  $\theta((Max\{\#(Input(S_{W_s})), \#(Output(S_{W_s}))\})^2)$ ;
  - so **square** in the worst case.
- The algorithmic complexity of the *Ra<sub>4</sub>C* algorithm is time **polynomial**
  - in
    - *#rows*, *#columns* of the *Causal Link Matrix*,
    - i.e.,  $\#(Input(S_{W_s}))$ .
  - with
    - Fail nodes detection;
    - Loop nodes detection;
- In general cases  $\theta(BuildClm) > \theta(Ra_4C)$ .



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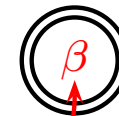


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- $\beta$  is still the goal,

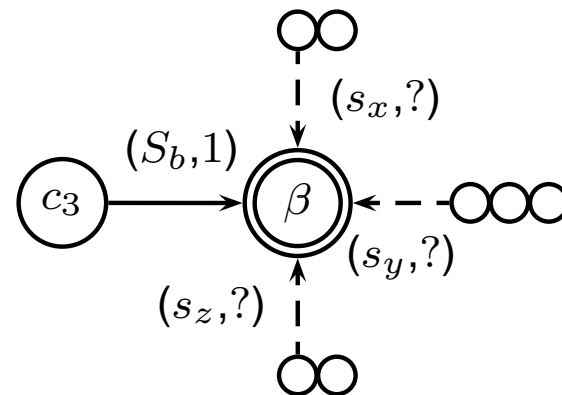


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- $S_c$  is a set of couple  $(s_y, v)$  such that  $s_y$  is a Web service with an output  $\beta$  and inputs  $I_i, 1 \leq i \leq \#In(s_y)$ :  $\langle s_y, Sim_{\mathcal{T}}(Out_{s_y}, \beta), s_x \rangle$  is a valid causal link.

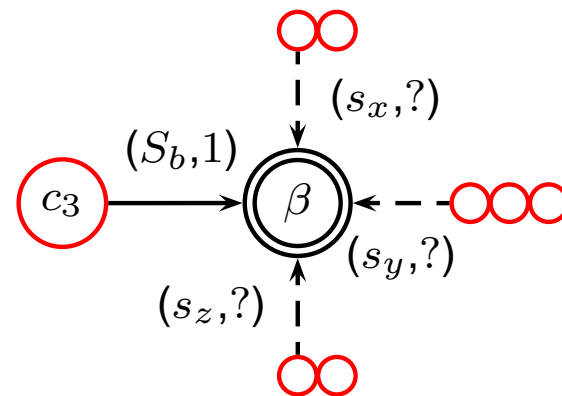


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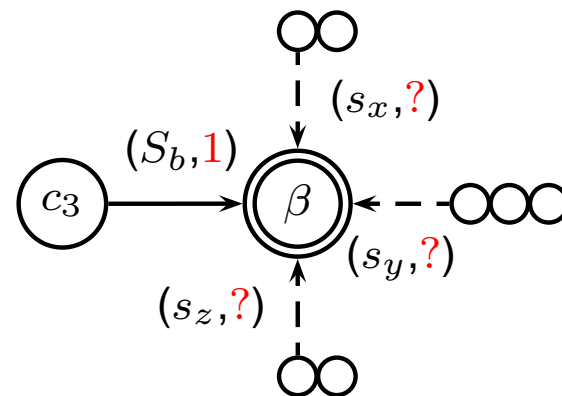


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- The **first sum** is depending on semantic similarity between an output parameter of  $s_y$  and  $\beta$ .

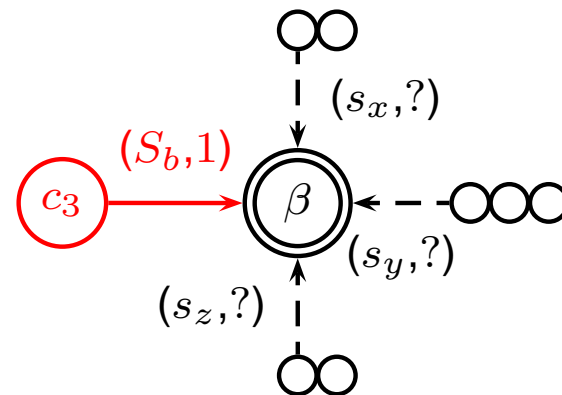


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$$W_{Max}(\beta) = Max_{S_c} \left\{ \frac{1}{\#In(s_y)^2} \sum_{In(s_y)} m_{I_i, \beta} \cdot score \times \left( \prod_{In(s_y)} (W_{Max}(I_i)) \right) \right\}$$

- The **first component** proposes a *causal link*-based optimization: The shorter is the solution path the better it is.

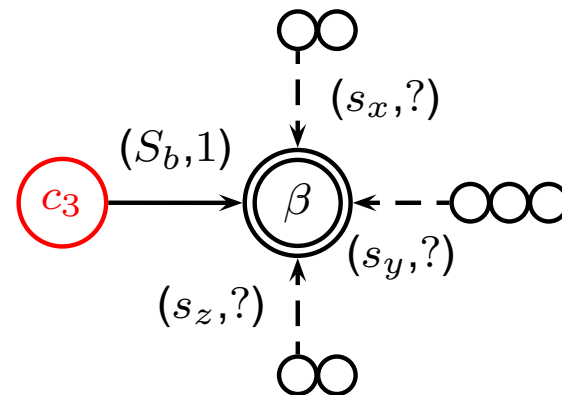


# A causal link-based optimization

- The  $Ra_4C$  algorithm returns a set of **correct, complete and consistent plans**.
- However such a set may contain a **large number of plans**:
  - **Pruning strategies** of plans'space is necessary to propose an **optimal solution**;
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- The **second component** is the recursive process.

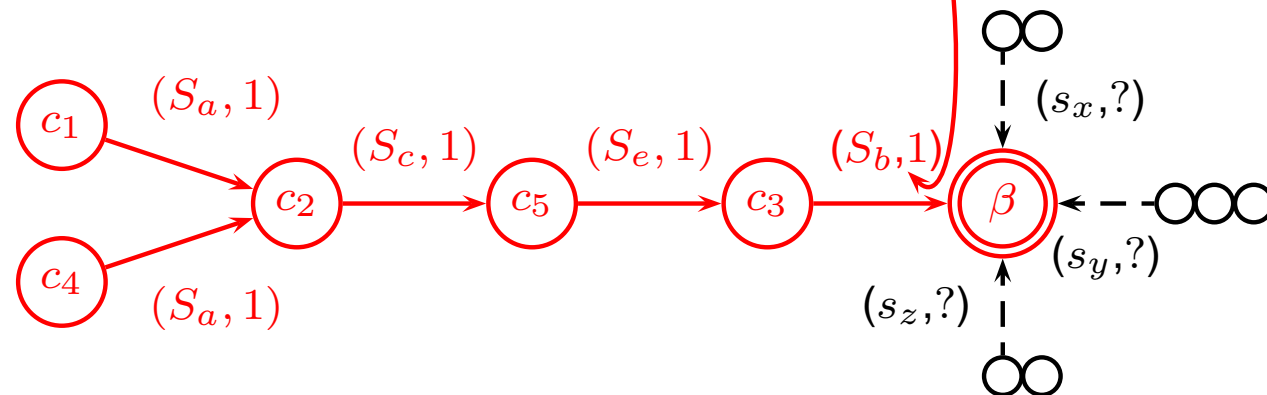


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- $Max_{S_c}$  is a  $n$ -arity function which returns **the maximum value** between  $n$  float value(s) depending on the  $S_c$  elements.



# A *causal link*-based optimization

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- Even if the optimal global plan may be obtained by  $Max_{p \in Plan} \{Weight(p)\}$ .
  - wherein the function  $Weight(p)$  computes the weight of each solution plan discovered by the  $Ra_4C$  algorithm.





# Related Work

- Models for automatic composition have roots in
  - AI planning (Situation calculii: `strips` influence, HTN) e.g., [Golog], [ConGoloG], [SHOP2];
  - Logic (Description Logics, Linear Logic, first-order logic);
  - (Guarded) Finite State Automata e.g., [WSAT], [Roman Model], [Mealy Model], [COCOA];
  - Petri nets, Coloured Petri Nets;
  - $\pi$  Calculus, Process Calculus.
- *What is the right way to model web services and their compositions?*
- Web services composition:
  - **Functional-level composition**: e.g., [M.Paolucci et al. 2002], [E.Sirin, J.Hendler, and B.Parsia 2003], [J.Cardoso and A.Sheth 2003], [R.Zhang et al. 2003].
  - **Process-level composition**: e.g., [D.Berardi et al. 2003], [T.Bultan et al. 2003], [S.Narayanan and S.McIlraith 2002], [M.Pistore et al. 2005].



# Conclusion and Future work

- A model is proposed to help automation of Web service composition at functional level:
  - by capturing **semantic connections** between Web services: **Causal links**;
  - by providing a relevant starting point to solve an AI planning problem: **Causal link matrix**;
  - by applying a **regression-based approach**:  $Ra_4C$ ;
  - by satisfying an **optimization criteria**;
  - in order to obtain correct, complete, consistent and optimal plans through the **Sequence-composability** property.
- Easily applied to Web services which are described according to **SAWSDL**, **OWL-S** (service profile) or **WSMO** (capability model) specification;
- Future Work:
  - Extending the set of semantic Web service matching functions for optimization reasons;
  - Scalability of the model.



# Questions?

