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**Methods of glacier
mapping using remote
sensing techniques: review**

Glacier mapping using remote sensing techniques has become popular in the past decade. This paper presents a review of glacier mapping methods using remote sensing. It also highlights the advantages and problems of remote-sensing-based glacier mapping. In addition, our previous experience on glacier mapping method are provided. It is concluded that semi-automated mapping of clean glacier ice is faster, not generalized and generating reproducible results, i.e. the same threshold values always generate the same outlines. This method can be the best method for glacier mapping comparatively large area.

Key words: methods of glacier mapping, manual delineation, automated mapping, remote sensing.

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**Арақашықтықтан зондылау
арқылы мұздықты
картографиялау әдістері: шолу**

Соңғы онжылдықта арақашықтықтан зондылау арқылы мұздықты картографиялау әдісі кең таралды. Бұл мақалада мұздықты картографиялаудың әдістеріне шолу жасалды. Сонымен қатар арақашықтықтан зондылауға негізделген картографиялаудың артықшылықтары мен кемшіліктері де қарастырылған. Мұздықты картографиялау бойынша алдыңғы тәжірибеміздің әдістері де көрсетілген. Ашық мұздықты жартылай автоматты картографиялау әдісі ең жылдам, генерализацияланбаған және қайта тексергенде сәйкес нәтижеге алып келетін әдіс болып қорытыланды. Бұл әдіс үлкен аймақтың мұздықтарын картографиялауда ең тиімді әдіс екені анықталды.

Түйін сөздер: мұздықты картографиялау әдістері, қолмен сызу, автоматты картографиялау, арақашықтықтан зондылау.

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**Методы картографирования
ледников с использованием
дистанционного
зондирования: обзор**

Методы картографирования ледников с использованием дистанционного зондирования стали популярными в последнее десятилетие. Эта статья представляет обзор методов картографирования ледников с использованием дистанционного зондирования. Также приведены преимущества и недостатки методов ДЗЗ. Кроме того, предоставлен наш предыдущий опыт по методу картографирования ледника. Установлено, что полуавтоматический метод картографирования чистого ледника быстрее, не генерализует результаты и генерируют повторяемые результаты, т.е. те же пороговые значения всегда генерируют те же контуры. Этот метод является лучшим способом для картографирования ледников сравнительно большой площади.

Ключевые слова: методы картографирования ледников, ручная оцифровка, автоматическое картографирование, дистанционное зондирование.

**METHODS OF GLACIER
MAPPING USING
REMOTE SENSING
TECHNIQUES: REVIEW****Introduction**

The principal goal of glacier mapping is to represent the spatial morphology of glacier terrain features on maps [1]. Glaciologists can use maps to obtain information about glacier variability, estimate mass balance, infer the morphometric status of glaciated regions, calculate changes in ice volume, and estimate the position of the equilibrium line.

Compared with the traditional methods which are always time-consuming, laborious and sometimes unpractical spatially in isolated areas, remote sensing has been an excellent choice for analyzing glaciers in remote mountains and to monitor numbers of glaciers at the same time [2]. It can save much money, time, manpower, material resources and also acquire information in isolated areas [3]. Automatic classification of glaciers and GIS-based extraction of glaciers from Landsat TM data have been widely recognized as highly valuable methods for glacier mapping. Much of work has been done to analyze glacier changes using remote sensing techniques [4, 5]. However, few studies have focused on comparison of different glacier mapping methods and selection of an appropriate mapping method.

This paper presents a review of glacier mapping using remote sensing. It also highlights the advantages and problems of remote sensing based glacier mapping. In addition, previous our experience on glacier mapping method are provided.

Manual delineation

Initial glacier inventory studies using remote sensing, such as by Williams [6] and Hall [7], started in Iceland and Austria, respectively, with the manual digitization of glacier boundaries on standard false colour composites of Landsat MSS and TM images. This method is time-consuming for larger areas, and its accuracy depends on the efficiency of identification and recognition of glacier terrain features on satellite imagery. Manually digitized glacier outlines differ in each digitization (even when performed by the same person), as the degree of generalization (e.g. spatial averaging over several pixels, number of vertices used for the line, interpretation of subtle differences in colour) varies each time. Hence, manual digi-

tizing gives inconsistent and generalized results that are difficult to reproduce. This is also a point to consider for change assessment. In Kazakhstan, almost all the glacier mapping techniques based on satellite imagery have been carried out by manual delineation [8, 9].

Automated glacier mapping

Automated mapping of glaciers involves image processing techniques on multispectral data such as simple band mathematics and classification. Automated mapping of snow and ice is based on the fact that snow exhibits high reflectance in the visible and near-infrared region (VIS and NIR) as compared to short-wave infrared (SWIR) region of the solar spectrum.

The methods for automated glacier delineation can be divided into these distinct groups:

a) Image rationing based mapping of various snow and ice types [10-12];

b) Normalized Difference Snow Index (NDSI) based techniques [13-16];

c) Multispectral image classification based techniques [11, 17-19];

d) Fractional snow-cover or sub-pixel classification based techniques [20, 21].

Study by Bayr et al. [22] proposed thresholds of a ratio image of TM-4 to TM-5 (NIR/SWIR) and TM-3 to TM-5 (RED/SWIR) ratio bands to delineate glacier ice area. Paul [12] evaluated both ratio image techniques and concluded that the TM-4 to TM-5 ratio technique is the more appropriate for clean-ice glacier mapping. The ratio RED/SWIR performs better in areas with dark shadow and thin debris cover [23, 24]. A number of inventories used simple and robust ratio methods [12, 24, 25]. Research by Hall et al. [26] proposed the Normalized Difference Snow Index (NDSI, $[VIS - SWIR] / [VIS + SWIR]$) technique for identification of snow. Racoviteanu et al. [27] successfully used the NDSI for glacier mapping of Cordillera Blanca, Sidjak and Wheate [18] obtained best results using a combination of principal components two, three and four of the masked glacier area, the ratio TM-4/TM-5, and the NDSI. However, many valley glaciers throughout the world are covered with varying amounts of supraglacial debris cover, which having a similar spectral response as that of the adjacent terrain cannot be clearly differentiated. Thus, delineation of debris-covered glaciers poses a major problem for rapid, automated inventorying of glaciers from satellite data.

Mapping of debris-covered glaciers

The general spectral similarity between supraglacial debris and adjacent unglaciated terrain (periglacial debris and valley rock) renders them indistinguishable from remote sensing data, which makes delineation of the actual glacier boundary difficult [28].

In previous studies, a variety of techniques have been reported for mapping of debris-covered glaciers. Stokes et al. [29] carried out manual digitization of debris cover on Landsat TM and ETM+ images over the Caucasus Mountains, Russia and reported that retreat of glaciers was accompanied by an increase in the overall areal extent of the debris cover. Bishop et al. [4] applied artificial neural network (ANN) classifier for estimation of debris cover over Himalayan glaciers. However, these studies concluded that sufficiently lower temperatures apt for delineation of debris-covered glacier ice from surrounding terrain were found only when thickness of debris cover did not exceed 40–50 cm. Kieffer et al. [30] analysed the DEM and observed that a distinct change in curvature occurs at the contact of the glacier ice with the lateral moraine. Bolch and Kamp [31] applied morphometry-based glacier mapping (MGM) for some debris-covered glaciers in Alps, using clustering of curvature features (i.e., plan curvature and profile curvature). However, the DEM-based methods require intense user interaction by specialists, encounter severe limitation in areas where the transitions between glaciated and unglaciated regions are smooth and not represented in the DEM and the availability of accurate DEMs over mountain regions is scarce.

Comparison of methods

According to comparative analysis of several glacier identification techniques by Paul et al. [32], the most efficient and accurate results for identification of glaciers were got with thresholding of ratio images (TM4/TM5), particularly for the glaciers located in shadow. The accuracy is better than 3% for debris-free glacier areas. Compared to other investigated methods, this method is easy and fast to perform, needs no special image-processing software, and interactive selection of the threshold value is quite robust. According to Paul et al. [32], the use of a median filter improves the results of the classification by removing misclassification (small snowfields, shadow pixels) and adding pixels where needed (small debris cover, glacier parts in shadow).

Paul et al. [33] concluded that automated delineation of debris-free glacier is better than hand delineation and recommended to use manual method only for required corrections of wrong identified glaciers (lakes, debris, shadows). According to published results [33], automated mapping of clean glacier ice is at least as accurate as manual digitization, but glacier sizes tend to be a few per cent smaller than the referenced datasets. Automated mapping has the clear advantages of being much faster, not generalized and generating reproducible results, i.e. the same threshold values always generate the same outlines. Manual digitization should thus focus on the correction of automatically derived outlines to cope with the typically problematic issues such as debris cover or ice in shadow.

Our experience

In our previous study [34] we have used a well-established semi-automated method utilizing the TM3/TM5 bands to glacier area delineation. We visually examined delineated glaciers for gross errors, and edited them by hand where needed. Glaciers with debris-cover, glacial lakes, snow patches and the data gaps only in SLC-off scenes results main reasons of errors. Additionally, the ETM+ pan-sharpened images were also used to mapping the most likely margin. Moreover, a 3 by 3 median filter was applied which only marginally alters the glacier size but eliminates isolated pixels. These are often wrong pixels because of debris or boulders on the ice cover. Supraglacial debris cover is a cause resulting to the bigger error of the glacier outline. However, in our study area, the glaciers were almost free of debris cover. We have used the glacier area from the

1989 image as a mask to minimize misclassification due to certain factors, such as seasonal snow cover. When using this mask, we assumed that glaciers did not advance between 1989 and 2012. This consistency is important in the case of seasonal snow that hampers correct identification of the upper glacier boundary [35]. Only the glaciers that were bigger than 0.01 km² were delineated in our study, small ice bodies are quite difficult for identification if they are snow or ice. Where an ice body had divided into the parts, the net area change in a research time was based on the total area of the parts.

In our study, the error was calculated by the buffering technique advised by Bolch et al. [35] and Granshaw & Fountain [36]. The buffer size was chosen to be half of the estimated RMSE, i.e. 7.5 m to each side. The resulting accuracy was within $\pm 5\%$.

Summary

This review provides a comprehensive overview of the constraints and challenges relating to mapping of clean-ice and debris-covered glaciers, the comparison of methods based on remote sensing techniques. According to results of comparison, the most efficient and accurate results for identification of glaciers were got with thresholding of ratio images. This semi-automated method was successfully used in our previous investigation with the accuracy within $\pm 5\%$.

Semi-automated mapping of clean glacier ice is faster, not generalized and generating reproducible results, i.e. the same threshold values always generate the same outlines. This method can be the best method for glacier mapping comparatively large area.

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