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Long range PCR-based deep sequencing for haplotype determination in mixed HCMV infections



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Abstract

Background: Short read sequencing has been used extensively to decipher the genome diversity of human cytomegalovirus (HCMV) strains, but falls short to reveal individual genomes in mixed HCMV strain populations. Novel third-generation sequencing platforms offer an extended read length and promise to resolve how distant polymorphic sites along individual genomes are linked. In the present study, we established a long amplicon PacBio sequencing workflow to identify the absolute and relative quantities of unique HCMV haplotypes spanning over multiple hypervariable sites in mixtures. Initial validation of this approach was performed with defined HCMV DNA templates derived from cell-culture enriched viruses and was further tested for its suitability on patient samples carrying mixed HCMV infections.

Results: Total substitution and indel error rate of mapped reads ranged from 0.17 to 0.43% depending on the stringency of quality trimming. Artificial HCMV DNA mixtures were correctly determined down to 1% abundance of the minor DNA source when the total HCMV DNA input was 4×10^4 copies/ml. PCR products of up to 7.7 kb and a GC content < 55% were efficiently generated when DNA was directly isolated from patient samples. In a single sample, up to three distinct haplotypes were identified showing varying relative frequencies. Alignments of distinct haplotype sequences within patient samples showed uneven distribution of sequence diversity, interspersed by long identical stretches. Moreover, diversity estimation at single polymorphic regions as assessed by short amplicon sequencing may markedly underestimate the overall diversity of mixed haplotype populations.

Conclusions: Quantitative haplotype determination by long amplicon sequencing provides a novel approach for HCMV strain characterisation in mixed infected samples which can be scaled up to cover the majority of the genome by multi-amplicon panels. This will substantially improve our understanding of intra-host HCMV strain diversity and its dynamic behaviour.

Keywords: Human cytomegalovirus, Genotypes, SMRT sequencing, Strain diversity, Mixed infections



Background

It is well-known that human cytomegalovirus (HCMV) seropositive persons can be infected with more than one HCMV strain, either synchronously or sequentially [1-6]. Solid organ transplant patients, in particular, are at high risk for harbouring complex HCMV strain mixtures when multiple donor HCMV strains are transmitted to an already HCMV seropositive recipient probably associated with a poorer clinical outcome [7-14].

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The genome sequence of an individual HCMV strain is characterised by a unique combination of linked sequence patterns of all polymorphic regions along the whole genome [15]. Individual polymorphic sites within the HCMV genome, either comprising a complete gene or a highly variable section thereof, have been widely investigated with first and second generation short read sequencing [16, 17]. These investigations uniformly show that almost all polymorphic regions cluster into defined genotypes [18, 19]. This allows assignment of even short sequence reads to reference genotype sequences by the use of genotype-defining signature sequence patterns of the respective polymorphic regions [10, 19, 20]. In recent years, widely used in-depth short read sequencing of the whole genome comprehensively assessed genome-wide intra- and inter-host diversity at the nucleotide level, and intrahost variability over time [18, 19, 21–25]. Moreover, these studies revealed that recombination between and within polymorphic regions of different HCMV strains have been common and single nucleotide variants that may emerge during replication periods will further contribute to the overall strain diversity. Accordingly, it appears that a huge variety of different HCMV strains circulate in the human population and the frequency of occurrence of completely identical "strain genotypes" among HCMV-infected persons seems to be very rare [19].

Due to short read lengths of second generation sequencing techniques, determination of individual genomes within mixtures can be challenging. It requires model-based analysis to reconstruct unique haplotypes from short sequencing reads [19, 22, 25, 26] but this might be difficult for genomic segments interspersed by longer conserved sections, low-complexity repetitions and GC-deviant regions [27].

In contrast to short read sequencing platforms, single molecule real-time (SMRT) sequencing from Pacific Biosciences (PacBio) and MinION Nanopore sequencing from Oxford Nanopore Technologies exceed with their ability to perform novel genome analyses, due to their extended read length [28, 29]. Unlike their predecessor, third generation single-molecule technologies can frequently generate read lengths up to 30 kb and have been used to fill many gaps in reference genomes, which could not be covered by short read lengths [30, 31].

Still, there is limited data on the number of unique HCMV DNA molecules within mixed HCMV populations, which in the following will be termed HCMV haplotypes. It is still unknown how specific combinations of polymorphic regions present on an individual HCMV DNA molecule affect pathogenicity or replication efficiency.

In the present study we assessed how enrichment of HCMV DNA by long range PCR and long read sequencing enables the identification of linkages between non-adjacent polymorphic regions present on single HCMV DNA molecules. The newly developed protocol was successfully applied to a selection of bronchoalveolar lavage samples (BALs) displaying mixed HCMV infections. This approach provides novel insights into the composition of individual haplotypes within a mixed HCMV strain population.

Results

Establishment of long range PCR for highly polymorphic UL regions

First, a long range PCR approach was established by targeting two genomic regions, spanning from UL55 to UL76 (30 kb), and from UL139 to UL146 (6.7 kb), respectively (Fig. 1). These two UL regions were primarily chosen based on high interstrain polymorphism and well-characterised genotype assignments of the respective polymorphic genes [19]. The 30 kb long UL region, UL55-UL76, was further divided into 7 segments, which resulted in amplicon sizes ranging from 7.7 kb to 18.0 kb. The target regions exhibit GC contents ranging from 48.5 to 58.9%. Respective primers were designed to align to highly conserved regions (Supplementary Table 1).

To find the best conditions for sensitive and specific long range amplification, three different commercially available PCR enzymes were compared (Supplementary Table 2). Amplification efficiency was tested using highly purified, low-fragmented TB40-BAC4-luc HCMV DNA isolated from *E.coli*. As shown in Table 1, the enzyme LA Taq Hot Start Version Polymerase delivered the best results in terms of efficiency, fragment length amplification and applicability (2-step PCR).

For further optimization 10-fold dilution series of human foreskin fibroblast (HFF)-derived HCMV DNA were used, as this source of HCMV DNA in the background of an excess of genomic DNA is comparable in composition and integrity to DNA derived from clinical samples. The highest sensitivity was obtained for the shortest amplicons, F3 and F4 (Table 1).

Error estimation of long amplicon sequencing

Next, long amplicons (>6.6 kb) were sequenced by PacBio and error rates introduced by PCR and sequencing were estimated and compared to Illumina sequencing. Total DNA was directly isolated from HFFs infected with HCMV strain TB40-BAC4-luc or Merlin and used either as PCR template (amplicons) or directly without any further enrichment (non-enriched) before sequencing. After demultiplexing, circular consensus sequencing reads (ccs) for each forward and reverse strand were generated

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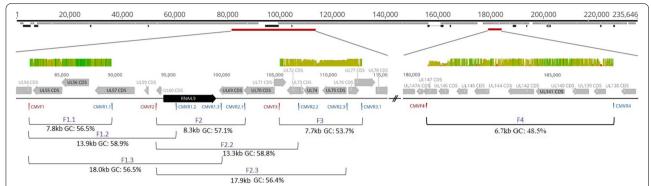


Fig. 1 Schematic representation of target sequences along an HCMV genome. Shown is an overview of polymorphic amplified regions and their genetic diversity along the HCMV genome strain Merlin (AY446894). The figure consists of four separate tracks. In the top track, a mini-map of the genome with a total bases of 235,646 is shown. Annotated CDS and non-coding RNAs are depicted in grey and black, respectively. Target regions for amplicon generation are depicted in red and are described in detail in track 2–4. For track 2, defined polymorphic regions were put through a blastn search. Over 200 published haplotypes for the described regions were aligned. The mean pairwise identity over all pairs in the column is depicted. Green: 100% identity, greenish-brown: at least 30% identity but less than 100%, red: less than 30%. Displayed above the sequences (3rd track), grey and black arrows again represent CDS and non-coding RNAs, respectively. Forward and reverse primer (red and blue) are depicted below the sequence. The bottom track indicates individual fragment sizes and GC content of eight polymorphic target regions. Annotations were generated with geneious prime 2019.0.3

Table 1 Efficiency of long range PCR for the distinct fragments by the use of three commercially available enzymes

Amplicon	Fragment length in bases	GC content in %	total BAC-DN	A as template (1	00 ng)	cell-culture derived D	NA as template
			ТаК	Pro	Qia	TaK	TaK
			efficiency	efficiency	efficiency	specificity (1 \times 10 ⁵ copies/reaction)	sensitivity (copies/ reaction)
F1.1	7807	56.5	high	low	low	low	300
F1.2	13,807	58.9	high	_	_	=	nd
F1.3	18,015	56.5	-	_	_	nd	nd
F2.1	8278	57.1	high	_	_	=	nd
F2.2	13,348	58.8	high	_	_	=	nd
F2.3	17,861	56.4	-	_	_	nd	nd
F3	7705	53.7	high	high	low	high	30
F4	6671	48.5	high	nd	nd	high	30

*two different HCMV strains (TB40E and Merlin); high and low efficiency as determined by the strength of visible bands of the correct length; high specificity as determined by the absence of unspecific bands; TaK: LA Taq Hot Start Version Polymerase; Qia: LongRange PCR Polymerase; Pro: Promega Go Taq Long; nd: not determined; "-": no visible band or smear

to prevent incorrect analysis due to heteroduplexes. Resulting ccs reads per sample showed an average length of 3583 to 6162 bases (Table 2). For comparison of PacBio with Illumina sequencing quality filtering was similarly performed for both, Illumina-derived (Supplementary Table 5) and PacBio-derived reads. Quality trimming, which was performed with a base-calling error probability (pError) of 0.01 (equals Q>20) and 0.001 (equals Q>30), respectively, resulted in a substantial reduction in read length. This reduction was even more pronounced when raw reads were trimmed to Q>30. Remarkably, up

to 19% of all reads had a length < 500 bases when quality trimmed to Q > 20, and up to 37% when quality trimmed to Q > 30. Thus, for subsequent mapping all reads \leq 500 bases were excluded after removal of human-specific DNA reads. Host read removal led to a reduction of up to 56% of reads for amplicon samples and up to 95% for non-enriched samples (Table 2). HCMV-specific mapping rates were \geq 85% for non-enriched samples and \geq 95% for amplicons. Illumina-derived reads were similarly analysed, except for length trimming of reads < 500 bases (Supplementary Table 5).

 Table 2
 Trimming, filtering, and mapping of PacBio-derived reads for error estimation

pError	perror Template HCMV DNA Input DNA	Input DNA	Reference	Number a	nd average	read length o	Number and average read length of seguencing reads					
_	_	-	Q		,	,	-					
					raw reads	after qtrim	after hu removal	% of reads <500 bases	after Itrim	% HCMV mapping	map to reference	average coverage
0.01	Merlin	amplicons	15.5	number	92,128	63,604	30,632	18.7	24,909	98.26	24,475	6885
		=		length -	4656	2820	3741	,	4547		((
	TB40-BAC4-luc	amplicons	15.5	_	73,439	46,547	42,060	19.1	34,041	99.53	33,881	9062
				length	6162	3590	3767		4601			
	Merlin	non-enriched 237		number	143,728	102,444	5166	13.9	4447	85.29	3793	45
				length	4378	2722	2956		3397			
	TB40-BAC4-luc	non-enriched	235		996'96	72,804	9122	12.6	7975	93.63	7467	73
				length	3583	2439	2417		2731			
0.001	Merlin	amplicons	15.5	number	92,128	50,031	22,247	36.4	14,154	97.76	13,837	2444
				length	4656	1631	1896		2843			
	TB40-BAC4-luc	amplicons	15.5	number	73,439	34,137	30,361	37.2	19,070	99.26	18,929	3118
				length	6162	1814	1865		2828			
	Merlin	non-enriched	237	number	143,728	83,991	4028	27.2	2931	86.49	2535	25
				length	4378	1849	1934		2566			
	TB40-BAC4-luc	non-enriched 235		number	996'96	60,539	7402	23.2	2688	94.57	5379	45
				length	3583	1727	1751		2205			

kb, kilobases; qtrim, quality trim; hu, human DNA-specific reads; Itrim, length trim

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The error rate was estimated from mapped reads either quality trimmed with pError of 0.01 or 0.001. A comparison between non-enriched and amplicon-enriched DNA allowed us to specifically determine the error rates introduced by long range PCR. Substitutions, deletions, and insertions relative to the reference sequence were counted and the percentage of mismatches out of the total number of matched bases was calculated. As shown in Table 3, PacBio sequencing displays a 5.5-fold to 9.5-fold (pError 0.01 and 0.001, respectively) higher substitution error rate for PCR-enriched compared to non-enriched DNA. Indel errors are similarly high in both sample types. Notably, more stringent quality trimming parameters have almost no effect on substitution errors, but can substantially reduce indels. Moreover, insertions are ~2.0 to 5.0-fold more frequently found than deletions. Taken together, these data show that substitutions are mainly introduced by PCR whereas deletions and insertions mainly result from sequencing. No difference was seen between the two template DNAs, TB40-BAC4-luc and Merlin, and between the distinct target regions for PCR enrichment (Supplementary Table 8).

Illumina sequencing shows a very low error rate for insertions (0.001%) and deletions (0.004%) whereas substitutions were 2.0-fold higher compared to PacBio sequencing (Table 3) which could be due to index PCR and bridge amplification steps applied during Illumina library preparation and sequencing.

Finally, a detailed analysis of substitution errors revealed that A and T substitutions are 2.0-fold more frequently found than G and C substitutions (Table 3 and Supplementary Table 9a). This was seen for both sequencing techniques, which further indicates that these substitutions are mainly introduced by PCR (Supplementary Table 9b).

Ratio estimation of artificial HCMV DNA mixtures after long range PCR

When long amplicon sequencing is intended to be used to estimate the frequency of occurrence of unique haplotypes in mixtures, the PCR enrichment step should guarantee equal amplification of each individual haplotype. For this purpose, purified Merlin and TB40-BAC4-luc HCMV DNAs, as representatives of two distinct haplotypes, were artificially mixed at defined ratios and subsequently used as template to generate long amplicons (Table 4a). For initial ratio estimation, the total amount of template DNA ranged from 4×10^6 to 1×10^7 copies per ml. Amplicons were subjected to Illumina sequencing. Quality trimmed and filtered reads were mapped against a total of 18 unique genotype reference sequences which comprise highly polymorphic regions within gN, gO, and gH (Supplementary Table 6). As seen in Table 4a, the obtained ratios displayed almost the exact same distributions as the original input. This appears to be independent of the input ratios, the polymorphic region tested and the HCMV genome (Supplementary Table 10).

To estimate the sensitivity limit of minor HCMV DNA templates in mixtures TB40-BAC4-luc to Merlin at a 99:1 ratio were further 10-fold diluted (Table 4b). We were able to detect the 1% minor HCMV DNA template down to 19 copies in a mixture with a total viral load of 4×10^4 copies per ml.

Haplotype assessment and linkage analysis in clinical samples with mixed genotype infections

Finally, we aimed to assess whether long read PacBio sequencing is suitable to determine unique haplotypes in clinical samples with mixed HCMV strain infections. Six BAL samples with a total viral load above 1×10^4 copies/ml were initially screened for mixed HCMV infections by short amplicon Illumina sequencing. DNA was

Table 3 Error rates introduct	ced by long range PCR and	l/or sequencing
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Sequencing platform	Quality trimming	Input DNA	Substitutions*	Deletions*	Insertions*	Substit	utions pe	r nucleoti	de*
						Α	C	G	Т
PacBio	pError 0.01	amplicons	0.083	0.06	0.289	0.115	0.054	0.061	0.111
		non-enriched	0.015	0.051	0.204	0.015	0.013	0.017	0.014
PacBio	pError 0.001	amplicons	0.081	0.018	0.077	0.110	0.052	0.062	0.108
		non-enriched	0.009	0.012	0.029	0.009	0.006	0.010	0.008
Illumina	pError 0.01	amplicons	0.163	0.005	0.002	0.242	0.096	0.089	0.240
		non-enriched	0.083	0.004	0.001	0.091	0.077	0.078	0.090
Illumina	pError 0.001	amplicons	0.120	0.004	0.001	0.182	0.071	0.067	0.171
		non-enriched	0.027	0.004	0.001	0.028	0.025	0.027	0.028

^{*}Error rate is the percentage of mismatches of the total number of bases mapped to the reference sequence. Error rates are means of two distinct input DNAs (Merlin and TB-BAC4-luc, and two amplicons (F1.1 + F3, respectively)

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Table 4a Ratio estimation of artificial mixtures used as template DNA for long range PCR

Artificial Mixture	HCMV-DNA	Aspired input ratio	Measured copies/ml ¹	Measured ratio ¹	Copy input for PCR	Measured ratio ²
1	Merlin	50	3.90E+06	57	3.90E+04	44
	TB40-BAC4-luc	50	2.90E+06	43	2.90E+04	56
2	Merlin	95	8.60E+06	94	8.60E+04	94
	TB40-BAC4-luc	5	4.70E+05	6	4.70E+03	6
3	Merlin	5	4.70E+05	11	4.70E+03	3
	TB40-BAC4-luc	95	3.90E+06	89	3.90E+04	97
4	Merlin	99	1.20E+07	99	1.20E+05	98
	TB40-BAC4-luc	1	1.30E+05	1	1.30E+03	2
5	Merlin	1	1.90E+05	5	1.90E+03	1
	TB40-BAC4-luc	99	3.90E+06	95	3.90E+04	99

¹⁾ confirmed by HCMV-specific qPCR against gH; 2) measured ratios are means of reads mapping to genotypic regions within gN, gO, and gH; sequencing was done in duplicates

Table 4b Ratio estimation of dilution series of artificial mixtures

Artificial Mixture	HCMV-DNA	Aspired Input ratio	Estimated copies/ml	Copy input for PCR	Measured ratio ²
1	Merlin	1	1,90E+05 ¹	1.90E+03	1.5
	TB40-BAC4-luc	99	3,90E+06 ¹	3.90E+04	98.5
1:10	Merlin	1	1.90E+04	1.90E+02	1
	TB40-BAC4-luc	99	3.90E+05	3.90E+03	99
1:100	Merlin	1	1.90E+03	1.90E+01	1.5
	TB40-BAC4-luc	99	3.90E+04	3.90E+02	98.5
1:1000	Merlin	1	1.90E+02	1.90E+00	0
	TB40-BAC4-luc	99	3.90E+03	3.90E+01	100

¹⁾ original mixture was confirmed by HCMV-specific qPCR (see Table 4a); 2) measured ratios are means of reads mapping to genotypic regions within gN, gO, and gH

directly purified from BAL samples and short amplicons targeting highly polymorphic regions within the F3 (gO, gN) and F4 region (UL146) were generated, pooled and sequenced on an Illumina MiSeq instrument (Supplementary Table 4). The amplicon sizes for gN, gO and UL146 ranged between 398bp, 369bp and 771bp, respectively (sizes are based on amplicon products of the Merlin strain). Consensus sequences upon mapping against a total of 30 genotype reference sequences were assessed and ambiguity codes included if at least 10% of the reads displayed a variant nucleotide. Samples, BAL2, BAL4, and BAL6 carry two gN, gO, and UL146 genotypes each, and sample BAL5, three distinct gN, gO, and UL146 genotype sequences (Table 5, Supplementary Table 11). These four samples were considered to be mixed HCMV strain infected and further subjected to PacBio long amplicon sequencing.

As listed in Table 5, up to 3 different haplotypes for both, F3 and F4, target sites were identified. These new haplotype sequences have been deposited in Genbank with the accession numbers MW560357-MW560373.

Ratio estimation of distinct haplotypes indicates that varying concentrations of haplotypes could be present in mixtures. Notably, BAL2 and BAL5 depict almost the exact same percentage for minor and major haplotypes (Table 5). This could indicate that these non-adjacent haplotype sequences F3 and F4 are located on the same DNA strand of a single strain.

Multiple nucleotide sequence alignments and phylogenetic tree analyses of the 8 unique F3 and the 9 unique F4 haplotype sequences, respectively, were generated (Figs. 2 and 3). Figure 3 displays the intra- and interpatient diversity of HCMV haplotypes determined by PacBio long amplicon sequencing. We observe no clustering between individual haplotypes of the same patients. Samples with the same genotypes identified by short amplicon Illumina sequencing can still be phylogenetically distant on a haplotype scale (e.g. BAL2_F4_hap1 and BAL2_F4_hap2). When both trees are compared, no consistent phylogenetic clustering pattern between the two non-neighbouring loci (F3, F4) is observed suggesting that there are no linkages between individual haplotypes of different

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Table 5 Number and ratio of individual haplotype sequences with corresponding qN, qO, and UL146 genotypes

Sample	Haplotypes de	etermined by long amp	licon PacBio sequencing			pes² assigno on Illumina s	
	Target site	Seq ID	Reference sequence Acc. No. (% identity) ¹	Frequency of occurrence (%)	gN	gO	UL146
BAL2	F3	BAL2_F3_hap1	JX512202.1 (99.9)	58.7	3b	2a	
		BAL2_F3_hap2	KP745677.1 (99.1)	35.1	3b	2a	
		BAL2_F3_hap3	KJ361966.1 (99.3)	6.2	1	1a	
	F4	BAL2_F4_hap1	KP745638.1 (99.9)	59.2			13
		BAL2_F4_hap2	KP745654.1 (98.6)	32.3			13
		BAL2_F4_hap3	KT726941.2 (98.3)	8.5			12
BAL4	F3	BAL4_F3_hap1	KR534203.1 (99.9)	100	1	1a	
					3b	2a	
	F4	BAL4_F4_hap1	KU550090.1 (99.9)	100			14
							13
BAL5	F3	BAL5_F3_hap1	KY490065.1 (99.9)	78.1	3b	2a	
		BAL5_F3_hap2	JX512208.1 (99.9)	14.1	2	2b	
		BAL5_F3_hap3	KY490066.1 (99.9)	7.8	3a	1b	
	F4	BAL5_F4_hap1	KR534198.1 (99.8)	75.1			6
		BAL5_F4_hap2	KP745691.1 (99.8)	16.8			7
		BAL5_F4_hap3	JX512208.1 (99.9)	8.1			11
BAL6	F3	BAL6_F3_hap1	KR534203.1 (99.9)	100	1	1a	
					3b	2a	
	F4	BAL6_F4_hap1	KY490086.1 (99.9)	85.6			2
		BAL6_F4_hap2	KY490085.1 (97.1)	14.4			1

¹⁾ Sequence in NCBI Nucleotide database with highest similarity to haplotype sequence; 2) according to Suarez et al., 2019, doi: https://doi.org/10.1093/infdis/jiz208; BAL, bronchoalveolar lavage; Acc.No., Accession number

regions. The overall nucleotide diversity (p-distance) for F3 sequences was 0.045 (range: 0.001 to 0.062) and for F4 was 0.07 (range: 0.034 to 0.099). Sequence comparison of the patient's haplotype population shows that two sequences can be identical over more than 200 bases and longer stretches of similarity often differ only by a few SNVs (Fig. 2). This clearly indicates that short reads are often not long enough to cover non-adjacent diversity. Of note, for all haplotype sequences similar sequences (>97%) were found in the NCBI Nucleotide (nr/nt) database (Table 5).

Comparison of both haplotyping and genotyping data revealed that the number of haplotypes and genotypes was numerically the same only for sample BAL5. In BAL4 and BAL6, a higher number of genotypes than haplotypes was detected. These results indicate that low level HCMV DNA sequences are still amplifiable by short range PCR but not by long range PCR. Remarkably, in BAL2 a higher number of haplotypes than genotypes was found. Further inspection of all sequences over the gN, gO, and UL146 region revealed that two distinct F3 haplotype sequences share the same gN3b and gO2a genotype, and two distinct F4

haplotype sequences share the same UL146-13 genotype (Table 5). These shared genotypes, however, vary by a few SNVs. In Fig. 4, the data for the two gN3b variants are displayed. Precisely, the two gN3b variants of the respective haplotypes differ by 3 SNVs (p-distance 0.008) over the genotype-defining region whereas the p-distance over the complete F3 amplicon length was 0.026. Further sequence alignments of PacBio and Illumina reads for BAL2 gN and UL146 are provided in Supplementary Figs. 1 and 2. These findings impressively demonstrate the information benefit of long amplicon over short amplicon sequencing. Additionally, BAL4_F4_hap1 was found to have a 1bp insertion in a homopolymeric region when compared with the Illumina reads (Supplementary Fig. 3). As our error estimation analysis shows, PacBio sequencing has a higher indel error rate compared to Illumina sequencing (Table 3). These calculations suggest that the insertion might have been introduced as a sequencing error. Nevertheless, as of this state, it is not possible to reliably determine which of the two homopolymeric sequences is correct. This observed discrepancy illustrates that both sequencing techniques can complement each other and improve data certainty.

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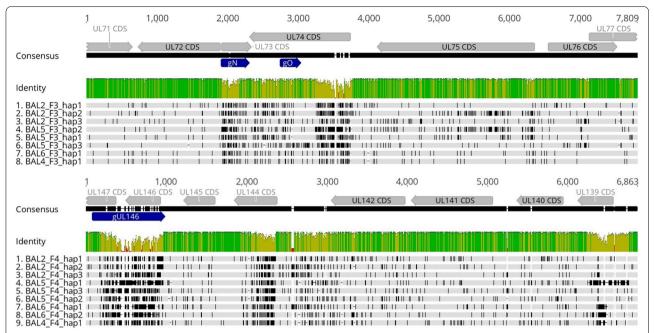


Fig. 2 Haplotype diversity of two polymorphic regions, F3 and F4 determined by PacBio sequencing. Shown are sequence alignments of the two polymorphic amplified regions F3 and F4 and their genetic diversity. Top: Haplotype alignments for region F3, Bottom: Haplotype alignments for region F4. Each figure consists of three separate tracks. Alignments of F3 cover a 7.7 kb region (from UL72 to UL76) and F4 alignments cover a 6.7 kb region (from UL146 to UL139). In the top track, annotated CDS and genotypes are depicted with grey or blue arrows, respectively; Track 2: The mean pairwise identity over all pairs in the column is depicted. Green: 100% identity, greenish-brown: at least 30% identity but less than 100%, red: less than 30%; Track 3: Lanes 1–8 or 1–9: Haplotypes sequences, hap, of all bronchoalveolar lavages, BAL, are depicted. Variants are shown in black. Annotations and alignments were generated with geneious prime 2019.0.3

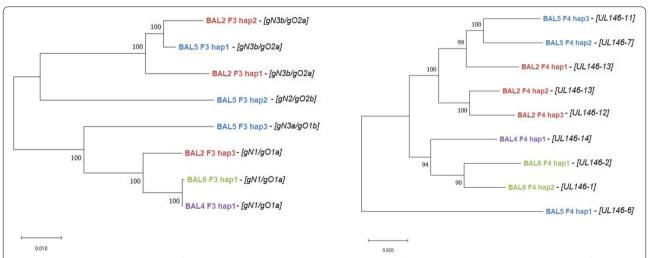


Fig. 3 Intra- and interpatient diversity of individual HCMV haplotype sequences determined by PacBio sequencing. Phylogenetic trees of 8 distinct F3 and 9 distinct F4 haplotype sequences, respectivley, were inferred by using the Maximum Likelihood method and Hasegawa-Kishino-Yano model (F3) or Kimura 2-parameter model (F4). F3 haplotype sequences cover a 7.7 kb region (from UL72 to UL76) and F4 haplotype sequences cover a 6.7 kb region (from UL146 to UL139) of the HCMV genome. Branches are labeled by the identified haplotypes of the respective sample and amplicon (e.g. BAL2_F3_hap1). Each font colour corresponds haplotypes that were identified in a single patient sample. Corresponding gN, gO and UL146 genotypes as determined by short amplicon sequencing are shown in bold italics in brackets next to the branch label. BAL, bronchoalveolar lavage; hap, haplotype

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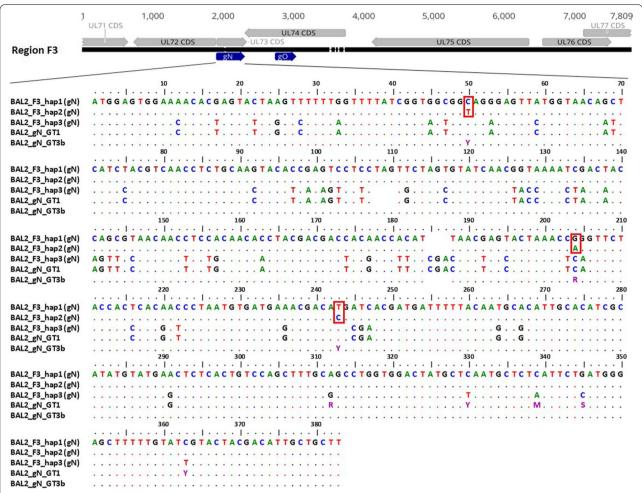


Fig. 4 Nucleotide variation between genotype and haplotype sequences of region gN. A depiction of the polymorphic region F3 (7.7 kb) can be seen on the top. While annotated CDS are depicted with grey arrows, genotypes gN (UL73) and gO (UL74), for short read sequencing, can be seen in dark blue. The respective gN region of three haplotype sequences and two gN genotype sequences were aligned. Ambiguous nucleotides are depicted in violet. Red boxes indicate the nucleotide differences between hap 1 and hap 2. Alignments were generated in BioEdit version 7.0.1; GT, genotype; BAL, bronchoalveolar lavage; hap, haplotype

Discussion

In this study, we established an amplicon-based deep sequencing approach to determine linkage of interspersed polymorphic regions along the HCMV genome. To the best of our knowledge, this is the first application to characterise and unravel distinct haplotypes within mixed HCMV strain populations by long read sequencing.

Pros and cons of long range PCR

Initially, we compared different DNA polymerases, all of which were advertised to be suitable for read lengths up to 20 kb. We tested the amplification of 8 HCMV specific target regions, with sizes from 6.7 to 18 kb and

observed substantial variations in performance even when highly purified low fragmented HCMV DNA (BAC) was used as template. Irrespective of the average GC content target regions which comprise a GC content of 72% over a 1 kb segment (fragments F2, F2.2, and F1.2) were especially difficult to amplify. Hence, for GC rich regions alternative target enrichment techniques such as solution-based capture [22, 32, 33] and molecular inversion probes [34] might be considered. The enzyme with the best performance was picked out for further optimisation of PCR conditions for the three target regions, F1, F3, and F4, (all < 8 kb) using HCMV DNA isolated from cell culture supernatant.

In addition to genome specific limitations, successful amplification of long range amplicons depends on the Brait et al. BMC Genomics (2022) 23:31 Page 10 of 16

integrity of input DNA. The extent of DNA fragmentation when directly isolated from patient samples may vary between different sample types and different storage conditions [35]. In this study, we applied our long range PCR protocol on DNA isolated from stored BAL samples. Amplicons with fragment lengths \leq 7.7 kb and a GC content \leq 54% (F3 and F4) were successfully generated from all samples whereas primer pairs for amplicon F1 (length: 7.8 kb, GC content: 56.5%) failed to amplify PCR products.

Taking these findings together it appears that fragment lengths up to 7 kb and an average GC content of less than 55% are best suited to generate long range amplicons from clinical samples.

Influence of trimming parameters on read length and error rate

Both, PCR target enrichment and sequencing are prone to false introduction of substitutions and indels [36]. Moreover, it has been reported that PacBio long read sequencing is associated with a higher error rate than short read sequencing techniques [37]. In order to precisely define the substitution and indel error rate of long amplicon sequencing, we compared PCR-enriched with non-enriched cell culture-derived samples. Although we observed a substantial reduction in the overall number of reads (25 to 54%) and in the average read length (42 to 72%) depending on the stringency of quality trimming parameters, this was similar for both sample types. Substitution errors, in contrast, were found to be 6-fold to 9-fold higher in amplicons compared to non-enriched samples, yet without any influence of the stringency of quality trimming. These findings suggest that substitution errors are largely introduced by PCR which is well in accordance with previous reports [36]. Overall substitution error rate was about 0.08% which means that low-level single nucleotide variants (SNV) down to 1% could be well distinguishable from PCRmediated substitutions. SNVs lower than 1%, however, may require additional steps for validation such as performance in duplicates. The number of indels was similar for non-enriched and amplicon-enriched samples indicating introduction by long read sequencing rather than by PCR. For non-ambiguous determination of true insertions and/or deletions either reanalysis with highly quality trimmed reads or an additional short read Illumina sequencing, which shows a very low indel error rate, could be performed. Alternatively, high coverage ccs can be aimed for in order to decrease the error rate down to $\sim 0.001\%$ [38]. As can also be seen within our haplotypes, indels are usually the second most abundant form of genetic variation. The reliable detection of indels is still a challenging problem, as our understanding of their origins and functional effects lags behind that of other types of variants. Indels have the potential to generate great changes in a viral population, as truncated or extended genes can be created through frameshifts or by the removal of stop codons. Overall, indels contribute to genetic variation in a virus genome. Within our haplotypes in the subset of samples we did not observe additional stop codons or significant changes in gene length.

When we applied the long read sequencing protocol to determine haplotypes in patient samples we chose a PHRED score of ≥ 20 for quality trimming. This approach ensures that a higher number of long reads is retained at the expense of a higher indel error rate. Further removal of short reads guarantees that only long reads spanning over multiple non-adjacent polymorphic sites are used for haplotype determination. Depending on the distribution of diversity along the target sites it will be necessary to adapt these analyses parameters accordingly. Alternatively, filtering of ccs reads using a cutoff for the number of full passes and a predicted accuracy will avoid read length reduction, but this filtering strategy requires a sufficiently high number of full passes.

Other artifacts known to be generated by PCR of highly homologous sequences are chimeric and heteroduplex sequences. In samples with multiple HCMV strains, we cannot fully rule out the possibility of chimera formation which might artificially increase the observed diversity in a mixed sample. We used manual inspection of final haplotypes to rule out that chimeric sequences are mistaken as additional haplotypes (Fig. 2). Chimera formation needs at least two different haplotypes in the pre-PCR sample and can only be of concern if ≥ 3 final haplotypes are detected post-PCR. In this study, in two of our clinical samples we found ≥3 haplotypes (BAL2 and BAL5) but none of these sequences displayed a chimeric sequence pattern composed of the remaining two haplotype sequences. Also, a low cycle condition of 30, no additional extension time and the use of a DNA-proofreading polymerase as used in this study are expected to induce less chimera formation. After visual inspection of these samples, we consider the bias of detecting artificial haplotypes as very low.

The formation of heteroduplexes is another concern in amplicon sequencing. DNA variants derived from closely related templates especially have a higher chance to form heteroduplexes during PCR amplification, which makes our application prone to such error. To prevent this false interpretation in our data, we decided to split our double stranded subreads into individual forward and reverse reads.

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Quantification of haplotype sequences in mixtures

It is critical that each haplotype sequence within a mixture is equally amplified by PCR in order to accurately determine and quantify all haplotypes. For validation, a set of artificial mixtures of two related HCMV DNAs were sequenced. Our data show that the mixed ratios can precisely be determined. Even low abundance haplotypes of 1% were correctly detected down to about 20 copies of the minor haplotype sequence. This finding correlates well with the before mentioned sensitivity limit of about 30 copies per reaction and underlines that both, the total HCMV DNA load and the sensitivity limit of the PCR are critical for detection of minor haplotypes in mixtures, given that the subsequent sequencing step was performed to an appropriate read depth. Since our protocol was validated solely for two haplotypes in mixtures it cannot be excluded that distinct haplotype mixtures or mixtures with more than two haplotypes may influence the PCR performance. All primer pairs, however, were designed to bind to highly conserved regions of the HCMV genome, thus it can be assumed that distinct haplotype sequences are similarly well amplified.

Interestingly, BAL samples which have the same number of haplotypes for regions F3 and F4, displayed almost identical frequencies of occurrence of individual haplotypes for both target sites. It is tempting to speculate that these individual haplotypes are found on the same HCMV DNA molecule within the HCMV population. Such observations may be verified in future studies through a long read based genome sequencing approach with overlapping long amplicons. HCMV displays several diversity hot spots spread across the genome with 30/170 genes having a dN (nonsynonymous substitutions per nonsynonymous site) value of >0.025 [23]. Our two target regions F3 and F4 cover already 7 of these hypervariable genes. To understand the linkage of distantly located genes, however, several overlapping amplicons can be generated.

Clinical applicability

Mixed strain infections in transplant recipients are common and have been associated with higher viral loads, delayed viral clearance and poorer clinical outcomes [16]. Potential application of this haplotype determination approach based on long read sequencing in a clinical setting is limited to samples with high viral loads (> 10^4 copies/ml) necessary for long range amplification. We have tested BAL samples for this study, however our lab has successfully used plasma samples as input material as well (data not shown). In clinical samples with a minimum viral load of 10^4 copies/ml, minor haplotypes of 20% can be detected with the determined sensitivity limit of 20 copies. Since the initial PacBio requirement

of a minimum of 700 ng DNA input for library preparation has been reduced to 100 ng, the use of clinical samples with restricted material availability has become even more feasible. Additionally, using multiplex PCRs for long range amplicon generation, patient samples can be used more efficiently. This approach was already tested within our lab and promising results multiplexing F3 and F4 have been achieved.

Haplotypes versus genotypes

In the present study, the newly developed long read PacBio sequencing approach was applied to four BAL samples that carry multiple genotypes as determined by short amplicon sequencing of gN, gO (located in the F3 target region) and UL146 (located in the F4 target site). Actually, also multiple haplotype sequences were identified by long amplicon sequencing. Comparison of sequencing data from both approaches clearly demonstrates limitations as well as main advantages of long amplicon sequencing. First, our findings indicate a potentially higher detection rate of low abundance populations by short amplicon compared to long amplicon sequencing as observed in two samples. Since short range PCRs usually show a higher sensitivity and are less prone to fragmented DNA found in patient samples, low abundance templates are easier to amplify. This makes this genotyping approach particularly suitable for initial screening of mixed infections. Second, short amplicon genotyping may strongly underestimate the intra-host diversity.

Our data show that individual haplotypes can carry the same genotype sequences across the respective target region but are otherwise substantially diverse. Moreover, SNVs of the same genotype which can be detected by short amplicon sequencing will not represent the overall haplotype diversity. Third, intra-host haplotype sequences show stretches of identity interspersed by diverse sections. This observation underlines the usefulness of long sequencing reads to identify co-linearity of multiple polymorphic regions of individual haplotype sequences which could not be assessed by short reads. Third generation long read sequencing platforms, such as SMRT sequencing from PacBio and Nanopore sequencing from Oxford Nanopore Technologies open this possibility due to its extended read length [28, 29].

Conclusions

In this study, we established and successfully applied a long read sequencing technique to long amplicons and identified co-linear genome stretches (haplotypes) in patient samples with mixed HCMV populations. This strategy for haplotype determination allows linkage analysis of multiple non-adjacent polymorphic sites

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along up to 7.7 kb. This allows a better approximation to the true strain diversity in mixed samples, which short read sequencing approaches failed to do. Taken together, this study provides the basis of a novel HCMV genome characterization strategy which will lead to an improved understanding of intra-host diversity and the dynamics of mixed HCMV strain populations. This could have important implications for diagnostics, treatment, and vaccine development.

Methods

Primer design for long range PCR

Primers are depicted in Supplementary Table 1. A total of 310 whole genome sequences were screened for conserved regions in the NCBI Multiple Sequence Alignment Viewer 1.11.1. Optimal primer sequences within the conserved regions were determined with Primer-Blast. In silico primer design was performed using the GeneArt® Primer and Construct Design Tool with the Single Site-Directed Mutagenesis option. Sequences of desired target regions which include highly polymorphic regions within the UL section were derived from strain Merlin (AY446894.2) and a blastn search with the Nucleotide collection database (nr/nt) was performed. Single CDS, partial and artificial genomes were excluded.

Preparation of HCMV DNA used for sequencing

Bacterial artificial chromosomes (BAC) HCMV DNA from E.coli

TB40-BAC4-DNA was purified from 400 ml of *E. coli* overnight culture using the Nucleobond BAC 100 kit (Machery-Nagel) for low-copy plasmid purification. All steps were done according to the manufacturer. Purified BAC-DNA was eluted in $50\,\mu l$ nuclease-free deionized water, quantified using Nanodrop and stored at $4\,^{\circ}C$ and under no conditions frozen to avoid DNA fragmentation. Purified BAC-DNA was used to establish long range PCR assays.

HCMV DNA from fibroblast supernatant

Cryopreserved virus-stock vials of strains Merlin (AY446894) and TB40-BAC4-luc (derivative of TB-BAC4, EF999921 [39]) derived from HFF supernatant were used for HCMV DNA purification. 500 µl of thawed virus stock samples were transferred into 2 ml of lysis buffer and eluted in 50 µl elution buffer using the bead-based NucliSens EasyMagextractor (BioMérieux). Quantification of HCMV DNA was done by HCMV-specific qPCR (see below) and stored at 4 °C before being directly subjected to Illumina and PacBio sequencing or taken as template for long range PCR.

HCMV DNA from BAL samples

Six BAL samples stored at $-20\,^{\circ}$ C, all from patients who received lung transplants at the Medical University of Vienna between 2014 and 2016, were investigated. DNA was isolated using the QIAamp Viral RNA Mini kit (Qiagen). 250 μ l of BAL solution was lysed and further purified as described in the manufacturer's protocol. DNA was eluted from columns with 70 μ l elution buffer. HCMV DNA was quantified by HCMV-specific qPCR (see below) and stored at 4 $^{\circ}$ C before being subjected to short and long range PCR.

Artificial mixtures of two distinct HCMV DNA genomes

HCMV DNA either purified from Merlin or TB40-BAC4-luc virus stocks were diluted to the appropriate concentrations and mixed to achieve the ratios as listed in Table 5. Five μl of each mixture (total HCMV DNA ranged from 3×10^6 to 1×10^7 copies per ml) was used as template DNA for amplification by long range PCR.

DNA quantification

Purity and content of BAC-DNA and cell-culture-derived DNA was quantified using the NanoDrop 1000 tool (Peqlab). Amount of PCR amplicons was determined using the Qubit[™] double-stranded DNA High-Sensitivity Assay according to the manufacturer's instructions (Thermo Fisher Scientific) on the Qubit 2.0 fluorometer. HCMV-specific DNA of cell-culture-derived DNA and BAL samples was quantified by an in-house qPCR as previously described [40] and cell-culture-derived HCMV DNA for generation of artificial mixtures was additionally quantified by a gH genotype-specific PCR, also as previously described [41].

Long range PCR amplification

PCR enzymes initially used for evaluation of sensitivity and specificity of long range PCR are listed in Table 1 and Supplementary Table 2. Target regions chosen for evaluation are shown in Fig. 1. After evaluation, LA Taq HS DNA polymerase kit from TaKaRa (TaKaRa Bio) conveyed the best performance and was therefore further used. For long range PCR 15 µl mastermix (0.25 μl Tag, 2.5 μl 10x buffer, 4 μl dNTPs, 9.75 μl nuclease-free water, 1.25 primer each) was combined with 10 µl extracted DNA. Correlating copy number input for individual samples can be seen in Tables 4a and 4b and Supplementary Table 11. The cycling program was 94°C for 1 min, 30x (98°C for 10s, 68°C for 1 min/kb) and without an additional extension step to avoid PCR-mediated recombination. Small aliquots of the PCR products were visualised on analytical agarose

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gels, then quantified by Qubit and subjected to library preparation for Illumina and PacBio sequencing.

Short range PCR amplification

HCMV DNA positive BAL samples were screened for mixed genotype infections by short range PCR amplification of polymorphic target regions within envelope glycoprotein N (gN), envelope glycoprotein O (gO), and UL146 (nested PCR). Detailed description of PCR amplicons, associated primers and respective annealing temperatures are listed in Supplementary Table 1. For PCR, 19 µl AmpliTaq Gold 360 Mastermix (Applied Biosystems) and 0.5 µl of each primer was combined with 5 µl of extracted BAL DNA. Initial denaturation was performed at 95 °C for 10 min followed by 40 cycles of 95 °C for 1 min, annealing for 1 min at 50-61 °C, and elongation at 72° for 1 min, with a final extension time of 5 min at 72°. For the second step of the nested UL146 PCR, 40 µl master mix and 8 µl PCR grade water was mixed with 2 µl of the first PCR product. Small aliquots of the PCR products were visualised on analytical agarose gels, then quantified by Qubit and subjected to library preparation for Illumina sequencing.

PacBio SMRT sequencing

SMRT bell library preparation and sequencing were performed by the Next Generation Sequencing Facility at Vienna BioCenter Core Facilities. Long range PCR amplicons and non-enriched DNA were further purified using the QIAEX II Gel extraction Kit (Qiagen). Due to indispensable loss of HCMV DNA (>80%) during gel extraction, both non-enriched DNA and PCR products were subjected to the protocol: Desalting and Concentrating DNA Solutions. All steps were performed as advertised in the protocol and the HCMV DNA was eluted in 20 µl of Tris buffer. For library preparation a minimum DNA input of 700 ng and 2.5 µg for amplicon and whole genome sequencing was required, respectively. Initial quantification and purity were measured with the NanoDrop 1000 tool (Peglab) and a Qubit 2.0 fluorometer (Thermo Fisher). Large fragment analysis was performed with a Femto Pulse system and the genomic DNA 165kb Kit (Agilent). Non-enriched DNA was sheared to an expected fragment length of <10kb. Samples were indexed and multiplexed according to the Sequencing facility. Subsequent to library preparation a blue pippin size selection (Sage Science Inc.) was used to isolate target fragment lengths of long range PCR amplicons. Sequencing was performed on a PacBio-Sequel system for 10 and 20 h for cell-culture derived and BAL samples, respectively. Details on PacBio sequencing run information is listed in Supplementary Table 3.

Illumina sequencing

Two ng input DNA per sample was used for library preparation using the Nextera XT library preparation kit, and samples were indexed using the Nextera XT index kit (Illumina). After index PCR, samples were purified with 45 µl of Agencourt AMPure XP magnetic beads with a sample to beads ratio of 3:2 (Beckman Coulter), normalized by Qubit quantification and pooled to generate a 4nM library. To compensate for low diversity libraries, a 12 pM PhiX control spike-in of 2.5% was added. Single and paired-end sequencing (150 to 250 cycles, V2 kits) was done on an Illumina MiSeq instrument with automatic adapter trimming (Illumina). Raw reads in fastq format that passed filters were used for analysis using CLC Genomics Workbench 12.0 (Qiagen). Detailed information on MiSeq sequencing runs is listed in Supplementary Table 4.

Bioinformatical workflows for PacBio and Illumina reads Generation of circular consensus sequence reads upon PacBio sequencing

Bam files of PacBio raw reads were demultiplexed using Lima (https://github.com/pacificbiosciences/barcoding/) with default parameters and symmetric options. In order to generate Highly Accurate Single-Molecule Consensus Reads, demultiplexed subreads were aligned with the PacBio ccs tool of Bioconda (https://github.com/Pacif icBiosciences/ccs). During this process, multiple reads of the same SMRTbell sequence are combined to produce high quality consensus sequences. To prevent incorrect analysis due to heteroduplexes, consensus sequences for each strand of a molecule were separated by strand. For all following steps, each forward and reverse strand was treated as individual single-strand reads. No full-length subreads were required for ccs generation, a minimum predicted accuracy of 0 and a minimal number of passes for ccs of 0 was chosen (Supplementary Table 3). Resulting ccs reads were further analysed using CLC Genomics Workbench 12.0 (Qiagen Bioinformatics). Low-quality reads were filtered out using the Phred-like Quality Value for each ccs read.

Trimming and mapping for error calculation

Illumina fastq reads were imported as paired-end reads and PacBio ccs were imported as single reads into CLC Genomics Workbench. Raw reads were quality trimmed by using the modified-Mott trimming algorithm ($pError=10^{-10}$) with a base-calling error probability of 0.01 or 0.001 (Phred quality score of 20 or 30, respectively), an ambiguous limit of 2 in a read, a minimum and maximum number of nucleotides in reads of 100 and 9000, respectively. Human genomic DNA

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reads were filtered out by randomly mapping them against the latest reference genome GRCh38 (accession GCA_00001405.28), with default setting parameters for match/mismatch scores and insertion/deletion costs, length fraction of 0.3, and similarity fraction of 0.8. PacBio-derived reads were further trimmed to exclude reads lower 500 nucleotides. Remaining reads from both sequencing platforms were randomly mapped to the pathogen reference sequences Merlin and TB40-BAC4-luc, respectively, with default setting parameters for match/mismatch scores and insertion/deletion costs, length fraction of 0.3, and similarity fraction of 0.8. Details are listed in Table 2 and Supplementary Table 5.

For error calculation resulting mappings were used. Therefore, the total number of bases as well as the total number of substitutions, insertions and deletions were counted to calculate the respective error rates. Error rate estimation was further divided into the 4 distinct bases in the reference sequence to estimate substitution among bases. Analysis was performed using the function QC for Read Mapping of CLC Genomics Workbench 12.0.

Trimming and mapping for ratio estimation

Illumina fastq raw reads were quality trimmed with a base-calling error probability of 0.001, an ambiguous limit of 2 in a read and a minimum and maximum number of nucleotides in reads of 100 and 9000, respectively. Human genomic DNA reads were filtered out as described.

First, quality trimmed and filtered reads were randomly mapped to the Merlin and TB40-BAC4-luc amplicon reference sequences, with default setting parameters for match/mismatch scores and insertion/deletion costs, length fraction of 0.3, and similarity fraction of 0.8 to determine the overall % of HCMV-specific reads. Second, for ratio estimation genotype-specific reads mapping to highly polymorphic regions within glycoprotein H (gH) (position in CDS of Merlin strain: 1 to 180), gO (1 to 680), and gN (1 to 220), were considered. In total, 2 gH, 8 gN, and 8 gO genotype sequences were used as reference sequences for mapping (Supplementary Table 6). Mapping parameters were: default setting parameters for match/mismatch scores and insertion/deletion costs, length fraction of 0.3, similarity fraction of 0.95, and nonspecific matches were ignored. Merlin and TB40-genotype-specific reads were counted to estimate the ratio. Reads mapping to one or more of the other genotype reference sequences were counted to determine the falsepositive mapping rate.

Trimming and mapping for genotype determination

Illumina fastq reads were quality trimmed with a basecalling error probability of 0.001, a minimum number of nucleotides in reads of 100, and human genomic DNA reads were removed. Then, quality trimmed and filtered reads were mapped to highly polymorphic regions within gO (1 to 680), gN (1 to 220), and UL146 (position in CDS of Merlin strain: 1 to 360) with default setting parameters for match/mismatch scores and insertion/deletion costs, a length fraction of 0.3 and a similarity fraction of 0.8. A total of 30 genotypic reference sequences were used as previously described [19] and listed in Supplementary Table 6.

A positive genotype mapping was scored if the number of reads was > 10 and the consensus length corresponded to at least 80% of the reference length. Consensus sequences were derived from the mappings by using a minimum read depth of 5 reads per base with low coverage regions coded as ambiguities (Ns). Ambiguity codes were inserted using a noise threshold of 0.1 and a minimum nucleotide count of 5. Alignments of derived consensus sequences were screened visually and unique consensus sequences were counted as independent genotypes.

Trimming and mapping for haplotype determination

To retain PacBio ccs reads that span the complete amplicon length, all ccs were initially length trimmed. For this, F3 amplicon-derived reads below 7500 and above 8000 and F4 amplicon-derived reads below 6500 and above 7000 number of nucleotides in reads were excluded. Remaining reads were processed with following parameters: quality trimming with a base-calling error probability of 0.01, ambiguous limit of 2 in a read and exclusion of low quality reads. Only reads that span more than half of the amplicon length (4000 nucleotides for F3- and 3500 nucleotides for F4-derived amplicons) were retained and human genomic DNA reads removed. Remaining reads were mapped to 236 HCMV full genomes (Supplementary Table 7), with default setting parameters for match/mismatch scores and insertion/deletion costs, length fraction of 0.7, and similarity fraction of 0.8 and non-specific mappings were ignored. Consensus sequences were generated from mappings with a consensus length of > 6.9 kb for F3- and > 5.9 kb for F4-derived amplicons, and with a minimum coverage of >0.1% of the average coverage (Supplementary Tables 12a and 12b). Extracted consensus sequences were aligned by muscle [42] and visually inspected in BioEdit 7.2.5 (Ibis Therapeutics). Unique consensus sequences were used as new reference sequences to repeat the mapping with length and similarity fraction of 0.9. New consensus sequences from mappings spanning over the complete amplicon length showing a uniform coverage were extracted. Ambiguity codes were inserted using a noise threshold of 0.1

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and a minimum nucleotide count of 5. Unmapped reads were further mapped to human and HCMV genomes to confirm that no haplotype sequences got lost during the analysis steps. After alignment and visual inspection unique consensus sequences were counted as independent haplotypes. To visualise the diversity among distinct haplotypes, nucleotide alignments and phylogenetic tree analysis of all haplotypes were performed in Geneious Prime® 2019.0.3 and Mega 7.0.14 [43], respectively. Phylogenetic trees were inferred by using the Maximum Likelihood method based on the HKY+G (0.05)+I (0.27) for F3 haplotypes and Kimura-2+G (0.47)+I (0.62) for F4 haplotypes. Best fit substitution model (lowest BIC score) was assessed with Mega 7.0.14.

Abbreviations

BAC: Bacterial artificial chromosomes; BAL: Bonchoalveolar lavage; css: circular consensus sequence; gH: envelope glycoprotein H; gN: envelope glycoprotein N; gO: envelope glycoprotein O; HCMV: human cytomegalovirus; HFF: Human foreskin fibroblast; PacBio: Pacific Biosciences; SMRT: Single molecule real-time; SNV: Single nucleotide variants; SRA: Sequence Read Archive.

Supplementary Information

The online version contains supplementary material available at https://doi.org/10.1186/s12864-021-08272-z.

Additional file 1 Supplementary Tables 1-12b. Supplementary tables final

Additional file 2: Supplementary Figs. 1–3. Supplementary_Figures

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Authors' contributions

I.G. and N.B. conceived the project. N.B. and B.K. carried out experiments. All authors participated in data analysis and discussion. N.B. made the formal analysis. I.G. and N.B. wrote the manuscript, B.K. revised the manuscript. All authors read and approved the submitted manuscript.

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Availability of data and materials

Sequence data generated in this study were deposited in GenBank with the accession numbers MW560357-MW560373.

Raw data of Illumina and PacBio sequencing were submitted to the NCBI Sequence Read Archive (SRA) under BioProject ID PRJNA698084 and BioSample accession numbers SAMN17705199-SAMN17705210, SAMN17705219-SAMN17705248.

Declarations

Ethical approval

This pilot study was approved by the Ethics Committee of the Medical University of Vienna under EK-number 1321/2017. All transplant recipients gave their written informed consent and all data were pseudonymised before analyses. This study was performed in accordance with the principles of the Declaration of Helsinki.

Consent for publication

Not applicable.

Competing interests

The author(s) declare that there are no conflicts of interest.

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References

- Drew WL, et al. Multiple infections by cytomegalovirus in patients with acquired immunodeficiency syndrome: documentation by southern blot hybridization. J Infect Dis. 1984;150(6):952–3.
- Numazaki K, et al. Simultaneous infection of immunocompetent individuals with multiple cytomegalovirus strains. Lancet. 1998;352(9141):1710.
- Spector SA, Hirata KK, Newman TR. Identification of multiple cytomegalovirus strains in homosexual men with acquired immunodeficiency syndrome. J Infect Dis. 1984;150(6):953–6.
- Ross SA, et al. Cytomegalovirus reinfections in healthy seroimmune women. J Infect Dis. 2010;201(3):386–9.
- Meyer-König U, et al. Simultaneous infection of healthy people with multiple human cytomegalovirus strains. Lancet. 1998;352(9136):1280–1.
- Bale JF Jr, et al. Cytomegalovirus reinfection in young children. J Pediatr. 1996;128(3):347–52.
- Humar A, et al. Cytomegalovirus (CMV) glycoprotein B genotypes and response to antiviral therapy, in solid-organ-transplant recipients with CMV disease. J Infect Dis. 2003;188(4):581–4.
- Manuel O, et al. Impact of genetic polymorphisms in cytomegalovirus glycoprotein B on outcomes in solid-organ transplant recipients with cytomegalovirus disease. Clin Infect Dis. 2009;49(8):1160–6.
- Manuel O, et al. An assessment of donor-to-recipient transmission patterns of human cytomegalovirus by analysis of viral genomic variants. J Infect Dis. 2009;199(11):1621–8.
- Görzer I, et al. Deep sequencing reveals highly complex dynamics of human cytomegalovirus genotypes in transplant patients over time. J Virol. 2010;84(14):7195–203.
- Puchhammer-Stöckl E, et al. Emergence of multiple cytomegalovirus strains in blood and lung of lung transplant recipients. Transplantation. 2006;81(2):187–94.
- Suarez NM, et al. Human cytomegalovirus genomes sequenced directly from clinical material: variation, multiple-strain infection, recombination, and gene loss. J Infect Dis. 2019;220(5):781–91.
- 13. Coaquette A, et al. Mixed cytomegalovirus glycoprotein B genotypes in immunocompromised patients. Clin Infect Dis. 2004;39(2):155–61.
- 14. Lisboa LF, et al. Analysis and clinical correlation of genetic variation in cytomegalovirus. Transpl Infect Dis. 2012;14(2):132–40.
- Wilkinson GW, et al. Human cytomegalovirus: taking the strain. Med Microbiol Immunol. 2015;204(3):273–84.
- Puchhammer-Stöckl E, Görzer I. Human cytomegalovirus: an enormous variety of strains and their possible clinical significance in the human host. Futur Virol. 2011;6(2):259–71.
- Marti-Carreras J, Maes P. Human cytomegalovirus genomics and transcriptomics through the lens of next-generation sequencing: revision and future challenges. Virus Genes. 2019;55(2):138–64.
- Lassalle, F., et al., Islands of linkage in an ocean of pervasive recombination reveals two-speed evolution of human cytomegalovirus genomes. Virus Evolution, 2016. 2(1): p. vew017.
- Suarez NM, et al. Human cytomegalovirus genomes sequenced directly from clinical material: variation, multiple-strain infection, recombination, and gene loss. J Infect Dis. 2019;220(5):781–91.
- Renzette N, et al. Extensive genome-wide variability of human cytomegalovirus in congenitally infected infants. PLoS Pathog. 2011;7(5):e1001344.

Brait et al. BMC Genomics (2022) 23:31 Page 16 of 16

- Renzette N, et al. Rapid intrahost evolution of human cytomegalovirus is shaped by demography and positive selection. PLoS Genet. 2013;9(9):e1003735.
- Hage E, et al. Characterization of human cytomegalovirus genome diversity in immunocompromised hosts by whole genomic sequencing directly from clinical specimens. J Infect Dis. 2017.
- Sijmons S, et al. High-throughput analysis of human cytomegalovirus genome diversity highlights the widespread occurrence of gene-disrupting mutations and pervasive recombination. J Virol. 2015.
- Cunningham C, et al. Sequences of complete human cytomegalovirus genomes from infected cell cultures and clinical specimens. J Gen Virol. 2010;91(Pt 3):605–15.
- Cudini J, et al. Human cytomegalovirus haplotype reconstruction reveals high diversity due to superinfection and evidence of within-host recombination. Proc Natl Acad Sci U S A. 2019;116(12):5693–8.
- Pang J, et al. Mixed cytomegalovirus genotypes in HIV-positive mothers show compartmentalization and distinct patterns of transmission to infants. Elife. 2020;9.
- 27. Aird D, et al. Analyzing and minimizing PCR amplification bias in Illumina sequencing libraries. Genome Biol. 2011;12(2):R18.
- 28. Ip CLC, et al. MinION Analysis and reference consortium: phase 1 data release and analysis. F1000Res. 2015;4:1075.
- 29. McCarthy A. Third generation DNA sequencing: pacific biosciences' single molecule real time technology. Chem Biol. 2010;17(7):675–6.
- Chaisson MJ, et al. Resolving the complexity of the human genome using single-molecule sequencing. Nature. 2015;517(7536):608–11.
- Pendleton M, et al. Assembly and diploid architecture of an individual human genome via single-molecule technologies. Nat Methods. 2015;12(8):780–6.
- Eckert SE, et al. Enrichment by hybridisation of long DNA fragments for Nanopore sequencing. Microb Genom. 2016;2(9):e000087.
- Houldcroft CJ, et al. Detection of low frequency multi-drug resistance and novel putative Maribavir resistance in immunocompromised pediatric patients with cytomegalovirus. Front Microbiol. 2016;7:1317.
- Absalan F, Ronaghi M. Molecular inversion probe assay. Methods Mol Biol. 2007;396:315–30.
- Naegele K, et al. Cytomegalovirus sequence variability, amplicon length, and DNase-sensitive non-encapsidated genomes are obstacles to standardization and commutability of plasma viral load results. J Clin Virol. 2018;104:39–47.
- Potapov V, Ong JL. Examining sources of error in PCR by single-molecule sequencing. PLoS One. 2017;12(1):e0169774.
- 37. Rhoads A, Au KF. PacBio sequencing and its applications. Genomics Proteomics Bioinformatics. 2015;13(5):278–89.
- Goodwin S, McPherson JD, McCombie WR. Coming of age: ten years of next-generation sequencing technologies. Nat Rev Genet. 2016;17(6):333–51.
- Scrivano L, et al. HCMV spread and cell tropism are determined by distinct virus populations. PLoS Pathog. 2011;7(1):e1001256.
- Kalser J, et al. Differences in growth properties among two human cytomegalovirus glycoprotein O genotypes. Front Microbiol. 2017;8:1609.
- Görzer I, et al. Virus load dynamics of individual CMV-genotypes in lung transplant recipients with mixed-genotype infections. J Med Virol. 2008;80(8):1405–14.
- 42. Edgar RC. MUSCLE: a multiple sequence alignment method with reduced time and space complexity. BMC Bioinformatics. 2004;5:113.
- 43. Kumar S, et al. MEGA X: molecular evolutionary genetics analysis across computing platforms. Mol Biol Evol. 2018;35(6):1547–9.

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