

A Software Infrastructure for Robotic Skill Learning and Cognition

(Or: how to improve your PhD students' software attitude)

Herman Bruyninckx

Dept Mechanical Engineering, KU Leuven, Belgium

BRICS (*Best Practices in Robotics*)

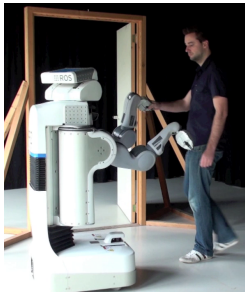
Rosetta (*RObot control for Skilled ExecuTion of Tasks*)

Lund, April 17, 2012

My background — research interests

- ▶ making robots “more intelligent”
(... as all of you do, I guess :-))
- ▶ got involved in **software engineering** aspects about a **decade ago**, because I got tired of the extreme **lack of reuse** of software modules in robotics.
(Anyway, that would only take a year or three-four...)
- ▶ **Reuse**:
 - ▶ multi “vendor”
 - ▶ multi robot
 - ▶ multi framework (ROS, Orocos, OpenRTM, OPRoS,...)
 - ▶ multi programming language
 - ▶ not just code, but also **knowledge: models!**
- ▶ **Ambition**: to bring robotics software development to **industry grade** quality levels

Overview — Problem statement



- ▶ **Cognitive...?** ... rather: smartly written **code!**
- ▶ **Learning...?** ... rather: adaptable **parameters!**

Still “**cognition/learning for robots by humans**”
instead of “**cognition/learning by robots for humans**”...

⇒ **revolution** in Software Engineering needed
(... among other things!)

Overview take-home messages

- ▶ Trend 1: **“Look ma, no hands!”** hackatons
- ▶ Trend 2: software made by **unsupervised PhD students**
- ▶ Trend 3: **software is law** (*implementation* = semantics)
- ▶ Problem 1: required **complexity** is not yet supported
- ▶ Problem 2: PhDs with too little **system knowledge**
- ▶ Problem 3: abundant **Not Invented Here attitude** in control, learning, planning, modelling, middleware,...
- ▶ Problem 4: current trends **not scalable & maintainable**
 - ▶ class libraries: **too deep** hierarchies
 - ▶ frameworks (Orocos, ROS,...): **too flat** architectures
 - ▶ distributed world models: **too few** ontologies
- ▶ Need 1: from *“it works!”* to **“it is reusable!”**
- ▶ Need 2: change **focus** from *code* to **models/standards**
- ▶ Need 3: **more smaller SW modules** needed



“Look ma, no hands” hackatons

Problem”

- ▶ **Goal** number one: **make it work!**
 - ▶ **Means** number one: **agile development...**
... but the abused version: look into each others' code and adapt, adapt, adapt,..., till it, indeed, works...
 - ▶ **Team** number one: **very homogeneous** with shared “hacker” mentality + Sense/Plan/Act decoupling
 - ▶ Moderns applications: dozens to **hundreds** of nodes, components, modules! Future applications: **thousands!**
- ⇒ “agile” inter-module adaptation won't scale anymore!



“Look ma, no hands” hackatons

Solution: Model-Driven Engineering:

- ▶ works in other domains (aerospace, automotive, mechatronics, embedded, medical,...)!
- ▶ knowledge is in the **model**, code is **generated**
- ▶ knowledge brings **structure**: hierarchy, stable “agent” sub-systems,...
- ▶ knowledge brings **discipline**: reference architectures, standards,...
- ▶ domain brings **complementary experts** together

Problem for robotics: **model = closed world assumption**

⇒ methodologies required for “opening up” models, **on-line**

⇒ robotics will (**have to**) **drive** new ICT paradigms!



Software made by unsupervised PhD students

- ▶ Peer review...?
Seniors read the [papers](#) of the juniors, but do they read their [code](#)?
Do they co-design their [software architectures](#)?
Do they make them [share data structures](#)!
- ▶ Seniors want it “to work”: *Just code it...*
- ▶ Macho attitude: “real men write code not documentation”
(One of the many [open source myths](#), sigh.)
- ▶ PhDs optimize [their](#) incremental progress, not others’
long-term maintainable solutions

Comparison/Solution: typical coding [team](#) in [aerospace](#) = 3-5 people, average age 50+, average lines-of-code-a-day 3–5, code-by-model,...



Software is law

Problem:

- ▶ **no** robotics software modules exist whose [behaviour/semantics](#) can be fully [predicted](#) by information in [documentation/model](#)
- ▶ **instead:** one has to [execute](#) and [observe](#)

Solution: [systematic](#) introduction of [semantic models](#), “*also known as [ontologies](#)*”:

- ▶ common sense & physics
- ▶ robot system architecture = [interactions](#) between planning, sensing, control, world modelling,...
- ▶ tasks, affordances, perception [networks](#),...



Class Libraries: too deep hierarchies

Problem illustrated by means of [inverse dynamics](#) class:

- ▶ v1: Newton-Euler, by inward/outward “sweeps” over kinematic chain with ideal 1DOF joints:
$$\tau = \text{ID_NE}(q, \dot{q}, F)$$
- ▶ v2: what about [posture control](#)?
$$\tau = \text{ID_NE_PC}(q, \dot{q}, F, \tau_p)$$
- ▶ v3: what about [damped least-squares](#) singularity robustness?
$$\tau = \text{ID_NE_PC_DLS}(q, \dot{q}, F, \tau_p, \lambda)$$
- ▶ v4: what about [joint limit avoidance](#)?
$$\tau = \text{ID_NE_PC_DLS_JL}(q, \dot{q}, F, \tau_p, \lambda, K)$$
- ▶ v5: what about [N-DOF joints](#)? [mobile platforms](#)?
[configuration](#) of all parameters?...

Severe [open source](#) “**vendor**” **lock-in!**



Class Libraries: too deep hierarchies (2)

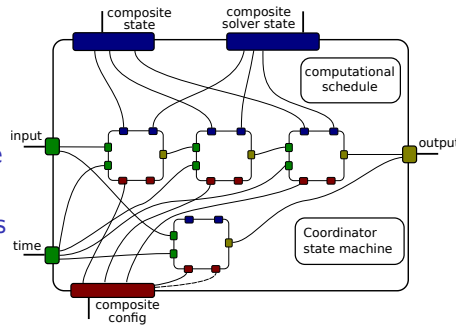
Solution: introduce data flow computational composites

- ▶ refactor libraries in functions that are atomic & composable

- ▶ tooling to embed them in port-based components...

... with (runtime!) configurable computational scheduling depending on triggered ports (>> Simulink!)

- ▶ Finite State Machines for life cycle and inter-composite coordination



(No software framework already provides all of this.)

Not Invented Here syndrom

Problem: "I have *my* hammer and can hit *all* nails!"

- ▶ planners: "faster planning avoids control", ...
- ▶ perception: "SLAM avoids planning and control", ...
- ▶ control: "ILC is control", "MPC is control", ...
- ▶ learning: "reinforcement learning avoids modelling", ...
- ▶ **all** of them: world model is **hidden inside!**

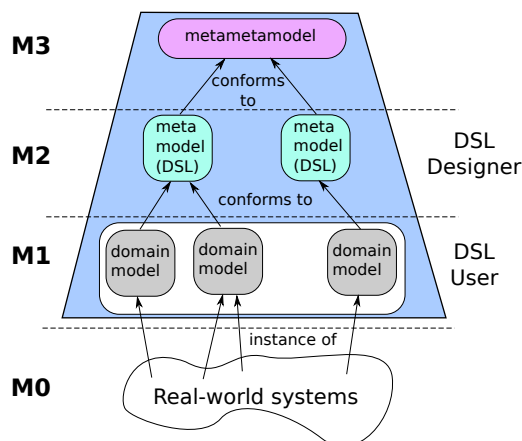
⇒ close to no real "multi-vendor" integration taking place

- ▶ communication middleware:
where was robotics the **last 20 years**...?!?!

Solution:

- ▶ **system-level education** (... also in seniors!)
- ▶ refactoring code to **atomic** libraries & components:
→ "do one thing only, and do it perfect!"

BRICS/Rosetta: MDE in robotics



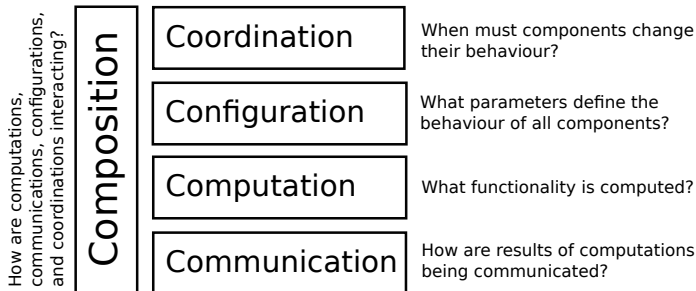
Self-awareness models: key to cognition & learning by robots!

Model-Driven Engineering (2)

M3 = **meta-meta model** (no domain-knowledge!)
 M2 = **meta model** (Domain Specific Language)
 M1 = **model** (domain model encoded in DSL)
 M0 = **implementation** (in specific programming language(s))

- ▶ **M3–M0**: is an **ontology**, i.e., a **formal** representation of knowledge about a domain!
- ⇒ necessary for giving our **robots** the ability to **interpret** their own actions, and their interactions with the world.

BRICS: “5C” separation of concerns



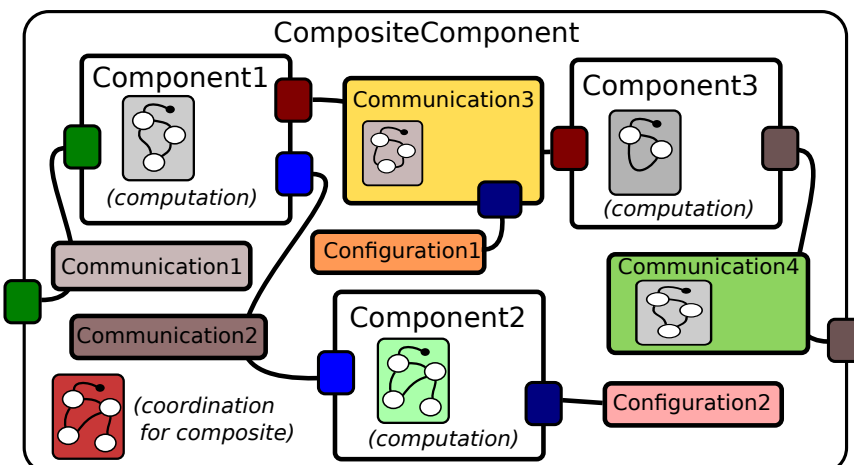
“4Cs”¹ for **decoupling**, “Composition” for **coupling**

5C “meta-model” helps to **separate**

- ▶ **framework** (Orocos, ROS...) from **functional code**.
- ▶ **elementary types** of functionality from each other.

¹Thanks to **Klas Nilsson**, Lund, for introducing me to this concept!

Example of a “5C” architecture



Added value in “5C”: Coordination & Configuration



Our spin-off Intermodalics.eu makes 90% of its money by adding 5% C&C code to available open source software, in context of advanced industrial integration projects. . .

Only possible when other functionalities are nicely separated in the software repositories

Rosetta: Task-Skill-Motion

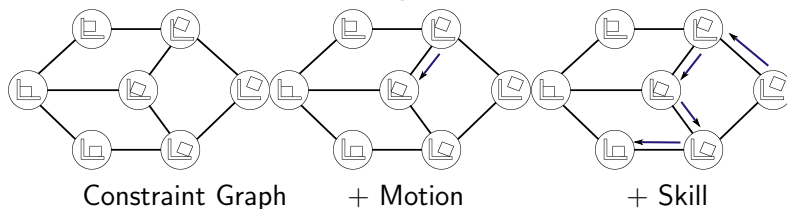
MDE models of “platforms”:

- ▶ **Task:** specification with only **manipulated object** properties
- ▶ **Skill:** adds **type** of robots, sensors, sensor processing, trajectory generation, . . .
- ▶ **Motion:** adds **properties** of **concrete** robot, sensor, sensor processing, . . .

Data structures:

- ▶ **Constraint Graph:**
node = {constraints on objects}, edge = context
- ▶ **Scene Graph:** node = object, edge = position
- ▶ **Skill Graph:** node = “control”, edge = transition

TSM — Dualities Contact–Skill–Constraint Graphs



Under uncertainty:

- ▶ one Motion can lead to **multiple** Constraints
- ▶ **transitions** in Skill Graph get **probabilistic**

Typically in current software:

- ▶ Constraint Graph is **not** made explicit!
- ⇒ although **necessary** for online **reasoning**. . .
- ▶ Scene Graph: **many** projects need such software. . .

Conclusions

- ▶ Robotics is going to lead the SW engineering field, because of the **incomparable challenges** of cognitive learning robots
 - ▶ we are still putting the intelligence in the programmers, not in the robots
 - ▶ revolution needed in **attitudes**: reusability & **modelling**
 - ▶ revolution needed in **standardization!**
 - ▶ revolution needed in **tooling!**
- ⇒ *"Coders of the world, unite!"* (and not (just) your **code**...)

Stop the hackatons!
Start the knowledge modelling!