

Overlapped peaks resolution for linear sweep polarography using Gaussian-like distribution

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Received 8 October 2012; accepted 26 April 2013

Abstract: A resolution method based on Gaussian-like distribution for overlapped linear sweep polarographic peaks was proposed to simultaneously detect the polymetallic components, such as Zn(II) and Co(II), coexisting in the leaching solution of zinc hydrometallurgy. A Gaussian-like distribution was constructed as the sub-model of overlapped peaks by analyzing the characteristics of linear sweep polarographic curve. Then, the abscissas of each peak and trough were pinpointed through multi-resolution wavelet decomposition, the curve and its derivative curves were fitted by using nonlinear weighted least squares (NWLS). Finally, overlapped peaks were resolved into independent sub-peaks based on fitted reconstruction parameters. The experimental results show that the relative error of half-wave potential pinpointed by multi-resolution wavelet decomposition is less than 1% and the accuracy of I_p fitted by NWLS is higher than 96%. The proposed resolution method is effective for overlapped linear sweep polarographic peaks of Zn(II) and Co(II).

Key words: zinc hydrometallurgy; Gaussian-like distribution; overlapped peaks resolution; multi-resolution wavelet decomposition; nonlinear weighted least squares fitting

1 Introduction

Hydrometallurgy is a major smelting technology of zinc with superiority in environment protection, resource utilization and mineral exploitation [1,2]. However, simultaneous determination of polymetallic components for the leaching solution of zinc hydrometallurgy fails to realize automation, which endangers the optimal operation of smelting process and lowers the metallurgical technology level.

On the aspect of detection method for heavy metal ions, linear sweep polarography has recently attracted more research attention [3,4] due to its rapidity and high sensitivity in simultaneous determination of polymetallic components. However, its application is narrowed in many cases, thereto, prevalent overlapped peaks resolution problem of detected signal becomes a bottleneck to restrict the development of automation for online analysis while polymetallic components coexist in leaching solution. There are many resolution methods,

such as natural logarithm derivative method (NLDM), immune algorithm, fractional-order differential and wave transform. FERNÁNDEZ-GONZÁLEZ and MONTEJO-BERNARDO [5] proposed an NLDM to accurately estimate peak positions based on a linearization of Gaussian curves, the method was used to detect a certain extent overlapping peaks. SHAO et al [6] summarized the use of basic immune algorithms and its modifications for resolving multi-component, overlapping, gas chromatography-mass spectroscopy signals, the advantages and the disadvantages of IAs were compared with other resolution methods. LI et al [7] presented a new resolution method for the overlapped peak using fractional-order derivative, the specified peak signals were obtained with the fractional-order differentiation filter. JIAO et al [8] described the application of continues wavelet transform for resolving overlapping peaks from capillary electrophoresis. TOFT et al [9] resolved severely overlapping mid-infrared mixture spectra into the pure compounds spectra and concentration profiles using SIMPLE-to-use Interactive

Foundation item: Project (2012BAF03B05) supported by the National Key Technology R&D Program of China; Project (61025015) supported by the National Natural Science Foundation for Distinguished Young Scholars of China; Project (61273185) supported by the National Natural Science Foundation of China; Project (2012CK4018) supported by the Science and Technology Project of Hunan Province, China

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DOI: 10.1016/S1003-6326(13)62715-6

Self-modelling Mixture Analysis (SIMPLISMA) and a 2nd order derivative approach. These methods for overlapped peaks focus on the fields of spectra [10], chromatogram [11] and voltammetry peaks [12]. Symmetric normal Gaussian, Lorenzian or Tsallis distribution are usually taken as sub-models for fitting, and then the overlapped peaks are separated into a number of independent peaks, but the methods mentioned above cannot be applied in asymmetry fields. Linear sweep polarographic curve is a strong irregular asymmetry distribution, which leads to the parameters of sub-peaks contained in overlapped curves cannot be effectively resolved.

In this work, a new resolution method based on Gaussian-like distribution for overlapped linear sweep polarographic peaks was proposed. Firstly, a Gaussian-like distribution was constructed as the sub-model of overlapped peaks by analyzing the characteristics of linear sweep polarographic curve. Then, the abscissas of peak and trough were pinpointed as initial values of the model parameters for fitting through multi-resolution wavelet decomposition, the curve and its derivative curves were fitted by using nonlinear weighted least squares. Finally, overlapped peaks were resolved into independent sub-peaks based on fitted reconstruction parameters.

2 Model formulation

Linear sweep polarography is a widely used electrochemical analysis method using half-wave potential, which limits the diffusion current of polarographic curve. However, its curve is a strong irregular asymmetry distribution and there is no simple function representation between polarographic current I and sweep voltage E , which leads to the parameters of sub-peaks contained in overlapped curves cannot be effectively resolved. To solve the problem, a distribution is built to fit the linear sweep polarographic curve, then the sub-peaks are reconstructed based on the fitted parameters, which lays a foundation for qualitative and quantitative analysis of polymetallic components coexisting in the leaching solution of zinc hydrometallurgy.

2.1 Characteristic analysis on linear sweep polarographic curve

The linear sweep polarographic curve is shown in Fig. 1, where E_p , $E_{p/2}$, I_p and $I_{p/2}$ denote the peak potential, half-wave potential, limiting diffusion current and half-wave current, respectively. The linear sweep polarographic curve has the following characteristics according to analysis: 1) asymmetry; 2) the left side ($E > E_p$) can be approximated as a Gaussian distribution;

3) the difference between the curve and criterion Gaussian distribution obeys an “S” type distribution described by arc tangent function in this study. Meanwhile, the determination results indicate that residual current can be described as a linear function, which affects the analysis of zero-order and first-order polarographic curves.

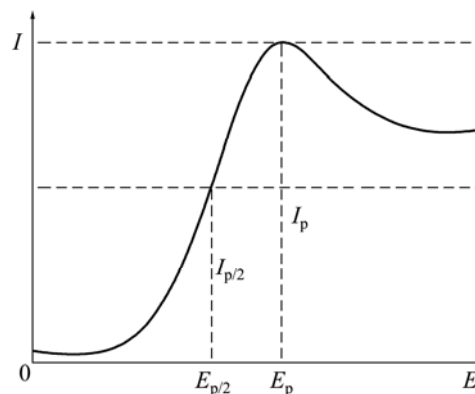


Fig. 1 Linear sweep polarographic curve

2.2 Gaussian-like distribution construction

The linear sweep polarographic curve of monocomponent is approximately expressed by a linear combination of Gaussian distribution, arc tangent function and linear function based on Section 2.1:

$$\phi(x) = k_1 e^{k_2(x-k_3)^2} + k_4 \arctan[k_5(x-k_6)] + i_{rc} \quad (1)$$

where $i_{rc} = k'x + b'$, $k_1, \dots, k_6, k'$ and b' are the reconstruction parameters of the curve. The Gaussian-like distribution is shown in Fig. 2.

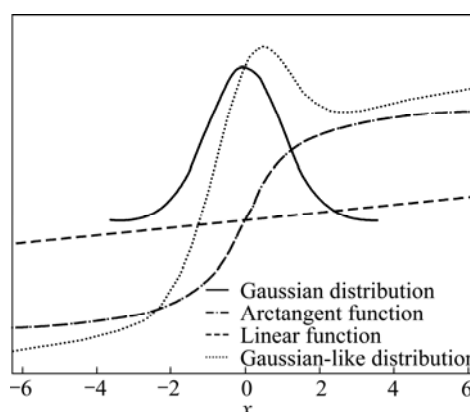


Fig. 2 Structure of Gaussian-like distribution

While polymetallic components coexist in solution, linear sweep polarographic curve can be approximately expressed by

$$\psi(x) = \sum_{i=1}^n \{k_{i1} e^{k_{i2}(x-k_{i3})^2} + k_{i4} \arctan[k_{i5}(x-k_{i6})]\} + I_{rc} \quad (2)$$

where $I_{rc} = kx + b$, $k_{i1}, \dots, k_{i6}, k$ and b are the reconstruction

parameters of the curve.

To improve the resolution, the first and secondary derivative of Eq. (2) are calculated, and the first derivative $\delta(x)$ is obtained as

$$\delta(x) = \sum_i^n \left\{ 2k_{i1}k_{i2}(x - E_{p,i})e^{k_{i2}(x - E_{p,i})^2} + \frac{k_{i3}k_{i4}}{1 + k_{i4}^2(x - E_{p,i})^2} \right\} + k \quad (3)$$

where $E_{p,i}$ is the peak position of the i -th curve.

The secondary derivative $\gamma(x)$ is obtained as

$$\gamma(x) = \sum_i^n 2k_{i1}k_{i2}(x - E_{p,i}) + 4k_{i1}k_{i2}^2(x - E_{p,i})^2 e^{k_{i2}(x - E_{p,i})^2} - \frac{2k_{i3}k_{i4}^2(x - E_{p,i})}{[1 + k_{i4}^2(x - E_{p,i})^2]^2} \quad (4)$$

2.3 Constraints for reconstruction parameters

It is effective to pinpoint coordinates of each peak and trough by using multi-resolution wavelet decomposition [13,14], which can separate overlapped peaks accurately by selecting optimal discrete detail $D^{(j)}$. The optimal decomposition time j is calculated as

$$j \approx \log_2 \frac{p_B - p_A}{Rt} \quad (j \text{ is integer}) \quad (5)$$

where t is the sampling period of polarographic signal, p_A and p_B denote the peak potentials of prepeak and postpeak, respectively. The separating degree R of two-component overlapped peaks is calculated by Eq. (6) as

$$R = \frac{2(p_B - p_A)}{w_A + w_B} \quad (6)$$

where w_A and w_B denote the half-peak widths of prepeak and postpeak, respectively. The half-peak width is defined as the difference between E_p and $E_{p/2}$, as shown in Fig. 1.

For the same signal, optimal decomposition time only depends on the separating degree R but not wavelet base.

The following parameters of linear sweep polarographic curve can be calculated by Eqs. (1)–(6): zero-order peak potential $E_{p,i}$, first-order prepeak potential $E_{p,i1}$, first-order posttrough potential $E_{p,i2}$, second-order prepeak potential $E_{p,i3}$, second-order trough potential $E_{p,i4}$ and second-order postpeak potential $E_{p,i5}$. Meanwhile, constraints for Eqs. (2)–(4) are obtained based on the micro-deviations of peaks during derivation, the constraint for Eq. (2) is calculated as

$$k_{i3} = k_{i6} \approx E_{p,i} \quad (7)$$

the constraints for Eq. (3) are calculated as

$$\begin{cases} -\varepsilon_1 \leq E_{p,i} - \frac{1}{\sqrt{-2k_{i2}}} - E_{p,i1} \leq \varepsilon_1 \\ -\varepsilon_2 \leq E_{p,i} + \frac{1}{\sqrt{-2k_{i2}}} - E_{p,i2} \leq \varepsilon_2 \end{cases} \quad (8)$$

the constraints for Eq. (4) are calculated as

$$\begin{cases} -\varepsilon_3 \leq E_{p,i} - \frac{3}{\sqrt{-6k_{i2}}} - E_{p,i3} \leq \varepsilon_3 \\ -\varepsilon_4 \leq E_{p,i} - E_{p,i4} \leq \varepsilon_4 \\ -\varepsilon_5 \leq E_{p,i} + \frac{1}{\sqrt{-6k_{i2}}} - E_{p,i5} \leq \varepsilon_5 \end{cases} \quad (9)$$

where $\varepsilon_1, \dots, \varepsilon_5$ denote the micro-deviations of peak and trough during derivation. Take $\varepsilon_1 = \varepsilon_2 = 0.05$, $\varepsilon_3 = \varepsilon_4 = \varepsilon_5 = 0.10$ as initial values.

3 Experimental

JP-06B microelement analysis instrument electrochemical analysis system was used as detecting platform. A three-electrode with a hanging mercury electrode as working electrode, Ag/AgCl (0.1 mol/L KCl) as reference electrode and dimethylglyoxime a platinum electrode as auxiliary electrode was used.

All the solutions were prepared with analytical grade chemicals and doubly distilled water. HCl, ammonia buffer solution, dimethylglyoxime, Na_2SO_3 , sodium citrate, OP-10 and NaNO_2 were used as supporting electrolytes.

Confect mixtures containing Zn(II) (34 mg/L) and Co(II) (0.1 mg/L) with a certain amount of standard solution were put into an electrolytic cell. The adding order of solutions was HCl, ammonia buffer solution, DMG, Na_2SO_3 , sodium citrate, OP-10, NaNO_2 and measured sample solution. The temperature was maintained at 20 °C and pH=8.26. The mixtures were measured by linear sweep polarography with JP-06B microelement analysis instrument electrochemical analysis system. The scanning potential was in the range of -1.3 to -0.9 V, the scan rate was 25 mV/s, and the standing time was 8 s. The signals detected were put into the test platform to be processed.

As shown in Fig. 3, the linear sweep polarographic curves of Co(II) and Zn(II) are overlapped in the voltage range of -1.3 to -0.9 V.

4 Results and discussion

In order to verify the feasibility and effectiveness of

the proposed method for the overlapped linear sweep polarographic peaks, detected signal is transmitted to the test platform, then Gaussian-like distribution is taken as sub-peak model. The abscissas of all peaks and troughs are pinpointed by multiresolution wavelet decomposition, namely substitute half-peak widths of the two sub-peaks w_A and w_B , peak potentials of prepeak and postpeak p_A and p_B into Eq. (6) to obtain the overlapped peaks separating degree R , then sampling period t and Eq. (5) are combined to gain the optimal decomposition time j . For the detected signal shown in Fig.3, the optimal decomposition time j is 8.

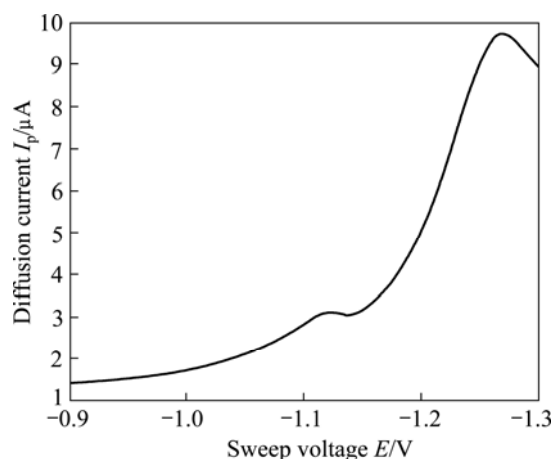


Fig. 3 Zero-order overlapped linear sweep polarographic peaks of Co(II) and Zn(II)

4.1 Resolution results

The abscissas of peak and trough are pinpointed based on multiresolution wavelet decomposition by using the optimal decomposition time. The decomposition result in MATLAB based on zero-order curve is shown in Fig. 4. The optimal discrete detail d_8 indicates that the peak potential of Co(II) $E_{p,Co,0} = -1.11$ V, and the potentials of the first and second order curves can be calculated simultaneously. All the data are listed in Table 1.

To eliminate the influence of stray peaks and residual current, NWLS [15,16] is applied for fitting. The resolution speed and accuracy are comprehensively considered, and the weight function is designed as Eq. (10) due to the resolution focused on the two overlapped peaks.

$$\omega(x) = e^{-\frac{(x-E_{p,1})^2}{2w_A^2}} + e^{-\frac{(x-E_{p,2})^2}{2w_B^2}} + \omega_0 \quad (10)$$

where $E_{p,1}$ and $E_{p,2}$ denote the peak potentials of the two zero-order polarographic curve, respectively, reference weight ω_0 is introduced to improve the fitting correlation degree, $\omega_0 \in [0,1]$.

The fitting results are shown in Figs. 5–7.

4.2 Performance analysis

Due to the asymmetry of Gaussian-like distribution, it is difficult to map the undetermined parameters by

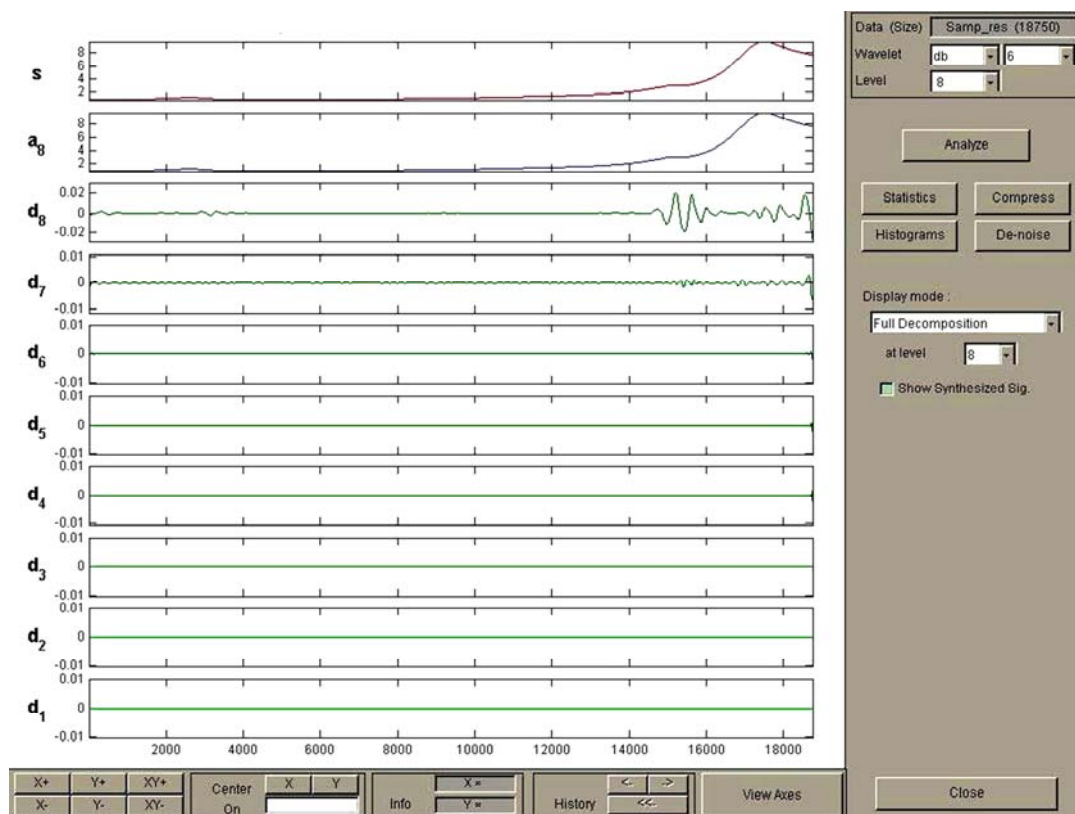
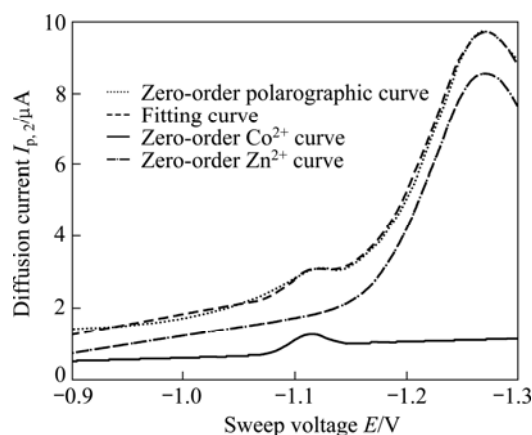
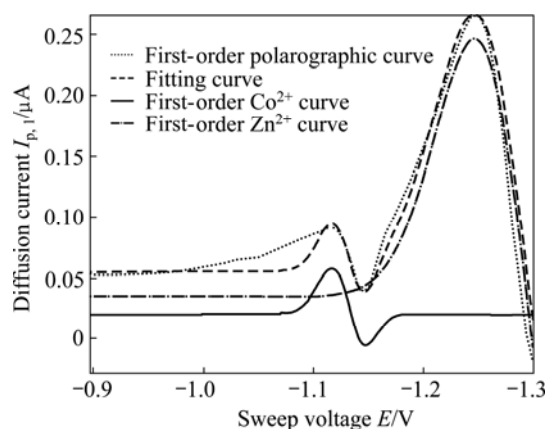
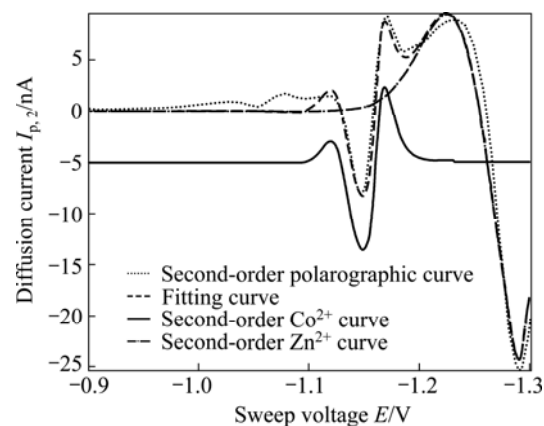


Fig. 4 Zero-order decomposition map of Co(II) and Zn(II)

Table 1 Potentials of peak and trough calculated by multi-resolution decomposition

Order	Potential of Co(II)/V			Potential of Zn(II)/V		
	Prepeak	Trough	Postpeak	Prepeak	Trough	Postpeak
0	-1.11	—	—	-1.27	—	—
1	-1.12	-1.15	—	-1.25	—	—
2	-1.12	-1.15	-1.16	-1.24	-1.30	—

**Fig. 5** Zero-order resolution results for Co(II) and Zn(II)**Fig. 6** First-order resolution results for Co(II) and Zn(II)**Fig. 7** Second-order resolution results for Co(II) and Zn(II)

using the proposed resolution method, which provides constraints and optimal initial values. Two conclusions can be drawn from the fitting results by selecting different initial values for fitting.

1) The speed of NWLS fitting is largely raised due to setting optimal initial values gained by multi-resolution decomposition and introducing constraints for reconstruction parameters;

2) The stability of NWLS fitting is also greatly improved by introducing constraints for reconstruction parameters.

The fitting correlation degree and mean square deviation are listed in Table 2. The following conclusions for fitting results can be drawn from Figs. 5–7 and Table 2.

Table 2 Statistics of fitting correlation degree and mean square deviation

Order	Correlation degree	Mean square deviation
Zero	0.99	0.026
First	0.95	0.16
Second	0.96	0.048

Confect mixtures containing Zn(II) of 34 mg/L and Co(II) of 0.1 mg/L.

As seen from Table 2, zero-order has the maximum correlation degree (0.99) and the minimum mean square deviation (0.026), those of the second-order are 0.96 and 0.048, and those of the first-order are 0.95 and 0.16. The maximum relative error appears on the interval of $[-1 \text{ V}, -1.13 \text{ V}]$ due to stray peaks generated by the reaction occurred between supporting electrolyte and sample leaching solution. The analysis precision of determined components can be improved by selecting different weights.

The validation and reliability are further verified according to the experimental comparisons of monocomponent as listed in Table 3.

Table 3 Fitting results and experimental comparisons

Order	$E_{p/2}$			I_p		
	Measured/ V	Fitted/ V	Relative error/%	Measured/ μA	Fitted/ μA	Relative error/%
Zero	-1.06	-1.07	-0.94	0.90	0.92	2.2
First	-1.13	-1.13	0	0.064	0.066	3.1
Second	-1.13	-1.13	0	0.013	0.013	0

Tables 2 and 3 indicate that the relative error of $E_{p/2}$ of zero order is less than 1%, and that of the first order and second order are 0, which proves that multi-resolution wavelet decomposition has the ability to pinpoint potentials of each overlapped sub-peak. The relative error of I_p of zero order is 2.2%, and that of the first order and second order is 3.1% and 0, which proves that NWLS fitting is effective to resolve overlapped linear sweep polarographic peaks of Zn(II) and Co(II).

5 Conclusions

1) A new resolution method was proposed for overlapped linear sweep polarographic peaks. Detection for the polymetallic components coexisted in leaching solution of zinc hydrometallurgy was taken as background.

2) A Gaussian-like distribution was built to describe the sub-peak of the overlapped peaks and multi-resolution wavelet decomposition was used to pinpoint the characteristic parameters of overlapped peaks. Based on the constraints of reconstruction parameters, overlapped curves resolution was implemented by using NWLS fitting. The experimental results show that the proposed method is feasible and effective for overlapped linear sweep polarographic signals of Zn(II) and Co(II).

3) The resolution of overlapped peaks is successfully extended into asymmetric sub-peak field by constructing asymmetric distribution, which provides references for other overlapped peaks composed by asymmetric sub-peaks.

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基于类 Gaussian 分布的线性扫描极谱重叠峰分离方法

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摘要: 湿法炼锌浸出液中存在多金属组分, 如 Zn(II)和 Co(II), 针对重叠峰分离提出一种基于类 Gaussian 分布的线性扫描极谱重叠峰分离方法。通过分析线性扫描极谱曲线的特性构造类 Gaussian 分布作为待分离重叠峰子峰模型, 并利用多分辨率小波分解确定各子峰波峰和波谷位置, 基于该模型及确定值对重叠峰及其导数峰进行非线性加权最小二乘(nonlinear weighted least squares, NWLS)拟合, 根据重构参数将重叠峰分离为独立的子峰, 实现该类重叠峰的分离。该类重叠峰分离的结果表明: 多分辨率小波分解的分辨误差小于 1%, NWLS 拟合的分离精度高于 96%, 本方法可以有效分离 Zn(II)和 Co(II)产生的极谱重叠峰。

关键词: 湿法炼锌; 类 Gaussian 分布; 重叠峰分离; 多分辨率小波分解; NWLS 拟合

(Edited by Jing-hua FANG)