

Detection of ultra-rare mutations by next-generation sequencing

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Next-generation DNA sequencing promises to revolutionize clinical medicine and basic research. However, while this technology has the capacity to generate hundreds of billions of nucleotides of DNA sequence in a single experiment, the error rate of ~1% results in hundreds of millions of sequencing mistakes. These scattered errors can be tolerated in some applications but become extremely problematic when “deep sequencing” genetically heterogeneous mixtures, such as tumors or mixed microbial populations. To overcome limitations in sequencing accuracy, we have developed a method termed Duplex Sequencing. This approach greatly reduces errors by independently tagging and sequencing each of the two strands of a DNA duplex. As the two strands are complementary, true mutations are found at the same position in both strands. In contrast, PCR or sequencing errors result in mutations in only one strand and can thus be discounted as technical error. We determine that Duplex Sequencing has a theoretical background error rate of less than one artifactual mutation per billion nucleotides sequenced. In addition, we establish that detection of mutations present in only one of the two strands of duplex DNA can be used to identify sites of DNA damage. We apply the method to directly assess the frequency and pattern of random mutations in mitochondrial DNA from human cells.

cancer | diagnostics | subclone | quasispecies | biomarker

The advent of massively parallel DNA sequencing has ushered in a new era of genomic exploration by making simultaneous genotyping of hundreds of billions of base pairs possible at a small fraction of the time and cost of traditional Sanger methods (1). Unlike conventional techniques, which simply report the average genotype of an aggregate collection of molecules, next-generation sequencing technologies digitally tabulate the sequence of many individual DNA fragments, thus offering the unique ability to detect minor variants within heterogeneous mixtures. This concept of “deep sequencing” has been implemented in a variety of fields including metagenomics (2), paleogenomics (3), forensics (4), and human genetics (5) to disentangle subpopulations in complex biological samples. Clinical applications are rapidly being developed, such as prenatal screening for fetal aneuploidy (6), early detection of cancer (7), and monitoring its response to therapy (8) with nucleic acid-based serum biomarkers.

Although, in theory, DNA subpopulations of any size should be detectable when deep sequencing a sufficient number of molecules, a practical limit of detection is imposed by errors introduced during sample preparation and sequencing (9). PCR amplification of heterogeneous mixtures can result in population skewing due to differential amplification (10, 11), and polymerase mistakes generate point mutations resulting from base misincorporations and rearrangements due to template switching (10, 12). Combined with the additional errors that arise during cluster amplification, cycle sequencing, and image analysis, ~1% of bases are incorrectly identified, depending on the specific platform and sequence context (1). This background level of artifactual heterogeneity establishes a limit below which the presence of true rare variants is obscured (9).

A variety of improvements at the level of biochemistry (13, 14) and data processing (14–19) have been developed to improve sequencing accuracy. In addition, techniques whereby PCR duplicates arising from individual DNA fragments can be resolved on

the basis of unique random shear points (20) or via exogenous tagging (21, 22) before amplification (23–28) have recently been reported. Because all amplicons derived from a particular starting molecule can be explicitly identified, any variation in the sequence or copy number of identically tagged sequencing reads can be discounted as technical error. This approach has been used to improve counting accuracy of DNA (25, 26, 28) and RNA templates (24, 25, 27, 29) and to correct base errors arising during PCR or sequencing (20, 23, 24, 26). For example, Kinde et al. (23) reported a reduction in error frequency of ~20-fold with a tagging method that is based on labeling single-stranded DNA fragments with a primer containing a 14-bp degenerate sequence. This approach allowed for an observed mutation frequency of ~0.001% mutations/bp in normal human genomic DNA. Nevertheless, a number of highly sensitive genetic assays have indicated that the true mutation frequency in normal cells is likely to be far lower, with estimates of per-nucleotide mutation frequencies generally ranging from 10^{-8} to 10^{-11} (30, 31). Thus, the majority of mutations seen in normal human genomic DNA by this method potentially still represent technical artifacts.

Prevailing next-generation sequencing platforms generate sequence data from single-stranded fragments of DNA. As a consequence, artifactual mutations introduced during the initial round of PCR amplification are undetectable as errors—even with tagging techniques—if the base change is propagated to all subsequent PCR duplicates. Multiple types of DNA damage are highly mutagenic and may lead to this scenario. Spontaneous DNA damage arising from normal metabolic processes results in thousands of damaging events per cell per day (32), and additional DNA damage is generated *ex vivo* during tissue processing and DNA extraction (33).

Limitations inherent to sequencing of single-stranded DNA can be overcome, however, as DNA naturally exists as a double-stranded entity, with one molecule reciprocally encoding the sequence information of its partner. Thus, it should be feasible to identify and correct nearly all forms of sequencing errors by comparing the sequence of individual tagged amplicons derived from one half of a double-stranded complex with those of the other half of the same molecule. Herein, we present an approach for tag-based error correction, termed Duplex Sequencing, which capitalizes on the redundant information stored in complexed double-stranded DNA. Our method has a theoretical background error rate of less than one artifactual error per 10^9 nucleotides sequenced and thus allows rare variants in heterogeneous populations to be detected with unprecedented sensitivity.

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DNA, which is a substrate that has been used extensively in sensitive genetic mutation assays and has a well-established base substitution frequency of 3.0×10^{-6} (34). M13mp2 DNA was sheared and ligated to Duplex Sequencing adapters and subjected to deep sequencing on an Illumina HiSeq 2000 (Fig. 2A). Analysis of the data by standard methods (i.e., without consideration of the double-stranded tag sequences and with quality filtering for a Phred score of 30) resulted in an error frequency of 3.8×10^{-3} , more than 1,000-fold higher than the true mutation frequency of M13mp2 DNA. Thus, >99.9% of the apparent mutations identified by standard sequencing are erroneous.

We generated SSCSs by using the unique tag affixed to each molecule to create a consensus of all PCR products that came from an individual molecule of single-stranded DNA. This resulted in a mutation frequency of 3.4×10^{-5} , suggesting that ~99% of sequencing errors are corrected in SSCS reads. However, this mutation frequency is >10-fold higher than the reference value of 3.0×10^{-6} , indicating that ~90% of the mutations identified by SSCSs are still artifacts.

Next, we further corrected errors by using the complementary tags to compare the DNA sequence arising from the two strands of each single molecule of duplex DNA to create DCSs. This approach resulted in a mutation frequency of 2.5×10^{-6} , nearly identical to the frequency of 3.0×10^{-6} determined by well-established genetic methods (34). The number of nucleotides of DNA sequence obtained by a standard sequencing approach, and after SSCS and DCS analysis, may be found in Table S1.

DNA Damage Alters SSCS Mutation Spectrum. We next examined the spectrum of mutations identified by both SSCS and DCS analysis relative to literature reference values (34) for the M13mp2 substrate (Fig. 2B). SSCS analysis revealed a large excess of G→A/C→T and G→T/C→A mutations relative to reference ($P < 10^{-6}$, two-sample *t* test). In contrast, DCS analysis was in excellent agreement with the literature values with the exception of a decrease relative to reference of these same mutational events: G→A/C→T and G→T/C→A ($P < 0.01$). To probe the potential cause of these spectrum deviations, the SSCS data were filtered to consist of forward-mapping reads from read 1 (i.e., direct sequencing of the reference strand) and the reverse complement of reverse-mapping reads from read 1 (i.e., direct sequencing of the antireference strand.) True double-stranded mutations should result in an equal balance of complementary mutations observed on the reference and antireference strand. However, SSCS analysis revealed a large number of single-stranded G→T mutations, with a much smaller number of C→A mutations (Fig. 2C). A similar bias was seen with a large excess of C→T mutations relative to G→A mutations.

Base-specific mutagenic DNA damage is a likely explanation of these imbalances. Excess G→T mutations are consistent with the oxidative product 8-oxo-guanine (8-oxo-G) causing first round PCR errors and artifactual G→T mutations. DNA polymerases, including those commonly used in PCR, have a strong tendency to insert adenine opposite 8-oxo-G (35, 36), and misinsertion of A opposite 8-oxo-G would result in erroneous scoring of a G→T mutation. Likewise, the excess C→T mutations are consistent with spontaneous deamination of cytosine to uracil (37), a particularly common DNA damage event that results in insertion during PCR of adenine opposite uracil and erroneous scoring of a C→T mutation.

To determine whether the excess G→T mutations seen in SSCSs might reflect oxidative DNA damage at guanine nucleotides, before sequencing library preparation we incubated M13mp2 DNA with the free radical generator hydrogen peroxide in the presence of iron, a protocol that induces DNA damage (38). This treatment resulted in a substantial further increase in G→T mutations by SSCS analysis (Fig. 3A), consistent with PCR errors at sites of DNA damage as the likely mechanism of this biased mutation spectrum. In contrast, induction of oxidative damage did not alter the mutation spectrum seen with DCS analysis (Fig. 3B),

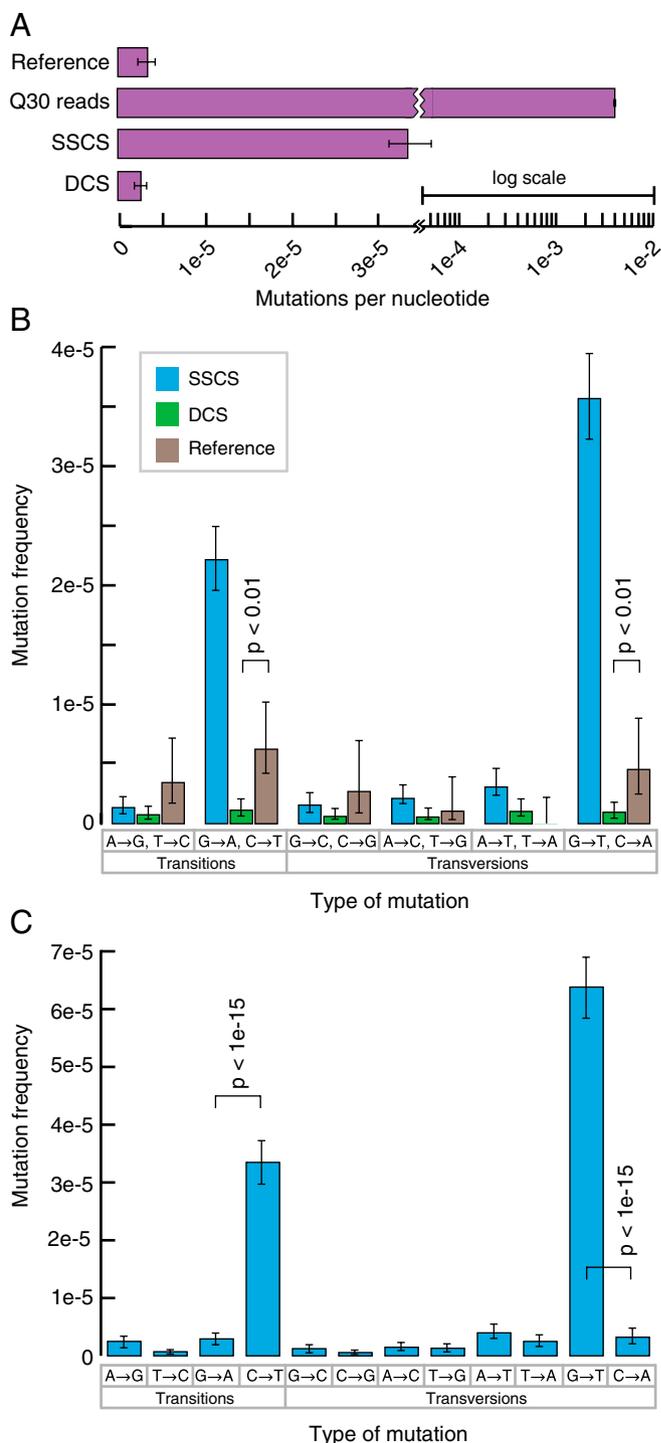


Fig. 2. Duplex Sequencing of M13mp2 DNA. (A) Average mutation frequency of M13mp2 DNA as measured by a standard sequencing approach, SSCS, and DCS. Reference value of 3.0×10^{-6} is from ref. 34. Note that the axis is plotted on a split-log scale. (B) Single-strand consensus sequences (SSCSs) reveal a large excess of G→A/C→T and G→T/C→A mutations, whereas duplex consensus sequences (DCSs) yield a balanced spectrum. Mutation frequencies are grouped into reciprocal mispairs, as DCS analysis only scores mutations present in both strands of duplex DNA. All significant ($P < 0.05$) differences between DCS analysis and the literature reference values are noted. (C) Complementary types of mutations should occur at approximately equal frequencies within a DNA fragment population derived from duplex molecules. However, SSCS analysis yields a 15-fold excess of G→T mutations relative to C→A mutations and an 11-fold excess of C→T mutations relative to G→A mutations. All significant ($P < 0.05$) differences between paired reciprocal mutation frequencies are noted.

Duplex Sequencing approach offers a powerful next-generation sequencing tool for diverse areas of medicine and biology.

Materials and Methods

Adapter Synthesis. Duplex Tag adapters were synthesized from two oligonucleotides with noncomplementary Y-shaped tails. A randomized single-stranded 12-nucleotide sequence present in one of the oligonucleotides was rendered double stranded by copying with DNA polymerase. After reaction cleanup, adapter A-tailing was performed by incubation with DNA polymerase and dATP. Further details are provided in *SI Materials and Methods*.

Sequencing Library Preparation. Double-stranded DNA was sheared and end repaired by standard protocols, followed by T-tailing with DNA polymerase and dTTP. T-tailed DNA was ligated to A-tailed Duplex Tag adapters, followed by PCR amplification for 18–20 cycles and sequencing on an Illumina HiSeq 2000. Further details are provided in *SI Materials and Methods*.

Data Processing. Reads were filtered for those containing a properly located tag sequence, and the 12-nucleotide tags present on each end of the paired reads were computationally combined to form a single 24-nucleotide tag for each read. Reads containing identical tag sequences were grouped together to form SSCS reads. Next, partner strands among SSCS reads were identified by virtue of the complementary tag sequences. The SSCS reads corresponding to both of the two strands of individual molecules of duplex DNA were then compared to form DCS reads. Resultant sequence positions were considered only when information from both DNA strands was in perfect agreement. Further details are provided in *SI Materials and Methods*.

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Supporting Information

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SI Materials and Methods

Adapter Synthesis. Duplex Tag-labeled adapters were synthesized from two oligonucleotides (PAGE purified; Integrated DNA Technologies), designated as the primer strand: AATGATACGGCGACCACCGAATCTACACTCTTCCCTACACGACGCTCTTCCGATCT and the template strand: /5phos/ACTGNNNNNNNNNNAGATCGGAAGAGCACACGTCTGAACTCCAGTCAC. The two adapter strands were annealed by combining equimolar amounts of each oligo to a final concentration of 50 μ M and heating to 95 $^{\circ}$ C for 5 min. The oligo mix was allowed to cool to room temperature over 1 h. The annealed primer-template complex was extended in a reaction consisting of 40 μ M primer template, 25 units Klenow exo- DNA polymerase (New England Biolabs), 250 μ M each dNTP, 50 mM NaCl, 10 mM Tris-HCl pH 7.9, 10 mM MgCl₂, and 1 mM DTT for 1 h at 37 $^{\circ}$ C. The product was purified by ethanol precipitation. Due to the partial A-tailing property of Klenow exo-, this protocol results in a mixture of blunt-ended adapters and adapters with a single-nucleotide A overhang. A single-nucleotide A overhang was added to residual blunt fragments by incubating the adapters with 25 units Klenow exo-, 1 mM dATP, 50 mM NaCl, 10 mM Tris-HCl pH 7.9, 10 mM MgCl₂, and 1 mM DTT for 1 h at 37 $^{\circ}$ C. The product was again ethanol precipitated and resuspended to a final concentration of 50 μ M.

Construction of M13mp2 Variants. M13mp2 gapped DNA encoding the LacZ α fragment was extended by human DNA polymerase δ (1) and the resultant products were transformed into *Escherichia coli* and subjected to blue-white color screening as previously described (2). Mutant plaques were sequenced to determine the location of the mutation resulting in the color phenotype. A series of mutants, each differing from wild type by a single nucleotide change, were then mixed together with wild-type M13mp2 DNA to result in a single final mixture with distinct mutants represented at ratios of 1/10 (G6267A), 1/100 (T6299C), 1/1,000 (G6343A), and 1/10,000 (A6293T).

Oxidative Damage of M13mp2 DNA. Induction of DNA damage was performed by minor modifications to a published protocol (3): 300 ng of M13mp2 double-stranded DNA was incubated in 10 mM sodium phosphate buffer, pH 7.0, in the presence of 10 μ M iron sulfate and 10 μ M freshly diluted hydrogen peroxide. Incubation proceeded for 30 min at 37 $^{\circ}$ C in open 1.5-mL plastic microcentrifuge tubes.

DNA Isolation. M13mp2 DNA was isolated from *E. coli* strain MC1061 by Qiagen Miniprep. To allow for greater sequencing depth at a defined region of the M13mp2 genome, an 840-bp fragment was enriched by complete digestion with the restriction enzymes Bsu36I and NaeI (New England Biolabs), followed by isolation of the fragment on an agarose gel by the RecoChip system (Takara Bio). Mitochondrial DNA was isolated as previously described (4).

Sequencing Library Preparation. A total of 3 μ g of DNA was diluted into 130 μ L of TE buffer (10 mM Tris-HCl, pH 8.0, 0.1 M EDTA) and was sheared on the Covaris AFA system with duty cycle 10%, intensity 5, cycles/burst 100, time 20 s \times 6, temperature = 4 $^{\circ}$ C. DNA was purified with two volumes of Agencourt AMPure XP beads per manufacturer protocol. After end repair with the New England Biolab DNA End Repair kit per manufacturer protocol, DNA fragments larger than the optimal range

of ~200–500 bp were removed by adding 0.7 volumes of AMPure XP beads and transferring the supernatant to a separate tube (fragments larger than 500 bp bind to the beads and are discarded). An additional 0.65 volumes of AMPure XP beads were added (this step allows fragments of ~200 bp or greater to bind to the beads). The beads were washed and DNA eluted. Standard Illumina library preparation protocols involve ligating A-tailed DNA to T-tailed adapters. However, as we used A-tailed adapters, the DNA was instead T-tailed. T-tailing was performed in a reaction containing 5 units Klenow exo-, 1 mM dTTP, 50 mM NaCl, 10 mM Tris-HCl pH 7.9, 10 mM MgCl₂, and 1 mM DTT. The reaction proceeded for 1 h at 37 $^{\circ}$ C. DNA was purified with 1.2 volumes of AMPure XP beads. The custom Duplex Sequencing adapters were ligated by combining 750 ng of T-tailed DNA with 250 pmol adapters in a reaction containing 3,000 units T4 DNA ligase (Enzymatics), 50 mM Tris-HCl pH 7.6, 10 mM MgCl₂, 5 mM DTT, and 1 mM ATP. The reaction was incubated at 25 $^{\circ}$ C for 15 min, and purified with 0.8 volumes of Ampure XP beads.

PCR Amplification and DNA Sequencing. Adapter-ligated DNA was amplified with the KAPA HiFi PCR kit (Kappa Biosciences) with PCR primers: AATGATACGGCGACCACCGAG and CAAGCAGAAGACGGCATAACGAGATXXXXXXXXGTGACTGGAGTTTCAGACGTGTGC (where XXXXXX indicates the position of a fixed multiplexing barcode sequence). Following PCR amplification, the adapters contain all flow-cell and sequencing primer binding sites required for the Illumina TruSeq system. Duplex Sequencing is founded upon the concept of generating and sequencing multiple PCR duplicates of each strand of individual molecules of double-stranded DNA, thus the amount of input DNA and the number of PCR cycles need to be titrated to generate an average of at least three PCR duplicates per tag family. Excess PCR duplication, however, will result in unnecessary loss of sequencing capacity. We obtained adequate DNA duplication and reasonable sequencing capacity by amplifying 40 attomoles of adapter-ligated DNA for 18–20 cycles. DNA sequencing was then performed on the Illumina HiSeq 2000 system according to the manufacturer's recommendations.

Data Processing. Reads with intact Duplex Tags will consist of a 12-nucleotide random sequence, followed by a 5-nucleotide fixed sequence immediately upstream of captured DNA sequence. These reads were identified by filtering out reads that lack the expected fixed sequence at positions 13–17. The 12-nucleotide tag sequences from both the forward and reverse sequencing reads were computationally added to the read header to result in a combined 24-nt tag for each read, and the 5-nucleotide fixed sequence was removed. The first 4 nucleotides following the fixed adapter sequence were also removed to eliminate errors introduced during fragment end repair and ligation. Reads were then aligned to the reference genome with the Burrows-Wheeler aligner (BWA) and nonmapping reads were discarded. The entire human genome sequence (hg19) was used as reference for the mitochondrial DNA experiment, and reads that mapped to chromosomal DNA were removed. Reads sharing identical tag sequences were then grouped together and collapsed to consensus reads. Sequencing positions were discounted if the consensus group covering that position consisted of fewer than three members or if fewer than 90% of the sequences at that position in the consensus group had the identical sequence. A minimum group size of three was selected because next-generation se-

quencing systems have an average base calling error rate of $\sim 1/100$. Requiring the same base to be identified in three distinct reads decreases the frequency of single-strand consensus sequence (SSCS) errors arising from base-call errors to $(1/100)^3 = 1 \times 10^{-6}$, which is below the frequency of spontaneous PCR errors that fundamentally limit the sensitivity of SSCSs. The requirement for 90% of sequences to agree to score a position is a highly conservative cutoff. For example, with a group size of eight, a single disagreeing read will lead to 87.5% agreement and the position will not be scored. If all groups in an experiment are of size nine or less, this cutoff will thus require perfect agreement at any given position to score the position. We anticipate that further development of our protocol may allow for less stringent parameters to be used to maximize the number of SSCS and duplex consensus sequence (DCS) reads that can be obtained from a given experiment.

Consensus reads were realigned with the BWA. The consensus sequences were then paired with their strand mate by grouping each 24-nucleotide tag of form $\alpha\beta$ in read 1 with its corresponding tag of form $\beta\alpha$ in read 2. Resultant sequence positions were considered only when information from both DNA strands was in perfect agreement. An overview of the data processing workflow is provided below.

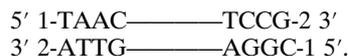
Statistical Analysis. Ninety-five percent confidence intervals were determined with the Wilson score interval method. *P* values were calculated by the two-sample test for equality of proportions with continuity correction.

Overview of Duplex Sequencing Data Processing.

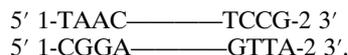
- i) Discard reads that do not have the 5 nucleotide fixed sequence CAGTA present after exactly 12 random nucleotides, which comprise the Duplex Tag sequence.
- ii) Combine the 12 nucleotide tags from read 1 and read 2 and transfer the combined 24-nucleotide tag sequence into the read header.
- iii) Discard tags with inadequate complexity (i.e., those with >10 consecutive identical nucleotides).
- iv) Remove the 5-nucleotide fixed sequence.
- v) Trim an additional 4 nucleotides from the 5' ends of each read pair (sites of error prone ligation and end repair).
- vi) Align reads to the reference genome and discard nonmapping reads.
- vii) Group together reads that have identical 24-nt tags, representing PCR duplicates of an individual single-stranded DNA fragment.
- viii) Collapse tag families to SSCS reads, scoring only positions represented by three or more PCR duplicates and having >90% sequence identity among the duplicates.
- ix) Realign reads to the reference genome.
- x) For each read in read 1 file having tag sequence of format $\alpha\beta$, group with corresponding DCS partner in read 2 file with tag sequence of format $\beta\alpha$.
- xi) Only score positions with identical sequence among both DCS partners.

Example: Duplex Sequencing Tag Pairs. Consider the 4-nucleotide tags below, with flow cell sequences 1 and 2 in the locations

marked and dashes representing a ligated DNA fragment. The Duplex Sequencing adapters actually contain 12-nucleotide Duplex Tags. Shorter tags are used here for clarity:



The same molecules are shown again here, but with the lower strand now written in the 5' \rightarrow 3' direction:

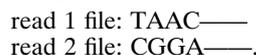


These molecules are then PCR amplified and sequenced. They will yield the following reads:

the "top" strand:



will give:



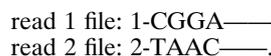
Combining the read 1 and read 2 tags will produce the tag sequence:



the "bottom" strand:



will give:

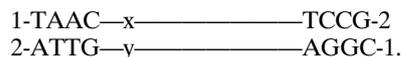


Combining the read 1 and read 2 tags will produce the tag sequence:



Note that the combined tags are of form $\alpha\beta$ (read 1) and $\beta\alpha$ (read 2). The key concept is that read 2 is read by the sequencer as the complement of the strand containing read 1.

Example: Orientation of Paired Strand Mutations in Duplex Sequencing. In the initial DNA duplex shown above, now consider a mutation "x" paired to complementary nucleotide "y" that is on the "left" side of the DNA duplex:



x will appear in read 1, and the complementary mutation on the opposite strand, y, will be seen in read 2. However, the mutation will appear specifically as x in both the read 1 and read 2 data, because y in read 2 is read out as x by the sequencer owing to the asymmetric nature of the sequencing primers, which generate the complementary sequence of the "lower" strand during read 2 as opposed to the direct sequence of the "top" strand during read 1.

If the identity of a base fails to match between the two reads, the position is considered undefined and is replaced by an "N" in the final sequence. For instance, with tag sequences denoted α and β , the sequence $\alpha\beta$ -AACTGT in read 1 and $\beta\alpha$ -AAGTGT in read 2 would result in a final sequence of AANTGT.

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