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**RESEARCH ARTICLE** 

# BC-store: A program for MGISEQ barcode sets analysis

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# Abstract

Here we present the devised BC-store—a program for analyzing and selecting sets of barcodes for sequencing on platforms manufactured by MGI Tech (China). The app is available as an open source in Python3 and as a desktop version. The application allows analyzing the compatibility of barcodes on a single lane of a flow cell in a set in the case of equal and arbitrary fractions. In addition, with the help of this tool barcodes can be added to an existing set with custom share options. In this paper we describe how BC-store works for different tasks and consider the effectiveness of using BC-store in sequence lab routine tasks.

# Author summary

The performance of modern NGS machines allows considerable amount of data to be obtained which exceed the data required for one specific sample. To pool multiple samples on a single lane of the flow cell, barcoding is used-adapters carrying a unique nucleotide sequence are introduced by ligation [1]. Adapters are sequenced from their specific primers. Their sequences are used for demultiplexing the sequencing results for individual fastq files by programs like zebracall [2] or bcl2fastq [3]. The task of selecting the adapters for a set is similar to sequencing low diversity libraries [4]: if all adapters on the lane have the same nucleotide during this sequencing cycle, the quality of its reading drops dramatically. Therefore, manufacturers recommend grouping the adapters by sets. However, the sets offered by MGI Tech [5] are far from routine practice, as they do not allow for nonequimolar sample pooling by default, and they have other disadvantages (more on them later in the text). To overcome these problems, we created the BC-store program, which allows analyzing the sets of MGI Tech barcodes entered by the user to be further used in sequencing. This tool also provides the opportunity to vary the number of simultaneously sequenced samples, to use reagents more efficiently, and, as a result, to correctly distribute reads across samples, which helps to increase both the quality of sequencing and the level of data interpretation.

# Introduction

The barcode for MGISEQ-2000/DNBseq-G400 is a sequence of 10 nucleotides. Several barcodes can correspond to a single sample, but each barcode is associated with only one sample. MGI Tech offers 96 variants of barcodes and a scheme for their optimal combination (Fig 1).

This scheme of set combinations has a number of limitations: it is not possible to merge barcodes in different proportions; a certain number of samples are supposed to be used, which limits the opportunities of research. Thus, it can lead to uneven and inefficient use of barcodes. According to our subjective perception, MGISEQ-2000 is more sensitive to the correct balance of barcodes in a set than the Illumina HiSeq 2500 that we use as well.

To solve these problems and create alternative set variants we have designed the BC-store program. This tool combines the ability to analyze the alternative sets of barcodes with equal and custom ratios. The algorithm is based on analyzing the sensitivity of the MGI device to the concentration of nucleotides in the cycle phase at each of the positions in the barcode sequence. The method was used and tested in our previous MGISEQ-2000 runs. BC-store is an open-source software with source code freely available licensed under GPLv3. The BC-store is available on our lab's website and GitHub [6,7]. In this paper, we describe the development of the BC-store tool and its application in two real-world scenarios and in two user options from the command line and in the desktop version.

			set3	set4	set5	set6	set7	set8	set9	set10		set11	
		1	2	3	4	5	6	7	8	9	10	11	12
et1	A	01	41	57	65	73	81	89	97	121	25	33	49
	в	02	42	58	66	74	82	90	. 98	122	26	34	50
Ň	с	03	43	59	67	75	83	91	99	123	117	35	(51)
	D	04	44	60	68	76	84	92	100	124	28	36	52
set2	E	13	(45)	61	69	77	85	93	101	125	29	37	(53)
	F	14	46	62	70	78	86	94	102	126	30	38	116
	G	(15)	47	63	71	. 79	87	95	103	127	114	39	55
	н	16	48	64	72	80	88	96	104	128	32	115	56

Fig 1. 11 main compatible sets of barcodes according to the manual for MGISEQ-2000 [5]. Sets are highlighted with colored rectangles and signed around the perimeter.

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#### Design and implementation

BC-store command-line version was developed in Python3 in order to be platform-independent; therefore, it can run under Linux, Mac, and Windows.

BC-store desktop version was developed in Python3 using QT-designer for desktop visualisation [https://doc.qt.io/qt-5/qtdesigner-manual.html] and works under Windows 10, which is installed by default on MGI Tech sequencers.

Users can collect sets of barcodes themselves, specify proportions and obtain results for matching barcodes, as well as add new barcodes in their own proportions. This format is particularly useful for workflows that require a lot of user interaction, such as selecting sets for sequencing.

#### Formulation and verification of criteria

During sequencing in MGISEQ-2000, a complementary nucleotide is cyclically added to all nanoballs (DNB) on the flow cell, which means that each position on the barcode in all DNBs is read simultaneously. The nucleotide is determined by analyzing the measurements of the signal intensity from four fluorophores specific to each of the nucleotide types [8] in a specific sequencing cycle for a specific DNB. MGISEQ-2000 has limitations on the level of intensity perception (will be shown below on the example of launches). We defined two criteria–strong and lite; the first criterion (strong) was obtained based on the analysis of sets offered by MGI Tech. The second one (lite) was formulated by analyzing 20 runs of the MGISEQ-2000 sequencer in our laboratory. We found out that the MGI sensitivity is higher than the default set, so both the range by the number of barcodes and the intensity at each position can be increased.

To evaluate the success of sequencing each position, we used SNR values (signal-to-noise: shows the noise level for each of the four nucleotide types, calculated as the ratio of this nucleotide's intensity to the intensities of the other three letters) (Fig 2) and FIT (essentially the same metric as SNR, but averaged over all 4 nucleotides and indicates the distribution of differences between signal and noise for each base), which are contained in html reports of the form



**Fig 2. Example of a single lane SNR for a PE150 run on MGISEQ-2000.** Sequencing cycles corresponding to the sequence number of the nucleotide in the reads are shown horizontally: 1:150 –forward read, 151:300 –reverse read, 301:310 –barcode sequence, SNR indicator is shown vertically. The indicator for each of the nucleotide types is marked by its own color (the colors are shown in the figure).



**Fig 3.** Example of a single lane FIT graph for a PE150 run on an MGISEQ-2000 with a non-optimal (A) and optimal (B) set of barcodes. Sequencing cycles corresponding to the sequence number of the nucleotide in the reads are shown horizontally: 1:150 –forward read, 151:300 –reverse read, 301:310 –bar code sequence, vertically–FIT (blue) and BIC (red) indicators which mean the probabilities or reliability of the base call results. A drop in the FIT graph at the positions of nucleotides, where the barcodes of different samples cannot be identified correctly.

"v300041900\_run21\_L02.summaryReport.html" for each lane and are generated by the device at the end of sequencing. Drops in FIT negatively affect the data quality, while a high level of FIT throughout the entire barcode reading indicates a better data quality. The FIT value is higher when the distribution of differences between signal to noise for each channel/color are more concentrated. Basecalling is unreliable when FIT < 10. In the pictures, we see a drop in the FIT graph at the positions of nucleotides, where the barcodes of different samples cannot be identified correctly (Fig 3). Next, it will be shown that drops in the FIT indicator occur at sites where the sets of barcodes are unbalanced. One more parameter BIC means "Basecall information content". We did not use BIC parameter in our investigation.

Notably, the cycle number increases with an increase in the error level (Fig 4). Since MGI-SEQ-2000 barcodes are always the last to be sequenced, it is important to minimize reading errors by balancing the set.



Fig 4. Error rate for a single-lane SNR for a PE150 run on MGISEQ-2000. The error rate increases with the increase in the cycle number.

Α				В			
#Sequence	Barcode	Count Perc	entage(%)	#Sequence	Barcode	Count	Percentage(%)
CGCGGAGCAT	barcode82	115315813	23.151067				
AGCTCTGGAC	barcode42	51911513	10.421874	ANAAACCNGA	undecoded	4	0.000001
AGCACCTCTC	barcode84	47483957	9.532988	ANAAACGACA	undecoded	4	0.000001
TTACAGTGCA	barcode85	41412227	8.314014	ANAAACTACT	undecoded	4	0.000001
CTATCACGTG	barcode43	37352641	7.499002	ANAAACTNGG	undecoded	4	0.000001
GCGTGAGTAT	barcode81	35885137	7.204382	ANAAAGAAAG	undecoded	4	0.000001
TAACAGTGCA	barcode85	24451569	4.908953	ANAAAGAGTG	undecoded	4	0.000001
GCGTGAGAAT	barcode81	20542450	4.124149	ANAAAGCACC	undecoded	4	0.000001
ATGCATCTAA	barcode41	18769544	3.768217	ANAAAGCAGC	undecoded	4	0.000001
CAATCACGTG	barcode43	16962114	3.405353	ANAAAGTACN	undecoded	4	0 000001
GCTATGATGG	barcode87	15504848	3.112789	ANAAAGTACK	undecoded	4	0.000001
AAGCATCTAA	barcode41	13706518	2.751752	ANAAAGTOOO	undecoded	4	0.000001
GCTATGAAGG	barcode87	8492237	1.704921	ANAAAGTGTA	undecoded	4	0.000001
AAGCATCAAA	barcode41	3599825	0.722709	ANAAAGTGTG	undecoded	4	0.000001
AACACCTCTC	barcode84	3290758	0.660660	ANAAANTACA	undecoded	4	0.000001
AACTCTGGAC	barcode42	3041404	0.610599	ANAAATAGAA	undecoded	4	0.000001
CGCGGAGAAT	barcode82	2461137	0.494104	ANAAATCNTA	undecoded	4	0.000001
AGCTCTGAAC	barcode42	1986785	0.398872	ANAAATTCCA	undecoded	4	0.000001
CACGGAGCAT	barcode82	1230163	0.246970	ANAACAAGGG	undecoded	4	0.000001

**Fig 5. Example from the file SequenceStat.txt.** A: barcode 82 was read in 23 percent of cases without error and in some cases with the recovery of the misread one nucleotide. B: read sequences of barcodes with more than two errors compared to the table of 96 sequences are assigned the status "undecoded".

We analyzed the output file SequenceStat.txt from the sequencer and concluded that MGI-SEQ-2000 can restore the original barcode sequence even if the individual letters are not read or read with an error (Fig 5A).

The algorithm uses the principle of comparing the found sequence of barcodes in a particular read with a table of 96 barcodes and searching for the closest one containing no more than 2 misread nucleotides. If the barcode is not found in the table, the read is assigned the "undecoded" class (Fig 5B). FIT values below 10 indicate that the nucleotide was not recognized.

Based on the above, the cases with the presence of letters with a FIT below 10 can clearly lead to an increase in the share of undecoded nucleotides due to the inability to unambiguously restore the original sequence of the barcode.

FIT occurs when the sensitivity of the detector, which uses the signal intensity and the overlap of the glowing from neighboring DNBS to determine which nucleotide is at a given position, is limited. For example, if the diversity of each nucleotide type in neighboring DNBS is high, detection is successful (Fig 6A). If one of the nucleotide types is overrepresented and the other one is underrepresented (Fig 6B), then the values of the SNR graph shift and, as a result, FIT drops in the corresponding positions of the barcode.



**Fig 6. Schematic representation of the DNB on the flow cell.** An ordered structure of DNB, each one is shown as a circle. The letter denotes the outer nucleotide on the nanoball to be identified in the current cycle. A-the level of radiation from each nucleotide type is approximately the same, the identification of nucleotides is successful, B-there is an overrepresentation of one of the nucleotide types and an underrepresentation of others, which leads to illumination and identification errors.



**Fig 7. Example of the NUCLEOTIDES FRACTION script.** A-for sets 1–10, the proportions of each nucleotide at each bar code position are equal to 0.25. B-for set 11, the proportions of each nucleotide vary within certain limits. Bold horizontal lines—lite criterion, thin lines—strong criterion.

To test the hypothesis, we analyzed all sets offered by the manufacturer MGISEQ-2000 (Fig 1) for balance per each letter.

We wrote a script in Python3, that consists of two parts–computation and visualization. For sets 1–10, the fractions of each nucleotide at each bar code position were found to be equal to 0.25, and for set 11, they varied in a certain corridor (Fig 7). From the results obtained, conclusions were drawn about the limits of a strict criterion for selecting sets based on the NUCLEOTIDES FRACTION indicator.

An additional option was also introduced–mixing barcodes in different proportions. This option is relevant to the analysis of several samples from different sources, when it is difficult to observe equal concentrations of barcodes. For example, when one lane is loaded with samples for WGS x30 with significant differences in genome size. Problems with lowering FIT can be avoided if the concentration is taken into account when forming sets. The fact that the rate is worth considering can be clearly illustrated by changing the concentrations in set 1 from equal to unequal (Fig 8).

Based on the analysis of 20 MGISEQ-2000 runs in our laboratory, the criterion was extended to the lite version, since in our runs the samples were often mixed in different proportions. For example, in the PE150 Z10 run, pooling samples with barcodes 87, 88, 89, 90, 91, 92, 93, 94, 95, 96 in proportion 9:9:9:9:5:5:5:5:5 did not lead to a drop in FIT (Fig 9A). Only one position was within the strong criterion, 6 ones were on the border, and 3 ones were outside the criterion. In this case, the number of positions that fall outside the strong criterion (3) exceeded the algorithmically acceptable value (2). Therefore, the criterion can be extended to the following values (Fig 9B). An illustration that going beyond the lite limit leads to a drop in FIT is given for the Z2 and Z3 runs in Fig 10.

We also analyzed the number of nucleotides making the barcodes different. A script was written to compare the sequences of barcodes in pairs (S1 Text). The minimum difference is 4 nucleotides, while the largest one is 10. Obviously, in order to avoid "merging" of barcodes in a set, the number of mistakenly read nucleotides during sequencing should not be equal to or exceed the smallest number of differences between barcodes from the set among all those obtained during pairwise comparison. In general, the number of errors during their sequencing should not be equal to or exceed 4.



**Fig 8. Changing the ratio in a set of barcodes.** In the example of set 1, concentrations of 1:1:1:1 (A) changed to 1:4:1:4 (B) lead to an unbalance of the set from the initially perfectly balanced state.

To check the decrease in the share of undecoded data generated by ZebraCall in the case of more than 2 unrecognized nucleotides in the barcode reading, we used the data recovery script (https://github.com/gateswell/SplitBarcode). In one of our runs in PE150 mode on a single lane, we received 2.4 GB and 2.5 GB for forward and reverse reads of undecoded files, respectively, comprising no more than 2% of the total data from this lane–this is the usual proportion for a well-passed run on MGISEQ-2000. We varied the parameters of the number of mismatches (2, 3, and 4) from the list of barcodes with which the sequenced barcodes are compared (17 pieces used in the launch or all 128 barcodes), and determined how much the



**Fig 9.** A–graph of the FIT and BIC distribution from the MGISEQ report for run Z10 and its NUCLEOTIDES FRACTION (B). For A: Sequencing cycles corresponding to the sequence number of the nucleotide in the reads are shown horizontally: 1:150 –forward read, 151:300 –reverse read, 301:310 –bar code sequence, vertically–FIT (blue) and BIC (red) indicators which mean the probabilities or reliability of the base call results. No drop in the FIT graph at the positions of nucleotides means that all nucleotides of barcodes can be determined by the sequencer.



Fig 10. Examples of a direct relationship between FIT and lite criteria based on runs Z2 (A1, B1) Z3 (A2, B2): On the left, the graph from the MGI report, a drop in letters by FIT means that the nucleotide at this position was not recognized. On the right there is an example of how the script works, the drop outside the criteria is highlighted with circles. The FIT drop and the criterion drop are in the same positions in the bar code.

undecoded percentage decreases after applying the script (Table 1). The size of the undecoded file for forward and reverse reads was found to be equal to those obtained through the algorithm if we took the mismatch value equal to 2. In the case of a mismatch equal to 3 and 4, the undecoded number was significantly reduced. Reducing the list of barcodes that the sequenced barcodes were compared did not significantly reduce the size of the undecoded fraction.

We also analyzed the Zebracall application installed on MGISEQ-2000. It converts.cal files to fastq ones. There are several launch options in the app folder: the first one starts automatically when sequencing is complete. The second one (C\:ZebraCallV2\client.exe) allows the user to run Zebracall independently with the required parameters. By default, the number of mismatches is also set to 2. Increasing the possible number of mismatches significantly reduces the value of undecoded nucleotides. However, we do not recommend using a value exceeding

Table 1.	The impact of the number	of allowed mismatches in the ba	ar code on the proportion of saved o	lata from undecoded.
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Barcodes in list	mismatches	undecoded R1, byte	undecoded R2, byte	% rescued data
17	2	2502659710	2652072230	-0,47%
17	3	2374062925	2515798025	-5,59%
17	4	1746296040	1850552520	-30,55%
All 128	2	2514592410	2664717330	0%



Fig 11. Example of BC-store operation from the command line in case of equal (A) and unequal (B) proportions of barcodes mixed in a set.

2, since in addition to the unbalanced set, there are other reasons that cause non-reading of letters during sequencing. The latter can lead to "connecting" samples with similar barcodes, for example, MGI Tech has barcodes that differ only by 4 letters out of 10.

Thus, we have demonstrated that the most important criterion determining the quality of sequencing data is the balance of barcodes in the set. It is also possible to have an unbalance for no more than two positions. We will further describe how BC-store works and how results are interpreted. Since we cannot guarantee that in addition to several mismatches, there will be no additional reasons for non-reading of nucleotides at launch, we do not allow exceeding the criteria for any bar code position by default. This approach yields good results in practical work, yet users can act at their own discretion. In any case, BC-store will be a useful application for selecting barcodes.

## **Results**

BC-store and readme-file is available in two versions: desktop for Windows and command line for operating systems with pre-installed Python3, available for download at [6,7]. Screenshots with examples of the program are presented on Figs 11-13.

#### Recommendations for MGI base sets (Fig 2)

Each of sets 1–10 is perfectly balanced when used in equal proportions, so it can be added to any ready-made set, equal proportions and a full set of barcodes should be observed. Furthermore, these sets can be combined with each other at any ratio, equal proportions within each set should be maintained.



**Fig 12. Layout of the desktop version with numbering of input fields and buttons.** 1 –enter the current set, 2 –enter set proportions, 3 –set analysis button, 4 –output field, 5 –input proportions of the current set with the new barcodes, 6 –enter the number of new barcodes, 7 –select criteria, 8 –tip for base sets, 9 –input the barcode to choose from, 10 – start analysis of set selection.



**Fig 13.** A-an example of how BC-store works in case of equal proportions of barcodes in a set. In the case of equal proportions, the field for entering shares should be left free. B-an example of how BC-store works if the other barcodes are added to the set.

Run	Set of barcodes	Rate	Number of drops	%	Graphs in
			in FIT	undecoded	Fig 14
Z5	35, 52, 73, 87, 88	equal	9	22	А
Z6	44, 81, 100	90, 12, 12	10	63	В
Z7	44, 45, 59, 60, 61, 62, 65, 66, 67, 68, 69, 70, 71, 72, 73, 74, 83	equal	0	0	С
Z8	41, 42, 43, 44, 46, 47, 48, 61, 62, 63, 64, 65, 66, 67, 68, 69, 70, 72, 73, 74, 75, 76, 77, 78, 79, 80, 81, 82, 85, 86, 87, 88, 89, 90, 91, 99	equal	0	1.7	D
Z9	28, 29, 30, 32, 34, 37, 55, 57, 58, 59, 60, 61, 62, 63, 64, 65, 66, 67, 68, 69, 70, 71, 72, 73, 74, 75, 76, 77, 78, 79, 80, 81, 82, 83, 84, 85, 86, 87, 88, 117	equal	0	2	E
Z10	87, 88, 89, 90, 91, 92, 93, 94, 95, 96	90, 90, 90, 90, 50, 50, 50, 50, 50, 50	0	1.75	F

Table 2.	Characteristics of PE150 mode runs on MGISEQ-2000 with	good and bad q	uality	7.

# Discussion

To demonstrate the effective operation of the BC-store on MGISEQ-2000 here we discuss the results for several launches. In particular, we used the non-standard combinations of barcodes that can be considered successful and unsuccessful, as well as the values of the undecoded data proportion, the number of dropped nucleotides in the FIT barcodes. Characteristics of runs and BC-store results for some of our PE150 runs on MGISEQ-2000 are shown in Table 2 and Fig 14. Thus, BC-store is firmly established in the routine practice of our laboratory and allows us to successfully combine samples in a variety of situations. The quantity for analysis and comparison can be the amount of undecoded data. Undecoded data means the procent of data with barcode that cannot be accurately identified. Such bad data cannot be used in further research.



**Fig 14.** FIT graphs and BC-store results for analyzing barcode sets for unsuccessful (A, B) and successful (C-F) launches in our laboratory in PE150 mode on MGISEQ-2000. The quantity for analysis and comparison can be the amount of undecoded data. Undecoded data means the procent of data with barcode that cannot be accurately identified. Such bad data cannot be used in furthesr research.

## Supporting information

**S1 Fig. Pairwise comparison of 63 barcodes.** The number and color indicate the number of different nucleotides in the barcodes. The greater the difference, the more likely it is that samples with these barcodes will not merge during sequencing. (TIF)

**S2 Fig. Pairwise comparison of all barcodes.** The number and color indicate the number of different nucleotides in the barcodes. (TIF)

**S1 Text. README-file.** Instruction for user. (DOCX)

### **Author Contributions**

Conceptualization: Dmitriy Korostin.

Data curation: Irina Bulusheva.

Formal analysis: Irina Bulusheva.

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Methodology: Dmitriy Korostin.

Project administration: Dmitriy Korostin.

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Visualization: Irina Bulusheva, Dmitriy Korostin.

Writing – original draft: Irina Bulusheva.

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