

Contents lists available at [ScienceDirect](http://www.sciencedirect.com/science/journal/13873806)

International Journal of Mass Spectrometry

iournal homepage: www.elsevier.com/locate/iims

Geographical origin classification of gem corundum using elemental fingerprint analysis by laser ablation inductively coupled plasma mass spectrometry

Pornwilard M.-M.^a, Rak Hansawek^b, Juwadee Shiowatana^a, Atitaya Siripinyanond^{a,∗}

a Department of Chemistry and Center for Innovation in Chemistry, Faculty of Science, Mahidol University, Rama VI Rd., Bangkok 10400, Thailand ^b Department of Mineral Resources, Ministry of Natural Resources and Environment, Rama VI Rd., Bangkok 10400, Thailand

a r t i c l e i n f o

Article history: Received 15 May 2011 Received in revised form 16 June 2011 Accepted 16 June 2011 Available online 23 June 2011

Keywords: Corundum Source identification LA-ICP-MS Fingerprinting Linear discriminant analysis

A B S T R A C T

Laser ablation inductively coupled plasma mass spectrometry (LA-ICP-MS) was applied to study source identification by using elemental fingerprint analysis combined with the use of multivariate statistical analysis of gem corundum samples with different colors (red, blue, purple, yellow) from six countries (Kenya, Madagascar, Nigeria, Tanzania, Cambodia and Thailand). With LA-ICP-MS, the element concentrations in the samples were calculated using NIST 612 standard glass reference material as the external standard, with Al being used as the internal standard. The optimum conditions of laser ablation, i.e., 9 mJ laser power, 100% laser energy, a spot size of 200 μ m and a repetition rate of 20 Hz, were selected to improve the signal intensities. The multivariate data analysis, including principal component analysis (PCA) and linear discriminant analysis (LDA) was used for classification study of samples. Two categories of gem corundum were analyzed including the gem corundum of the same color and the gem corundum of different colors. In the case of gem corundum of the same color classification, the LDA provided good scatter plot that could differentiate rubies between South East Asia and African countries and blue sapphires from Madagascar and Nigeria. For the classification of gem corundum with different colors, the LDA with the use of normalization factor was effective for the identification of the origin of corundum samples with 80% accuracy.

© 2011 Elsevier B.V. All rights reserved.

1. Introduction

Gem corundum is considered as one of the most precious stones, by which its cost depends on color, clarity, size and cut. In addition, its geographic origin is one of the most important factors affecting the price and value [\[1–3\].](#page-4-0) The ability to classify the source of gem corundum is therefore needed. As the elemental compositions of samples reflect their geographic origins, fingerprinting techniques based on elemental compositions and multivariate statistical analysis can be used for geographic identification of samples [\[4–7\].](#page-4-0) Suitable elements that reflect the link with geological origin must be selected to have discriminating potential for that particular product.

Various techniques have been reported to provide elemental fingerprint information. Particle induced X-ray emission/proton induced gamma-ray emission (PIXE/PIGE) was used for analysis of large collection of emeralds from various places [\[8\].](#page-5-0) The elemental database obtained was then applied to infer the origin of several ancient emeralds set on historical jewels. Moreover, micro PIXE was employed for the determination of trace element concentrations

in ruby samples [\[9\].](#page-5-0) Trace element concentrations of 130 natural rough rubies from nine locations in Myanmar were reported. Further, the techniques were used to examine element concentrations in gold alloys [\[10\].](#page-5-0) Laser induced breakdown spectrometry (LIBS) was employed for characterization of the jewelry products [\[11\].](#page-5-0) Energy-dispersive X-ray fluorescence analysis was also applied to determine trace element contents of rubies and sapphires [\[12\].](#page-5-0) The aforementioned techniques, however, either are time-consuming or provide insufficient detection limits.

Laser ablation inductively coupled plasma mass spectrometry (LA-ICP-MS) has been successfully reported to provide element concentrations for jewelry and gemstones applications [\[1,13–18\]](#page-4-0) including the investigation of beryllium diffusion in yellow and orange sapphires [\[19,20\];](#page-5-0) source identification of sapphires [\[1,15,16\];](#page-4-0) and elemental fingerprint analysis of diamond [\[17,18\].](#page-5-0) Guillong and Günther studied 25 sapphire samples from five different locations using LA-ICP-MS [\[1\].](#page-4-0) The use of statistical methods could separate five groups of sapphires from each other. However, sources and colors of these gemstones were not given in their work. Peucat et al. used the Ga/Mg ratio from LA-ICP-MS technique to define the twomajor types of blue sapphires [\[21\].](#page-5-0) The ratio washigh for magmatic sapphires, whereas metamorphic sapphires exhibited lower ratios. The 31 diamonds originating from four different mines were studied by Moens et al. using LA-ICP-MS [\[17\].](#page-5-0) Nine

[∗] Corresponding author. Tel.: +66 2 201 5195; fax: +66 2 354 7151. E-mail address: scasp@mahidol.ac.th (A. Siripinyanond).

^{1387-3806/\$} – see front matter © 2011 Elsevier B.V. All rights reserved. doi:[10.1016/j.ijms.2011.06.010](dx.doi.org/10.1016/j.ijms.2011.06.010)

elements (Al, Hg, Na, Ni, Pb, Sb, Sn, Ti and Zn) were selected for fingerprinting purpose and different pattern recognition techniques were used in order to classify the data.

Previous works focus only on simple case, which is the classification of gem corundum of the same color. Nonetheless, the classification of gem corundum with different colors is also useful when in the lack of known samples with the same color to create separation pattern. In this work, two categories of gem corundum were analyzed including the gem corundum of the same color and the gem corundum of different colors. Linear discriminant analysis (LDA) was used for classification study of the samples. This work illustrates the first attempt to differentiate the source of gem corundum of different colors. The criteria for selection of suitable elements for classification purpose were also discussed.

2. Experimental

2.1. Instrumentation

A 266 nm Nd:YAG laser ablation system (LSX 500, CETAC Technologies, Omaha, NE, U.S.A.) coupled to an inductively coupled plasma quadrupole mass spectrometer (ICP-MS, Elan 6000 Perkin Elmer/Sciex, Toronto, Canada) was employed. A laser beam with the maximum energy of 9 mJ was focused onto the sample placed inside an ablation cell to skin off the sample surface producing fine particles. Helium (1.0 L min−1) was used as a carrier gas to sweep the obtained particles out of the ablation cell because He gas can spread particles away from the sampling position faster than the other gases [\[22\].](#page-5-0) The He gas containing particles was transported through a 1 m Tygon® transfer tube having an internal diameter of 3.2 mm. An argon carrier gas flow $(0.9 L \text{min}^{-1})$ was merged with the helium stream at approximately 5 cm before entering the ICP-MS torch. The operating parameters for LA-ICP-MS are detailed in Table 1. Data reduction was performed using the method reported by Longerich et al. [\[23\].](#page-5-0)

2.2. Corundum samples

Fifty eight natural gem corundum from six locations, four from Africa (Kenya, Madagascar, Nigeria and Tanzania) and two from Asia (Cambodia and Thailand) were provided by the Department of Mineral Resources, Ministry of Natural Resources and Environment, Thailand. These samples were analyzed for their elemental fingerprints by LA-ICP-MS. The description of the samples is sum-

marized in Table 2. All corundum samples were cleaned with 10% hydrochloric acid and ethanol (Merck, Germany) in order to remove dust and other remnants on surfaces of the samples. In this work, SRM NIST 612 (glass reference material) was used for quantification purpose, because no commercial reference standards for elements in gem corundum were available.

2.3. Multivariate processing of data

For multivariate processing of data, the SPSS software package (version 16.0, SPSS Inc.) was used. Factor analysis including principal component analysis (PCA) and linear discriminant analysis (LDA) were performed for the classification of gem corundum samples according to their origins. A matrix was constructed with rows representing gem corundum samples and columns representing elemental concentrations from LA-ICP-MS. The data matrix consisted of 14 columns (concentration of B, Si, Zn, Ga, Sn, Mg, Ti, V, Cr, Fe and 58 rows (the numbers of sample from six locations)).

3. Results and discussion

3.1. Elemental fingerprint analysis by LA-ICP-MS

With the selected LA-ICP-MS operating conditions as indicated in Table 1, the limits of detection for 28 elements are summarized in Table 3. Fifty eight natural gem corundum samples were ana-

Fig. 1. LDA analysis of 33 rubies from five locations (Kenya, Madagascar, Tanzania, Cambodia and Thailand) using the concentration values of B, Si, Zn, Ga, Sn, V, Mg, Ti, Cr and Fe.

lyzed for the element concentrations. Only some elements, which were found in the higher concentrations than the detection limits, were quantified as summarized in [Table](#page-2-0) 4. The concentrations of 10 elements (B, Si, Zn, Ga, Sn, Mg, Ti, V, Cr and Fe) are possible to be used for classifying source of origin of the gem corundum samples. However, the Zn concentration in gem corundum in some location regions was not detectable or lower than the detection limits. Among these elements, B, Si, Zn, Ga and Sn are not the main coloring elements, whereas Mg, Ti, V, Cr and Fe are involving in the color of gem corundum [\[2,24,25\].](#page-4-0) Multivariate data analysis was performed for classification study of samples. Two statistical methods, i.e., factor analysis and linear discriminant analysis, were employed.

3.2. Origin classification of gem corundum samples

To classify the origin of samples by the SPSS statistical technique, the values of variables (concentrations)in every case (sample) must be available. So, the concentration values of less than the detection limits were replaced with zero to complete statistical process. In this study, the gem corundum samples from all six sources were not of the same color, therefore the study of source identification was divided in two parts, i.e., classification of gem corundum of the same color; and classification of gem corundum of different colors. As some trace elements can influence on the colors of gem corundum, e.g., Fe and Ti on blue in blue sapphire; Ti and V on purple in purple sapphire; Cr on red in ruby; and Fe and Mg on yellow in yellow sapphire, classification of gem corundum with color giving elements must be careful.

3.2.1. Gem corundum of the same color classification

The multivariate statistical analysis was applied to classify the location of gem corundum samples of the same color. As listed in [Table](#page-1-0) 2 the yellow sapphires were from only one source, which is in Tanzania region. However, the red and the blue were from more than one country. Thirty three rubies were from Kenya, Madagascar, Tanzania, Cambodia and Thailand. Sixteen blue sapphires were from Madagascar and Nigeria. Principal component analysis (PCA) was applied to the concentrations of the color and non color giving elements, clear separation pattern was not obtained between the samples of various origins (see Fig. S1 in [supplementary](#page-4-0) data). Therefore, another statistical method, linear discriminant analysis (LDA) was employed. This method maximizes the ratio of betweenclass variance to the within-class variance in any particular data set thereby guaranteeing maximal separability [\[26\].](#page-5-0) Linear discriminant analysis of 33 rubies from five locations (6 from Kenya, 8 from Madagascar, 9 from Tanzania, 6 from Cambodia and 4 from Thailand) is presented in Fig. 1, which was plotted between the score of linear combination of 10 elements (B, Si, Zn, Ga, Sn, V, Mg, Ti, Cr and Fe) of each sample calculated from discriminant functions

Fig. 2. LDA analysis of 16 blue sapphires from two locations (Madagascar and Nigeria) using the concentration values of B, Si, Zn, Ga, Sn, V, Mg, Ti, Cr and Fe.

1 and 2. This score plot shows good separation of Kenya rubies from the other samples. In addition, the Madagascar and Tanzania rubies showed lower value in scale of discriminant function 2 as compared with those of Cambodia and Thailand rubies. This LDA plot illustrated the potential of this pattern for classification of rubies between South East Asia and African countries. On the other hand, when compared this LDA technique with PCA technique (see Fig. S1 in [supplementary](#page-4-0) data)in the same case, better classification in term of the scattering within and between groups was achieved with LDA. With LDA, the within group scatter was low whereas the between group scatter was high.

Similar to rubies, 10 elements were used to classify the origin of blue sapphires by LDA analysis. The concentrations of 10 elements (B, Si, Zn, Ga, Sn, V, Mg, Ti, Cr and Fe) were used to construct the LDA plot of 16 blue sapphires from two locations (Madagascar and Nigeria). As this case consists of only two groups (countries), 10 elements were calculated to only one discriminant function. Fig. 2 shows the relationship between blue sapphire number and score of discriminant function 1. The values of discriminant function 1 of Madagascar (between −8 and −6) were clearly different from those of Nigeria blue sapphires [\[1–5\].](#page-4-0) Therefore, the LDA function from these 10 elements can be used for the differentiation of the blue sapphires from these two locations. This LDA method gave better classification of blue sapphires over the PCA method (see Fig. S2 in [supplementary](#page-4-0) data).

3.2.2. Gem corundum of the different color classification

The ability to differentiate the origin of the gem corundum with different colors is useful when in the lack of samples with the same color. Therefore, the aim of this part was to construct the pattern for identifying the origin of gem corundum samples that have different colors in the same mapping. Both PCA and LDA techniques were applied to the concentration values of the elements. Nonetheless, with PCA clear separation pattern was not obtained (see Figs. S3 and S4 in [supplementary](#page-4-0) data). Therefore, only the separation patterns obtained from the LDA technique are illustrated as shown in [Figs.](#page-4-0) 3 and 5.

Using the non color giving elements, which are B, Si, Zn, Ga and Sn, for LDA statistical method, the LDA of 58 gem corundum from six different locations (6 from Kenya, 13 from Madagascar, 11 from Nigeria, 18 from Tanzania, 6 from Cambodia and 4 from Thailand), the score plot of each source is scattered and not suitable for use with unknown samples (see Fig. S5 in [supplementary](#page-4-0) data). Consequently, the linear discriminant fingerprint of B, Si, Zn, Ga, Sn, Mg, Ti, V, Cr and Fe as both non and color giving elements of six locations (6 from Kenya, 13 from Madagascar, 11 from Nigeria, 18 from Tanzania, 6 from Cambodia and 4 from Thailand) of 58 gem corundum samples was constructed and the LDA pattern is shown in [Fig.](#page-4-0) 3 showing the three groups as follows:

Fig. 3. LDA analysis of 58 gem corundum samples from six locations (Kenya, Madagascar, Nigeria, Tanzania, Cambodia and Thailand) using the concentration values of B, Si, Zn, Ga, Sn, V, Mg, Ti, Cr and Fe.

- group I: South East Asia area where the borders are connected including Cambodia and Thailand.
- group II: only one country, i.e., Kenya.
- group III: Africa area including Madagascar, Nigeria and Tanzania.

Therefore, the new fingerprint patterns were required for complete classification of the gem corundum in group I and group III countries. For classifying gem corundum from two countries in the first group, the ratio of Si and B concentrations were investigated and shown to be able to distinguish the Cambodian and the Thai gem corundum as shown in Fig. 4. Silicon and B were the suitable elements to create the ratio for classifying the origin because both elements are the non color giving elements. Moreover, the concentration values of these two elements were found in significant levels in every sample (higher than the detection limit). The use of the ratio of some elements or isotopes to differentiate gem corundum from different locations or different source rocks was reported earlier by other investigators [1,21]. As illustrated in Fig. 4, the ratio of Si and B concentrations was higher in the case of Cambodia gems when compared with those of Thailand. Nonetheless, poor precision was obtained which may be caused by heterogeneity of the samples.

For classifying gem corundum from three countries in the third group (African area), the concentration data were normalized before subjecting to LDA technique. Four new variables were then obtained by normalization factor with average concentration of B and Sn from the following equations:

Fig. 4. Ratio between Si and B concentrations of Cambodia and Thailand gem corundum $(n=3)$.

Fig. 5. LDA analysis of African gem corundum samples from three locations using the conscentration values of Si, V, Zn, Ga and the normalized values of $Si₁$, $V₁$, Zn₁ and Ga1.

B and Sn were selected to be incorporated in the normalization factor as B and Sn showed highest factor loading score in each component of PCA analysis (results not shown here). With four new variables, LDA using concentrations of Si, V, Zn, Ga and their normalized concentrations was performed as shown in Fig. 5. This LDA pattern can be used for the identification of the country origin of corundum samples with 80% accuracy. Separation between the countries was not perfect which may be likely due to the similar compositions in geological appearance of the countries where in the nearby location.

4. Conclusions

This work illustrates successful attempt to use elemental fingerprint data obtained by LA-ICP-MS combined with the use of LDA for source identification of gem corundum. Two categories of gem corundum were analyzed including gem corundum of the same color and gem corundum of the different colors. For the same color group, the LDA mapping can separate rubies between South East Asia and African countries and blue sapphires from Madagascar and Nigeria. For the classification of gem corundum with different colors, the LDA with the use of normalization factor was effective for the identification of the corundum origin with 80% accuracy.

Acknowledgements

We gratefully acknowledge the research grants from the Thailand Research Fund (TRF) and Center for Innovation in Chemistry: Postgraduate Education and Research Program in Chemistry (PERCH-CIC), Commission on Higher Education, Ministry of Education, Thailand. We are also thankful to Department of Mineral Resources, Ministry of Natural Resources and Environment for providing gem corundum samples.

Appendix A. Supplementary data

Supplementary data associated with this article can be found, in the online version, at [doi:10.1016/j.ijms.2011.06.010](http://dx.doi.org/10.1016/j.ijms.2011.06.010).

References

- [1] M. Guillong, D. Günther, Quasi 'non-destructive' laser ablation-inductively coupled plasma-mass spectrometry fingerprinting of sapphires, Spectrochim. Acta B 56 (2001) 1219–1231.
- [2] T.Calligaro,J.P. Poirot, G. Querr, Trace elementfingerprinting ofjewellery rubies by external beam PIXE, Nucl. Instrum. Methods B 150 (1999) 628–634.
- [3] T.F. Yui, K. Zaw, C.M. Wu, A preliminary stable isotope study on Mogok ruby Myanmar, Ore Geol. Rev. 34 (2008) 192–199.
- [4] R. Kovacs, S. Schlosser, S.P. Staub, A. Schmiderer, E. Pernicka, D. Günther, Characterization of calibration materials for trace element analysis and fingerprint studies of gold using LA-ICP-MS, J. Anal. At. Spectrom. 24 (2009) 476–483.
- [5] M. Uda, G. Demortier, I. Nakai, T. Calligaro, The Origin of Ancient Gemstones Unveiled by PIXE, PIGE and μ -Raman Spectrometry. In X-rays for Archaeology, Springer, Netherlands, 2005, pp. 101–112.
- [6] R.S. Harmon, J. Remus, N.J. McMillan, C. McManus, L. Collins, J..L. Gottfried Jr., F.C. DeLucia, A.W. Miziolek, LIBS analysis of geomaterials: geochemical fingerprinting for the rapid analysis and discrimination of minerals, Appl. Geochem. 24 (2009) 1125–1141.
- [7] M. Xin-Pei, J.D. MacArthur, P.L. Roeder, A.N. Mariano, Trace element fingerprinting of emeralds by PIXE/PIGE, Nucl. Instrum. Methods B 75 (1993) 423–427.
- [8] T. Calligaro, J.C. Dran, J.P. Poirot, G. Querr, J. Salomon, J.C. Zwaan, PIXE/PIGE characterisation of emeralds using an external micro-beam, Nucl. Instrum. Methods B 161 (2000) 769–774.
- [9] J.L. Sanchez, T. Osipowicz, S.M. Tang, T.S. Tay, T.T. Win, Micro-PIXE analysis of trace element concentrations of natural rubies from different locations in Myanmar, Nucl. Instrum. Methods B 130 (1997) 682–686.
- [10] M.F. Guerra, Fingerprinting ancient gold with proton beams of different energies, Nucl. Instrum. Methods B 226 (2004) 185–198.
- [11] L.E. García-Ayuso, J. Amador-Hern ndez, J.M. Fernández-Romero, M.D. Luque de Castro, Characterization of jewellery products by laser-induced breakdown spectroscopy, Anal. Chim. Acta 457 (2002) 247–256.
- [12] D. Joseph, M. Lal, P.S. Shinde, B.D. Padalia, Characterization of gem stones (rubies and sapphires) by energy dispersive X-ray fluorescence spectrometry, X-ray Spectrom. 29 (2000) 147–150.
- [13] D. Günther, R.E. Kane, Laser ablation-inductively coupled plasma-mass spectrometry: a new way of analyzing gemstones, Gems Gemol. 35 (1999) 160–161.
- [14] A. Abduriyim, H. Kitawaki, Applications of laser ablation-inductively coupled plasma-mass spectrometry (LA-ICP-MS) to gemology, Gems Gemol. 42 (2006) 98–118.
- [15] A.H. Rankin, J. Greenwood, D. Hargreaves, Chemical fingerprinting of some East African gem rubies by laser ablation ICP-MS, J. Gemmol. 28 (2003) 473–482.
- [16] A. Abduriyim, H. Kitawaki, Determination of the origin of blue sapphire using laser ablation inductively coupled plasma mass spectrometry (LA-ICP-MS), J. Gemmol. 30 (2006) 23–36.
- [17] F. Vanhaecke, D. Hutsebaut, K. De Corte, L. Moens, Possibilities of laser ablationinductively coupled plasma-mass spectrometry for diamond fingerprinting, J. Anal. At. Spectrom. 18 (2003) 1238–1242.
- [18] R.J. Watling, H.K. Herbert, I.S. Barrow, A.G. Thomas, Analysis of diamonds and indicator minerals for diamond exploration by laser ablation-inductively coupled plasma mass spectrometry, Analyst 120 (1995) 1357–1364.
- [19] V. Pisutha-Arnoud, T. Häger, P. Wathanakul, W. Atichat, Yellow and brown coloration in beryllium treated sapphires, J. Gemmol. 29 (2004) 77-103.
[20] A. Peretti, D. Günther, The beryllium-treatment of n.
- D. Günther, The beryllium-treatment of natural fancy sapphires with a new heat-treatment technique Part A, [http://www.gemresearch.ch/journal/No4/contents.htm.](http://www.gemresearch.ch/journal/No4/contents.htm)
- [21] J.J. Peucat, P. Ruffault, E. Fritsch, M. Bouhnik-Le Coz, C. Simonet, B. Lasnier, Ga/Mg ratio as a new geochemical tool to differentiate magmatic from metamorphic blue sapphires, Lithos 98 (2007) 261–274.
- [22] B. Hattendorf, C. Latkoczy, D. Günther, Laser Ablation-ICPMS, Anal. Chem. 75 (2003) 341–347.
- [23] H.P. Longerich, S.E. Jackson, D. Günther, Laser ablation inductively coupled plasma mass spectrometric transient signal data acquisition and analyte concentration calculation, J. Anal. At. Spectrom. 11 (1996) 899–904.
- [24] L. Bonizzoni, A. Galli, G. Spinolo, V. Palanza, EDXRF quantitative analysis of chromophore chemical elements in corundum samples, Anal. Bioanal. Chem. 395 (2009) 2021–2027.
- [25] T. Calligaro, A. Mossmann, J.P. Poirot, G. Querr, Provenance study of rubies from a Parthian statuette by PIXE analysis, Nucl. Instrum. Methods B 136 (1998) 846–850.
- [26] S. Mika, G. Ratsch, J. Weston, B. Scholkopf, K.R. Mullers, In Fisher discriminant analysis with kernels, IEEE (1999) 41–48.