

Fracture network mapping using Landsat-8 OLI images of the mining zone of Jbel Tijekht in Moroccan Eastern Anti-Atlas.

Mapeo de redes de fracturas mediante imágenes Landsat-8 OLI en la zona minera de Jbel Tijekht en el Anti-Atlas oriental de Marruecos.

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ABSTRACT

Jbel Tijekht is one of the most important geological structures of the Ougnat-Ouzina ridge in the Eastern Anti-Atlas. This crescent-shaped massif was affected by a network fractures that is visible at different scales. It is particularly rich in numerous mineralized veins of barite, and is associated with other minerals (e.g. pyrite, chalcopyrite, sphalerite and galena).

In order to study fracture systems in the mining zone of Jbel Tijekht, we opted for a combination of remote sensing and field investigation that became an important tool for fracture mapping and mineral exploration. This work presents a methodological approach to detect structural lineaments. For this purpose, various techniques were applied to the Landsat 8 image to improve the visibility of linear structures. After the radiometric and atmospheric corrections, the colors composites and directional filters applied to the Principal component (PC1) allow for the establishment of a lineaments map of Jbel Tijekht. The validation and the correction of lineaments are based on preexisting documents combined with field observations.

Statistical analysis of the lineament map allows for identification of at least three directional fracture systems with average NS, NE-SW, and ENE-WSW orientations. NS and NE-SW systems show a high density in the largest part of the study area. These results clearly overlap different tectonic structures and existing veins. It allowed for the establishment of a geological link between lithology, fractures systems and mineralization. The fracture density can be attributed to the last variscan brittle phases, reflecting the rheology of rock units; the high fracture density is observed in competent rocks such as the Tabanit sandstones. These zones constitute a favorable area for mineralization deposits.

Keywords: Structural mapping, Lineaments extractions, Variscan, Jbel Tijekht, Ougnat-Ouzina Ridge, Moroccan Eastern Anti-Atlas.

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RESUMEN

El Jbel Tijekht es una de las estructuras geológicas más importantes de la cordillera de Ougnat-Ouzina en el Anti-Atlas Oriental. Este macizo en forma de media luna fue afectado por una red de fracturas que es visible a diferentes escalas. Es particularmente rico en vetas mineralizadas de barita y está asociado con otros minerales (por ejemplo, pirita, calcopirita, esfalerita y galena).

Para estudiar los sistemas de fracturas en la zona minera de Jbel Tijekht, optamos por una combinación de teledetección e investigación de campo que se convirtió en una importante herramienta para la cartografía de las fracturas y la exploración de minerales. Este trabajo presenta un enfoque metodológico para detectar los lineamientos estructurales. Para ello, se aplicaron diversas técnicas a la imagen del Landsat 8 para mejorar la visibilidad de las estructuras lineales. Tras correcciones radiométricas y atmosféricas, los colores compuestos y los filtros direccionalles aplicados al componente principal (PC1) se pudo establecer un mapa de lineamientos para Jbel Tijekht. La validación y corrección de estos lineamientos se basan en documentos preexistentes combinados con observaciones de campo.

El análisis estadístico del mapa de lineamientos permite la identificación de al menos tres sistemas de fractura direccional con orientaciones promedio NS, NE-SW y ENE-WSW. Los sistemas NS y NE-SW muestran una alta densidad en la mayor parte del área de estudio. Estos resultados claramente se superponen a diferentes estructuras tectónicas y a las vetas existentes. Esto permitió establecer un vínculo geológico entre la litología, los sistemas de fracturas y la mineralización. La densidad de fracturas puede atribuirse a las últimas fases de fragilidad del orógeno varisco, lo que refleja la reología de las unidades de roca; la alta densidad de fractura se observa en las rocas competentes como las areniscas de Tabanit. Estas zonas constituyen un área favorable para los depósitos de mineralización.

Palabras clave: Cartografía estructural, Extracciones de lineamientos, Variscan, Jbel Tijekht, Dorsal Ougnat-Ouzina, Anti-Atlas oriental marroquí.

Introduction

Over the last decade, remotely sensed satellite data has been used for detailed geological mapping at district and regional scales. Remote sensing provides a useful approach, especially in basement complexes in which access is low due to the rugged topography. For this reason, remote sensing and the processing of satellite images become more and more necessary, to recognize geological structures by lithological mapping (Adiri *et al.*, 2017) and lineaments mapping (faults, diaclases, joints, schistosity) (Hashim *et al.*, 2013; Pour & Hashim, 2016). This technique is also applied in hydrogeological and mineral explorations (Marghanay & Hashim, 2010). These techniques provide good results especially in arid climates and desert areas where the rock units are exposed (Abdullah *et al.*, 2013; Adiri *et al.*, 2017; Si Mhamdi *et al.*, 2016, 2017; Pour *et al.*, 2017, 2018).

This work focuses on extraction of structural lineaments. It is based on the automatic extraction using algorithms (Argialas *et al.*, 2004; Thannoun, 2013), and the visual interpretation of directional filters, color composites and spectral band ratios, which allow for more accurate mapping of linear or curvilinear discontinuities (El Alaoui El Moujahid *et al.*, 2016; Si Mhamdi *et al.*, 2017; Ta *et al.*, 2014; Youssef *et al.*, 2006).

This study concerns the mining zone of Jbel Tijekht, located in the southern part of the Ougnat-Ouzina Ridge, Eastern Anti-Atlas. The region benefits from a few geological studies and was only recently the focus of several research studies. Detailed geological mapping of the area was conducted by Ait Daoud *et al.*, 2020; Baidder *et al.*, 2008, 2016; Benharref *et al.*, 2014b; Destombes & Hollard, 1986; Makkoudi, 1995; and Pouclet *et al.*, 2017, 2018. This paper is a contribution to geological mapping of the mining zone of Jbel Tijekht. It combines remote sensing and field study. This contribution involves the structural study and the kinematics of fracturing. The resulting map and field work will allow us the scientific community to understand the tectonic relationship between lineaments and structural elements, and correlate with the variscan brittle tectonics noted in this region.

Geological Framework

The Anti-Atlas belt comprises the northern boundary of the West African Craton (WAC). It is limited by the Hamada of Guir to the East, the Hamada of Kem-Kem to the South, the Atlantic Ocean to the West and the Cretaceous and Tertiary of Errachidia Boudnib basin to the north. The Anti-Atlas chain is in the

form of inliers oriented ENE-WSW (Choubert, 1947; 1963; Thomas *et al.*, 2004; Gasquet *et al.*, 2005). It is occupied in the center by Precambrian rocks and boarded by the Paleozoic rocks (Figures 1b, 1c).

The eastern part of the Anti-Atlas is occupied by two outcrops, the Precambrian inliers of Saghro and that of Ougnat (Gasquet *et al.*, 2005), surround by the Paleozoic lands of Tafilalet, Maider, Rivers Rheris-Jorf and those of Tisdafine (Figure 1a and figure 3). On the other hand, these Precambrian formations are not limited in these two main inliers; they are outcroppings at the southern edge of the Ougnat-Ouzina Ridge in the Jbel Tazoult n'Ouzina and at the east of the town of Erfoud in the two localities of Gour Brikat and El Aness (Destombes & Hollard, 1986).

The Ougnat-Ouzina Ridge, where the study area is located, is formed by Paleozoic formations ranging from Cambrian to Ordovician strata; while the eastern and western boundaries (Tafilalet basin and Maider Basin respectively) present the Devonian to

Carboniferous strata (Figure 1d). The structuration of this region occurred during the early Paleozoic era and then during the Variscan cycle (Baidder *et al.*, 2016; Michard *et al.*, 2008). The tectonic in the Tafilalet, in the river of Rhéris-Jorf, and in the Maider, is rather to the variscan chain-front type. It is marked by folds with a large radius of curvature and by the abundance of faults (Baidder *et al.*, 2016; Benharref *et al.*, 2014).

The Jbel Tijekht anticline, the object of this study, is located in the southwest of the touristic dunes of Marzouga, precisely at 30 km west of Taouz village. It stretches for more than 15 kilometers west of Tizi n'Rsas. In the study area, the Middle Cambrian and Lower Ordovician mark the two main elements of the Paleozoic cover (Figure 2). They are materialized by detrital sediments crossed by mineralized veins. The structural study of the anticline structure of Tijekht made it possible to relate it to a multiphase variscan deformation (Destombes & Hollard, 1986).

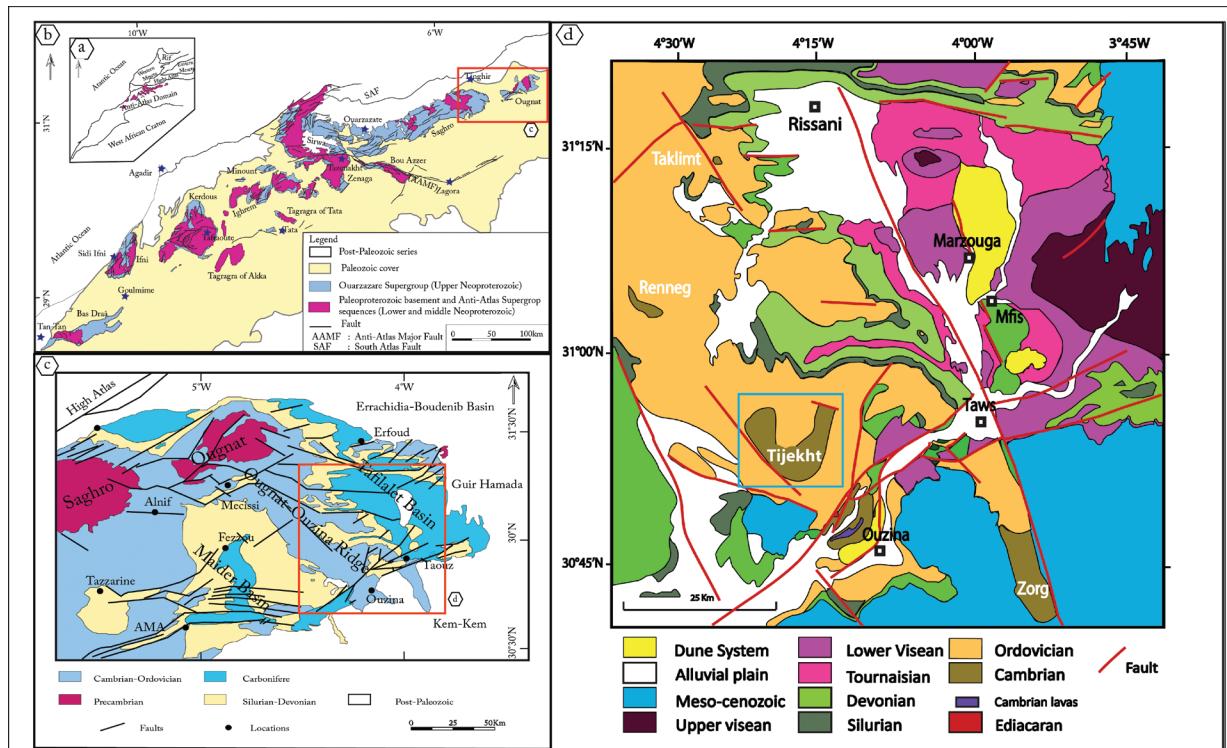


Figure 1.—Geological situation of the study area in a regional framework: a; Map of geological Morocco domains, b; Anti-Atlas geological map showing all Precambrian inliers surrounded by Paleozoic rocks, adapted from 1: 1000000-scale geological map of Morocco (Geologic service of Morocco, 1985), c; Geological map of Eastern Anti-Atlas (Baidder *et al.*, 2016; Benharref *et al.*, 2014; Michard *et al.*, 2008), d; Geological Map of the province of Tafilalet, (Álvaro *et al.*, 2014a, 2014b; Benharref *et al.*, 2014a, 2014b, 2014c; Baidder *et al.*, 2016; Destombes & Hollard, 1986); Bleu rectangle in "d" indicates the study area.

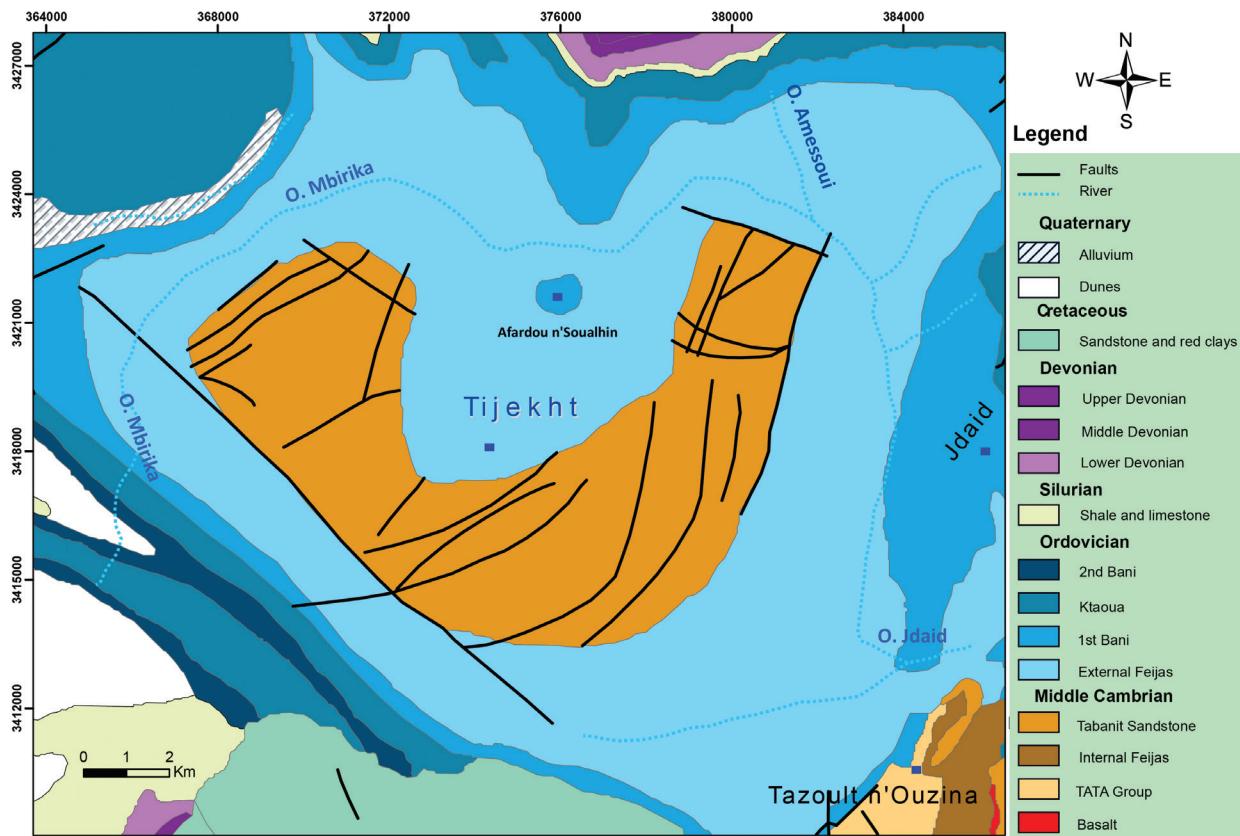


Figure 2.—Lithological outcrops and Structural schema of the study area, showed the crescent shape of Tijekht, modified after (Benharref et al., 2014b).

This anticline oriented E-W is located north of the ENE-WSW fault corridor of Oumjrane Taouz (Baidder *et al.*, 2016). The crescent shape of Tijekht is made by the second phase of sub-orthogonal folding dated late variscan (Baidder *et al.*, 2016). These folds are very open with axes oriented N-S to NNE-SSW (Figure 2).

Materials and Methods

Materials

To achieve the objectives, an optical Landsat-8 OLI image was used with 9 spectral bands of different wavelengths (Table 1). This image was acquired on 25 August 2018 at the L1T (corrected terrain) level, with a Universal Transverse Mercator (UTM) projection and a World Geodetic System WGS 84 datum. The acquisition date is characterized by the scarcity or the absence of clouds in the area of interest.

Methods

The preprocessing step of the satellite image involves both radiometric calibration and atmospheric corrections, and is critical in order to get a useful scientific product (Chander *et al.*, 2009). This step is followed by a treatment procedure to improve the sharpness of the image and the visibility of geological structures. It includes the color composites, principal component analysis (PCA), spatial filtering and banding ratios (Figure 4).

In this study, two approaches have been used for lineament extraction:

- 1) Visual interpretation: This method corresponds to manual tracing of the observed lineament in the input data. In this study, the visual interpretation was applied to the band ratios and on the color composite in the true colors (432 in RGB respectively), with the aim of combining

Table 1.—Landsat-8 OLI spatial and spectral band resolutions (NIR = Near Infrared; SWIR = Short-Wave Infrared).

Bands	Spatial Resolution (m)	Wave length (μm)	Common name
1	30	0,433 - 0,453 μm	Aerosols
2	30	0,450 - 0,515 μm	Blue
3	30	0,530 - 0,590 μm	Green
4	30	0,640 - 0,670 μm	Red
5	30	0,850 - 0,880 μm	NIR
6	30	1,570 - 1,650 μm	SWIR1
7	30	2,110 - 2,290 μm	SWIR2
8	15	0,500 - 0,680 μm	Panchromatic
9	30	1,360 - 1,380 μm	Cirrus

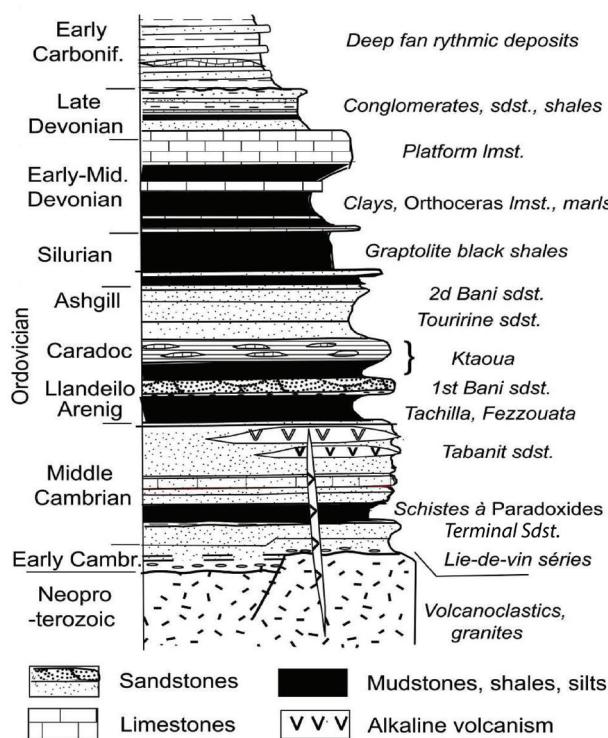


Figure 3.—Synthetic stratigraphic column of Palaeozoic formations of the eastern Anti-Atlas (Baidder et al., 2008). The informal lithostratigraphic units are labelled on the right-hand side, with their age after Destombes & Hollard, 1986.

- its results with the results obtained by automatic extraction (Figures 4, 5 & 8).
- 2) Automatic extraction: Before the automatic extraction, a visual aspiration of Oli8 bands and principal components were tested to identify the most suitable input for lineament extraction. Since the lineament extraction is based on the spatial resolution and the relief visibility, we

selected band 5 and PC1 where the lineaments are well interpreted. Subsequently, tests were applied to different types of filters to the inputs (Band 5 and PC1) in order to increase the visibility of lineaments (Figures 4, 6 & 7). Then, the automatic extraction was applied to the direction filters using the most widely used algorithm LINE extraction of the PCI Geomatica software (Anbalagan *et al.*, 2015; Mandal & Maiti, 2014; Matori *et al.*, 2012). Algorithm of this LINE modular runs mainly in three phases: edge detection, thresholding and curve extraction. However, LINE module extracts lineaments from an image and converts these linear features to vector form by taking consideration of six optional parameters (RADI, GTHR, LTHR, FTHR, ATHR, and DTHR). These parameters can be defined by the user depending on image resolution and lineament density (www.pcigeomatics.com). In order to obtain the most appropriate lineaments related to the tectonic setting of the studied area, we suggested the following optimum values for LINE modular parameters (Table 2). These parameters are explained briefly according to (www.pcigeomatics.com):

RADI = Filter radius: specifies the radius of the edge detection filter in pixels. It roughly defines the smallest-detail level in the input image to be detected. The data range for this parameter is between 0 and 8192.

GTHR = Gradient threshold: specifies the threshold in pixels for the minimum gradient level

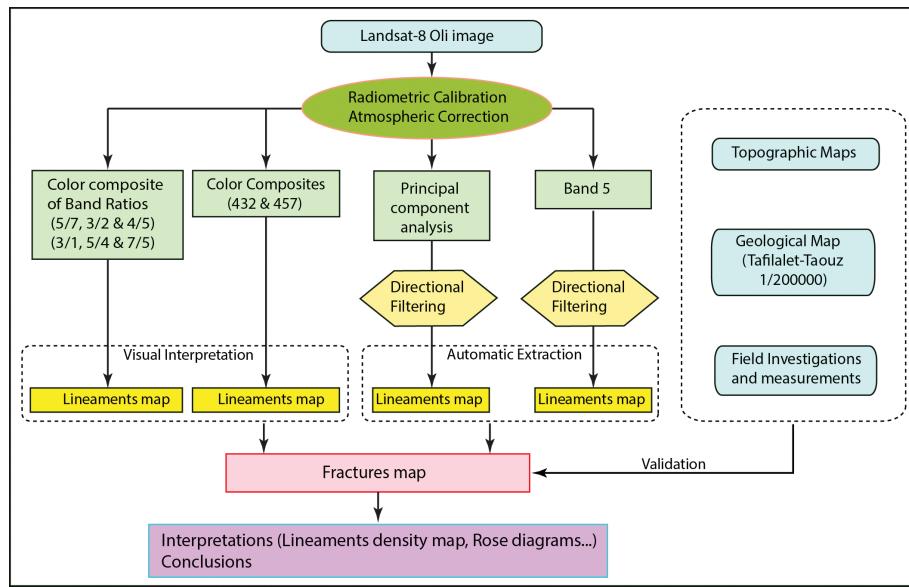


Figure 4.—Methodological approach of lineament extraction from the Landsat-8 Oli image.

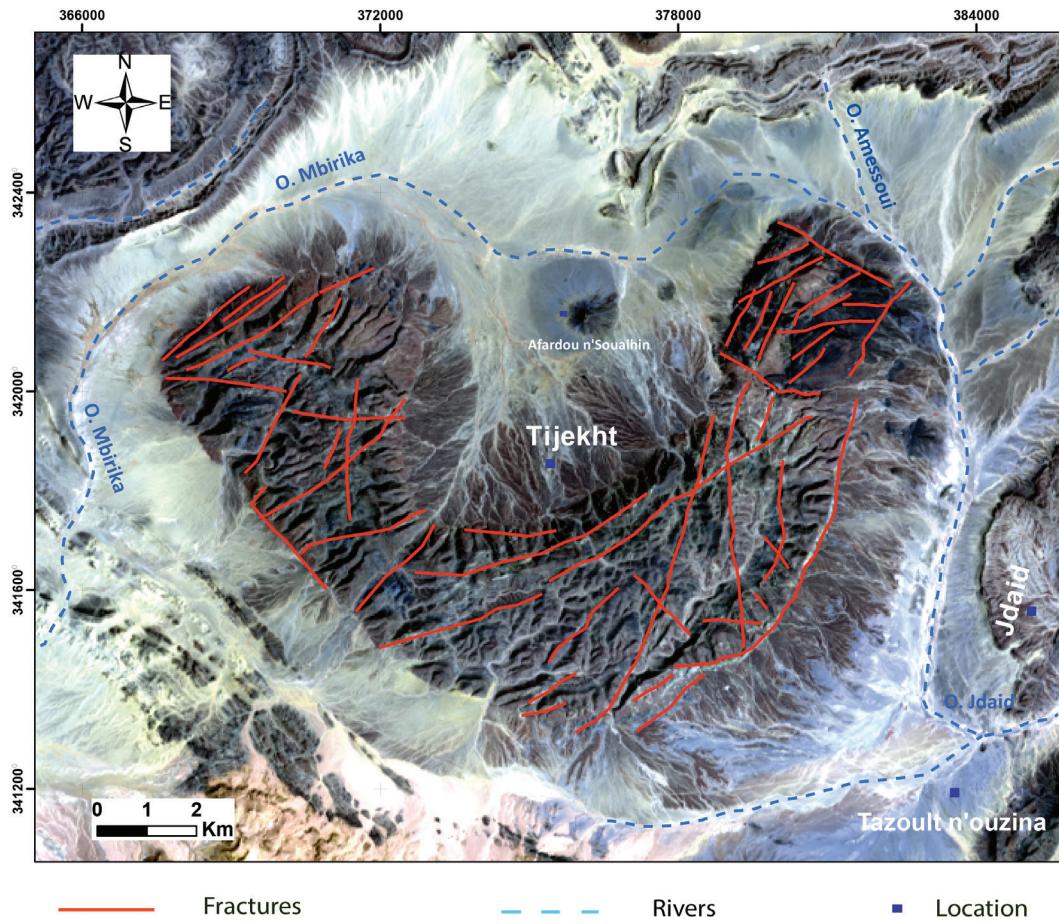


Figure 5.—Color composite of bands 4, 3 and 2 in RGB, respectively; true-color mosaic image of the study area resulted from pre-processing, and lineaments extracted from manual methods.

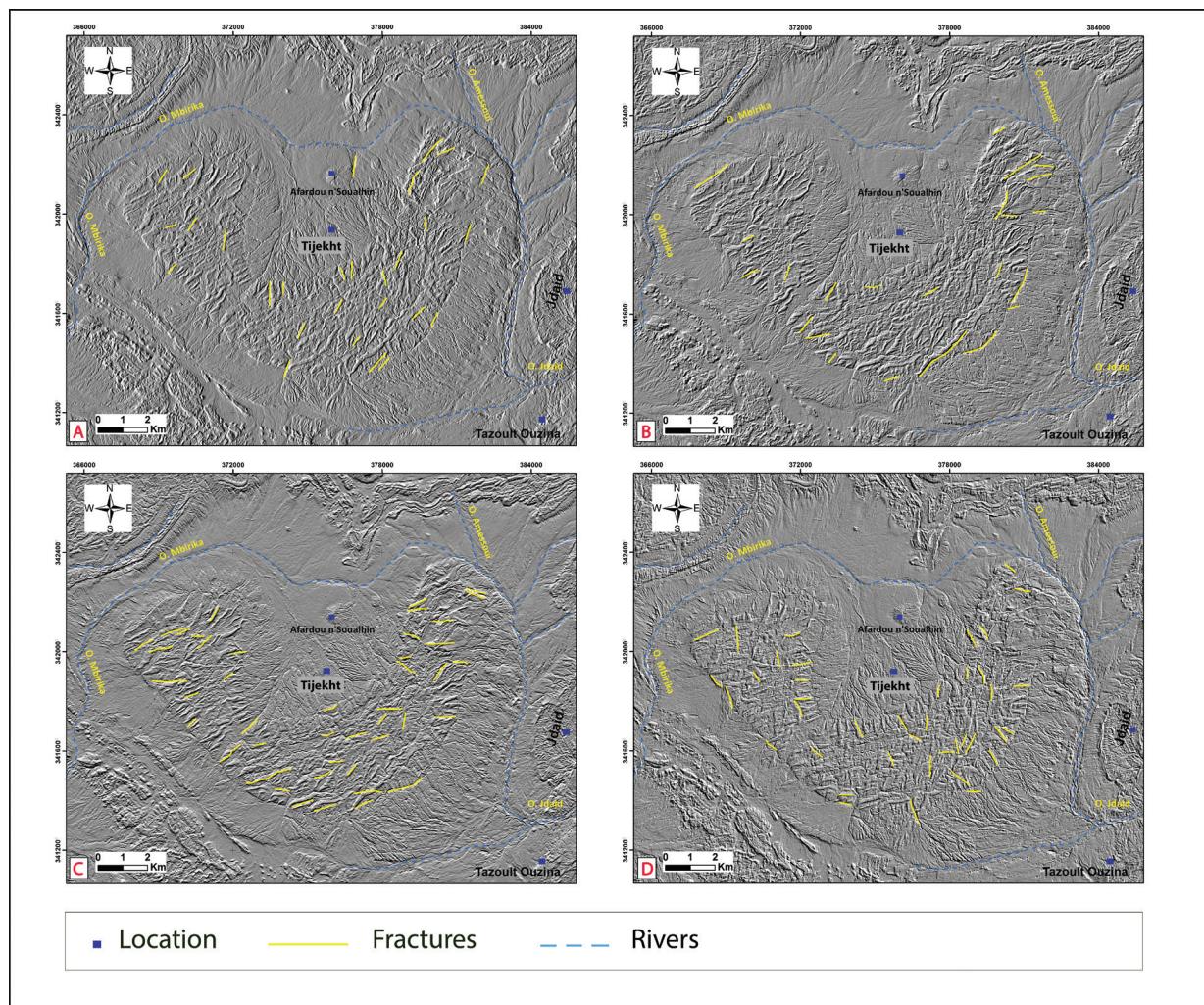


Figure 6.—Extracted lineaments from spatial filtering of the principal component analysis. A Filter NS. B Filter NE-SW. C Filter E-W. D Filter NW-SE.

for an edge pixel to obtain a binary image. The data range for this parameter is between 0 and 255.

LTHR = Length threshold: expounds the minimum length of curve in pixels to be considered as lineament or for further consideration; such as, the linking with other curves. The data range for this parameter is between 0 and 8192.

FTHR = Line fitting error threshold: specifies the maximum error in pixels, allowed when fitting a polyline to a pixel curve. Low FTHR values give better fitting but also shorter segments in polyline. The data range for this parameter is between 0 and 8192.

ATHR = Angular difference threshold: the parameter which specifies the maximum

angle in degrees, between segments of a polyline. Otherwise, if the angle exceeds the specified maximum, the polyline is segmented into two or more vectors. This angle also defines the maximum angle between two vectors for them to be linked. The data range for this parameter is between 0 and 90.

DTHR = Linking distance threshold: this measurement is the parameter which specifies the minimum distance in pixels, between the ends points of two vectors for them to be linked. The data range for this parameter is between 0 and 8192.”

The control and validation of these results are based on the use of topographic and geological maps made in the region, such as the Tafilalet-Taouz

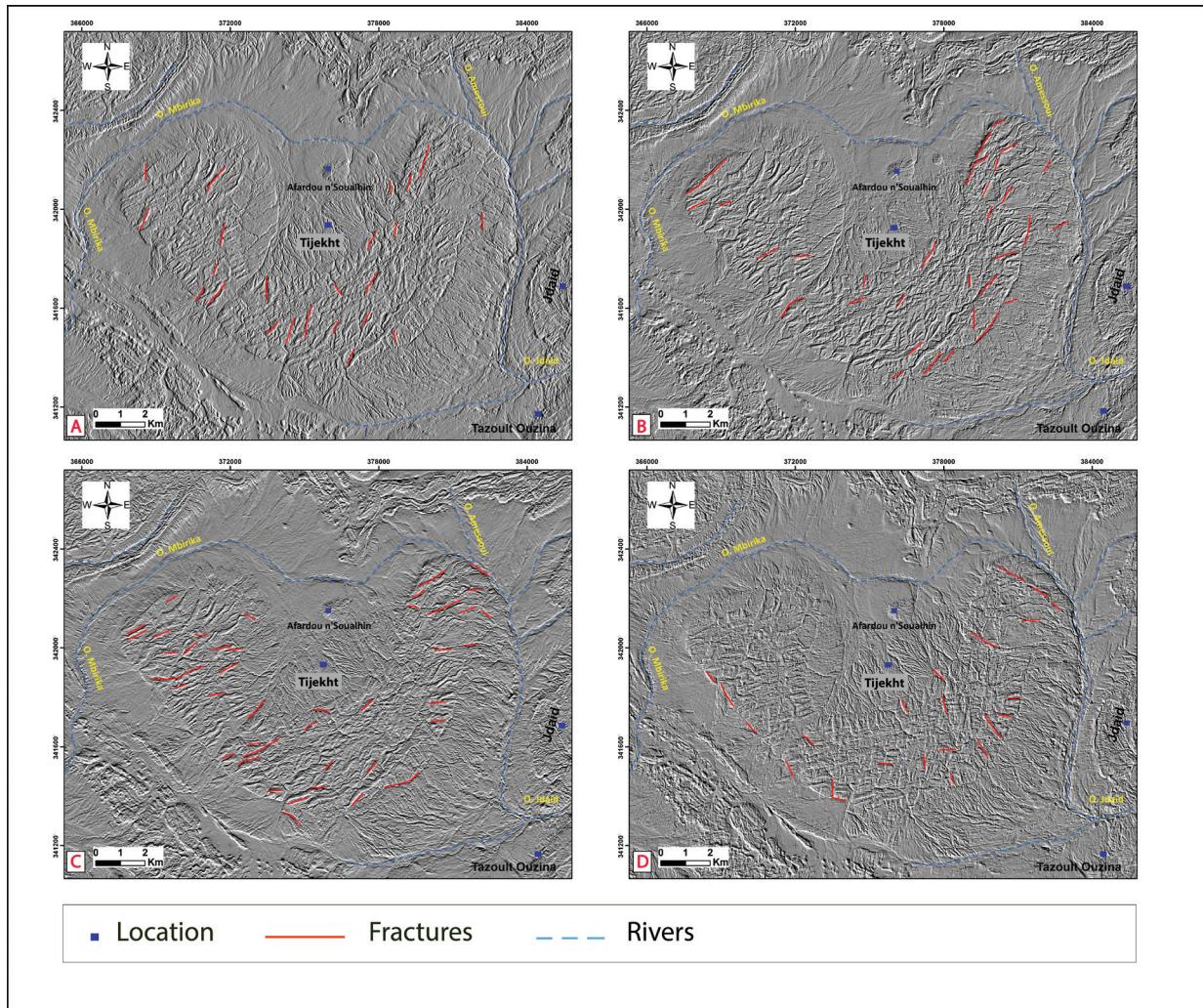


Figure 7.—Extracted lineaments from spatial filtering of the band 5. A Filter NS. B Filter NE-SW. C Filter E-W. D Filter NW-SE.

geological map, as well as courses and field investigations (Figure 4).

Color composite

The creation of color composition (RGB) which consists of assigning three spectral bands of a satellite sensor to each of the three colors (Red, Green, and Blue). The analysis of these compositions requires an interpretation of the spot coming from the identical ranges of color corresponding theoretically to the same object, on the basis of calculation of the Optimal Index Factor (OIF) (Abrams *et al.*, 1983; Si Mhamdi *et al.*, 2017).

Spectral Band Rationing

The application of band ratios makes it possible to reduce the topographic effects through mathematical operations (Dembele, & Xiufen Ye, 2017; El Janati, 2019). It also improves the ability to specify the boundaries between the lithological units as a function of their mineralogical composition and the development of crystals (El Janati, 2019; Schowengerdt, 2006; Si Mhamdi *et al.*, 2017), otherwise the improvement of different spectral signature between bands.

Spectral relationships based on a mathematical correlation between pixel values in wavelengths

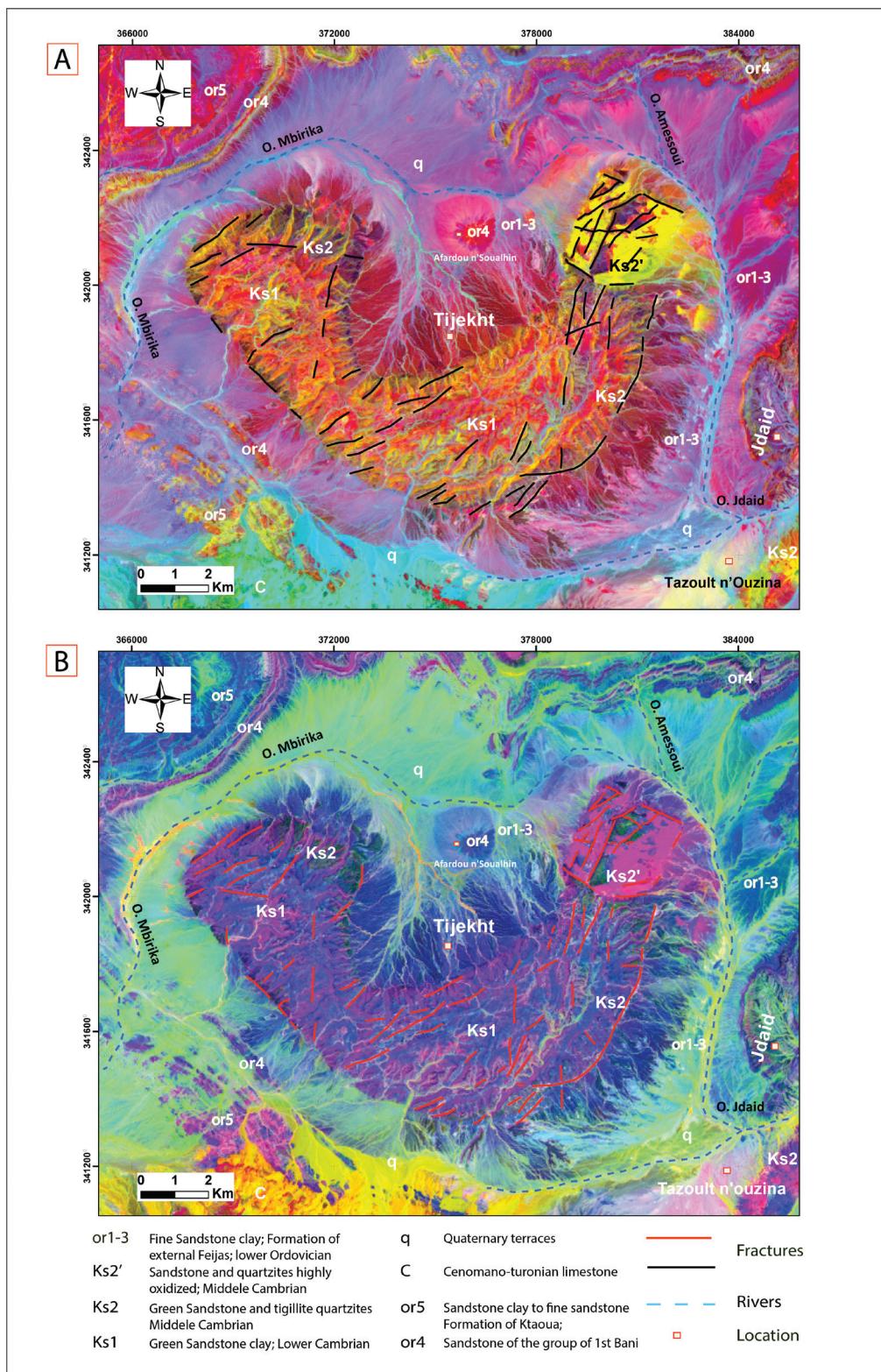


Figure 8.—Extracted lineaments from visualization interpretation of bands rationing (B5/B7, B3/B2 and B4/B5) and (B3/B1, B5/B4 and B7/B5), respectively.

target the reflectance and absorption characteristics of minerals (El Janati, 2019), which contribute to a better approach to gain spectral information in regions where brightness values may vary due to topographic influences. It is the most widely adopted method to discriminate between different lithologies (Adiri *et al.*, 2016; Si Mhamdi *et al.*, 2017). The choice of bands is related to the spectral difference of the material with respect to its environment (Si Mhamdi *et al.*, 2017; Thannoun, 2013). The application of the combinations of previous studies (Esamaldeen, 2012; Adiri *et al.*, 2016; Si Mhamdi *et al.*, 2017; Yousefi *et al.*, 2018), did not allow for specification of the exact limit between these two lithological groups. For this reason, the present study adopted combinations according to the reflectance of the formations targeted, and it appears that the ratios (5/7, 3/2 & 4/5) and the ratios (3/1, 5/4 & 7/5) in RGB respectively are considered to be the best reports of bands, due to their ability to improve the spectral reflectance of lithology and linear structures (Figure 8).

The principal component analysis

Principal Component Analysis (PCA) is an efficient technique broadly used for geological mapping (Adiri *et al.*, 2018, 2016; Amer *et al.*, 2012; Gad & Kusky, 2007; Pour & Hashim, 2011, 2012; Si Mhamdi *et al.*, 2016, 2017). This method consists of defining the new bands (Principal Components (PCs)) which sum up the information contained in several bands in a multispectral space (Ahmad Irouhani *et al.*, 2017; Dembele & Xiufen Ye, 2017; El Alaoui El Moujahid *et al.*, 2016; Estornell *et al.*, 2013; Franchi *et al.*, 2016). Sometimes the information filed in 5 or 6 bands is condensed into two or three components by this analysis (Si Mhamdi *et al.*, 2017). This mathematical transformation aims to statistically maximize the amount of variance of the original data in a small number of components (Franchi *et al.*, 2016; Pour *et al.*, 2017).

However, principal component analysis (PCA) produces new channels. These channels make it possible to create colored compositions, constituting an excellent visual interpretation. In

addition, they increase the contrast between the various objects on the ground. Given their good quality, we decided to use the first component (CP1) in the automatic extraction of linear structures (Figure 6).

Control and validation of lineaments

The characterization and the validation of the lineaments extracted from the satellite images and the determination of the possible chronological relations between the different directional families are the main objectives of the work done on the ground. In addition, the control of these fractures relates to the elimination of linear structures corresponding to different morphological and topographical parameters, such as the ridge lines, the tracks, the hues, the rivers, etc. Also to the comparison of result lineaments map with the fracturing map made on the basis of field data and pre-existing structural data (Figures 9, 10 & 11). However, the realization of a fracturing map based on field observations, and collected fracture measurements helped us to confirm the linear structures, and to determine their kinematics and the tectonic events affecting the area.

The control and validation step is essential to evaluate the relevance of the data obtained and the validity of the method used. In addition, this step allows for the determination of the structural significance of the fracturing extracted from the Landsat images, in order to use the results without the tectonic evaluation.

Results and Discussion

Structural lineaments mapping

Color composites

Based on the high OIF, triples of groups are considered significant and used as color channels for an RGB image. The combinations 432 and 457 of the RGB, respectively, were selected on the basis of a set of tests carried out previously. The analysis of the selected compositions allowed for establishment of visual interpretations on some lineaments which will be extracted later (Figure 5).

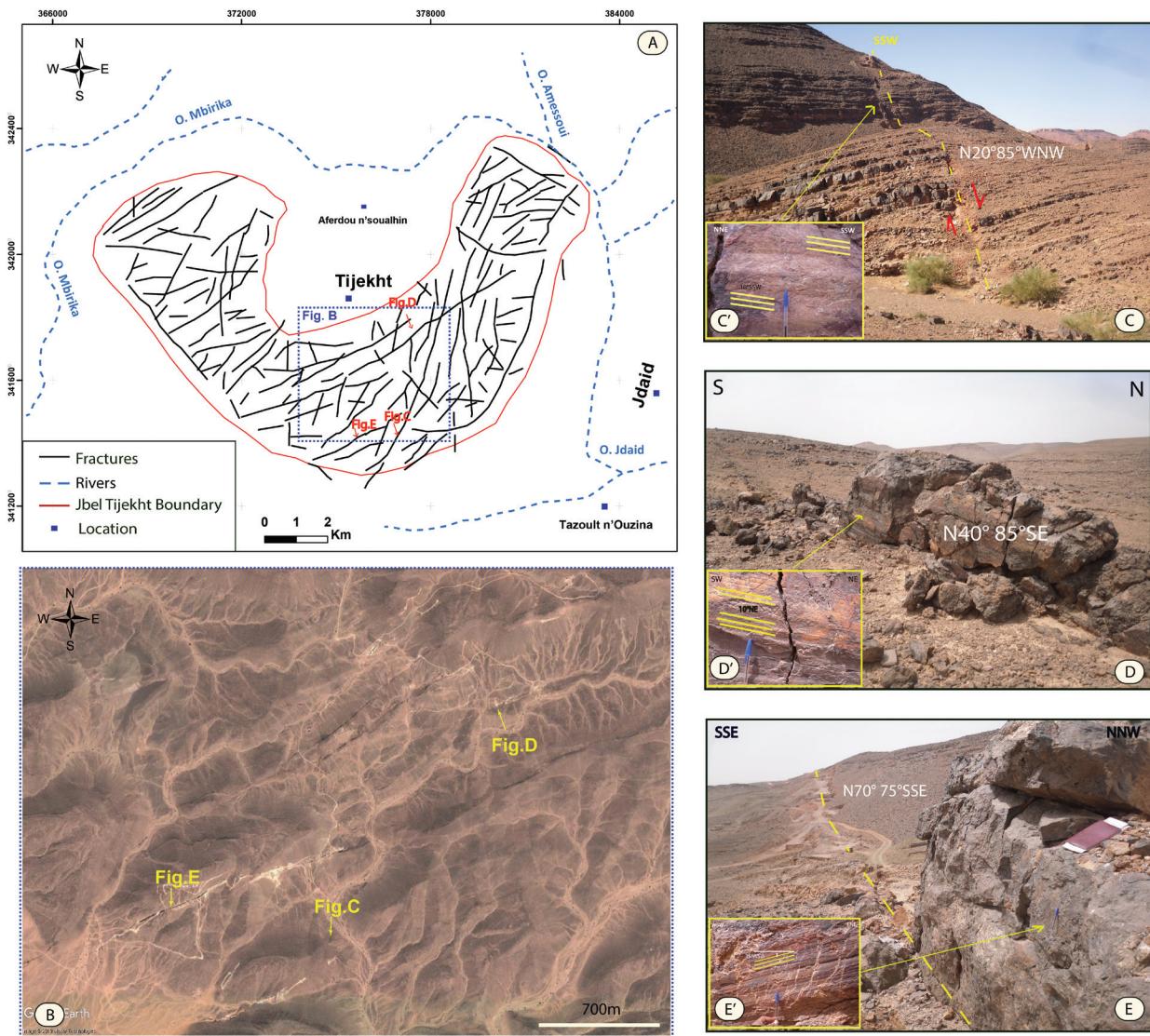


Figure 10.—Lineaments Validation: A; Synthetic lineament map. B; Image extracted from Google earth showing the emplacement of some linear structure extracted from image processing. C, D, and E; show Field Photographs of linear structure (faults) in the Jbel Tijekht. C', D' and E'; show Photographs of Fault Plan carry striations.

Directional filtering of the PC1 and Band 5

The results from the application of directional filters (NS, NE-SW, EW and NW-SE) to the first component analysis (PC1) and the band 5 will be used to create a structural map of the study area (Figures 6 & 7). The characterization and validation of the linear structures have been carried out based on the field and bibliographic data (geological maps of Tafilalet-Taouz 1/200000 (Destombes & Hollard, 1986) and of Al Atrous 1/50000; (Benharref *et al.*, 2014b)).

Band ratios

In the present work, the chosen technique aims to make a visual interpretation (manual tracing) of different linear structures observed to be intersecting the Middle Cambrian lithological groups, bordered by the Ordovician lithological groups (or1 to or5) which constitute the study area. After the difficult distinguishing and despite the resemblance of the outcrops of the study area Jbel Tijekht, the boundary between its facies are very well distinguished and exhibit the classification of the facies. So, by the

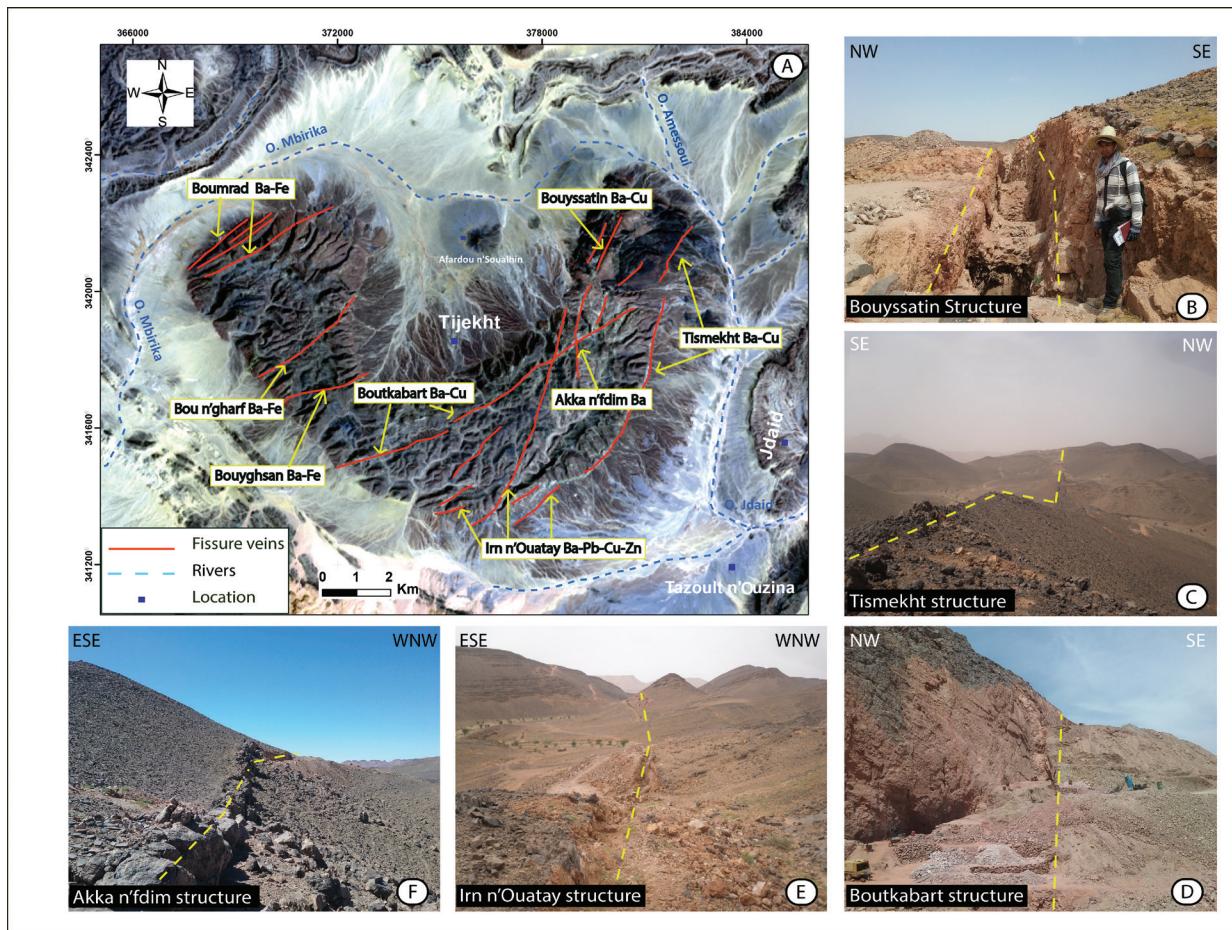


Figure 11.—A: Extract from the Landsat satellite image of study area showing the place of the most important mineralized structures. From B to F: Field photographs showing some mineralized structures mentioned in the map.

ratios (5/7, 3/2 & 4/5) in RGB respectively, we can identify the quaternary (q) in green and soft green to yellow; the pelitic formations, so called “Schistes à paradoxides (Ks1)” in sky blue and lavender blue; the Tabanit sandstones (Ks2), representing the carapace of Jbel Tijekht, in dark blue, purple and purplish-pink (Ks2’); the Ordovician lithological groups (or1 to or5) in dark blue and purple; and the Cretaceous units (c) in yellow to dark orange (Figure 8).

Control and validation

The combination of the different results obtained by processing satellite images allowed us, after the elimination of repetitions, to make a synthetic map (Figure 9) that will be validated with the data field and the published geological map of the Tafilalet-Taouz region, (Destombes & Hollard, 1986).

The observation of the synthetic structural map of lineaments (Figure 9) allowed us to notice a major trend between the results obtained by the processing of satellite images and the field work, and with the pre-existing data in the map of Tafilalet-Taouz. The coincidence of lineaments extracted from Landsat-8 OLI data with the major fault directions suggests that some faults in some locations have been correctly identified in the study area (Figure 9 and 10A). However, we didn't take in consideration the non-structural lineaments (e.g. ridge line, track, shade, etc.).

The results obtained show some similarities, although this superposition is sometimes translated through several segments (Figure 9), which may be related to the spatial resolution of satellite images (30 m) or the invisibility of lineaments in these areas. These linear structures correspond to non-mineralized faults (Figure 10) and mineralized faults

(Figure 11). Some faults can postpone microstructures, allowing for comprehension of the movements that they generate namely the striations and the steps of tearing. The figure 10 (C', D' and E') show a subhorizontal striated fault plane, involving the sense of movement of those faults.

The mineralization at Jbel Tijekht mining zone materialized in the form of numerous veins, with variable length that can reach more than one

kilometer. However, the most important vein structures in terms of thickness and length are: Tismekht, Bouyssatin, Akka n'Fdim, Boutkabart, Irm n'Ouatay, Bouyghsan, Bou n'Gharf, and Boumrad (Figure 11). The NE-SW directions are the main vectors of the mineralization of barite, copper, lead and zinc in the Jbel Tijekht mining zone, in the vein fields, which is part of the mining domain of Tafilalet.

Structural lineaments analysis

Orientation and length frequency

After the validation, the synthetic map shows 227 lineaments widespread throughout the study area, with length that varies from 200 m to 5200 m. Figure 13a, which diagrams length frequency of lineaments with a classis of 400m, indicates that over 70% of lineaments are between 400m and 1200m in length.

Table 2.—Used parameters for lineament extraction in this study.

Parameter	Code	Value
Filter Radius	RADI	60
Edge Gradient Threshold	GTHR	10
Curve Length Threshold	LTHR	60
Line Fitting Error Threshold	FTHR	3
Angular Difference Threshold	ATHR	15
Linking Distance Threshold	DTHR	10

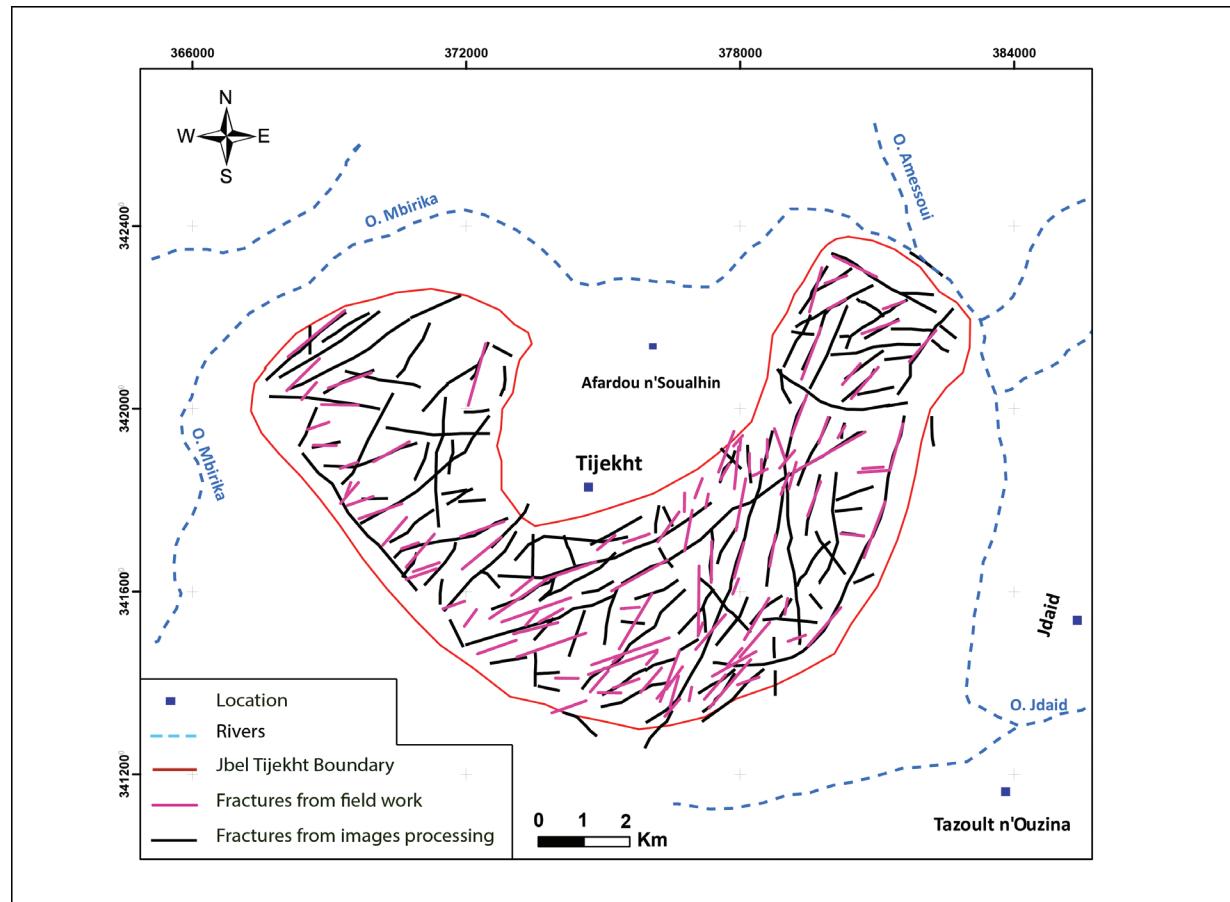


Figure 9.—Fractures map validation and control; superposition of the results from images processing and the results from fieldwork.

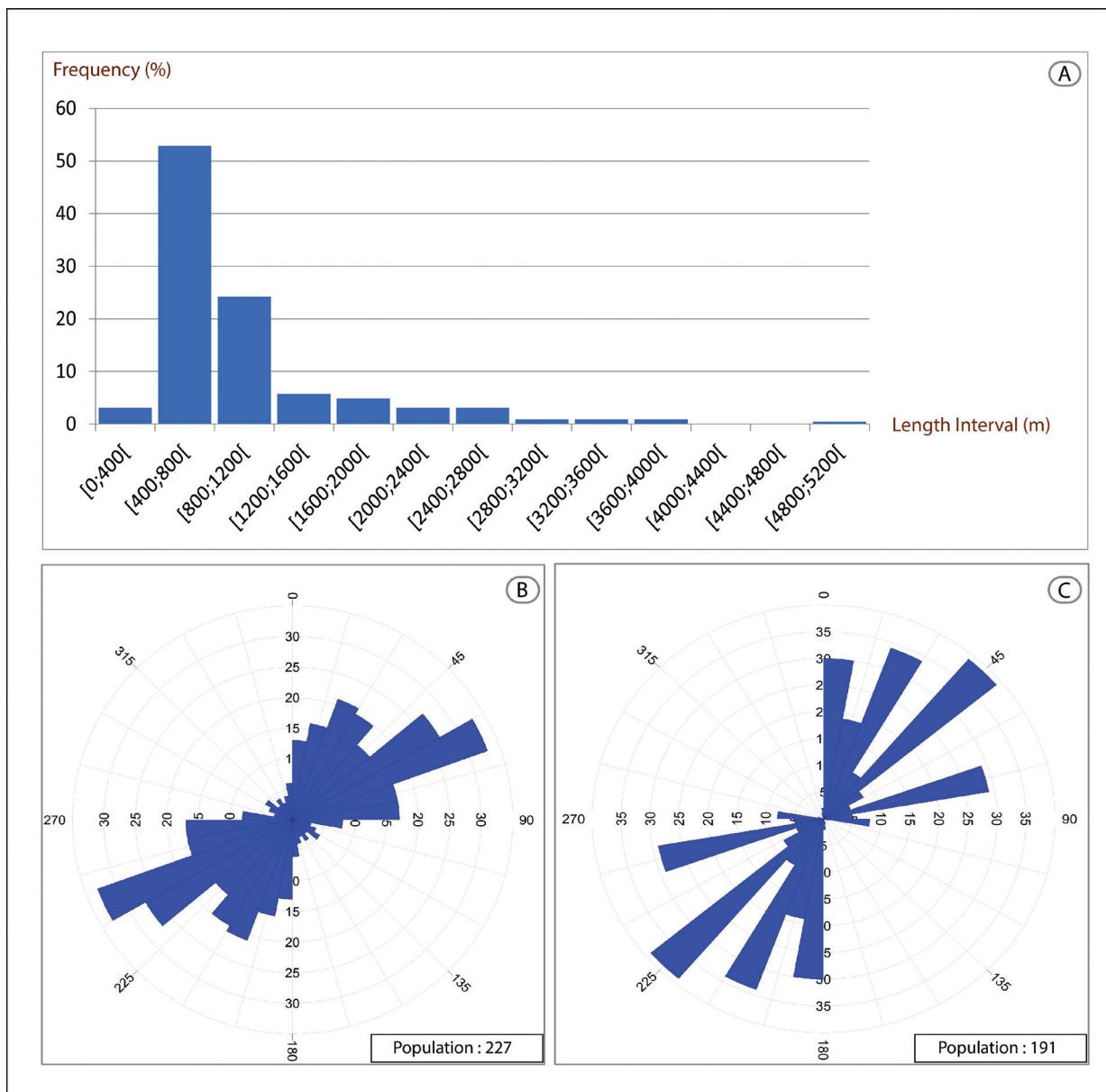


Figure 12.—Statistical analysis of the lineaments orientations: A, Histogram showing the frequency by length of the Jbel Tijekht fractures extracted from remote sensing. B, Rose diagramm of fractures from image processing. C, Rose diagramm of fractures from fieldwork.

A statistical analysis of the lineaments orientations, with an angular spacing 10° , revealed that the most of the lineaments have a direction between $N0^\circ$ and $N90^\circ$ with modes around $N30^\circ$ and $N60^\circ$ (Figure 12b). Field data also shows a distribution of lineaments from $N0^\circ$ to $N90^\circ$; however, the main mode is the $N45^\circ$ (Figure 12c). This finding may be due to the lower resolution of the image, and resulting inability to detect small fractures.

Lineament Density

The density parameter is widely used in studies of the lineaments. The used algorithm “Line Density” provides information on the concentration of lineaments per unit area (ArcGIS manual; Silverman, 1986, 1981). In the produced density map (Fig. 13), the value of the output cell corresponds to the total length of the lineaments contained in a search radius of 1 km and whose center is the center of the output

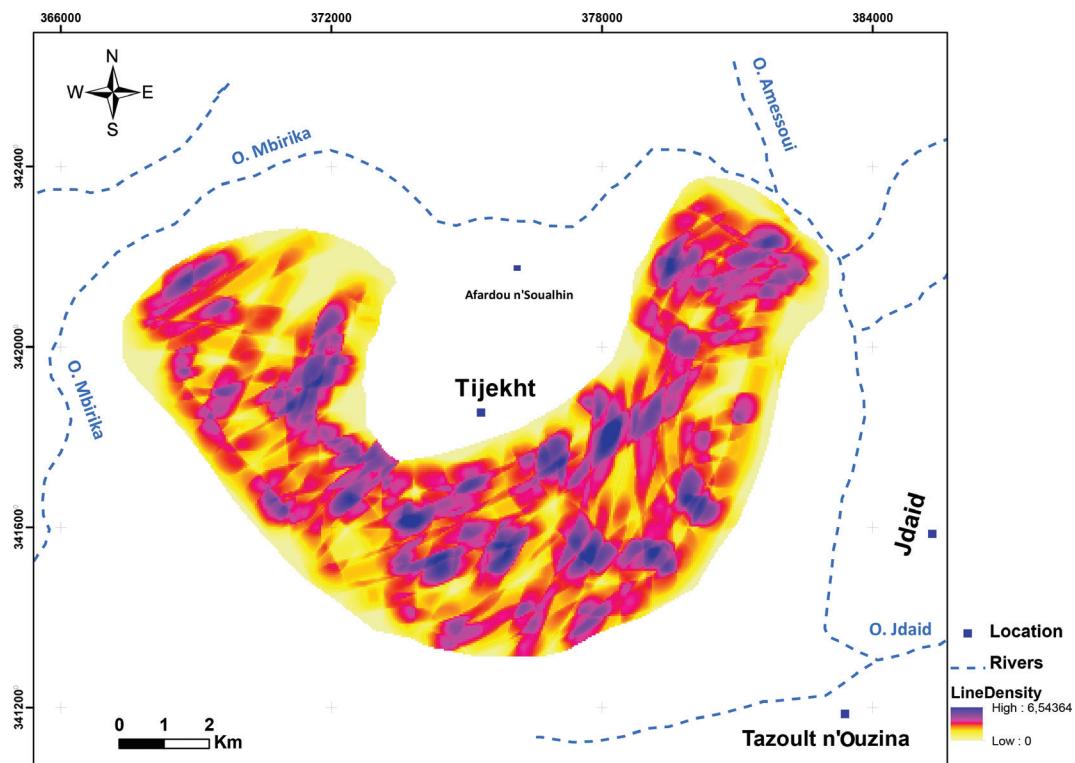


Figure 13.—Density map of fractures.

cell. The output density unit is kilometers per square kilometers.

In the present work, the density used to find the relationships between the areas of high density of lineaments and geological features (measured faults, veins and lithological units). The results obtained show high density in area where the lithological units are competent, such as the Tabanit sandstone. However, the overall analysis of this density map showed that the areas of high density occupied the majority of the studied area (Figure 13). The most important density values are mainly concentrated in the Jbel Tijekht carapace (Tabanit sandstone) where fracturing is materialized, whereas most of the weak values (medium to low densities) are located in places where the lithological units are tender (Pelitic formation). This finding implies the fragile rheological behavior of the Cambrian lands of the Jbel Tijekht.

The areas with a high density of lineament may constitute a favorable zone to the circulation of hydrothermal fluids and the formation of mineralized deposits. The throw of these fractures shows

a great influence on fluid retention and the setting up of mineralization, which is very apparent in field observations.

Conclusions

The present study is a contribution to structural mapping that used spatial remote sensing combined with field work (classical methods). This paper presents a contribution of satellite imagery type Landsat-8 Oli in structural mapping of the inaccessible area in the south-east Moroccan region. Taking into consideration that most fractures contain mineralization with economic value, the established fracture map combined with field data will be useful and a valuable target for advanced metallogenetic researches and mineral exploration in the Jbel Tijekht. Moreover, this study provides a clarification about structural analysis on the study areas.

In conclusion, the present study reveals that the major directions of fractures in crescent-shaped massif of Jbel Tijekht are NS, NE-SW, and ENE-WSW with some NW-SE fractures. This network of

fractures constitutes the main marker of the variscan rotational constraint from NS to E-W with a paroxysmal position towards the N60°. This fracturing intensity implies a fragile rheological behavior of the Cambrian lands of the Jbel Tijekht. Fragile tectonics and the alternation of competent (Tabanit Sandstone) and incompetent levels (Pelitic formation called "Schistes à paradoxides") have a primordial role in the structuration of Jbel Tijekht, which can be attributed to the last variscan brittle phases.

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