Geostatistical analysis on distribution of gold veins

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Abstract

The distribution of gold minerals in the vein depends on the initial formation caused by hydrothermal process. The investigation in this work is related to the gold (Au) mineralization in Penjom Gold Mine in the state of Pahang, Malaysia. Gold mineralization in Penjom can be described as sheeted orogenic mesotermal veins and dissemination deposit in Permian sedimentary sequence of fine-grained sediments and volcanics. Variogram calculation results of gold values from 304 drill hole data obtained show that anisotropy phenomenon occurs in east-west direction which the minor range $a_1=720$ meters and major range $a_2=2397$ meters, while in southeast-northwest direction the minor ranges is $a_1=935$ meters and the major $a_2=3401$ meters. Isotropy phenomenon occurs in the southwest-northeast and north-south directions with each range of a = 1622 meters and a = 2143 meters respectively. After the release of 88 data based on variogram calculations of data outliers, anisotropy phenomenon still occurs in east-west direction the ranges are $a_1=1316$ meters and $a_2=1829$ meters respectively. Isotropy phenomenon occurs in southwest-northeast and north-south with the same range of a=1543 meters. In trials with various active lag 823.95, 411 975 and 205. 987, the drift occurs in east-west and northwest-southeast, and indicating similarty with the directions of lithologic structures.

Key words: Geostatistics, area of influence, drift effect.

Introduction

Gold is a precious metal found in form of mineral in rocks. Because of its unique physical and chemical properties, gold finds main uses in jewellery, long-term monetary investment, medical and insustrial purposes. Gold is derived from the earth's crust, resulting from geological hydrothemal processes of which the majority of the gold is found in epithermal and mesothermal orogenic type of gold deposits.

There are several gold formation processes, one of which is that gold as ion is transported in form of hydrothermal solution and deposited in open spaces filling in faults, veins and other fractures in rocks giving vein-type gold deposit. A vein is a tabular or flat lenticular epigenetic rock body composed largely of quartz, carbonates, or occasionally, sulphides and other minerals (Barnes 1988). Primary gold in veins and other types of deposits are weathered when exposed on the earth's surface producing placer gold deposit.

Most of veins are associated with faults, fracture fillings and shear zones which in these conditions allow for the effect of dilution on the rock side. In general, the difference between the assay inside vein and rock side is very striking. It is related to the contact with the rock side, impregnation on the rock side, as well as the branching pattern vein. In addition, vein thickness fluctuations are difficult to predict and have a limited range of possible occurrence of highly erratical levels, even unpredictable (Annels, 1992).

Generally, the gold is found together with a number of other minerals such as quartz, pyrite, chalcopyrite, arsenopyrite, etc (Craig & Vaughan 1981). Because of its presence deep in the earth reaching hundreds of meters, then to get to it requires knowledge about its occurrence and size of the reserve. Before reaching the stage of mining or production, it requires a few years of study, from the early activity, namely the exploration and development to the final mine closure stage.

In mining industry exploration stage includes early exploration and detail mining-stage exploration. Calculations using geostatistical rules in the exploration stage is very important to know the spatial characteristics of mineral distributions. Spatial characteristics are used as the basis for making estimates to calculate the amount of reserves.

Conditions And Regional Geology

The data for this study is based on Penjom Gold Mine, the mining company that is located a few kilometers of south-west Kuala Lipis, in the state of Pahang, Peninsular Malaysia. The bed rocks in the area belong to the Permian Raub Group, consisting of fine-grained sediments and volcanics. Bedrocks in the mine area is dominated by marine clastic sediments which in some places are carbonaceous, intermediate to acid volcaniclastics, and subordinate rhyolitic lava sequences. They belong to the Padang Tengku Formation of the Raub-group rock. This volcaniclastic and sedimentary association is intruded by a few shallow dipping sheets of tonalite unit as narrow sills and minor dykes of quartz porphyries, running almost parallel to the main mineralized shear zone. Tonalite is a major igneous intrusion within the area. Sedimentary sequence strikes about north-south and dip moderately to the east at 30° (Metcalfe 2000).

A prominent structural feature of Peninsular Malaysia is the north-south trending Raub-Bentong Suture (RBS) that has accommodated considerable strike-slip movement and sustained over 100 km. Penjom mine which is situated about 20 km to the east of thi RBS, as well as other gold mines within the area are strongly affected by this feature by giving faults and structural features in almost north-south direction (Fig. 1). Structural analysis has indicated a regular geometrical pattern of repeated district scale fault trends (Kelau fault) which can be observed within most of the goldfields in the Central Belt (Tjia & Zaitun, 1985).



Figure 1. Map of Peninsular Malaysia showing the metallogenic belts, Raub-Bentong suture (RBS) and the location Penjom (Flindell 2003)

Mineralization at the Penjom gold deposit is structurally controlled and erratic laterally and vertically. The Penjom thrust is the dominant feature controlling the distribution of ore at Penjom and generally strikes NE (35°) and dips to the southeast (30°-40°). Considerable shear stresses along the Penjom thrust have remobilized much of the carbon within the shale sequence to form a graphitic "alteration" zone. This, together with sheared and milled rock (fault gouge materials), makes the Penjom thrust an impermeable zone. Major gold mineralization took place within the footwall of this thrust (Wan Fuad & Heru Sigit 2002, Kamar Shah 2012).

Kamar Shah Arifin (2012) divided mineralization bodies in the Penjom deposit into four groups, namely sheeted vein, dissemination, massive and fragmental. Sulphide minerals mainly arsenopyrite and pyrite are dominant constituents embedded in quartz-carbonate veins. There are widespread occurrences of pyrite, arsenopyrite, sphalerite, galena, chalcopyrite, molybdenite, tetrahedrite and tellurides. The gangue minerals commonly associated with gold mineralization include quartz, feldspars, carbonates and graphite.

Objectives

The basic theory of investigation is geostatistics, which includes a variety of effects that may be caused by, among others the emerging or absence of drift, hole effect, nugget, sill, and the influence of geology that can be used as a basis to determine the various phenomena that occur in the existence of the data. By compiling the geological data and determining whether the amount of regional influence is isotropy or anisotropy, these phenomena can be used to determine the strength or direction of the mineralization. Following the fitting variogram and knowing the power and influence within the region, the kriging rule estimation can be performed on each sample for basic calculation of gold reserves.

Materials and Rules Data

Gold assay values (Au in ppm) analysed by fire assay-AAS method of core drilling samples on regular grid pattern, were obtained from the Penjom Gold Mine, Kuala Lipis, Pahang. Drilling is done on the coordinates up to 0.29562-0.49299 and 0.28798-0.49192.

The data taken from 30,757 grade assays were composited into 304 data, or as much of the core drill holes with a maximum thickness of 216.3 meters and a minimum thickness of 2 meters. Thickness data is used as a parameter in the region to find out the overall volume of the mine to search for reserves. Kishné et al. (2003) states that, in order not to interfere with the process of analysis, data outliers should "bootstraped" or be excluded. Based on the analysis, there were 88 deviant data, which in distinct lithologic and most of them lies in up to 0.29480-0.487742 and 0.29509-0.49019. It will be analyzed in a separate discussion.

There are two categories of data. The first, as it is with the assumption that the data are relatively free from human cases in the analysis or calculation error initially. This data is used to determine the geologic conditions or parameters based on calculations derived from the geostatistics calculations. Second, excluded data or "bootstraped" i.e. data is free from outliers conditions.



Figure 2. Histogram of (a) all Au data and (b) after Au data excluded

Outlier is defined as an observation that "appears" to be inconsistent with other observations in the data set (Barnett & Lewis 1985 in Walfish 2006). Data outliers (Rousseeuw & Zomeren 1990) can be identified, both graphs (box plot and scatter plot) or by mathematical formulas as Leverage values, Standardized DfFIT, Cook's distance, etc. While Thomas & Snowden (1990) states that the outliers can be identified from the skewness is positive, and if it will be continued to the variogram calculation, the estimation will be overestimate.

From some of 304 drilling data resulted at the distribution zone of gold with an average thickness of 90.7865 m (with maximum thickness of 216.3 m and a minimum 2 m), there is a minimum level of 0.02 ppm (Au) and a maximum of 0.50549 (50.549 ppm) ppb (Au) with coefficient of variance value is 3.0135 and the coefficient of skewness=4.9327. Because of the skewness value is 0.5957, and statistics visualization especially boxplot method obtained information that there were 88 of data outliers with a value greater than 99.8 ppm (Au) will interfered or excluded from the analysis.

After the data outliers is removed, the coefficient of variance is changed to 0.5864, (as before 3.0135) and the coefficient of skewness is 0.5957 (as before 4.9327), which minimum data is 0.02 and maximum 99.8. Its means that the distribution is normal relatively (Fig. 2). From the analysis, it is shown that 216 selected data are located in the same lithologic region.

Statistics

Univarian statistical analysis used to determine the characteristic of the gold assay data population. Several statistical parameters to note include maximum/minimum, mean, median and coefficient of variance (Velasco & Verma 1998). Dominy et al. 1997 in Roy et al. (2004) suggests, if the coefficient of variation over the 1.5, variogram should not be built, although geologically, it indicates of erratical levels as stated Wan Fuad & Heru Sigit 2002.

Table 1. Statistical parameter before (all grade) and after excluded (bootstrap)

| Data | Min. | 1 st Qu. | Median | 3 rd Qu. | Max. | CV |
|-------------|------|---------------------|--------|---------------------|--------|--------|
| All grade | 0.02 | 0.251 | 0.431 | 9.69 | 505.49 | 3.0135 |
| Bootstraped | 0.02 | 0.209 | 0.379 | 5.08 | 99.80 | 0.5864 |

After bootstrapped the coefficient of variation changed to 0.5864 (Table 1) or less than 1.5, thus further calculations, especially with regard to variography and estimation can proceed.

Geostatistics

Variogram

Geostatistics is a rule which the main element is regionalized variables, or is a spatial variable that depends on the spatial location. The primary gold, particularly gold inside the vein is a natural phenomenon in the form of spatial sprinkles, so the positioning can be mathematically formulated as a regionalized variable. Region in the investigation means, an area containing gold mines in Penjom with a value of the spatial variable.

Variogram is the main tool of spatial variables or geostatistics theory that quantified the size and intensity of spatial variation, provide the basis optimum interpolation or estimation through kriging rules (Webster & Oliver 2007; Emery 2007). Huang & Hu (2009) states that the variogram is a geostatistical basis for describing, modeling, and exploiting the spatial autocorrelation of the spatial variables. One of the important things in variogram modeling is to determine the control of mineralization (Coombes 2009).

Estimated classical variogram by Matheron (1962) in Cressie (1993) stated as follows:

$$2\hat{\gamma}(\mathbf{h}) = \frac{1}{|\mathbf{N}(\mathbf{h})|} \sum_{\mathbf{N}(\mathbf{h})} (Z(s_i) - Z(s_j))^2; \ \mathbf{h} \in \mathsf{R}^d$$
(1)

where $N(h) \equiv \{(s_i, s_j) : s_i - s_j = h; i, j = 1,...,n\}$ and |N(h)| is a different sample pairs point separated by vector **h**.

In a practice, the data values are not just limited to form a regular pattern (regular) as it is commonly known. Thus, it is necessary to use a rule for calculating $\gamma(\mathbf{h})$ semivariogram. The sum of n samples be shown as the value of $Z(s_i)$, i=1, ..., n. To estimate $\gamma(\mathbf{h})$ in the direction θ variogram with distance \mathbf{h} , then there is a provision, the maximum deviation is within the area direction (angle) of d θ and deviation distance along h. All the sample pairs of vectors $Z(s_i)$ and $Z(s_j)$ on θ_{ij} direction that is the interval direction θ -d θ and θ +d θ , are treated equally. Likewise, all sample pairs s_i and s_j are located at a distance \mathbf{h}_{ij} and were among interval \mathbf{h} -d \mathbf{h} and \mathbf{h} +d \mathbf{h} will be treated equally. $Z(s_i)$ and $Z(s_j)$ is used for semivariogram estimated of direction θ and distance \mathbf{h} . For the record, that the direction and distance used in the fitting is done the average direction and distance than the overall sample pairs by taking into consideration (mean value than θ_{ij} and \mathbf{h}_{ij} , respectively) and the nominal price θ and \mathbf{h} (Rendu 1981; Igúsquiza & Dowd 2001). The grade semivariograms are in the directions N 0° E, N 45° E, N 90° E, and N 135° E with angle tolerance of 22.5.

Nugget effect and sill

Nugget effect is a condition in which the extrapolation of the curve leading to **h**=0 does not produce $\gamma(0)=0$, but $\gamma(0)=C_0$. Or, mathematically C_0 is nugget effect if $\gamma(-\mathbf{h})=\gamma(\mathbf{h})$ and $\gamma(0)=0$, so applicable $\gamma(\mathbf{h}) \rightarrow C_0 > 0$, as $\mathbf{h} \rightarrow 0$. While the sill is the maximum variance contained in a distribution, where the mean does not depend anymore to distance between samples. Nugget effect indicates a sprinkling of erratical data (Annel 1992).

Sill is the maximum variance contained in a distribution, a condition where the distance does not have a spatial effect, and this is an area of statistics. In "normal" conditions, the sill is the boundary between the geostatistical and classical statistics.

Drift

Drift is the phenomenon in which a variogram that initially behave normally – that is up until it reaches the sill – but then suddenly a parabolic rise. Its mean, that the regionalized variable was no longer stationary (Thakur et al. 2004). Drift can be determined by calculating the average difference in the variables s_i and s_j in accordance with the direction of the vector **h**, especially when visualized graphically. Average difference is, mathematically formulated:

$$\Delta(\mathbf{h}) = \frac{1}{2N(\mathbf{h})} \sum_{i=1}^{N(\mathbf{h})} \left\{ \frac{1}{2} \left[Z(s_i) - Z(s_j) \right] \right\}$$
(2)

Fitting variogram

Various theoretical variogram is linear, Gaussian, spherical, etc. It is said that the condition of R^d and $d \ge 1$:

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Linear:
$$\gamma(\mathbf{h}; \theta) = \begin{cases} 0, & \mathbf{h} = 0 \\ c_0 + b_1 |\mathbf{h}|, & \mathbf{h} \neq 0 \end{cases}$$
 (3)

where $\theta = (c_0, b_1)$ ' and $c_0 \ge 0, b_1 \ge 0$.

If the conditions R¹, R², and R³ then,

Gaussian:
$$\gamma(\mathbf{h}; \theta) = \begin{cases} 0, & \mathbf{h} = 0 \\ c_0 + c_g \left(1 - \exp\left(-\frac{|\mathbf{h}|^2}{a_g^2} \right) \right), 0 < |\mathbf{h}| \le a_g \\ c_0 + c, & , |\mathbf{h}| \ge a_g \end{cases}$$
 (4)

 $\theta = (c_0, c_g, a_g)$ ' where $c_0 \ge 0$, $c_g \ge 0$, and $a_g \ge 0$.

Spherical:
$$\gamma(\mathbf{h}; \theta) = \begin{cases} 0, & \mathbf{h} = 0 \\ c_0 + c_s \{ (3/2)(|\mathbf{h}|/a_s) - (1/2)(|\mathbf{h}|/a_s)^3, 0 < |\mathbf{h}| \le a_s \\ c_0 + c_s, & |\mathbf{h}| \ge a_s \end{cases}$$
 (5)

 $\theta = (c_0, c_s, a_s)'$ where $c_0 \ge 0$, $c_s \ge 0$, and $a_s \ge 0$.

Analysis And Discussion

Analysis variogram

Range is an area of influence that indicates, how long or widespread influence of sample to sample. From the calculation, influence of the sample were still going on between the minimum distance 720 meters (minor) and a maximum was 2397 meters (major). This condition is reflected the anisotropy phenomenon that occurs in an east-west direction. While on a northwest-southeast direction, the influence between samples occur at minimum 935 meters (minor) and a maximum along of 3402 meters (major). Isotropy condition occurs in the northeast-southwest with a range 1623 meters and north-south with a range of 2143 meters.

| Direction | Nugget | Sill | Range | | Area of | Model |
|-----------|--------|------|---------|---------|-----------------------------|---------|
| | | - | Minor | Major | Influence (m ²) | |
| E-W | 0.001 | 4.22 | 720.5 | 2397.16 | 5,428,442 | Ellipse |
| NE-SW | 0.159 | 3.82 | 1622.76 | 1622.76 | 8,276,223 | Cycle |
| N-S | 0.001 | 3.66 | 2143.00 | 2143.00 | 14,433,411 | Cycle |
| NW-SE | 0.207 | 4.05 | 935.31 | 3401.75 | 9,999,562 | Ellipse |

Table 2. Geostatistical parameters all grade

In the east-west direction, influence between two samples occurs in an elliptical area of 5,428,442 m². While on a northwest-southeast direction between two samples influence still occurs in an elliptical area of 9,999,562 m². In the northeast-southwest influence occurs in an area of 8,276,223 m² (cycle). While the north-south direction between samples influence occurs in a cycle area of 14,433,411 m² (Table 2).

The direction of gold deposition occurred with significant distribution is in the northwest-Southeast, with an area of influence $9,999,562 \text{ m}^2$ in the ellipse form with 935 meters minor axis and the major axis is 3401 meters. Its can be seen from the position of the biggest nugget i.e. 0.207 (see Table2).

Variogram on excluded data

Variogram parameters calculated after "bootstrapping" the data states that small value of nugget relatively, near the abscissa distance lag i.e. 0.004. Although it is not too extreme, anisotropic condition exists on the east-west and northwest-southeast where each minor-major axis is 1889-4586 and 1288-1865. The model is Gaussian with active lag 463.58, distance interval 30.91 and degree tolerance 22.5.

| Direction | Nugget | Sill | Range | | Area of | Model |
|-----------|--------|------|---------|---------|-----------------------------|---------|
| | | | Minor | Major | Influence (m ²) | |
| E-W | 0.004 | 0.64 | 1889.67 | 4586.47 | 27,238,832 | Ellipse |
| NE-SW | 0.004 | 0.22 | 1461.16 | 1461.16 | 6,709,964 | Cycle |
| N-S | 0.004 | 0.22 | 1461.16 | 1461.16 | 6,709,964 | Cycle |
| NW-SE | 0.004 | 0.24 | 1288.65 | 1865.42 | 7,555,003 | Ellipse |

Table 3. Geostatistical parameters after excluded data

Drift analysis

In this investigation, for all three active lags (823.95, 411.975 and 205. 987) the drift occurs in both directions i.e. east-west and northwest-southeast which according to Metcalfe (2000) in a line with the sedimentary rocks along strike and the direction of northwest-southeast (Table 4). And it would seem apparent that the average price drift further away from the position of the abscissa. This occurs in both directions i.e. east-west and northwest-Southeast.

| | E-W direction | n | NW-SE direction | | | |
|--------------|---------------------|------------------|-----------------|---------------------|---------------|-------|
| Lag class | Average distance | Average drift | Pairs | Average distance | Average drift | Pairs |
| 1 | 34.27 | -0.002854 | 560 | 36.13 | 0.140990 | 483 |
| 2 | 83.03 | 0.071582 | 1006 | 83.44 | 0.030044 | 899 |
| 3 | 137.66 | 0.187278 | 1028 | 137.34 | 0.060289 | 1099 |
| 4 | 189.07 | 0.386039 | 827 | 191.86 | 0.078085 | 1082 |
| 5 | 243.46 | 0.363551 | 404 | 245.45 | 0.116045 | 932 |
| 6 | 303.14 | 0.618226 | 329 | 300.75 | 0.163527 | 668 |
| 7 | 357.04 | 1.355416 | 413 | 356.54 | 0.734487 | 765 |
| 8 | 412.49 | 1.922172 | 458 | 412.97 | 1.348686 | 922 |
| 9 | 468.19 | 2.109447 | 524 | 463.57 | 1.661324 | 833 |
| 10 | 518.94 | 2.183491 | 449 | 521.54 | 1.777527 | 553 |
| 11 | 560.57 | 1.891813 | 75 | 574.51 | 1.906973 | 469 |
| 12 | - | - | - | 630.21 | 1.835178 | 209 |
| 13 | - | - | - | 683.80 | 1.775271 | 178 |
| 14 | - | - | - | 744.52 | -1.229143 | 280 |

787.14

Table 4. Drift effect on direction east-west and northwest-southeast direction

15

185

-2.166777

Results of the estimation

The comparison between the original data (Z all data) with estimated data (Z estimation) are relatively linear with mean error (ME)=-0.04, mean square error MSE)=5.675E-02 and mean absolute error (MAE) is 1.8868. This suggests that the data on the estimation is relatively similar to the original data, and it became the important base in a final calculation of reserves.

| | Min. | Max. | Median | Mean | Var. |
|--------------|------|------|--------|------|-------|
| Z real data | 0.02 | 9.98 | 3.44 | 3.79 | 0.052 |
| Z estimation | 1.55 | 6.79 | 3.79 | 3.83 | 0.005 |

Table 5. Comparison of statistical parameters between Z real and Z estimation

Conclusion

One of the information obtained from the drift phenomenon is, from three lags being tested is known that the drift occurs in both directions i.e. east-west and northwest-southeast its same with Metcalfe (2000) analysis that the sedimentary rocks along strike and the direction of northwest-southeast.

The results showed the similarities calculation between the original data (Z real data) with estimated reserves (Z estimation) are linear. This suggests that the data on the estimation is relatively similar to the real data, and it became an important base in the final calculation of reserve.

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