

COMPUTER MODELING OF CONCRETE MATERIALS AND STRUCTURES

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Summary

High performance concretes are being developed to produce stronger, lighter-weight structures and for numerous other applications that require improved concrete performance in the fresh or hardened states. Motivated partly by ecological factors, there has also been an increasing usage of alternative binders, as partial replacements for portland cement, and alternative sources of aggregates for concrete. Whereas conventional reinforced concrete design has been supported by decades of laboratory testing and observations of field performance, these newly emerging materials lack the database necessary for design and assurances of adequate long-term performance over the intended service life.

Computer modeling offers a precisely controlled environment for studying material composition and its relationships with structural performance. Such modeling stands to play a prominent role in the development of new concrete materials and their structural applications, complimenting results obtained through laboratory testing. Modeling supports the necessary shift from materials development based on empiricism to that based on the materials science of cement-based composites. Variations in the material composition, production processes, and exposure conditions (and the effects of such variations on life-cycle performance) can be simulated for large intervals on the length and time scales. This chapter highlights general concepts and trends in computer

modeling of concrete materials and structures, with coverage of some of the research needs and challenges.

1. Introduction

To a large extent, knowledge of conventional concrete materials has evolved through decades of laboratory testing and the monitoring of field performance. Structural mechanics and design concepts, such as no-tension design and plastic limit state design, have also played important roles in the application of concrete materials within structures. Although such methods continue to serve the structural design community well, it has become increasingly apparent that computer modeling is an essential component within the overall strategy to develop and improve concrete materials and structures.

Most of the advances in modeling capabilities have been accomplished within the framework of finite element methods. Indeed, roughly since the 1980s many of the techniques for structural analysis under mechanical loading had been developed and summarized in an American Society of Civil Engineers (ASCE) committee report. That ASCE document covers essential concepts such as constitutive modeling of concrete under multi-axial stress conditions, representation of cracking (including discussions of smeared versus discrete crack models), incorporation of reinforcement and its associated bond with the concrete, time-dependent effects including shrinkage and creep under sustained loading, and dynamic analyses. More recent literature contains a wealth of publications on the continued development of finite element and alternative modeling strategies. Notable amongst these publications are those produced by the FraMCoS and Euro-C conference series. Amongst this work, there has been growing interest in simulating microstructure development using models defined at the cement grain scale, as pioneered by researchers at the US National Institute of Standards and Technology (NIST).

Structural concrete design has traditionally involved the provision of safe and serviceable structures. For justifiable reasons, the most intense analysis efforts were first directed toward understanding load-induced failure of concrete structures, and thus their safety. As a result of several national programs on High Performance Concrete (HPC), which were formed in the early 1990s, research and development efforts have been extended to meet a broader set of objectives. Some of these objectives pertain to structural durability, which depends strongly on the mass transport properties of concrete and cracking behavior (e.g. crack spacing and opening) under service loading. Prolonging the maintenance-free service life is one objective. Furthermore, in recent years emphases on economy (e.g. efficient production technologies, such as self-consolidating concrete) and the keener realization of ecological constraints have fostered the development of new concrete materials, many of which involve alternative binders (usually as a partial replacement of portland cement) or alternative aggregates. Whereas portland cement has been the main binding agent in both conventional and newly emerging concrete materials, alternative binders (e.g. calcium aluminate cements and geopolymers) are receiving much attention. The role of computation has been strengthened and expanded by these recent shifts in interests. Along with stronger

roles of computation comes increased needs for model validation at all scales of interest, and thus increased needs for collaboration with experimentalists.

This chapter reviews general concepts and motivations for the computer modeling of concrete materials and structures, assuming that the reader is familiar with most of the essential concepts, such as those outlined in previous state-of-the-art reports. Present research trends are directed towards the development of high-performance materials, alternative materials with lower environmental load, as well as non-traditional reinforcing materials (such as hybrid-fiber reinforcement and fiber-reinforced plastics). The totality of experimental data and field experience on these materials is limited and not sufficient for forecasting their service life performance, especially in severe environments. Many factors, such as component geometry, boundary conditions, degree of confinement, and size effects are important and complicate a comprehensive understanding of material performance within structural settings.

As a starting point for this chapter, we describe concrete as a multi-scale material. Discussions then center on the notion of model-based simulation, which can be viewed as a three-stage process of model construction, analyses, and results interpretation. For effective support of material and structural design, the three-stage process should be implemented within a fast-feedback loop that supports the creative abilities of the designer. This has been the intent of many earlier research works, but only now is computing technology meeting such needs within the three-dimensional frameworks necessary for addressing most research and practical problems.

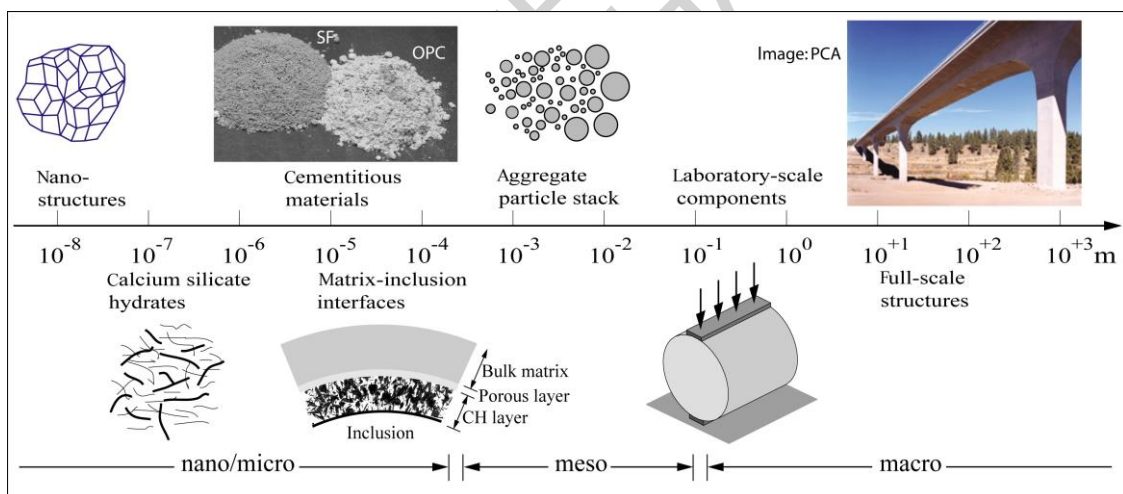


Figure 1. Concrete as a multi-scale material (adapted from van Mier (1997))

2. Concrete as a Multi-Scale Material

Concrete is a mixture of cementitious binder (which has been predominantly portland cement), aggregate inclusions, water, and an increasing variety of admixtures to modify the fresh and hardened properties of the product. Concrete is profoundly affected by structures and processes that reside within or span different (often disparate) length and time scales. Figure 1 depicts some of the relevant features and configurations that appear over the range of observation scales, from molecular structures and C-S-H

morphology within the finer size intervals up to large-scale applications of concrete as a macroscopic continuum. The boundaries to what are often called the nano/micro/meso/macro-scales are not distinct and open to interpretation. The engineering of cement-based composites or concrete structures is occurring at all scales.

During concrete production, portland cement reacts with water to produce two main hydration products: calcium silicate hydrate (C-S-H) and calcium hydroxide. The calcium silicate hydrates are mainly responsible for the strength and stiffness of the cement paste, which develops over time due to continued hydration. Strength and stiffness are also affected by the packing efficiencies, and thus the particle size distributions, of both the cementitious materials and inert fillers. The desired trend toward stronger, less permeable materials follows from densification of the microstructure of the binder and at the interfaces of material/structural components. The amount, size distribution, and connectivity of porosity, and the introduction of cracks caused by volume instabilities or mechanical loading, affect the transport properties and thus the durability of structural concrete. Computer simulations at the fine scales are able to characterize evolving pore structures and study the role of phase interfaces on developing cracks.

The variety of potentially effective substitutions for portland cement is astounding, including materials that exhibit pozzolanic or latent hydraulic behaviors (e.g., industrial and agricultural by-products such as fly ash, ground granulated blast furnace slag, silica fume, and rice husk ash; and naturally derived materials, such as volcanic tuff and metakaolin). Whereas early age strength is generally lower due to dilution of the portland cement content, the addition of these mineral admixtures generally provides lower rate of heat production, increases longer term strength through secondary reactions, and improves the mass transport properties governed in large part by total porosity and its size distribution. Partial replacement of portland cement with these materials offers the added benefits of waste utilization and of reducing the CO₂ footprint of structural concrete. Indeed, such environmental benefits have become the central motivation in many concrete applications.

Micro-structural parameters		Composite performance measures
Fiber:	<ul style="list-style-type: none"> • Dimensions and geometry • Elastic modulus • Volume fraction • Orientation and distribution • Rupture strength • Electrical conductivity 	<ul style="list-style-type: none"> • Pre-cracking strength • Elastic modulus • Post-cracking strength • Toughness • Fatigue life • Impact resistance • Crack size and spacing • Permeability • Electrical Properties
Matrix:	<ul style="list-style-type: none"> • Tensile strength • Pore size distribution • Defect size and concentration • Elastic modulus 	
Interface:	<ul style="list-style-type: none"> • Porosity • Bonding properties 	

Table 1. Basic elements within material-structure-property relationships for fiber-reinforced cement composites

There has been a growing appreciation of the multi-scale nature of concrete within the current movement toward performance-based designs of concrete materials and structures. Historically, however, studies of concrete materials and structures have been separated into different disciplines. This lack of integrated study has led to more or less distinct bodies of knowledge assembled at different scales of observation. The samplings of topics covered in this section, although mostly at the material scale, are highly relevant to the structural performance objectives, whether they concern safety, serviceability, constructability or economy. For the case of fiber reinforced concrete, Table 1 lists some of the basic elements within material-structure-property relationships that bridge the micro/meso-scales and the macroscopic continuum. Computer modeling provides the capability to quantitatively link such various factors that are defined over different length and time scales.

3. Motivations for Numerical Modeling

The motivations for developing computational models of concrete materials and structures are numerous. Some of the main motivations stem from:

- practical limitations of physical testing, especially considering the large ranges of relevant length and time scales that often need to be considered. Statistically significant and representative test results are generally cost-prohibitive for larger scale structural components and systems;
- potentially large variations in the properties of the source materials. Methods of processing often induce inconsistencies in the distributions of constituents, including variations in the positioning of reinforcing components;
- sensitivity of concrete properties to early-age thermal, chemical, and physical processes and their dependence on curing practice;
- aging and degradation of materials under the influence of multiple, possibly aggressive, environmental phenomena;
- three-dimensionality of material structure, transport mechanisms, and damage processes; and
- lack of quantitative links between actions occurring at different length and time scales.

An additional incentive for computer modeling comes from the thought exercises that go hand-in-hand with model development. Regardless of the predictive capabilities of the model, the thought processes used for program development differ from those involved in physical experimentation. The provision of unambiguous sets of instructions (i.e. the computer program) requires making formal connections between the various factors that affect concrete performance. Validated computer models offer a precisely controlled environment to study cause-and-effect relationships and the lack of practical constraints facilitates the exploration of design possibilities. Beyond the research capabilities and benefits, it can be argued that algorithm development has intrinsic educational value and should be promoted within the study of concrete materials and structures, and in engineering curricula in general.

4. Analysis Process and Modeling Strategies

Model-based simulation of materials and structures can be viewed as a three-stage process consisting of: 1) model selection and construction; 2) execution of the analysis routines; and 3) results interpretation. The analysis stage is mainly accomplished through the use of computer programs whereas, traditionally, model construction and results interpretation have involved significant human intervention and effort. Obviously, the overall process is largely affected by the material/structural type and analysis goals. These stages are now described with reference to concrete materials and structures, and particular emphasis on model selection and construction.

4.1. Model Selection and Construction

Model type should be carefully selected according to the objectives of the analyses, availability of data required for running and verifying the model, and adequacy of the available computational resources. Whereas the large majority of previous modeling studies have been conducted using two-dimensional analysis frameworks, most current research needs involve three-dimensional (material or structural) configurations, constraint conditions, and processes. The extension to 3-D can involve conceptual differences from the 2-D counterparts, but many of the challenges involve more practical matters, including the inherent difficulties in 3-D domain discretization, tremendous increases in computational expense, and difficulties in processing/interpreting the large amount of data generated by the analyses. Adequacy of available computational resources often becomes a controlling issue when modeling in three dimensions.

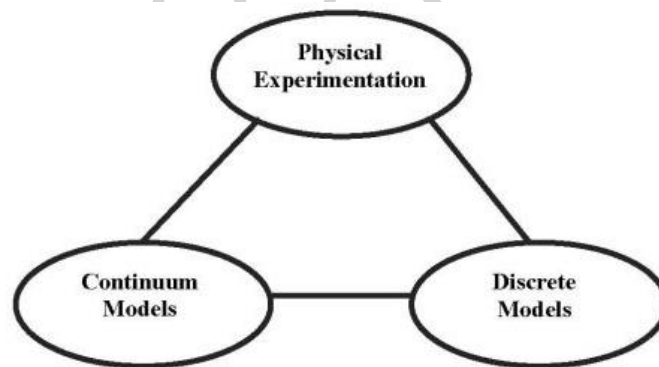


Figure 2. Complementary modes of investigation

The literature describes a multitude of different models for concrete materials and structures. This great variety makes their precise categorization difficult. Nonetheless, categorization is useful for discussing the commonalities and general capabilities of models. One broad categorization places models into one of two categories, depending on whether concrete is represented as a homogeneous continuum or as a collection of discrete elements. The utility of such models can be understood through comparisons with physical experiments (Figure 2). Both categories are described below with emphasis on discrete models as a growing trend, enabled by advances in computing technology. Recent research on fracture and damage has also involved the development

of multi-scale models, many of which are a hybrid combination of continuum and discrete approaches.

4.1.1. Continuum Models

Continuum models provide an average description of material behavior for a representative volume element. Microstructure can be considered within the continuum description, through the use of homogenization and constitutive modeling techniques, but only in a mean field sense. A large set of parameters is needed to simulate complex behaviors and parameter values are typically calibrated through comparisons with experimental results. Nonetheless, this approach is attractive for engineering analysis, since sizable domains can be analyzed in a computationally efficient manner. Additional motivations come from the observation that the width of the fracture process zone in concrete can be large, roughly several times the maximum aggregate size. In some situations, damage is finely distributed over a region of a structural component and therefore its modeling via a continuum approach is attractive.

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Biographical Sketches

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