International Journal of Computational Methods Vol. 6, No. 1 (2009) 1–27
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ON THE CONVERGENCE OF THE KRIGING-BASED FINITE ELEMENT METHOD

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13	Received

An enhancement of the FEM using Kriging interpolation (K-FEM) was recently proposed. This method offers advantages over the conventional FEM and mesh-free methods. With Kriging interpolation, the approximated field over an element is influenced not only by its own element nodes but also by a set of *satellite nodes* outside the element. This results in *incompatibility* along interelement boundaries. Consequently, the convergence of the solutions is questionable. In this paper, the convergence is investigated through some numerical tests. It is found that the solutions of the K-FEM with an appropriate range of parameters converge to the corresponding exact solutions.

Accepted

23 Keywords: Finite element; Kriging; convergence.

1. Introduction

25 In the past two decades various mesh-free methods have been developed and applied to solve problems in continuum mechanics [e.g. Liu (2003); Gu (2005)]. These methods have drawn the attention of many researchers partly due to their flexibility 27 in customizing the approximation function for a desired accuracy. Among all the 29 mesh-free methods, those using the Galerkin weak form, such as the element-free Galerkin method (EFGM) [Belytschko (1994)] and the point interpolation methods [Liu (2003)], maintain the same basic formulation as the FEM. However, although 31 the EFGM and its variants have appeared in many academic articles for more than 33 a decade, their applications seem to find little acceptance in real practice. This is in part due to the inconvenience of their implementation, such as the difficulties in 35 constructing mesh-free approximations for highly irregular problem domains and in handling problems of material discontinuity [Liu (2003)].

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A very convenient implementation of EFGM was recently proposed [Plengkhom 1 and Kanok-Nukulchai (2005)]. Following the work of Gu [2003], Kriging interpolation (KI) was used as the trial function. Since KI passes through the nodes and 3 thus possesses the Kronecker delta property, special treatment of boundary con-5 ditions is not necessary. For evaluating the integrals in the Galerkin weak form, finite elements could conveniently be used as the integration cells. KI was constructed for each element by the use of a set of nodes in a domain of influence 7 (DOI) composed of several layers of elements. Thus, for 2D problems, the DOI is in 9 the form of a polygon. With this way of implementation, the EGFM of Plengkhom and Kanok-Nukulchai [2005] can be viewed as an FEM with Kriging shape functions. This method is referred to as the Kriging-based FEM (K-FEM) in this 11 paper. 13 The K-FEM retains the advantages of mesh-free methods as follows: (1) Any requirement for high order shape functions can be easily fulfilled without 15 any change to the element structure; (2) The field variables and their derivatives can be obtained with remarkable accuracy and global smoothness. 17 A distinctive advantage of the K-FEM over other mesh-free methods is that it inherits the computational procedure of the FEM so that existing general purpose 19 FE programs can be easily extended to include this new concept. Thus, the K-FEM has a higher chance to be accepted in practice. The current trend in research 21 on the K-FEM is toward extension and application of this new technique to dif-23 ferent problems in engineering, such as applications to Reissner–Mindlin (RM) plates [Wong and Kanok-Nukulchai (2006a, b)], problems with material discontinuity [Sommanawat and Kanok-Nukulchai (2006)], and adaptive procedure [Mazood 25 and Kanok-Nukulchai (2006)]. Dai et al. [2003] pointed out that the method using the standard Galerkin weak 27 form with KI is *nonconforming* (incompatible) and so is the K-FEM. The very important issue of incompatibility and its effect on the convergence of the K-FEM 29 have not been addressed in the previous researches. In this paper we address the incompatibility in the K-FEM — the reason why the K-FEM is not conforming is 31

explained and existing techniques for restoring incompatibility are briefly discussed.
33 The convergence is scrutinized through some numerical tests in plane-stress and RM plate problems. First, the weak patch tests for each problem are performed. Then,
35 benchmark problems for plane-stress solids and for RM plates are solved. Relative error norms of displacement and strain energy are utilized to study the convergence.
37 The convergence characteristics of the K-FEM with Gaussian and quartic spline (QS) correlation functions are assessed and compared.

The present paper is organized as follows. Section 2 briefly reviews the formulation of KI. Its implementation in plane-stress/plane-strain and RM plate problems
is presented in Sec. 3. In Sec. 4, the incompatibility in the K-FEM is discussed.

On the Convergence of the Kriging-Based FEM 3

1 Numerical studies on the convergence of the K-FEM are presented in Sec. 5, with concluding remarks in Sec. 6.

3 2. Kriging Interpolation

This section presents a review of the KI formulation in the context of the K-FEM.
A detailed explanation and derivation of Kriging may be found in the geostatistics literature [e.g. Olea (1999); Wackernagel (1998)].

7 2.1. Formulation

Consider a continuous field variable u(**x**) defined in a domain Ω. The domain is
represented by a set of properly scattered nodes **x**_i, i = 1, 2, ..., N, where N is the total number of nodes in the whole domain. Given N field values u(**x**₁),..., u(**x**_N),
the problem is to obtain an estimated value of u at a point **x**₀ ∈ Ω.

The Kriging estimated value $u^h(\mathbf{x}_0)$ is a linear combination of $u(\mathbf{x}_1), \ldots, u(\mathbf{x}_n)$ 13 in the form

$$u^{h}(\mathbf{x}_{0}) = \sum_{i=1}^{n} \lambda_{i} u(\mathbf{x}_{i}), \qquad (1)$$

15 where λ_i's are termed (*Kriging*) weights and n is the number of nodes surrounding the point x₀ inside a subdomain Ω_{x0} ⊆ Ω. This subdomain is referred to as a domain of influence (DOI) in this paper. Considering the value of each function u(x₁),..., u(x_n) as the realizations of random variables U(x₁),..., U(x_n), Eq. (1)
19 can be written as

$$U^{h}(\mathbf{x}_{0}) = \sum_{i=1}^{n} \lambda_{i} U(\mathbf{x}_{i}).$$
⁽²⁾

- 21 The Kriging weights are determined by requiring the estimator $U^h(\mathbf{x}_0)$ to be *unbi*ased, i.e.
- 23

$$E[U^{h}(\mathbf{x}_{0}) - U(\mathbf{x}_{0})] = 0, \qquad (3)$$

and by minimizing the variance of the estimation error, $var[U^{h}(\mathbf{x}_{0}) - U(\mathbf{x}_{0})]$. Using the method of Lagrange for constraint optimization problems, the requirements of minimum variance and unbiased estimator lead to the following Kriging equation system:

$$\mathbf{R}\boldsymbol{\lambda} + \mathbf{P}\boldsymbol{\mu} = \mathbf{r}(\mathbf{x}_0),$$

$$\mathbf{P}^T\boldsymbol{\lambda} = \mathbf{p}(\mathbf{x}_0),$$

(4)

in which

$$\mathbf{R} = \begin{bmatrix} C(\mathbf{h}_{11}) & \cdots & C(\mathbf{h}_{1n}) \\ \cdots & \cdots & \cdots \\ C(\mathbf{h}_{n1}) & \cdots & C(\mathbf{h}_{nn}) \end{bmatrix}, \quad \mathbf{P} = \begin{bmatrix} p_1(\mathbf{x}_1) & \cdots & p_m(\mathbf{x}_1) \\ \cdots & \cdots & \cdots \\ p_1(\mathbf{x}_n) & \cdots & p_m(\mathbf{x}_n) \end{bmatrix}, \quad (5)$$

February 2, 2009 16:9 WSPC/IJCM-j050 00178

4 F. T. Wong & W. Kanok-Nukulchai

$$\boldsymbol{\lambda} = \begin{bmatrix} \lambda_1 & \cdots & \lambda_n \end{bmatrix}^T, \quad \boldsymbol{\mu} = \begin{bmatrix} \mu_1 & \cdots & \mu_m \end{bmatrix}^T, \quad (6)$$
$$\mathbf{r}(\mathbf{x}_0) = \begin{bmatrix} C(\mathbf{h}_{10}) & C(\mathbf{h}_{20}) & \cdots & C(\mathbf{h}_{n0}) \end{bmatrix}^T, \quad \mathbf{p}(\mathbf{x}_0) = \begin{bmatrix} p_1(\mathbf{x}_0) & \dots & p_m(\mathbf{x}_0) \end{bmatrix}^T$$
(7)

R is an n × n matrix of covariances, C(h_{ij}), between two nodal values of U(x) evaluated at {x_i, x_j}; P is an n × m matrix of polynomial values at the nodes; λ is an n × 1 vector of Kriging weights; μ is an m × 1 vector of Lagrange multipliers; r(x₀) is an n × 1 vector of covariance between the nodes and the node of interest, x₀; and p(x₀) is an m × 1 vector of polynomial basis at x₀. In Eqs. (5) and (7),

$$C(\mathbf{h}_{ij}) = cov[U(\mathbf{x}_i), U(\mathbf{x}_j)].$$
(8)

7 Solving the Kriging system, Eq. (4), results in Kriging weights, as follows:

$$\boldsymbol{\lambda}^{T} = \mathbf{p}^{T}(\mathbf{x}_{0})\mathbf{A} + \mathbf{r}^{T}(\mathbf{x}_{0})\mathbf{B}, \qquad (9)$$

9 where

$$\mathbf{A} = (\mathbf{P}^T \mathbf{R}^{-1} \mathbf{P})^{-1} \mathbf{P}^T \mathbf{R}^{-1}, \quad \mathbf{B} = \mathbf{R}^{-1} (\mathbf{I} - \mathbf{P} \mathbf{A}).$$
(10)

- 11 Here, **A** is an $m \times n$ matrix, **B** is an $n \times n$ matrix, and **I** is the $n \times n$ identity matrix. The expression for the estimated value u^h given by Eq. (1) can be rewritten in
- 13 matrix form as

$$u^{h}(\mathbf{x}_{0}) = \boldsymbol{\lambda}^{T} \mathbf{d}, \tag{11}$$

15 in which $\mathbf{d} = [u(\mathbf{x}_1) \cdots u(\mathbf{x}_n)]^T$ is an $n \times 1$ vector of nodal values. Since the point \mathbf{x}_0 is an arbitrary point in the DOI, the symbol \mathbf{x}_0 will henceforth be replaced 17 by the symbol \mathbf{x} . Thus, using the usual finite element terminology, Eq. (11) can be expressed as

$$u^{h}(\mathbf{x}) = \mathbf{N}(\mathbf{x})\mathbf{d} = \sum_{i=1}^{n} N_{i}(x)u_{i},$$
(12)

19

in which $\mathbf{N}(\mathbf{x}) = \boldsymbol{\lambda}^T(\mathbf{x})$ is the matrix of shape functions.

Two key properties of Kriging shape functions that make them appropriate to be used in the FEM are the *Kronecker delta* (or *interpolation*) property and *consistency*property [Gu (2003); Plengkhom and Kanok-Nukulchai (2005)]. Due to the former

property, the KI function passes through all nodal values. The consequence of the
latter property is that if the basis includes all constants and linear terms, the Kriging shape functions will be able to reproduce a linear polynomial exactly.

27 2.2. Polynomial basis and correlation function

Constructing Kriging shape functions in Eq. (12) requires a polynomial basis func tion and a model of covariance function. For the basis function, besides complete polynomial bases, it is also possible to use incomplete polynomial bases such as
 bilinear, biquadratic, and bicubic bases for interpolation in a 2D domain (for

February 2, 2009 16:9 WSPC/IJCM-j050 00178

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On the Convergence of the Kriging-Based FEM 5

1 comparison, see Noguchi *et al.* [2000] for polynomial bases in the context of the moving least-squares approximation).

Covariance between a pair of random variables $U(\mathbf{x})$ and $U(\mathbf{x} + \mathbf{h})$ can be expressed in terms of the correlation coefficient function or, in short, the *correlation function*, as follows:

$$\rho(\mathbf{h}) = \frac{C(\mathbf{h})}{\sigma^2},\tag{13}$$

- 7 where ρ(h) is the correlation function, σ² = var[U(x)], and h is a vector separating two points, x and x+h. According to Gu [2003], σ² has no effect on the final results
 9 and so in this study it is taken as 1. One of the widely used correlation models in the area of computational mechanics is the Gaussian correlation function [e.g. Gu
- 11 (2003); Dai *et al.* (2003); Wong and Kanok-Nukulchai (2006a)], viz.

$$\rho(\mathbf{h}) = \rho(h) = \exp\left(-\left(\theta\frac{h}{d}\right)^2\right),\tag{14}$$

13 where $\theta > 0$ is the *correlation parameter*, $h = ||\mathbf{h}||$, i.e. the Euclidean distance between the points \mathbf{x} and $\mathbf{x} + \mathbf{h}$, and d is a scale factor for normalizing the distance.

17 correlation function [Wong and Kanok-Nukulchai (2006a,b)] as follows:

$$\rho(h) = \begin{cases}
1 - 6\left(\theta\frac{h}{d}\right)^2 + 8\left(\theta\frac{h}{d}\right)^3 - 3\left(\theta\frac{h}{d}\right)^4 & \text{for } 0 \le \theta\frac{h}{d} \le 1, \\
0 & \text{for } \theta\frac{h}{d} > 1.
\end{cases}$$
(15)

- 19 Our study shows that using the QS correlation function, Kriging shape functions are not sensitive to the change in the parameter θ .
- 21 The proper choice of the parameter θ is very important, because it affects the quality of KI. In order to obtain reasonable results in the K-FEM, Plengkhom and
- 23 Kanok-Nukulchai [2005] suggested a rule of thumb for choosing θ ; namely, θ should be selected so that it satisfies the lower bound,

$$\left| \sum_{i=1}^{n} N_i - 1 \right| \le 1 \times 10^{-10+a},\tag{16}$$

where a is the order of the basis function, and also satisfies the upper bound,

$$\det(\mathbf{R}) \le 1 \times 10^{-b},\tag{17}$$

where b is the dimension of the problem. For a 2D problem with a cubic basis function, for example, a = 3 and b = 2.

Numerical investigations on the upper and lower bound values of θ [Wong and 31 Kanok-Nukulchai (2006a)] revealed that the parameter bounds vary with respect to the number of nodes in the DOI. Based on the results of the search for the

lower and upper bound values of θ satisfying Eqs. (16) and (17), we proposed the following explicit parameter functions for practical implementation of the K-FEM
 for problems with 2D domains.

For the Gaussian correlation parameter, the parameter function is

$$\theta = (1 - f)\theta^{\text{low}} + f\theta^{\text{up}}, \quad 0 \le f \le 0.8, \tag{18}$$

where f is a scale factor, and θ^{low} , and θ^{up} , are the lower and upper bound functions:

$$\theta^{\text{low}} = \begin{cases} 0.08286n - 0.2386 & \text{for } 3 \le n < 10, \\ -8.364E - 4n^2 + 0.1204n - 0.5283 & \text{for } 10 \le n \le 55, \\ 0.02840n + 2.002 & \text{for } n > 55, \end{cases}$$
(19)

$$\theta^{\rm up} = \begin{cases} 0.34n - 0.7 & \text{for } 3 \le n < 10, \\ -2.484E - 3n^2 + 0.3275n - 0.2771 & \text{for } 10 \le n \le 55, \\ 0.05426n + 7.237 & \text{for } n > 55. \end{cases}$$
(20)

For the QS correlation parameter, the parameter function is

$$\theta = \begin{cases} 0.1329n - 0.3290 & \text{for } 3 \le n < 10, \\ 1 & \text{for } n \ge 10. \end{cases}$$
(21)

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2.3. Layered-element domain of influence

9 Let us consider a 2D domain mesh using triangular elements, as illustrated in Fig. 1.
For each element, KI is constructed based upon a set of nodes in a polygonal DOI
encompassing a predetermined number of layers of elements. The KI function over the element is given by Eq. (12). By combining the KI of all elements in the domain,
13 the global field variable is approximated by piecewise KI. This way of approximation is very similar to the approximation in the conventional FEM.

15 It should be mentioned here that it is also possible to use quadrilateral elements to implement the concept of a layered-element DOI. Mesh with triangular elements



Fig. 1. Domain of influence for element el with one, two, and three layers of elements [Plengkhom and Kanok-Nukulchai (2005)].

On the Convergence of the Kriging-Based FEM 7

Table 1. Minimum number of layers for various basis functions.

Basis	Minimum number of layers
Linear	1
Quadratic, bilinear	2
Cubic, biquadratic	3
Quartic, bicubic	4

is chosen in this study, owing to its flexibility in representing complex geometry and 1 its ease in being automatically generated.

The number of layers for each element must cover a number of nodes in such a 3 way that the Kriging equation system, Eq. (4), is solvable. If an *m*-order polynomial 5 basis is employed, the DOI is required to cover a number of nodes, n, that is equal to or greater than the number of terms in the basis function, i.e. n > m. Based on our

7 experience, the minimum number of layers for different polynomial bases is listed in

Table 1. As the number of layers increases, the computational cost becomes higher. 9 Thus we recommend the use of a *minimum* number of layers for each polynomial basis.

11 3. Formulation

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3.1. K-FEM for plane-strain/plane-stress solids

The governing equations for plane-strain/plane-stress problems in the Cartesian 13 coordinate system can be written in a weak form, as follows:

$$\int_{V} \delta \boldsymbol{\varepsilon}^{T} \boldsymbol{\sigma} dV = \int_{V} \delta \mathbf{u}^{T} \mathbf{b} dV + \int_{S} \delta \mathbf{u}^{T} \mathbf{t} dS, \qquad (22)$$

where $\mathbf{u} = \{u \ v\}^T$ is the displacement vector, $\boldsymbol{\varepsilon} = \{\varepsilon_x \ \varepsilon_y \ \gamma_{xy}\}^T$ is the vector of 2D strain components, $\boldsymbol{\sigma} = \{\sigma_x \ \sigma_y \ \tau_{xy}\}^T$ is the vector of 2D stress components, 17 $\mathbf{b} = \{b_x \ b_y\}^T$ is the body force vector; $\mathbf{t} = \{t_x \ t_y\}^T$ is the surface traction force vector, V is the 3D domain occupied by the solid body, and S is the surface on 19 which the traction \mathbf{t} is applied.

21 Suppose that the domain V is subdivided by a mesh of N_{el} elements and N nodes. To obtain an approximate solution using the concept of KI with a layeredelement DOI, for each element $e = 1, 2, ..., N_{el}$ the displacement components u and 23 v are approximated by KI as follows:

$$u(x,y) \simeq \sum_{i=1}^{n} N_i(x,y)u_i, \quad v(x,y) \simeq \sum_{i=1}^{n} N_i(x,y)v_i$$
 (23)

Here, $N_i(x,y)$ denotes the Kriging shape function associated with node i; u_i and v_i are nodal displacement components in the x and y directions, respectively; and n is the number of nodes in the DOI of an element, which generally varies from element to element. Employing the standard formulation procedure of the FEM

1 [e.g. Cook *et al.* (2002); Zienkiewicz and Taylor (2000)], we may obtain the equilibrium equation for each element as follows:

$$\mathbf{k}^e \mathbf{d}^e = \mathbf{f}^e,\tag{24}$$

where the element stiffness matrix $(2n \times 2n)$

$$\mathbf{k}^{e} = \int_{V^{e}} \mathbf{B}^{eT} \mathbf{E} \mathbf{B}^{e} dV, \qquad (25)$$

the displacement vector $(2n \times 1)$

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 $\mathbf{d}^{e} = \{ u_{1} \quad v_{1} \quad u_{2} \quad v_{2} \quad \cdots \quad u_{n} \quad v_{n} \}^{T},$ (26)

and the consistent nodal force vector of element $e(2n \times 1)$

$$\mathbf{f}^{e} = \int_{V^{e}} \mathbf{N}^{eT} \mathbf{b}^{e} dV + \int_{S^{e}} \mathbf{N}^{eT} \mathbf{t}^{e} dS.$$
(27)

Matrix \mathbf{N}^e is the Kriging shape function matrix, i.e.

$$\mathbf{N}^{e} = \begin{bmatrix} N_{1} & 0 & N_{2} & 0 & \cdots & N_{n} & 0\\ 0 & N_{1} & 0 & N_{2} & \cdots & 0 & N_{n} \end{bmatrix},$$
(28)

 \mathbf{B}^e is the element strain-displacement matrix, i.e.

$$\mathbf{B}^{e} = \begin{bmatrix} N_{1,x} & 0 & N_{2,x} & 0 & \cdots & N_{n,x} & 0 \\ 0 & N_{1,y} & 0 & N_{2,y} & \cdots & 0 & N_{n,y} \\ N_{1,y} & N_{1,x} & N_{2,y} & N_{2,x} & \cdots & N_{n,y} & N_{n,x} \end{bmatrix},$$
(29)

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and **E** is the constitutive matrix, which, for the case of isotropic material, can be expressed in terms of modulus elasticity E and Poisson's ratio ν as follows:

$$\mathbf{E} = \frac{\bar{E}}{1 - \bar{\nu}^2} \begin{bmatrix} 1 & \bar{\nu} & 0\\ \bar{\nu} & 1 & 0\\ 0 & 0 & (1 - \bar{\nu})/2 \end{bmatrix},$$
(30)

17 with

$$\bar{E} = \begin{cases} E \\ \frac{E}{1-\nu^2} \end{cases}, \quad \bar{\nu} = \begin{cases} \nu & \text{for plane stress,} \\ \frac{\nu}{1-\nu} & \text{for plane strain.} \end{cases}$$
(31)

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 V^e is the 3D domain of element e and S^e is the surface of element e on which the traction ${\bf t}$ is applied.

For a triangular element of thickness h and area A^e , with traction force on edge s^e , Eqs. (25) and (27) can be expanded as follows:

$$\mathbf{k}^{e} = h \int_{A^{e}} \mathbf{B}^{eT} \mathbf{E} \mathbf{B}^{e}, \tag{32}$$

$$\mathbf{f}^{e} = h \int_{A^{e}} \mathbf{N}^{eT} \mathbf{b}^{e} dA +, h \int_{s^{e}} \mathbf{N}^{eT} \mathbf{t}^{e} ds.$$
(33)

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On the Convergence of the Kriging-Based FEM 9



Fig. 2. Positive directions for displacement and rotation components.

3.2. K-FEM for Reissner-Mindlin plates 1

Consider a plate of uniform thickness, h, homogeneous, referred to a three-3 dimensional Cartesian coordinate system with the x-y plane lying on the middle surface of the plate (Fig. 2). Its domain, V, is defined as

$$V = \left\{ (x, y, z) \in \mathbb{R}^3 | z \in \left[-\frac{h}{2}, \frac{h}{2} \right], (x, y) \in S \subset \mathbb{R}^2 \right\}.$$
 (34)

Rotation of a normal line has two components, namely ψ_x and ψ_y . The positive sign 7 convention for these rotation components and displacement components is shown in Fig. 2. For small displacement and rotation, the displacement field is described by

$$\mathbf{u}_{3\mathrm{D}} = \left\{ \begin{array}{c} u \\ v \\ w \end{array} \right\} = \left\{ \begin{array}{c} -z\psi_x(x,y) \\ -z\psi_y(x,y) \\ w(x,y) \end{array} \right\},\tag{35}$$

9

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where w(x, y) is the deflection of a point initially lying on the reference plane, S, and 11 $\psi_x(x,y)$ and $\psi_y(x,y)$ are the normal line rotation components around its midpoint with respect to the -y and x directions, respectively.

The governing equations for static deflection of RM plates under transversal 13 load q(x, y) can be written in a weak form as follows:

$$\int_{S} \delta \boldsymbol{\kappa}^{T} \mathbf{D}_{b} \boldsymbol{\kappa} dS + \int_{S} \delta \boldsymbol{\varepsilon}_{s}^{T} \mathbf{D}_{s} \boldsymbol{\varepsilon}_{s} dS = \int_{S} \delta \mathbf{u}^{T} \mathbf{p} dS.$$
(36)

In this equation,

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$$\boldsymbol{\kappa} = \{\psi_{x,x} \quad \psi_{y,y} \quad \psi_{x,y} + \psi_{y,x}\}^T \tag{37}$$

is the curvature vector,

$$\boldsymbol{\varepsilon}_s = \{\gamma_{x\,z} \quad \gamma_{y\,z}\}^T \tag{38}$$

is the transverse shear vector,

$$\mathbf{u} = \{ w \quad \psi_x \quad \psi_y \}^T \tag{39}$$

February 2, 2009 16:9 WSPC/IJCM-j050 00178

- 10 F. T. Wong & W. Kanok-Nukulchai
- 1 is the vector of three independent field variables for RM plates,

$$\mathbf{p} = \{q \quad 0 \quad 0\}^T \tag{40}$$

3 is the surface force vector,

21

$$\mathbf{D}_{b} = \frac{Eh^{3}}{12(1-\nu^{2})} \begin{bmatrix} 1 & \nu & 0\\ \nu & 1 & 0\\ 0 & 0 & (1-\nu)/2 \end{bmatrix}$$
(41)

5 is the elasticity matrix for bending deformation, and

$$\mathbf{D}_s = Gkh \begin{bmatrix} 1 & 0\\ 0 & 1 \end{bmatrix} \tag{42}$$

7 is the elasticity matrix for transverse shear deformation. Here,

$$G = \frac{E}{2(1+\nu)} \tag{43}$$

9 is the shear modulus and k is a shear correction factor to account for the parabolic z direction variation of transverse shear stress. The accepted value of k for a homo11 geneous plate is k = 5/6 [Cook et al. (2002)].

Suppose that the domain S is subdivided by a mesh of N_{el} triangular elements and N nodes. To obtain an approximate solution using the concept of KI with a layered-element DOI, for each element $e = 1, 2, ..., N_{el}$ the plate field variables are approximated by KI as follows:

$$w(x,y) \simeq \sum_{i=1}^{n} N_i(x,y) w_i,$$

$$\psi_x(x,y) \simeq \sum_{i=1}^{n} \eta_i(x,y) \psi_{xi}, \quad \psi_y(x,y) \simeq \sum_{i=1}^{n} \xi_i(x,y) \psi_{yi}.$$
 (44)

Here $N_i(x, y)$, $\eta_i(x, y)$ and $\xi_i(x, y)$ denote Kriging shape functions associated with node *i* for approximating defection and rotation in the *y* direction, and rotation in the *x*-direction, respectively; and w_i , ψ_{xi} , and ψ_{yi} are nodal deflection, and nodal rotation in the -y direction, and nodal rotation in the *x* direction, respectively. Shape functions N_i , η_i , and ξ_i do not have to be the same; they are independent of each other. In this study, however, they are taken to be the same, i.e.

$$\eta_i(x, y) = \xi_i(x, y) = N_i(x, y).$$
(45)

19 Inserting Eq. (44) into the variational equation of RM plates, Eq. (36), leads to the following discretized equilibrium equation for each element:

$$\mathbf{k}^e \mathbf{d}^e = \mathbf{f}^e, \tag{46}$$

February 2, 2009 16:9 WSPC/IJCM-j050 00178

On the Convergence of the Kriging-Based FEM 11

1 in which the element stiffness matrix $(3n \times 3n)$ is

$$\mathbf{k}^{e} = \mathbf{k}^{e}_{b} + \mathbf{k}^{e}_{s} = \int_{S^{e}} \mathbf{B}^{eT}_{b} \mathbf{D}_{b} \mathbf{B}^{e}_{b} dS + \int_{S^{e}} \mathbf{B}^{eT}_{s} \mathbf{D}_{s} \mathbf{B}^{e}_{s} dS,$$
(47)

3 the element nodal displacement vector $(3n \times 1)$ is

$$\mathbf{d}^{e} = \{ w_{1} \quad \psi_{x1} \quad \psi_{y1} \quad w_{2} \quad \psi_{x2} \quad \psi_{y2} \quad \cdots \quad w_{n} \quad \psi_{xn} \quad \psi_{yn} \}^{T},$$
(48)

5 and the element nodal force vector $(3n \times 1)$ is

$$\mathbf{f}^e = \int_{S^e} \mathbf{N}^{eT} \mathbf{p}^e dS. \tag{49}$$

In Eqs. (47) and (49), matrices \mathbf{N}^e , \mathbf{B}^e_b , and \mathbf{B}^e_s are defined as follows:

$$\mathbf{N}^{e} = \begin{bmatrix} N_{1} & 0 & 0 & \cdots & N_{n} & 0 & 0\\ 0 & N_{1} & 0 & \cdots & 0 & N_{n} & 0\\ 0 & 0 & N_{1} & \cdots & 0 & 0 & N_{n} \end{bmatrix},$$
(50)

$$\mathbf{B}_{b}^{e} = \begin{bmatrix} 0 & N_{1,x} & 0 & \cdots & 0 & N_{n,x} & 0 \\ 0 & 0 & N_{1,y} & \cdots & 0 & 0 & N_{n,y} \\ 0 & N_{1,y} & N_{1,x} & \cdots & 0 & N_{n,y} & N_{n,x} \end{bmatrix},$$
(51)

$$\mathbf{B}_{s}^{e} = \begin{bmatrix} N_{1,x} & -N_{1} & 0 & \cdots & N_{n,x} & -N_{n} & 0\\ N_{1,y} & 0 & -N_{1} & \cdots & N_{n,y} & 0 & -N_{n} \end{bmatrix}.$$
 (52)

7 3.3. Global discretized equilibrium equation

The global discretized equilibrium equation,

$$\mathbf{K}\mathbf{D} = \mathbf{F},\tag{53}$$

can be obtained from the element equilibrium equations — Eq. (24) for planestress/plane-strain problems and Eq. (46) for RM plates — by using the assembly procedure, i.e.

$$\mathbf{K} = A_{e=1}^{N_{el}} \mathbf{k}^{e}, \quad \mathbf{D} = A_{e=1}^{N_{el}} \mathbf{d}^{e}, \quad \mathbf{F} = A_{e=1}^{N_{el}} \mathbf{f}^{e}.$$
 (54)

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Here **K** is the global stiffness matrix, **D** is the global nodal displacement vector, **F** is the global nodal force vector, and $A_{e=1}^{N_{el}}$ denotes the assembly operator. It should be mentioned here that the assembly process for each element involves *all nodes in*

17 *the element's DOI*, and not only the nodes within the element as in the conventional FEM.

19 4. Incompatibility in the K-FEM

As described in Sec. 2, the KI is constructed for each element using a set of nodes, within and outside the element, in a predetermined layered-element DOI. Therefore, within each element the interpolation function is naturally continuous.



Fig. 3. The domain of influence of element 1 and element 2.

 However, along the element edges between two adjacent elements the function is not perfectly continuous, because the KI for each of the two neighboring elements
 is constructed using a different set of nodes.

For illustration, we consider element 1 and element 2 in a 2D domain as shown
in Fig. 3 and suppose that we use two element layers as the DOI for each element. Polygon A-B-C-D-E-F-G-H-I is the DOI for element 1 and polygon B-C-D-K-F-G-H-I is the DOI for element 2. The KI within element 1 is constructed using the 12 nodes in the first polygon, while the KI within element 2 is constructed using
the 11 nodes in the second polygon. As a result, the function along the edge LM of element 1 is different from the function along the edge LM of element 2. In other
words, the displacement function is not continuous across the common edge LM of the two neighboring elements. The foregoing explanation is principally the same as
that presented by Dai *et al.* [2003] in the context of the EFGM with KI.

To illustrate further the interelement incompatibility in the K-FEM, we consider
again the domain shown in Fig. 3 and suppose now that the value at node K is 1 and the other nodal values are 0. According to the KI of element 1, the function
along the interface LM is a zero function since the value at node K does not have any effect on the KI within element 1. On the contrary, according to element 2, the function along LM is not a zero function because the shape function associated with node K is not 0 between nodes L and M.

Thus it is apparent that the K-FEM does not satisfy the interelement compatibility requirement (*nonconforming*), except for the K-FEM with a linear basis and one layer DOI. Is this incompatibility acceptable? It is acceptable if it tends to zero as the mesh is repeatedly refined [Cook *et al.* (2002)]. In other words, the interelement compatibility needs only to be satisfied in the limit as the size of the element tends to zero. This is assessed through the weak patch test and convergence studies in the following section.

$On \ the \ Convergence \ of \ the \ Kriging-Based \ FEM \quad 13$

It should be mentioned here that it is also possible to employ a constrained variational equation in the K-FEM to deal with the incompatibility [e.g. Dai *et al.* (2003)]. This approach, however, will destroy the key advantage of the K-FEM mentioned in Sec. 1, namely its ease of implementation in a general purpose finite
 element program. It is for this reason that we do not resort to this approach to deal with the incompatibility.

7 After completion of the present study, we became aware of recent works by G. R. Liu's group on a class of computational methods based on the Galerkin for-9 mulation using the so-called generalized gradient smoothing technique [Liu (2008)]. Examples of the methods in this class are the node-based smoothed point interpolation method (NS-PIM, originally called the linearly conforming point inter-11polation method) [Liu et al. (2005); Zhang et al. (2007)] and the node-based smoothed radial point interpolation method (NS-RPIM) [Liu et al. (2006); Li et al. 13 (2007)]. In these methods, the compatibility of the incompatible node-based inter-15 polations was restored by using the stabilized conforming nodal integration proposed by Chen et al. [2001]. Nevertheless, the methods entail creation of smoothing 17 domains that are generally different from the original finite element mesh. A technique for constructing smoothing domains should be judiciously selected or invented 19 in order to preserve the simplicity of the K-FEM. It seems that the edge-based smoothing technique [Liu (2008) and references therein], in which the smoothing 21 domains are created based on edges of the elements, is a good choice for implementation of the gradient smoothing technique in the K-FEM. This needs further 23 research.

5. Numerical Tests

In the following tests, the integrals over each triangular element in the expressions for element stiffness matrices, Eqs. (32) and (47), and for nodal force vectors, Eqs. (33) and (49), were computed using the six-point quadrature rule for triangles [e.g. Hughes (1987)]. This rule was selected because it may give results that are reasonably accurate yet inexpensive in terms of computational cost. For computing the line integral in Eq. (33), the two-point Gaussian quadrature for line integrals was used, since it can yield an exact nodal force vector for edge traction force with cubic distribution or less.

Abbreviations in the form of P*-*-G* or P*-*-QS, in which the asterisk denotes a number, are adopted in this section to designate various options of the K-FEM.
The first syllable denotes a polynomial basis with the order indicated by the number next to letter P. The middle asterisk denotes the number of layers. The last syllable
denotes the Gaussian correlation function with the adaptive parameter given by

Eq. (18) and with the scale factor f indicated by the number next to the letter
G (in percent); QS denotes the quartic spline correlation function with the adaptive parameter given by Eq. (21). For example, P3-3-G50 means cubic basis, three

1 element layers, Gaussian correlation function with midvalue parameter function, i.e. f = 0.5.

3 5.1. Plane-stress/plane-strain solids

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To study the convergence of the K-FEM for plane-stress/plane-strain solids, two measures of error were utilized. The fist one is a relative L_2 error norm of displacement, defined as

$$\mathbf{u} = \left(\frac{\int_{V} (\mathbf{u}^{\mathrm{app}} - \mathbf{u}^{\mathrm{exact}})^{T} (\mathbf{u}^{\mathrm{app}} - \mathbf{u}^{\mathrm{exact}}) dV}{\int_{V} (\mathbf{u}^{\mathrm{exact}})^{T} \mathbf{u}^{\mathrm{exact}} dV}\right)^{1/2},$$
(55)

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where \mathbf{u}^{app} and $\mathbf{u}^{\text{exact}}$ are approximate and exact displacement vectors, respectively. The second one is a relative error norm of strain energy, defined as

$$r_{\varepsilon} = \left(\frac{\int_{V} \left(\boldsymbol{\varepsilon}^{\mathrm{app}} - \boldsymbol{\varepsilon}^{\mathrm{exact}}\right)^{T} \mathbf{E}(\boldsymbol{\varepsilon}^{\mathrm{app}} - \boldsymbol{\varepsilon}^{\mathrm{exact}}) dV}{\int_{V} \left(\boldsymbol{\varepsilon}^{\mathrm{exact}}\right)^{T} \mathbf{E} \boldsymbol{\varepsilon}^{\mathrm{exact}} dV}\right)^{1/2},\tag{56}$$

where ε^{app} and ε^{exact} are approximate and exact strain vectors, respectively. For computing these relative errors, the 13-point quadrature rule for triangles was
 employed for each element.

5.1.1. Weak patch test

- 15 We patch test is a test on a "patch" of finite elements with states of constant strains or constant stresses. Since the K-FEM is nonconforming, it will not pass the patch
 17 test for a patch with a large size of elements. Passing the patch test for a large size of elements, however, is not a necessary condition for convergence. The *necessary* and
 19 sufficient condition for convergence is to pass the patch test in the limit, as the size of the elements in the patch tends to zero [Zienkiewicz and Taylor (2000); Razzaque (1986)], provided that the system of equations is solvable and all integrations are exact. This kind of test is referred to as a weak patch test [Zienkiewicz and Taylor (2000); Cook et al. (2002)].
- The patch used for the weak patch test is shown in Fig. 4(a). It was adapted from
 the patch proposed by MacNeal and Harder [1985]. In order to be consistent with the displacement field u = 10⁻³(x + y/2), v = 10⁻³(y + x/2), u = 0.24 × 10⁻³, and
 v = 0.12 × 10⁻³ were prescribed at node B. The initial course mesh, which includes 25 nodes, is shown in Fig. 4(b). We defined the element characteristic size for this mesh h_c = 0.06. Subsequently, mesh refinements were performed by subdividing the elements.
 The following K-FEM options were used for the weak patch test: P2-2 with
- G0, G50, G80, QS and P3-3 with G0, G50, G80, QS. Displacement error norms of
 the K-FEM solutions are plotted against element characteristic sizes in Fig. 5. The average convergence rate (R) of each option is also shown in the legend. The figure
 indicates that the K-FEM does not pass the test in any mesh but the solutions

1



On the Convergence of the Kriging-Based FEM 15

Fig. 4. (a) A patch under constant stresses and (b) its initial mesh for the weak patch test.

converge. For the K-FEM of option P3-3-G0, however, the convergence is doubtful. Therefore, we conclude that the K-FEM passes the weak patch test, except for that 3 with option P3-3-G0. For the K-FEM with Gaussian correlation functions, as the parameter θ comes closer to the upper bound values, the convergence rate and 5 accuracy increase. The K-FEM with the QS is the best in terms of the convergence rate (R = 1.45 for P2-2 and R = 1.82 for P3-3).

7 The strain energy error norms vs. element characteristic sizes are shown in Fig. 6. These energy errors are mainly due to "gaps" or "overlaps" along the interface 9 between two elements, because the roundoff and numerical integration errors are negligible. Therefore, in this case the energy error may serve as a measure of the 11 degree of incompatibility of the K-FEM. The figure shows that the incompatibilities of the K-FEM with various options tend to decrease as the mesh is refined. The

16 F. T. Wong & W. Kanok-Nukulchai



Fig. 5. Relative error norm of displacement vs. element characteristic size for the patch analyzed using the K-FEM with: (a) P2-2, (b) P3-3. The number after the code for the K-FEM option in the legend indicates the average convergence rate.

1 K-FEM with the QS correlation function is "more compatible" than that with the Gaussian.

3 5.1.2. An infinite plane-stress plate with a hole

An infinite plane-stress plate with a circular hole of radius a = 1 was subjected to a uniform tension $T_x = 100$ at infinity [Tongsuk and Kanok-Nukulchai (2004)] [Fig. 7(a)]. In view of the symmetry, only the upper right quadrant of the plate, $0 \le x \le 5$ and $0 \le y \le 5$, was analyzed. Zero normal displacements were prescribed on the symmetric boundaries and the exact traction boundary conditions were imposed on the right (x = 5) and top (y = 5) edges.

The initial course mesh of 42 nodes is shown in Fig. 7(b). The element characteristic size for this problem is taken as the distance between two nodes at the right or top edge, i.e. $h_c = 1$. Subsequently, the mesh was refined by subdividing the previous element into four smaller elements. The refined meshes considered in this test are meshes with $h_c = 0.5$ (141 nodes) and $h_c = 0.25$ (513 nodes). In performing the analysis with $h_c = 0.25$ using the Gaussian correlation function, the scale factor



On the Convergence of the Kriging-Based FEM 17

Fig. 6. Relative error norms of strain energy vs. element characteristic sizes for the patch analyzed using the K-FEM with: (a) P2-2, (b) P3-3.

1 f = 0.79 was used in place of f = 0.8, because the use of f = 0.8 resulted in det(**R**) exceeding the upper bound criterion, Eq. (17), for some elements.

The convergence characteristics for displacement and strain energy are shown in Figs. 8(a) and 8(b), respectively. The figures indicate that the rates of convergence of all K-FEM options are nearly equal, for displacement as well as strain energy. The fastest convergence rate in terms of the displacement error is achieved by the K-FEM with P3-3-G80 (the rate R = 2.60), while the fastest one in terms of the strain energy error is the K-FEM with P3-3-QS (R = 1.37). Theoretically, the accuracy and convergence rate of the K-FEM with a cubic basis higher than those with a quadratic basis. However, this is not the case because of the incompatibilities of the K-FEM.

5.2. Reissner-Mindlin plates

13 The convergence of the K-FEM for RM plates was assessed in terms of the relative L_2 error norm of displacement, viz.

$$r_u = \frac{\|\mathbf{u}_{3D}^{\text{app}} - \mathbf{u}_{3D}^{\text{exact}}\|}{\|\mathbf{u}_{3D}^{\text{exact}}\|},\tag{57}$$

18 F. T. Wong & W. Kanok-Nukulchai



Fig. 7. (a) An infinite plate with a circular hole and (b) the initial mesh of the shaded area.

1 where \mathbf{u}_{3D}^{app} and \mathbf{u}_{3D}^{exact} are approximate and exact displacement vectors of the 3D solid, respectively. The displacement norm in Eq. (57) was expanded as follows:

$$\|\mathbf{u}_{3\mathrm{D}}\| = \left(\int_{V} \mathbf{u}_{3\mathrm{D}}^{T} \mathbf{u}_{3\mathrm{D}} dV\right)^{1/2} = \left(\int_{V} (u^{2} + v^{2} + w^{2}) dV\right)^{1/2}.$$
 (58)



On the Convergence of the Kriging-Based FEM 19

Fig. 8. Relative error norms of (a) displacement and of (b) strain energy and their convergence rates for the holed plate.

1 Substituting the u, v, and w in this equation with those stated in Eq. (35) and then integrating over the thickness resulted in

$$\|\mathbf{u}_{3\mathrm{D}}\| = \left(h \int_{S} w^2 dS + \frac{h^3}{3} \int_{S} (\psi_x^2 + \psi_y^2) dS\right)^{1/2}.$$
 (59)

As in the previous tests, the 13-point quadrature rule for triangles was employed to evaluate the integrals in this equation for each element.

5.2.1. Weak patch tests

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- 7 The same patch and meshes as in the previous patch test (Fig. 4) were used in the following tests, except for the loading condition and the thickness. Two conditions
 9 of the patch were considered: constant curvature and constant transverse shear strain. The length-to-thickness ratio of the patch was differently specified for each
- 11 condition of the tests. Based on the study of the performance of various K-FEM options in alleviating shear locking [Wong and Kanok-Nukulchai (2006a, b)], the
- 13 following K-FEM options were used for the patch tests: P3-3-G0, P3-3-QS, P4-4-G0, and P4-4-QS.

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1 5.2.1.1. Constant curvature condition

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The boundary of the patch was imposed by the essential boundary conditions as presented by MacNeal and Harder [1985], i.e.

$$w = \frac{10^{-3}(x^2 + xy + y^2)}{2},\tag{60}$$

-P3-3-G0 -P3-3-QS, 1.36

-P4-4-G0, 0.84 Y P4-4-QS, 1.62

$$\psi_x = \frac{\partial w}{\partial x} = 10^{-3} \left(x + \frac{y}{2} \right), \quad \psi_y = \frac{\partial w}{\partial y} = 10^{-3} \left(\frac{x}{2} + y \right).$$
 (61)

These fields lead to the following constant curvatures and moments:

$$\boldsymbol{\kappa} = \{1 \quad 1 \quad 1\}^T \times 10^{-3}, \quad \mathbf{M} = -\left\{\frac{10}{9} \quad \frac{10}{9} \quad \frac{1}{3}\right\}^T \times 10^{-7}.$$
 (62)

Shear strains and shear stresses corresponding to these constant curvatures are zero. The length-to-thickness ratio of the patch was set to 240 (h = 0.001) in order to 5 represent thin plates.

Displacement error norms of the K-FEM solutions are plotted against element 7 characteristic sizes in Fig. 9. It can be seen that from the second mesh $(h_c = 0.03)$ until the last mesh $(h_c = 0.0075)$ the solutions of the K-FEM converge, except 9 for the K-FEM with option P3-3-G0. The solutions for the mesh of $h_c = 0.06$ (25 nodes) are exceptionally accurate, because 16 of the 25 nodes are located at 11 the boundary and accordingly imposed by the boundary conditions (60). Thus, the nodal displacements associated with the 16 boundary nodes are automatically 13 exact. In addition, for a cases of a relatively small number of nodes in a domain, the K-FEM may yield extraordinarily accurate results because the KI is close to 15 a polynomial function of higher order than the basis function. We conclude that

the K-FEM with options P3-3-QS, P4-4-G0, and P4-4-QS pass the weak constant 17 curvature patch test but the K-FEM with P3-3-G0 does not pass. The K-FEM with



Fig. 9. Relative error norm of displacement vs. element characteristic size for the constant curvature patch test. The numbers in the legend indicate the average convergence rates from the second mesh up to the last.

February 2, 2009 16:9 WSPC/IJCM-j050 00178

On the Convergence of the Kriging-Based FEM 21

1 the QS correlation function has a better convergence characteristic than that with G0. This finding is similar to the one regarding the plane-stress condition.

3 Constant transverse shear-strain condition

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A state of constant transverse shear strains and zero curvatures, i.e.

$$\boldsymbol{\varepsilon}_s = \{1 \quad 1\}^T \times 10^{-6}, \quad \boldsymbol{\kappa} = \{0 \quad 0 \quad 0\}^T, \tag{63}$$

can be obtained, with all equilibrium equations satisfied, only for the extreme case
of thick plates [Batoz and Katili (1992)]. In this test, an extremely thick plate with the length-to-thickness ratio 0.0024 (h = 100) was considered. The displacement
fields leading to the constant shear strains, Eq. (62), are as follows:

$$w = 10^{-6} \frac{x+y}{2}, \quad \psi_x = -\frac{1}{2} \times 10^{-6}, \quad \psi_y = -\frac{1}{2} \times 10^{-6}.$$
 (64)

11 The shear forces corresponding to the constant shear strains are

$$\mathbf{Q} = \left\{ \frac{100}{3} \quad \frac{100}{3} \right\}^{\mathrm{T}}.$$
 (65)

The test was performed by imposing nodal values on the boundary according to the fields stated by Eq. (63). The error indicator used in this test is the relative L₂
error norm of deflection, defined as

$$r_w = \left(\frac{\int_S (w^{\text{app}} - w^{\text{exact}})^2 dS}{\int_S (w^{\text{exact}})^2 dS}\right)^{1/2}.$$
(66)

- 17 This indicator was used here instead of the displacement error norm, Eq. (57), because the thickness of the plate was extremely large so that if we used Eq. (57),
- 19 the norm would be dominated by the rotation errors. We found that these rotation errors are relatively constant for different degrees of mesh refinements.



Fig. 10. Relative error norm of deflection vs. element characteristic size for the constant shear patch test.

The plot of the relative deflection error norms for the K-FEM with different analysis options is shown in Fig. 10. It can be seen that all of the options lead to converging solutions and therefore they *pass* the weak constant shear patch test. As in the previous test, the accuracy and convergence rate of the K-FEM with QS are better than those with G0.

5.2.2. A thin square plate

We considered a hard simply supported square plate of length L = 100 and length-7 to-thickness ratio L/h = 100 under uniform transverse load $q = -1 \times 10^{-6}$. The modulus of elasticity is $E = 2 \times 10^6$ and Poisson's ratio is v = 0.3. To study 9 the convergence of the K-FEM solutions, a quadrant of the plate was discretized with different degrees of mesh refinement: 4×4 ($h_c = 12.5$, Fig. 11), 6×6 ($h_c =$ 11 $(8.33), \ldots, 12 \times 12$ ($h_c = 4.17$). The meshes were automatically generated using the Delaunay algorithm and thus the triangles had random orientation, such as 13 shown in Fig. 11. The K-FEMs with P3-3-QS and P4-4-QS were chosen in this and subsequent tests because they showed good performance both in the shear locking 15 study [Wong and Kanok-Nukulchai (2006a, b)] and in patch tests. In computing the displacement error norms, Eq. (57), the exact displacement fields according to 17 the thick plate theory [Reissman (1988)] were used.

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The displacement error norms are plotted against element characteristic sizes in Fig. 12. The figure shows excellent convergence characteristics. The results with



Fig. 11. Initial mesh of a quarter of the square plate (4-by-4).

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10

On the Convergence of the Kriging-Based FEM 23

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Fig. 12. Relative error norms of displacement and their convergence rates for the square plate.

option P4-4-QS, as expected, are more accurate than those with P3-3-QS. However, 1 the best converge rate is achieved for P3-3-QS with R = 5.54. The reason for this is that the incompatibilities in the K-FEM with P3-3-QS diminished faster than that 3 in the K-FEM with P4-4-QS.

100

5 5.2.3. A thick circular plate

A clamped circular plate of diameter D = 100 and length-to-thickness ratio D/h =7 5 was considered. The uniform load intensity and material properties were the same as in the previous test (the thin square plate). A quadrant of the plate was 9 discretized with different degrees of mesh refinement, as shown in Fig. 13. The element characteristic size h_c was defined as the length of the first line segment on 11 the x axis (which is one of the edges of the triangle in the center). In computing the displacement error norms, the exact solutions based on the thick plate theory [Reismann (1988)] were used. 13 The convergence of the solutions in terms of the displacement error norm is

15 shown in Fig. 14. The figure indicates that the average convergence rates for P3-3-QS and P4-4-QS are nearly equal. The solutions of P3-3-QS are slightly more accurate that those of P4-4-QS. This fact disagrees with the usual tendency in the 17 standard FEM, namely the higher the degree of shape functions, the more accurate the results. This disagreement occurs because in this problem the incompatibility 19 in the K-FEM with P4-4-QS is more severe than that in the K-FEM with P3-3-QS.

6. Conclusions 21

The convergence characteristics of the K-FEM with different options have been studied in the context of plane stress and Reissner–Mindlin plate problems through 23 some numerical tests. It was found that the K-FEM with different options passed 25 the weak patch tests except for the K-FEM with P3-3-G0. For the K-FEM with the Gaussian correlation function, the convergence characteristics were better as the 27 correlation parameters were closer to the upper bound. The K-FEM with the QS

24 F. T. Wong & W. Kanok-Nukulchai



(a) Mesh No. 1: 34 nodes, 47 elements, $h_c = 10$



Fig. 13. Meshes of a quarter of the circular plate [adopted from Kokaew (2003)].

 $On \ the \ Convergence \ of \ the \ Kriging-Based \ FEM \quad 25$

(c) Mesh No. 3: 76 nodes, 119 elements, $h_c=5\,$

(d) Mesh No. 4: 208 nodes, 359 elements, $h_c = 2.2$

Fig. 13. (Continued)

26 F. T. Wong & W. Kanok-Nukulchai

Fig. 14. Relative error norms of displacement and their convergence rates for the circular plate.

correlation function had better convergence characteristics than that with the Gaussian as its solutions were not sensitive to the change of the correlation parameter.
 The numerical tests with several benchmark problems demonstrated good and reliable convergence characteristics of the K-FEM using QS correlation functions.

Passing the weak patch tests indicates that the incompatibility decreases as the mesh is refined. Therefore, the convergence of the K-FEM with appropriate options

- 7 is guaranteed. The use of the QS correlation function in a K-FEM for analyses of two-dimensional problems is thus recommended. The results of the present study
 9 confirm that the K-FEM is a viable alternative to the conventional FEM and has great potential in engineering applications. Future research may be directed at
- 11 implementation of the generalized gradient smoothing technique [Liu (2008)] in the K-FEM.

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