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Extracting Elastic-Plastic Properties from Experimental Loading-Unloading Indentation Curves using Different Optimization Techniques

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Highlights

- Elastic-plastic material properties are extracted from indentation tests
- Three numerical optimisation techniques are applied with Finite Element Analysis (FEA)
- Optimised solutions are compared to the corresponding experimental test data
- Applicability and limitations of Finite Element (FE) and optimisation techniques are evaluated

Graphical Abstract

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Abstract

This work is focused on the determination of elastic-plastic material properties from indentation loading-unloading curves using optimisation techniques and experimental data from instrumented indentation tests. Three different numerical optimisation methods (namely, FE analysis, dimensional mathematical functions and simplified mathematical equations approaches) have been used to determine three material properties; Young's modulus, yield stress and work-hardening exponent. The predictions of the material properties from the three approaches have been validated against the values obtained from uniaxial tensile tests and compared to the experimental loading-unloading curves. In general, the elastic-plastic material properties predicted from these three proposed optimisation methods estimate the Young's modulus to within 6% and the yield stress and work-hardening exponent to within 12%, compared to the values obtained from the uniaxial tensile tests.

Keywords:

Indentation; Finite Element Analysis; Optimization, elastic-plastic, material properties

1. Introduction

Indentation techniques have been used for mechanical characterisation of materials for decades due to their non-destructive nature and applicability to small sized samples. **Figure 1** shows a schematic illustration of an indentation testing system [1] where a downward load is applied to the indenter to penetrate the test sample, and the reaction force and the displacement at the indenter tip are recorded during the test. Different approaches have been proposed to obtain the mechanical material properties, such as Young's modulus (E), yield stress (σ_v) and work-hardening exponent (n), from the indentation data, see e.g. [2-12]. In many studies, there is only one interpreting method involved and it is usually performed using numerical simulations, see e.g. [4, 8]. Experimental indentation tests have been carried out for different materials using different indenter geometries and compared to the corresponding numerical simulations, e.g. [6, 7, 12].

Figure 1. Schematic illustration of a typical instrumented indentation system [1].

To analyse the material response of an indented specimen, the effects of the indenter geometry on the prediction of the material properties have been investigated by Kang et al [13] using the commercial FE software ABAQUS with new optimisation approaches combining three different methods: (i) Combined FE Simulation and optimisation [14] (ii) Combined dimensional analysis and optimisation [15] and (iii) Optimisation using simplified equations [16]. However, the previous optimisation techniques [14-16] have been mainly based on simulated target FE loading-unloading curves, rather than curves obtained from experimental tests. It has been found in a previous study [14] that determining elastic-plastic properties from indentation data using only FE simulation and optimisation is less accurate when it is based on experimental indentation data with random errors. Therefore, it is worth extending the investigation to the other two developed optimisation approaches to evaluate their feasibility and robustness.

This study highlights the extraction of elastic-plastic properties from experimental instrumented indentation loading-unloading curves, using the three developed optimization techniques. The general performance and the applicability of these techniques are evaluated and some limitations and areas that need to be explored in the future are addressed. In this study, the experimental loading-unloading curves are obtained using a single Berkovich indenter under different indentation loads [14].

To investigate the mechanical properties of materials that exhibit a power law hardening, which is generally assumed to characterise the work-hardening plasticity behaviour of metals including steels, the stress-strain relationship is given as follows:

$$
\sigma = \begin{cases} \text{E}\varepsilon, & \varepsilon \le \frac{\sigma_y}{E} \\ \text{K}\varepsilon^n, & \varepsilon > \frac{\sigma_y}{E} \end{cases}
$$
 (1)

where the coefficient K is given by:

$$
K = E^n \sigma_y^{1-n} \tag{2}
$$

2. Nanoindentation and tensile experimental data

Room temperature nanoindentation tests with a Berkovich indenter have been performed in [17] on P91 steel specimens with maximum loads of 150mN, 200mN as shown in **Figure 2**. Ten indentation tests have been completed at each load level to provide accurate indentation curves. The details of the nanoindentation tests are presented in **Table 1** where the loading time and the unloading time were set at 20s and 10s respectively. Young's modulus of the P91 steel at room temperature can be obtained based on the Oliver-Pharr method which uses the unloading part of the indentation curve to obtain Young's modulus [19]. The average values of Young's modulus at each load level are presented in **Table 2**.

Figure 2. Experimental loading-unloading curves at (a) 150mN and (b) 200mN load levels using a Berkovich indenter [17].

Material	Geometry of indenter	Temperature	Applied Force	
P91 steel	Berkovich indenter	Room $(23^{\circ}C)$	$(100mN, 150mN,$ and 200mN	

Table 2 Young's modulus from nanoindentation tests based on the Oliver-Pharr method.

Uniaxial tensile tests at room temperature (23°C) on P91 steel specimens have also been performed [18] to obtain the stress-strain uniaxial data. P91 true stress-true strain curve is shown in **Figure 3** where Young's modulus (E) is 215 GPa and the yield stress (σ_{γ}) is 515 MPa at a strain of 0.0033. A power law hardening, described by equations (1) and (2), was assumed for the plasticity of the material. By fitting the stress-strain data from Figure 2, the hardening exponent n was determined to be 0.136. The

material properties obtained from the uniaxial tensile stress-strain data can be used to validate the optimised results based on the three different optimisation techniques. It is interesting to note that Young's modulus values for P91 steel obtained from the nanoindentation tests using the Oliver-Pharr method [2] are approximately 14% higher than those from the uniaxial tensile tests.

Figure 3. True stress-strain curves for the P91 steel specimen.

3. Applying three different optimisation methods to experimental indentation loading-unloading curves

3.1 Optimisation Method 1: Combined FE simulation and optimisation algorithm approach

A combined FE simulation and optimisation approach has been developed to determine the elasticplastic material properties in a previous study [14], in which the simulated FE loading-unloading curves have been used as the target loading-unloading curves. In other studies (e.g. [20]), indentation tests results have been used together with FE simulations to determine the mechanical material properties, but the results are less accurate compared to the purely numerical studies [20]. The experimental nanoindentation tests in this study have been performed using a Berkovich indenter with different applied loads. 3D FE indentation models of the Berkovich indenter have been implemented using the ABAQUS FE software with four-node linear tetrahedron elements (C3D4 in ABAQUS). A high element density was implemented in the vicinity of the indenter tip to model the steep stress gradients in this region, as shown in **Figure 4**. Boundary conditions were applied in the x and y directions to prevent rigid body motion. The depth and diameter of the bulk material are 1.5 mm and 10 mm respectively.

Figure 4. 3D FE mesh around the contact region of a 3D Berkovich indenter.

3D indentation FE models have been used with the maximum applied forces of the Berkovich indenter of 150mN and 200Nm. The simulation has been carried out in two distinct steps, a loading step and an unloading step. In the first step, the maximum load has been imposed and the rigid indenter moved downwards along the vertical direction penetrating the foundation up to the maximum specified load. In the second step, the indenter is moved upwards to the initial position.

Previous optimisation results in [15] and [16**]** showed that using just a single loading-unloading curve with a single indenter geometry could not guarantee arriving at a unique set of elastic-plastic material properties since optimisation methods may come up with more than one set of material properties that result in the same indentation loading-unloading curve. Therefore, to compare with other optimisation methods, two different loading-unloading curves based on the same Berkovich geometry but with two different applied loads (150 mN and 200 mN) are used as two (dual) loading-unloading curves. To determine the elastic-plastic material properties, loading-unloading curves for tests 3 and 7 for both 150mN and 200mN tests were selected as the representative experimental curves because they were close to the average of the results of the repeated tests. As Figure 1 shows, there are some differences between the results of the repeated tests, which indicates that nanoindentation is a sensitive testing technique. The focus of the current study is applying the inverse optimisation method to the experimental data from the indentation tests. The optimised results using the combined FE simulation and optimisation algorithm approach are shown in **Table 3** for test 3 and **Table 4** for test 7.

The optimisation methods work by assuming an initial guess for the material properties and then performing iterations to improve the predictions by comparing the predicted loading curves to the actual loading curves [13-16]. The results show that optimised results are reached in about 18-38 iterations and the total number of iterations increases as the initial guess values deviate from the target values. Young's modulus and yield stress are generally in good agreement compared with the uniaxial tensile test data. However, both optimised results of the work hardening exponent are approximately 5-12% less than the value obtained from the tensile test data. **Figures 5 and 6** show the convergence history of the material properties for tests 3 and 7, respectively. In general, convergence starts after 15 iterations, with the exception of case 1(b) in **Figure 5**.

Case	Parameters	Target values	Initial guess	Final optimised	Percentage	Iterations to
			values	values	Error	convergence
	E(GPa)	215.0	180.0	214.4	0.3%	
$\mathbf{1}$	$\sigma_{v}(\text{MPa})$	515.0	400.0	504.5	2.0%	18
	$\mathbf n$	0.136	0.100	0.126	7.3%	
2	E(GPa)	215.0	110.0	214.0	0.4%	
	$\sigma_{v}(\text{MPa})$	515.0	592.0	497.8	3.3%	25
	$\mathbf n$	0.136	0.193	0.129	4.8%	
3	E(GPa)	215.0	80.0	214.9	0.7%	
	$\sigma_{v}(\text{MPa})$	515.0	250.0	512.9	0.4%	38
	$\mathbf n$	0.136	0.450	0.127	6.6%	

Table 3 Optimisation results with different initial values for 150mN and 200mN tests (Test 3 with Optimisation Method 1)

Table 4 Optimisation results with different initial values for 150mN and 200mN tests (Test 7 with Optimisation Method 1)

Figure 5. Optimised parameter values versus iterations for test 3 (a) case 1, (b) case 2 and (c) case 3 (Berkovich indenter using Optimisation Method 1)

Figure 6. Optimised parameter values versus iterations for test 7 (a) case 1, (b) case 2 and (c) case 3 (Berkovich indenter using Optimisation Method 1)

Figure 7 shows the comparison between experimental loading-unloading curves and the optimised FE simulated loading-unloading curves for a Berkovich indenter with 150mN and 200mN based on the set of the final optimised parameters in **Tables 3** and **4**, respectively, where a good agreement is obtained. Optimisation Method 1 generally estimates the elastic-plastic material properties well, despite the under-estimation of the value of the work hardening exponent.

Figure 7. Comparison between Experimental curves and FE curves from final optimised results (a) Experimental test 3 (b) Experimental test 7 (Berkovich indenter using Optimisation Method 1)

3.2 Optimisation Method 2: Combined dimensional approach and optimisation

A combined dimensional analysis and optimisation approach has been developed and used to determine the elastic-plastic material properties from loading-unloading curves, as discussed in [15]. To construct the dimensional functions, a parametric study using FE analyses with a wide range of steel material properties and a sharp indenter has been performed. In general, the elastic-plastic material properties may not uniquely be determined using a single indentation loading-unloading curve [1]. Since more accurate estimated results can be obtained from more than one indentation curve, indenters with different indenter angles were used to arrive at the dimensionless functions.

The dimensional functions used in [15] were constructed by using a representative plastic strain and a representative stress. From the P91 true stress-strain curve in **Figure 2**, the representative strain value is 0.0115 which corresponds to a stress value of approximately 560 MPa.

Figure 8 shows the comparison between the experimental loading-unloading curves and the FE simulated curves, based on the reference properties obtained from the uniaxial tensile tests. FE simulated curves generally agree well with both experimental loading-unloading curves.

Figure 8. Comparison between experimental loading-unloading curves of test 3 and test 7 and FE simulated curves (Berkovich indenter using Optimisation Method 2)

Table 5 shows the optimisation results based on the experimental indentation curves for tests 3 and 7, where it is shown that Young's modulus is estimated more accurately than the values of the yield stress and work hardening exponent. Compared with the Oliver and Pharr's method shown in **Table 2,** the predictions of Young's modulus using this approach are more accurate. However, the errors in the predictions of the yield stress and work hardening exponent for both experimental tests are relatively large, with errors of approximately 10% for the yield stress and 5-10% for the work hardening exponent.

Figure 19 shows the experimental indentation curves and the FE simulated curves based on the final optimised results in **Tables 5** and **6**. It is can be seen that the optimised curves agree well with the experimental loading-unloading curves despite the prediction errors of the yield stress and work hardening exponent. This means that the dimensional functions can capture the physical relationships between the indenter and the specimen due to the fact that the functions have been generated from FE simulations performed with a wide range of material properties.

To demonstrate that using dual loading-unloading curves with different loads does not guarantee the uniqueness of the optimised material properties, loading-unloading curves has been generated from the FE analysis of five different sets of elastic-plastic properties obtained during the optimisation procedure, as shown in **Figure 10** . It can be seen that visually it is hard to distinguish the differences between the loading-unloading curves. Therefore, it is advisable to use indentation curves based on different indenter geometries, rather than just different indentation loads. Also, this indicates that a combined dimensional approach and optimisation algorithm could not arrive at the elastic-plastic material properties uniquely without further background information. Therefore, to improve the accuracy and uniqueness of Optimisation Method 2, dual loading-unloading curves with different indenter geometries should be used.

Table 5 Optimisation results with two different initial values for Test 3 (Berkovich indenter using Optimisation Method 2)

Table 6 Optimisation results with two different initial values for Test 7 (Berkovich indenter using Optimisation Method 2)

Figure 9. Loading-unloading curves for experimental tests and curves generated by FE simulation based on the final optimised values in (a) **Tables 5** and (b) **Tables 6** (Berkovich indenter using Optimisation Method 2)

Figure 10. Loading-unloading curves for FE simulated curves based on different elastic-plastic material properties and the target value of FEA curves (Berkovich indenter using Optimisation Method 2)

3.3 Optimisation Method 3: Obtaining material properties from indentation loading-unloading curves using simplified equations

Material properties from indentation loading-unloading curves can be obtained using simplified equations. This has been achieved using a MATLAB nonlinear least square routine with LAQNONLIN function to produce the best fit between the experimental loading-unloading curve and the predicted optimised curves. Further details of the simplified equations can be found in [15].

Tables 7 and **8** show the target and final optimised values based on different initial guess values of the material properties. In general, there are excellent agreements for Young's modulus and the workhardening exponent, which agree within 5% with both experimental loading-unloading curves. However, the yield stress values $\sigma_{0.0115}$ are approximately 12% over-estimated. To demonstrate how the elastic-plastic material parameters reach convergence, **Figure 11** shows the forward differences $(X_{t+1} - X_t)$ versus iterations in case 2 in **Table 8**.

Table 7 Optimisation results with two different initial values for Test 3 (Berkovich indenter using Optimisation Method 3)

Case	Parameters	Target values	Initial guess values	Final optimised values	Percentage Error for E, σ_v, n
1	E(GPa)	215.0	180.0	217.0	1.0%
	$\sigma_{0.0115}$ (MPa)	560.0	400.0	635.9	12.0%
	$\mathbf n$	0.136	0.100	0.140	3.5%
$\overline{2}$	E(GPa)	215.0	110.0	214.7	1.0%
	$\sigma_{0.0115}$ (MPa)	560.0	592.0	635.5	12.0%
	$\mathbf n$	0.136	0.193	0.140	3.5%

Table 8 Optimisation results with two different initial values for Test 7 (Berkovich indenter using Optimisation Method 3)

Case	Parameters	Target values	Initial guess values	Final optimised values	Percentage Error for E, σ_{γ}, n
	E(GPa) $\sigma_{0.0115}$ (MPa) n	215.0 560.0 0.136	180.0 400.0 0.100	217.7 638.3 0.138	1.0% 12.0% 1.4%
$\overline{2}$	$\begin{array}{c}\hbox{E(GPa)}\\ \sigma_{0.0115}(\text{MPa})\end{array}$ n	215.0 560.0 0.136	110.0 592.0 0.193	218.4 635.6 0.140	1.0% 12.0% 2.6%

Figure 11. Forward differences $(X_{t+1} - X_t)$ versus iterations for case 2 in **Table 8** (Berkovich indenter using Optimisation Method 3)

Figure 12 shows the comparisons between the optimised curve from MATLAB and the experimental loading-unloading curves. In addition, the final optimised material properties are fed as input into the FE simulation to generate two FE simulated loading-unloading curves. The optimised curves from MATLAB agree well with the experimental test curves. However, there is some deviation between the FE simulated curves and the optimised curves from MATLAB. Therefore, accurate and unique material properties using simplified mathematical equations cannot be guaranteed based on loadingunloading curves with different loads. It can be said that the mathematical equations may not accurately capture the physical relationships between the indenter and the specimen. Therefore, further investigations with more experimental tests using different indenter geometries may be required to improve this optimisation method.

Figure 12. Loading-unloading curves for FE simulated curves based on the different elastic-plastic material properties from the optimised values and the target value of FE curves (Berkovich indenter using Optimisation Method 3)

4. Discussion

Three different optimisation methods; FE analysis, dimensional analysis and a simplified empirical method, are used to extract elastic-plastic material properties (E, σ_v, n) from experimental loadingunloading indentation curves using a Berkovich indenter. Room temperature nanoindentation tests have been performed on a P91 steel specimen with two maximum load levels of 150 and 200 mN to provide two sets of indentation loading-unloading curves.

With regards to Optimisation Method 1 (FE method), there are small differences between the experimental test curves and the corresponding FE generated curves, especially in the loading portion of the curve. The differences are expected since the effects of friction, sharpness of the indenter tip, indentation size effects and strain rate effects in the experimental indentation tests are not taken into account in the FE analysis. The optimised results are very similar to the results obtained in [14]. Both the values of Young's modulus and yield stress are close to the results obtained from the uniaxial tensile test. However, the values of the work-hardening exponent are over-estimated. This indicates that using an experimental indentation curve from a single indenter, albeit with two different load levels, may not be sufficient to arrive at accurate predictions of the work hardening exponent.

With respect to Optimisation Method 2 (dimensional functions approach), the values of Young's modulus and work hardening exponent are relatively more accurate than the values of yield stress. The issues of uniqueness have clearly been illustrated in **Figure 9**, which shows that different sets of material properties can result in similar loading-unloading curves. This raises the issue of uniqueness of the material properties obtained from optimisation methods, i.e. using the same indenter geometry with different loads does not guarantee obtaining a unique set of elastic-plastic material properties.

With reference to Optimisation Method 3 (simplified equations approach), the results show that the values of Young's modulus and work hardening exponents agree well with those obtained from uniaxial tensile tests, but the final optimised values of the yield stress are generally over-estimated. **Figure 12** shows that the FE simulated loading-unloading curves do not match well with the corresponding experimental curves, even though the final simulated curves from MATLAB agree well with the experimental curves.

5. Conclusions

Three different optimisation methods have been used to establish the accuracy and robustness of optimisation techniques in extracting the elastic-plastic material properties from an experimental indentation test in which a loading-unloading curve can be obtained. A Berkovich indenter and two different loads, 150mN and 200mN, have been applied to provide dual indentation data.

In general, the elastic-plastic material properties from these three proposed methods estimate the values of Young's modules to within 6%, compared to the actual values obtained from the uniaxial tensile tests. Furthermore, the estimations of Young's modulus are much better than those obtained from the Olive-Pharr method, which are approximately 20% over-estimated. The yield stress and work-hardening exponent are obtained to within 12%, compared to the values obtained from the uniaxial tensile tests.

To obtain a unique set of elastic-plastic material properties, especially the yield stress and work hardening exponent, it is recommended that different indenter geometries should be used to generate loading-unloading curves rather than using the same indenter geometry with different loads.

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