# Formal Methods for Multiscale Models Derivation

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### Abstract :

We are currently developing software dedicated to multiscale and multiphysics modeling of arrays of micro and nanosystems. Unlike traditional software that is based on models built once and for all, here this is the software that constructs models. It is based on the mathematical Two-Scale Transform, a technique for asymptotic methods, together with formal specification and verification techniques in computer science, combining formal transformations and term rewriting and type theory. We aim at taking into account a wide range of geometries combining thin structures, periodic structures with the possibility of multiple nested scales and any combination of these features. In this paper we present the principle of our methods and our first results.

### Mots clefs : Multi-scale methods; MEMS arrays; symbolic computation

### Résumé :

Nous développons un logiciel dédié à la modélisation multiphysique et multi-échelles de matrices de micro- et nanosystèmes. Contrairement aux logiciels existants, qui opèrent sur des modèles prédéfinis, ce nouveau logiciel permet de construire des modèles. Il est fondé sur la transformation mathématique à deux échelles, une technique pour les méthodes asymptotiques, couplée avec des méthodes informatiques de spécification et de vérification formelle, combinant transformations formelles, réécriture et théorie des types. Notre objectif est de prendre en compte un large éventail de géométries, combinant des structures minces et des structures périodiques à plusieurs échelles imbriquées. Dans cet article nous présentons les principes de nos méthodes et nos premiers résultats.

### 1 Introduction

Simulation software available on the market does not take into account large arrays of micro and nanosystems such as that shown in Figure 1. From the point of view of geometric features, the software we develop aims at filling this gap. In fact, it will aid to design multiphysics systems with high contrast in equation coefficients and complex geometries including thin structures, periodic structures with possibly many nested scales, and combinations of these. The produced simulations should be light enough to be inserted into parameter identification and optimization loops. The software is based on multiscale models, especially on models obtained by asymptotic methods. An asymptotic model is derived from a system of partial differential equations (PDEs) when taking into account that at least one parameter is very small, as for a thin structure (small thickness) or for a periodic structure (small ratio of cell size to global size). The resulting model,



FIGURE 1 – An array of micro-levers for parallel AFM applications. A courtesy of A. Meister from CSEM Switzerland.

another system of PDEs, is obtained by taking the mathematical limit of the nominal model, in some energy sense, when the small parameters are going to zero. This approach provides a reasonably good approximation and has the advantage to be rigorous and systematic which are factors of reliability. The resulting PDEs can be implemented in simulation software as for instance a finite element based simulator, and simulations turn to be fast as needed. We quote that the literature in this field is vast and that a large number of techniques have been developed for a large variety of geometric features and of physical phenomena. However, none of them have been implemented in a systematical approach to render it available to engineers as a design tool. In fact, each published paper focus on a special case regarding geometry or physics, and very few works are considering a general picture. In our software, we treat the problem of systematic implementation of asymptotic methods in the software by implementing the construction of models rather than the models themselves. This approach would cover many situations from a small number of bricks. It combines two types of tools, namely the mathematical Two-scale Transform originally introduced in [1, 2, 3] (also referred as the Unfolding Method) to model asymptotic periodic structures together with formal specification techniques in computer science, combining term rewriting,  $\lambda$ -calculus and types [4]. The software is written in the symbolic computation language Maple<sup>TM</sup>. Regarding the Two-Scale Transform technique, we have extended its domain of application to cover in the same time homogenization of periodic media, see for instance [5], and methods for asymptotic analysis for thin domains, see [6]. Compared to other techniques, ours requires more modular calculations and avoids any non-constructive proof. In the paper we present each aspect of our method as well as our first results.

### 2 The mathematical tools used for model derivation

To date, the program covers only the elliptic second order PDE,  $-\sum_{i,j=1}^{d} \frac{\partial}{\partial x_i} (a_{ij}(x) \frac{\partial}{\partial x_j} u(x)) = f(x)$ , posed in a region  $\Omega$  in  $\mathbb{R}^d$  consisting of subregions each of which may have a periodic structure, be thin or combining these two features. The coefficients  $a_{ij}$  of the equation may also be periodic. The boundary conditions can be Dirichlet conditions u = g on a part  $\Gamma_1$  of the boundary  $\partial\Omega$  for a given g, and Neumann conditions  $\sum_{i,j=1}^{d} n_j a_{ij}(x) \frac{\partial}{\partial x_j} u = h$  on the other part  $\Gamma_2$  of the boundary with outward unit vector  $(n_1, ..., n_d)$  for a given h. This partial differential equation appears in a number of physical models such as the stationary diffusion equation, the equation of electrostatics or a model for elastic beam in torsion. We assume that all small parameters of the problem are expressed in terms of a single one denoted by  $\varepsilon$ .

**Example :** For the sake of illustration, we present the example of thermal equilibrium of the AFM array, shown in Figure 1, connected to a thin bar and placed in a vacuum, see Figure 2(a). The bar thickness is in the same range as the cell sizes. A heat source is placed in each cantilever to model the presence of actuations by thermo-elastic coupling. The heat flux at all boundaries is vanishing (h = 0) except at the bar end and at the left and bottom sides of the lever array where a temperature is imposed at  $g = 0^{\circ}C$ . Modeling is done in two dimensions, so that the matrix a represents the two-dimensional thermal conductivity and f the two-dimensional density of thermal source.

Here, we do not detail the mathematical steps of construction of asymptotic model, but we will just review the mathematical objects that are manipulated in order to explain, in Section 3, how they are treated in terms of formal computing. Several proofs have been published in [7], [8], [3], [9], and [10]. Here we adapt the proofs of the paper [9] where an effort has been made to formulate proofs in a modular form and to avoid any non-computational steps. The steps in this formal method are rigorously specified at a high level of generality, that make them independent of the domain geometry and applicable to other equations. The model derivation starts from the weak formulation associated to the above classical formulation boundary value problem. Find  $u \in V$  such that

$$\sum_{i,j=1}^{d} \int_{\Omega} a_{ij} \frac{\partial u}{\partial x_i} \frac{\partial v}{\partial x_j} dx = \int_{\Omega} f v dx \tag{1}$$

for all  $v \in V$  where V represents the set of admissible functions  $V = \{u \mid u = 0 \text{ on } \Gamma_1\}$ . We observe that we have dropped the question of function regularity that should be taken into account in the set of admissible functions because this has not yet been taken into account in the implementation.

The weak formulation (1) requires the definition of regions as  $\Omega$  and their boundaries as  $\Gamma_1$  and  $\Gamma_2$ , of variables as  $x = (x_1, ..., x_d)$ , of functions as w(x) and v(x), of set of functions as V, and then of

operations associated with them. Beyond simple operations such as addition or multiplication between functions, it is required to define formally the integral over a region and the sum over a set of indices. Once these mathematical objects have been defined, we also introduces properties as Green's formula, the natural extension of the integration by part formula,  $\int_{\Omega} \frac{\partial w}{\partial x_i} v \, dx = -\int_{\Omega} w \frac{\partial v}{\partial x_i} \, dx + \int_{\partial\Omega} w \, v \, n_i \, dx$ , that may be used during the proof.



(a) Geometry and boundary conditions for an array of can- (b) Flowchart representing the Two-Scale Transformation tilevers connected to a beam  $\alpha$  of the region  $\Omega$ 

#### FIGURE 2 – Running example

On the other hand, the model derivation relates to the Two-Scale Transform whose principle is shown in Figure 2(b). It consists of a phase of region splitting into several sub-regions ( $\Omega_1 \cup \Omega_2$  in the example) requiring different treatments. If a subregion is not subject to any simplification when its processing stops. Otherwise, it is partitioned into a family of periodic cells, even if it does not undergo a simplification to the periodicity, and is transformed (by a process not detailed here) into the product of so-called *macroscopic* and *microscopic* regions. The latter contains all the information on the microstructure of the sub-region while the first is only used to locate the position of the cells so that in the case of a thin structure its dimension is that of the neutral axis or plane. Figure 2(b) illustrates this construction process on the example where  $\Omega_1$  is a periodic region and  $\Omega_2$  a thin region. Their image pairs are denoted by  $(\Omega_1, Y_1)$  and  $(\Omega_2, Y_2)$  respectively. By composition with the above operation, a function defined on a sub-region is transformed into a function defined on the product of its macroscopic and microscopic regions. This defines the linear operator T named the Two-Scale Transform. For demonstration purposes, we defined the adjoint  $T^*$  of T. Since T is a linear operator which transforms a function defined on a subdomain  $\Omega_1$  into a product  $\widetilde{\Omega}_1 \times Y_1$ , conversely its adjoint for the  $L^2$ -inner product is defined from  $\widetilde{\Omega}_1 \times Y_1$  to  $\Omega_1$  by the equality  $\int_{\Omega_1} T^* w \ v \ dx = \int_{\widetilde{\Omega}_1 \times Y_1} w \ Tv \ dxdy$  for w and  $\widetilde{\Omega}_1$ v respectively defined in  $\Omega_1 \times Y_1$  and  $\Omega_1$ . To derive the approximate model, we require the concept of approximation of a function v by another function w in the sense of the small parameter  $\varepsilon$ , that we denote by  $v = w + O(\varepsilon)$ , together with the algebraic rules on  $O(\varepsilon)$ . Finally, the linearity of some operators is used repeatedly.

### **3** Software architecture

This section presents our software design methodology and its theoretical foundations. The software will transform a nominal multiphysic model, composed of a geometry and PDEs, into a multiscale (MS) asymptotic model approximating the initial one. This transformation depends on specifications about periodic and thin parts of the model, which are formulated by the designer.

The software will implement the sequence of modelling steps depicted in Figure 3. The Data Structure Constructor is in charge of importing the nominal model from a finite element analysis and simulation software package of physics and engineering applications, e.g. COMSOL. Conversely, a Geometry & Equation Generator will export the derivated multiscale model towards COMSOL after being adapted so that the simulation with COMSOL can be done effectively. Finally the results of this simulation

will be brought back to the physical domain by means of a Inverse MS Transform.

The modelling step named Multiscale Data Structure Constructor is essentially devoted to the extension of the internal data structure with additional multiscale data. Its input is a symbolic representation of the geometry produced by the Data Structure Constructor from the numerical data from COMSOL. The multiscale data structures are designed and implemented to be complete, flexible and able to describe complex geometries, but without redundancies. They describe the mathematical objects (e.g. functions, variables ...) and their properties, the geometrical regions and their boundaries, the admissible functional spaces, and the algebraic properties of the two-scale operators. The purpose of the modelling step named Multiscale (MS) Model Constructor is to automatically construct the asymptotic multiscale model



FIGURE 3 – Flowshart of the modelling steps

from the multiscale data structures. Yet this purpose is not completely fulfilled since it requires a unification of multiscale methods. However two parts of this modelling step are already built and tested, namely a symbolic transformation package and a type-checker.

## 3.1 Symbolic transformation package

Most of the transformations performed by multiscale methods are based on quasi-systematic derivations of equalities. The classical way to automate these derivations is to consider mathematical expressions as symbolic ones, called *terms*, and to give a computational meaning to mathematical equations. The idea is to orient the equality x = y into a *rewrite rule*  $x \to y$  which states that every occurrence of an instance of x can be replaced with the corresponding instance of y. Consequently equational derivations are reduced to a series of term rewritings.

Term rewriting provides a theoretical and computational framework which is very useful to express, study and analyze a wide range of complex dynamic systems. It is characterized by the repeated transformation of a data object such as a word, term or graph. Transformations are combinations of rules specifying how to transform an object into another one when it follows a specific pattern. Rule application can be restricted by additional conditions and rules can be combined by specifying strategies controlling the order and the way rules are repeatedly applied. Term rewriting is used in formal semantics to describe the meaning of programming languages and more generally in computer science to describe program transformations and to perform automated reasoning. It is central in systems where the notion of *rule* is explicit such as expert systems, algebraic specifications, etc.

We have implemented a Maple package, named symbtrans, extending Maple with rewriting-based programming where rules, strategies and usual Maple functions can be freely combined [11]. The transformation language provided by the symbtrans package is deliberately an adaptation for Maple of popular strategy languages such as  $\rho$ -log [12] or TOM [13]. The common theoretical basis for all these works is the  $\rho$ -cube [4]. The current version of our transformation language corresponds to the untyped version of the  $\rho$ -cube, called the  $\rho$ -calculus.

Each mathematical tool introduced in Section 2, namely the integral and PDE calculus, the algebraic rules on  $O(\varepsilon)$  and the algebraic properties of the two-scale operators, is expressed in the software by means of the notion of strategy. Roughly speaking, a strategy is a combination of rewriting rules. It expresses the way the rules are applied. Thanks to the notion of strategy the formal proof is close to the mathematical one in terms of size and nature of steps.

# 3.2 Type-checker

This section shows the interest of a typing discipline for the formalization of multiscale methods. In computer science type systems complete grammatical descriptions of programming languages with additional contextual conditions of *well-formedness*. For example, the fact that a mathematical expression under an integration sign has to be integrable is a contextual information that is better detected by well-formedness rules than by grammatical rules. The set of rules that relate the type of a mathematical expression with the one of its sub-expressions is called a *type system*. The reader is invited to see [14] for more information on type theory. We propose a first type system which basically corresponds to the Basic Extended Simple Type Theory [15]. In this system region names  $(\Omega, \Omega_1, \Omega_2, \Omega_3)$  $\hat{\Omega}_1, \hat{\Omega}_2, Y_1$  and  $Y_2$  in the example) are considered as type constants, i.e. atomic type names. The other type constants are \* for Booleans and  $\mathbb{R}$  for real numbers. The notation e: A asserts that e is an expression of type A. The type  $A \to B$  denotes the set of functions whose domain is A and co-domain is B. Moreover, any Cartesian product of region names also forms a type. For instance, the functions wdefined on  $\widetilde{\Omega}_1 \times Y_1$  in Section 2 are expressions of type  $\widetilde{\Omega}_1 \times Y_1 \to \mathbb{R}$ . It is denoted by  $w : \widetilde{\Omega}_1 \times Y_1 \to \mathbb{R}$ . For any region  $\Omega$ , any variable x such that  $x : \Omega$  and any expression e such that e : A or  $e : A \to B$ , where A is a Cartesian product composed of other regions than  $\Omega$ , the expression  $\int_{\Omega} e \, u \, dx$  (where u is any expression) can be rewritten as  $e \int_{\Omega} u \, dx$  and the expression  $\partial e / \partial x$  as 0. Such simplification rules of major importance are made possible thanks to the typing information. The type checking process requires that the user declares the type of all the mathematical objects used in the proof. These objects are the constants, variables, functions,  $O(\varepsilon)$  terms, etc. For all the possible software inputs the types of the standard mathematical operators such as derivation and integration are predefined in the type system. For each region  $\Omega$  we can define the type of the Two-Scale Transform  $T_{\Omega}$  of functions

defined on  $\Omega$  as  $(\Omega \to \mathbb{R}) \to (((\nu(\Omega) \times \mu(\Omega)) \to \mathbb{R})$  where  $\nu(\Omega)$  (resp.  $\mu(\Omega)$ ) denotes the macroscopic

4 Validation

(resp. microscopic) region of  $\Omega$ .

When applying our software to Eq. (1), we specify that the Two-Scale Transforms to be used are  $T^1$  and  $T^2$  corresponding to Fig. 2(b). The two-scale model provided by the software includes the microscopic equation posed in the  $Y_1$ cell with the coefficient  $a^1 = T^1 a$ , the function space  $W^1 = \{v \text{ defined in } Y_1 \mid v \text{ is } Y_1\text{-periodic}\}$ and the variational formulation :

Find  $w_i^1 \in W^1$  such that  $\sum_{k,\ell=1}^2 \int_{Y_i} a_{k\ell}^1 \frac{\partial w_i}{\partial y_k} \frac{\partial v}{\partial y_\ell}$ 



FIGURE 4 – Results for  $u^0$  by FEM simulations

$$\begin{split} dy &= -\sum_{k,\ell=1}^2 \int_{Y_1} a_{k\ell}^1 \delta_{ik} \frac{\partial v}{\partial y_\ell} \, dy \text{ for all } v \in W^1. \text{ It also includes a problem posed in the microscopic cell of the thin part <math>Y_2$$
 even if the latter has not the periodicity feature. This problem is written in a similar manner not detailed here and leads to the definition of  $a^2$  and  $w_i^2$ . It follows the definition of homogenized thermal diffusion coefficient and density of heat source per unit area in the first macroscopic part  $\tilde{\Omega}_1$ ,  $a_{ij}^H = \sum_{k,\ell=1}^2 \frac{1}{|Y_1|} \int_{Y_1} a_{k\ell}^1 (\delta_{ik} + \frac{\partial w_i^1}{\partial y_k}) (\delta_{j\ell} + \frac{\partial w_i^1}{\partial y_\ell}) \, dy \text{ and } f^H = \frac{1}{|Y_1|} \int_{Y_1} T^1 f \, dy. \\ \text{Similar formula yields } a^H \text{ and } f^H \text{ in } \tilde{\Omega}_2 \text{ the second macroscopic part. The two-scale model also includes the macroscopic problem posed on <math>\tilde{\Omega}_1 \cup \tilde{\Omega}_2$  the macroscopic region with  $V^0 = \{v \text{ defined in } \tilde{\Omega}_1 \cup \tilde{\Omega}_2 \mid v = 0 \text{ on } \Gamma_1 \cap (\tilde{\Omega}_1 \cup \tilde{\Omega}_2)\}$  the macroscopic region during space and the variational formulation : Find  $u^0 \in V^0$  such that  $\sum_{i,j=1}^2 \int_{\tilde{\Omega}_1} a_{ij}^H \frac{\partial u^0}{\partial x_i^1} \frac{\partial u^0}{\partial x_i^1} \, d\tilde{x}^1 + \int_{\tilde{\Omega}_2} a_{11}^H \frac{\partial u^0}{\partial x_1^2} \frac{\partial u^0}{\partial x_1^2} \, d\tilde{x}^2_1 = \int_{\tilde{\Omega}_1} f^H v^0 \, d\tilde{x}^1 + \int_{\tilde{\Omega}_2} f^H v^0 \, d\tilde{x}_1^2 \text{ for all } v \in V^0. \text{ The final approximation in the physical region <math>\Omega$  is  $u \approx B^1(u^0 + \varepsilon \sum_{i=1}^2 (y_i + \overline{w}_i^1) \frac{\partial u^0}{\partial x_i^2})$  in  $\Omega_1$ , where  $\overline{w}_i^1 = w_i^1 - \frac{1}{|Y_1|} \int_{Y_1} w_i^1 \, dy$  and  $B^1$  is the approximate inverse two-scale transform defined for any  $Y_1$ -periodic function  $v(\tilde{x}^1, y)$  by  $(B^1v)(x) = v(\tilde{x}^1, \frac{x-\varepsilon/2}{\varepsilon})$ . A similar approximation is built in  $\Omega_2$ . Now we compare the results obtained with the nominal model and the simplified model, see Fig. 4. To obtain

sufficient accuracy of calculations with the software COMSOL we used meshes with 459,840 elements to model the complete problem, of 7664 elements for both microscopic problems and with 305 elements for the macroscopic problem. The relative quadratic error  $(\int_{\Omega} |u - u^0|^2 dx)^{1/2} / (\int_{\Omega} |u|^2 dx)^{1/2}$  between u, the model nominal solution, and  $u^0$ , this of the homogenized model, is 6.85%. The computing time on a laptop for the three problems are respectively 3.734s, 0.046s and 0.015s, giving a ratio of computation time of the nominal model and simplified model of 0.029.

# 5 Conclusion

We presented the basic principles of a new software dedicated to the generation of multiscale models for applications to MEMS arrays and their illustration on an example. The symbolic transformation package and the type-checker have been successfully applied together to a couple of models. In particular, the asymptotic model from the running example has been produced from Eq. (1) with the assistance of these tools. To conclude, we underline that there are a number of interests with our approach. Clearly, the final model is "correct-by-construction", human errors are avoided, and the model derivation effort is dramatically reduced. In the point of view of a MEMS designer, this software will generate simplified analytical and numerical models corresponding to a design and to a set of requested simplifications. Since the computation will be fast enough, he will test a variety of simplifications and retain the one satisfying the best tradeoff between simulation time and precision.

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