

Validation of the VirCapSeq-VERT system for differential diagnosis, detection, and surveillance of viral infections

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ABSTRACT There is a need in clinical microbiology and public health for assays that enable sensitive and rapid detection of infectious agents. Next Generation Sequencing (NGS) is increasingly used in the fields of oncology and personalized genome medicine but has not gained a wider acceptance for clinical microbiology due to operational and bioinformatics complexity, as well as lower sensitivity compared to agent-specific quantitative polymerase chain reaction (qPCR) assays. VirCapSeq-VERT is a positive selection system for detection, typing, and strain differentiation of both RNA and DNA viruses with sensitivity comparable to qPCR. Here we report the analytical and clinical validation of the VirCapSeq-VERT system for detection of viruses in plasma and nasal secretions that cause systemic and/or respiratory infections.

IMPORTANCE Broad range assay for accurate and sensitive diagnostics.

KEYWORDS VirCapSeq, diagnostics, analytical validation, clinical validation, sequencing, clinical microbiology

A cluster of severe respiratory infections emerged in December 2019, linked to a wet market in Wuhan, China. By the spring of 2020, the world was in the grips of a pandemic with the near collapse of healthcare systems, leading to unprecedented global lockdowns (1, 2). Subsequent reports of Mpox, polio, enterovirus D68 (EV-D68), respiratory syncytial virus (RSV), and measles outbreaks confirmed our vulnerability to the emergence and reemergence of viral diseases (3–12). Despite the advances made in healthcare and medicine, microbial infections are still one of the leading causes of death in both developing as well as developed countries (13). The impact of infectious diseases includes not only morbidity and mortality but also a substantive economic burden (14, 15).

Polymerase chain reaction (PCR) has transformed clinical microbiology by providing methods for the detection of viruses and quantitation of viral load. It is nonetheless applicable only for the detection of known and closely related pathogens and has limited potential for multiplexing. Unbiased Next Generation Sequencing (NGS) is not constrained in multiplex capacity, but has other limitations that include higher cost, longer time to deliver results, greater complexity of workflow and data analysis, and lower sensitivity (1,000–10,000 copies/mL versus 10–100 copies/mL) (16, 17).

VirCapSeq-VERT is a positive selection system for detection, typing, and strain differentiation of both RNA and DNA viruses. It has sensitivity similar to qPCR (5–50 copies/mL), and enables high throughput detailed genomic analyses in less than 36 hours. Total nucleic acid is extracted and subjected to first and second-strand cDNA synthesis. Products are sheared prior to library construction. After pooling of bar-coded libraries, viral targets are enriched by VirCapSeq-VERT capture oligonucleotides, followed by washing to remove host products prior to sequencing (schematic in

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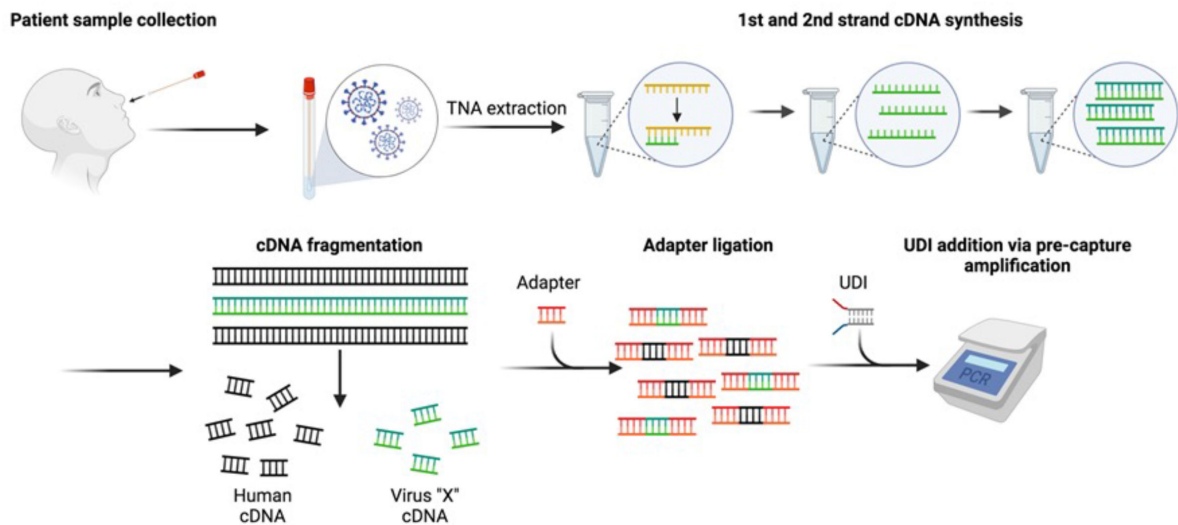
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Fig. 1). VirCapSeq-VERT has been used with multiple specimen types including saliva, nasopharyngeal swabs, serum, plasma, urine, feces, cerebrospinal fluid, environmental samples, and organ tissues (16, 18–31). The enabling assay component is a library of oligonucleotide probes designed to bind and capture sequences of all known vertebrate viruses. The capture probes cover all relevant sequences in Genbank, RefSeq, EMBL, or GISAID (a listing of viral targets included in VirCapSeq-VERT capture library construction can be found in Table S1 of reference 16; the capture library was updated in May 2021 by adding probes for newly reported sequence entries, including the novel SARS-CoV-2 virus). With the goal of extending this method to clinical microbiology, we undertook a rigorous assessment of the performance characteristics of VirCapSeq-VERT including its limit of detection (LoD), repeatability and reproducibility, differential diagnosis in mixed infections, clinical accuracy, and precision. This assessment was undertaken to obtain formal approval for the use of VirCapSeq-VERT as a certified diagnostic test by the New York State Department of Health (NYSDOH) under the auspices of the Clinical Laboratory Evaluation Program (CLEP), a stringent state licensure program run by the NYSDOH (32).

A. EXTRACTION AND LIBRARY PREPARATION



B. CAPTURE ENRICHMENT AND SEQUENCING

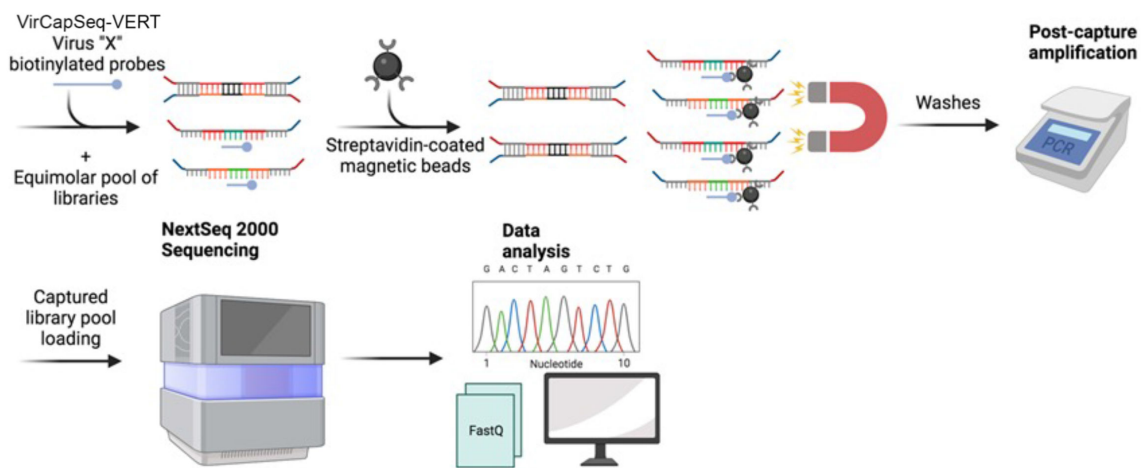


FIG 1 Schematic of VirCapSeq-VERT workflow. (A) sample collection, total nucleic acid (TNA) extraction, and library preparation; (B) Capture enrichment and sequencing.

MATERIALS AND METHODS

Participating institutions and ethical clearance

The validation was a collaborative effort between the Center for Infection and Immunity in the Mailman School of Public Health and the Personalized Genomic Medicine laboratory in the Department of Pathology and Cell Biology in the Vagelos College of Physicians and Surgeons, at Columbia University New York, NY. All work was pursued with Columbia University IRB approval.

Viruses

A representative set of viruses with RNA and DNA genomes that vary in polarity, size, and structure, and are relevant to the practice of clinical microbiology were selected for validation (Table 1).

Validation was performed using a mix of contrived samples, controls, and clinical specimens. Virus culture supernatants were procured either pre-quantified or were quantified in copies per milliliter using Conformité Européenne (CE) marked commercial qPCR kits from Siemens Healthineers (Resp21 FTD Plus and Neuro9 FTD) with the exceptions of severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) and Zika virus (ZIKV) which were quantified using FDA Emergency Use Authorization (EUA) approved assays (33, 34). To replicate conditions found in clinical materials, we spiked live viruses into appropriate negative matrices that were confirmed to be negative for the viruses included in the validation. The only exception being SARS-CoV-2, where, for safety reasons, pre-extracted total nucleic acid (TNA) from both the virus and pooled nasal swabs were mixed. Viruses or TNA were spiked into the background at desired concentrations for all performance characteristics studies.

Controls

Negative controls

Negative controls included either single donor plasma samples or a pool of anterior nasal swabs in viral transport media (VTM) (Becton Dickinson, USA; Copan, Italy) that were confirmed in specific PCR assays to be free of nucleic acids of viruses used in validation studies.

Positive control

The External RNA Controls Consortium (ERCC, ThermoFisher Scientific, USA) has created a commercial kit for use as a common set of RNA controls for various molecular platforms including NGS (35). We used ERCC spike-in mix 1 in a salmon sperm DNA background

TABLE 1 Genome structures and sizes for 22 representative viruses used for validation study in plasma and nasal swab samples

Plasma			Nasal swab		
Virus	Genome Type	Genome Size (nt)	Virus	Genome Type	Genome Size (nt)
Adenovirus 1	dsDNA linear	40,000	Adenovirus 1	dsDNA linear	40,000
BK Polyomavirus	dsDNA linear	5,000	Coronavirus 229E	ss(+) RNA	30,000
Coxsackievirus A16	ss(+) RNA	7,400	Coronavirus OC43	ss(+) RNA	30,000
Coxsackievirus B4	ss(+) RNA	7,300	SARS-CoV-2	ss(+) RNA	30,000
Enterovirus A71	ss(+) RNA	7,000	Enterovirus D68	ss(+) RNA	7,000
Hepatitis B	dsDNA circular	3,200	Human metapneumovirus	ss(-) RNA	14,000
Human herpesvirus 1	dsDNA linear	152,000	Respiratory syncytial virus	ss(-) RNA	15,000
Human herpesvirus 2	dsDNA linear	155,000	Human parainfluenza virus 1	ss(-) RNA	16,000
Human herpesvirus 5	dsDNA linear	240,000	Human parainfluenza virus 2	ss(-) RNA	16,000
Parvovirus B19	ssDNA	5,600	Human parainfluenza virus 3	ss(-) RNA	16,000
Zika virus	ss(+) RNA	11,000	Influenza A virus	ss(-) RNA	13,500
			Influenza B virus	ss(-) RNA	14,500

as a technical post-extraction control to monitor the performance of the library and capture hybridization workflow as well as spillover/contamination events of sample sequences (viral or human) into ERCC/salmon sperm or vice versa. The capture probe set was designed to include probes matching only half of the ERCC RNA control set that represented the various template sizes and concentrations included in the set to specifically measure the efficacy of the capture enrichment.

Extractions

TNA was extracted either from 300 μ L of plasma or 250 μ L of anterior nasal swabs collected in VTM on the NucliSENS easyMAG platform (bioMérieux, France). A no-template control (nuclease-free water) was included in each extraction run.

Library preparation, capture hybridization, and sequencing

For the plasma samples, libraries were prepared as per our published protocol (16). For analyses of respiratory samples, we employed Twist library preparation kits and Twist Fast Hybridization Reagents (Twist Biosciences, USA). Amplified and purified barcoded libraries were pooled and set up for the capture using VirCapSeq-VERT probes and using either Roche Hybridization Kits (Roche, USA) or Twist Fast Hybridization Reagents (Twist Biosciences, USA). The enriched pools were sequenced on Illumina NextSeq instruments. Our target range was 10 million raw reads per sample.

Creating contrived samples and analytical validation studies designs

Analytical validation was done with contrived samples, comprised of quantified live cultured viral isolates or viral TNA from SARS-CoV-2, spiked into negative background matrices. Single donor plasma from 5 individuals sourced from the New York Blood Center and nasal swabs collected from 10 anonymized volunteers in 2 mL VTM were screened by VirCapSeq-VERT. A sample was defined as negative if it did not contain sequences of any of the viruses used in the validation. The acceptable negative background matrices used were one single donor plasma and a pool of nasal swabs in VTM. The viral isolates were sourced from our own archived repository and from commercial sources (ATCC, USA; Zeptomatrix, USA). Viruses were quantified and serially diluted in 10-fold dilutions, ranging from 500,000 copies/mL to 0.5 copies/mL for nasal swabs and from 500,000 copies/mL to five copies/mL for plasma, due to the limited single donor sample volume.

Using the LoD data, we proceeded to determine repeatability and reproducibility, and accuracy in differential diagnosis of mixed infections. Repeatability and reproducibility assays were done at 5x LoD for each virus. Following guidance from CLEP, three independent runs, with each run containing three replicates of all viruses, were conducted by three different operators, starting from distinct extractions, on three separate starting dates. For mixed infections, samples were generated that contained one agent at LoD and another at a higher concentration.

Clinical concordance

We examined diagnostic concordance between VirCapSeq-VERT and approved qPCR assays. Clinical samples (plasma and nasal swabs in VTM) were sourced through the New York Presbyterian Hospital (NYP) network and from Associated Regional and University Pathologists, Inc. (ARUP Labs, USA). ARUP samples included 30 plasma specimens that had been tested using qPCR for the following viruses: BK Polyomavirus (BKPyV), human herpesvirus 5 (HHV-5), hepatitis B virus (HBV), human parvovirus B19 (B19V), human herpesvirus 4 (HHV-4), human herpes virus 6 (HHV-6), and hepatitis C virus (HCV) based on availability. Additionally, to test assay performance for viruses for which we had no relevant clinical specimens, live virus at concentrations ranging from 10,000 to 100 copies/mL were seeded in the negative plasma diluent to create contrived specimens [10 adenovirus C (ADV-C), 5 coxsackievirus B4 (CV-B4), 6 enterovirus A71 (EV-A71), 10

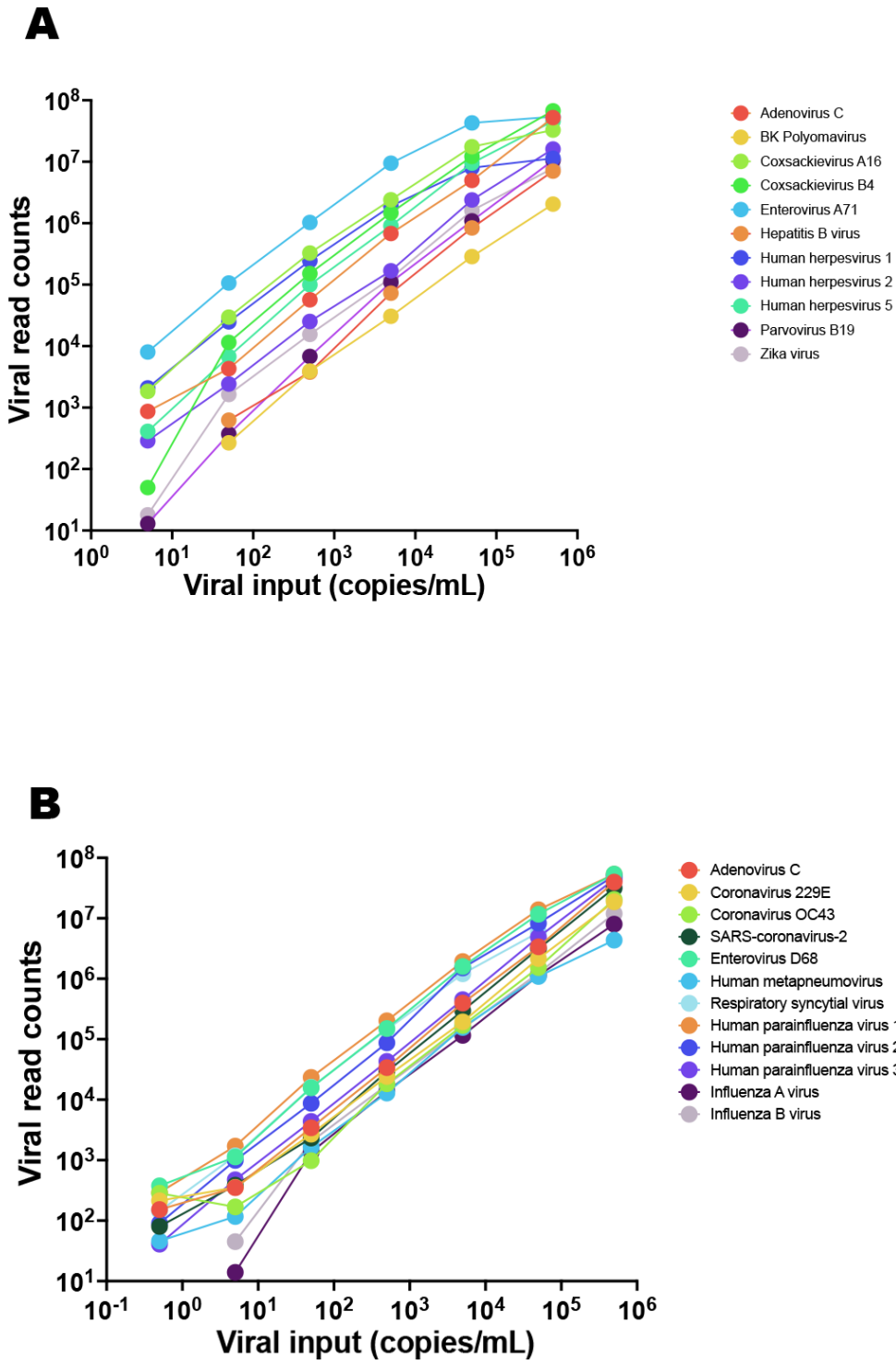


FIG 2 Linearity data for (A) systemic and (B) respiratory infection test validation. Virus stock was serially diluted in sample matrix (plasma or nasal swabs in VTM, respectively) that had been tested negative for the viruses used for validation, prior to processing for VirCapSeq-VERT.

human herpesvirus 1 (HHV-1), 11 ZIKV, 2 BKPyV, 10 (HBV), and 4 B19V]. For respiratory infections, we tested 50 banked and de-identified clinical nasal swab specimens that had been previously tested for a range of respiratory viruses and were made available to us through NYP.

Data analysis, interpretation, and reporting

Sequencing data sets were analyzed using an automated bioinformatics pipeline and a custom viral database. Demultiplexed fastq files had adapters trimmed using Cutadapt program (36). The reads were then quality filtered and end-trimmed with PRINSEQ software (37). The host reads were removed by mapping quality-filtered reads against a custom host reference database using Bowtie2 mapper (38). Then reads that match any of these criteria were removed: shorter than 50 bases after adapter trimming; reads with Q scores below 25; low complexity reads with an entropy value ≤ 70 ; and those with 20 or more Ns. The first 9 bases of the remaining reads were trimmed as the quality tends to be inherently poor. The final host-subtracted reads were subjected to homology search using GenBank MegaBLAST against a curated custom viral database that was created by downloading viral sequences from GenBank and removing faulty and misannotated sequences. All reads were subsequently remapped to the reference viral sequences identified by the initial homology search to validate the MegaBLAST results. Finally, stringency filters including e-value of $\leq 1.00E-35$, identity of $\geq 95\%$, alignment lengths of ≥ 100 nucleotides (nt), minimum number of unique reads aligned, minimum number of regions ≥ 100 nt, and cumulative minimum length of ≥ 500 nt were applied. All viral sequences that were identified at this stage were included in the final results report.

RESULTS

Limits of detection and linearity

LoDs and performance of VirCapSeq-VERT in the context of virus quantity were determined using qPCR quantitated virus stocks or TNA (SARS-CoV-2) serially 10-fold diluted in the respective background matrix (plasma or nasal swab in VTM), starting at a concentration of 500,000 copies/mL. A LoD of 5 copies/mL was determined in plasma for ADV-C, coxsackieviruses (CV) A16 and B4, EV-A71 and HHV-1 and HHV-5, and in nasal swabs for EV-D68 and human parainfluenza viruses (HPIV) 1 and 2. An LoD of 50 copies/mL was determined in plasma for BKPvV, HBV, HHV-2, B19V, ZIKV, and in nasal swabs for ADV-C, coronaviruses 229E, OC43, and SARS-CoV-2, human metapneumovirus (HMPV), RSV, HPIV-3, and influenza viruses (FLUV) A and B. Linearity data for plasma and respiratory swab samples are shown in Fig. 2 and LoDs are listed in Table 2; Tables S1 and S2 shows raw and normalized read counts and the fraction of viral reads per sample.

Repeatability and reproducibility

Based on the LoD information, contrived specimens were created at 5x LoD for each virus to measure intra-run repeatability and inter-run reproducibility. Three independent runs, each containing triple replicates of every virus, were conducted by three different operators, starting from independent extractions, on three separate starting dates.

TABLE 2 Limits of detection (LoD) for 22 representative viruses used for validation study in plasma and nasal swab samples

Virus	Plasma		Nasal swab	
	Virus	LoD (copies/ml)	Virus	LoD (copies/ml)
Adenovirus 1	Adenovirus 1	5	Adenovirus 1	50
BK Polyomavirus	Coronavirus 229E	50	Coronavirus 229E	50
Coxsackievirus A16	Coronavirus OC43	5	Coronavirus OC43	50
Coxsackievirus B4	SARS-CoV-2	5	SARS-CoV-2	50
Enterovirus A71	Enterovirus D68	5	Enterovirus D68	5
Hepatitis B	Human metapneumovirus	50	Human metapneumovirus	50
Human herpesvirus 1	Respiratory syncytial virus	5	Respiratory syncytial virus	50
Human herpesvirus 2	Human parainfluenza virus 1	50	Human parainfluenza virus 1	5
Human herpesvirus 5	Human parainfluenza virus 2	5	Human parainfluenza virus 2	5
Parvovirus B19	Human parainfluenza virus 3	50	Human parainfluenza virus 3	50
Zika virus	Influenza A virus	50	Influenza A virus	50
	Influenza B virus	50	Influenza B virus	50

VirCapSeq-VERT achieved a high degree of precision for all viruses tested with an overall coefficient of variance of 18% for plasma and 10% for respiratory swab samples. Data for both sample types are plotted in Fig. 3.

Coinfections/mixed infections

We tested for the detection of coinfections using samples that contained one agent at LoD and another at 1000x LoD. VirCapSeq-VERT accurately identified coinfection in 25 samples (Tables 3 and 4). We did not detect HHV-5 at the LoD in one sample in the presence of EV-A71 at 50,000 copies/mL (Table 3). On recommendations from CLEP, we

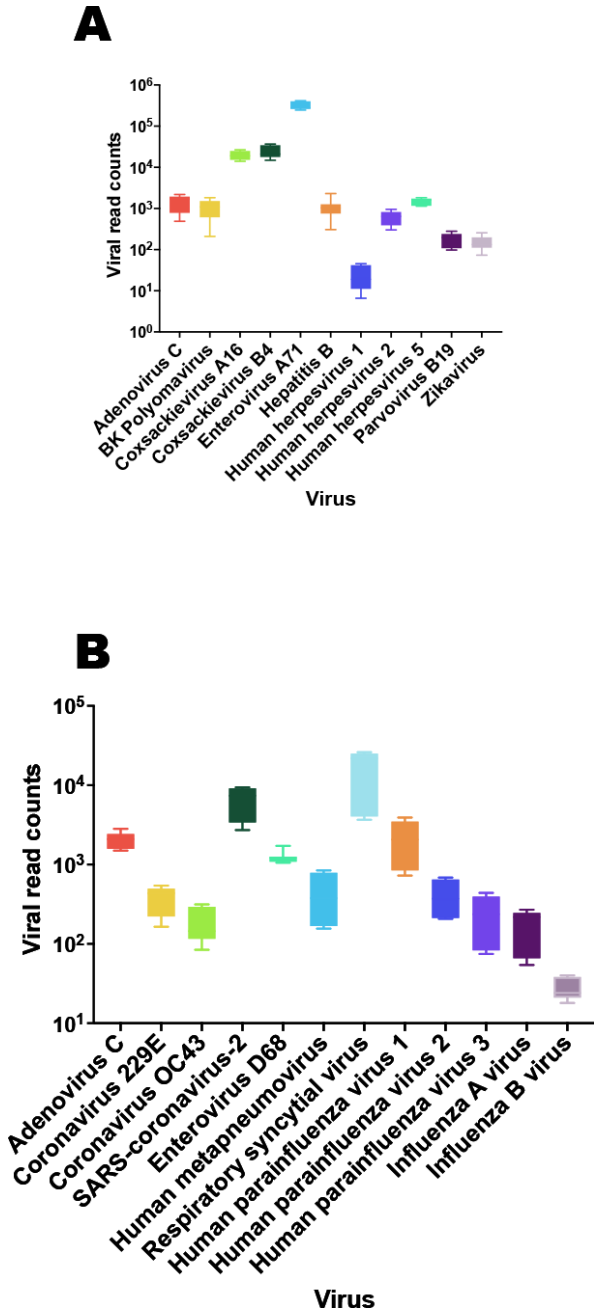


FIG 3 Repeatability and reproducibility for the (A) systemic and (B) respiratory test validation experiments. Negative specimen matrices (plasma or nasal swabs in VTM) were spiked with viruses at 5x their respective LoD (see Table 2). The boxplots represent values for the 10–90% of the normalized viral read counts after host subtraction.

TABLE 3 Detection of co-infections in plasma samples

Mix	Virus	Viral Load	Co-infections				
			Conc./mL	Detected	Total reads	Viral Reads	Viral Reads/M
M1	Adenovirus 1	High	5.00E + 04	+	3,048,365	795,972	261,114
	Coxsackievirus A16	LoD	5.00E + 00	+		1,404	461
M2	Adenovirus 1	LoD	5.00E + 00	+	2,924,053	85	29
	Coxsackievirus A16	High	5.00E + 04	+		438,814	150,070
M3	Human herpesvirus 5	High	5.00E + 04	+	2,186,442	2,329	1,066
	Enterovirus A71	LoD	5.00E + 00	+		16,663	7,621
M4	Human herpesvirus 5	LoD	5.00E + 00	-	37,343,993	10	1
	Enterovirus A71	High	5.00E + 04	+		30,033,914	804,250
M5	BK polyomavirus	LoD	5.00E + 01	+	2,310,452	53	28,372
	Hepatitis B virus	High	5.00E + 04	+		65,553	24
M6	Human herpesvirus 1	High	5.00E + 04	+	4,824,399	1,418,998	294,130
	Human parvovirus B19	LoD	5.00E + 01	+		126	26
M7	Human herpesvirus 1	LoD	5.00E-01	+	2,115,787	224	106
	Human parvovirus B19	High	5.00E + 04	+		222,780	105,294
M8	Human herpesvirus 2	High	5.00E + 04	+	3,056,605	474,699	325
	Zika virus	LoD	5.00E + 01	+		994	155,303
M9	Human herpesvirus 2	LoD	5.00E-01	+	2,386,911	606	4,328
	Zika virus	High	5.00E + 04	+		10,331	254
M10	Coxsackievirus B4	High	5.00E + 04	+	3,479,489	948,246	272,525
	Enterovirus A71	LoD	5.00E + 01	+		19,391	5,573
M11	Coxsackievirus B4	LoD	5.00E-01	+	97,052,301	3,361	35
	Enterovirus A71	High	5.00E + 04	+		79,274,785	816,825
M12	BK polyomavirus	High	5.00E + 05	+	24,259,301	4,462	184
	Hepatitis B virus	High	5.00E + 05	+		8,042	332
	Human herpesvirus 1	High	5.00E + 05	+		37,386	1,542
	Human parvovirus B19	High	5.00E + 05	+		41,967	1,730

validated the LoD of 5 copies/mL for HHV-5 by generating another 10 replicates of HHV-5 in plasma at LoD and all were correctly detected (Table S3).

Diagnostic concordance

For systemic infections, we tested clinical specimens sourced commercially. Clinical specimens positive for additional viruses to those used for analytical validation (Table 1) were included based on availability. These were HHV-4, HHV-6, and HCV-positive specimens. Findings with these specimens provided additional support for the utility of the platform in detecting and differentiating between related members within a virus family, subfamily, or genus. VirCapSeq-VERT results matched previous diagnoses with the exception of three HHV-4 samples and two HBV samples. The provided qPCR Ct values for the negative HHV-4 samples were 42.7, 42.1, and 40.6. The negative HBV samples had a load <10 and 20 IU. We conducted independent qPCR with CE-cleared tests, confirmed our VirCapSeq-VERT results, and concluded that discordance may reflect sample degradation from the date of the initial clinical testing and receipt for VirCapSeq-VERT analysis. CLEP advised us to create additional contrived material for viruses not adequately represented in the available clinical samples. Table 5 lists data for all plasma samples examined during clinical validation. VirCapSeq-VERT demonstrated a 100% clinical sensitivity and specificity on the valid samples. For respiratory infections, we tested 50 banked clinical nasal swab specimens that were diagnosed for respiratory pathogens using the BioFire Diagnostics FilmArray Respiratory Panel. We were blinded at the time of sample processing and data analysis but were provided results of the initial molecular characterization. Some of these samples had coinfections at the time of initial testing (see Table S4). There were instances where we did not detect the purported virus

TABLE 4 Detection of coinfections in nasal swab samples

Mix	Virus	Viral Load	Coinfections				
			Concentration Copies/mL	Detected	Total reads	Viral Reads	Viral Reads/M
M1	Influenza A virus	LoD	5.00E + 01	+	41,026,700	1,050	26
	Coronavirus OC43	High	5.00E + 04	+		35,158,111	856,957
M2	Influenza A virus	High	5.00E + 04	+	3,517,029	110,729	31,484
	Coronavirus OC43	LoD	5.00E + 01	+		1,524	434
M3	Adenovirus C	LoD	5.00E + 01	+	4,486,231	17,335	3,864
	Human metapneumovirus	High	5.00E + 04	+		1,112,083	247,888
M4	Adenovirus C	High	5.00E + 04	+	7,830,480	3,934,006	502,397
	Human metapneumovirus	LoD	5.00E + 01	+		1,253	161
M5	Human parainfluenza virus 2	LoD	5.00E + 00	+	18,636,157	1,117	60
	Respiratory syncytial virus	High	5.00E + 03	+		12,985,557	696,794
M6	Human parainfluenza virus 2	High	5.00E + 03	+	4,563,732	1,327,348	290,847
	Respiratory syncytial virus	LoD	5.00E + 00	+		105,840	23,192
M7	Influenza B virus	LoD	5.00E + 01	+	2,994,401	493	165
	Human parainfluenza virus 3	High	5.00E + 04	+		123,490	41,240
M8	Influenza B virus	High	5.00E + 04	+	2,698,984	122,712	45,466
	Human parainfluenza virus 3	LoD	5.00E + 01	+		170	63
M9	Coronavirus 229E	LoD	5.00E + 01	+	22,887,286	4,578	200
	Enterovirus D68	High	5.00E + 04	+		18,213,661	795,799
M10	Coronavirus 229E	High	5.00E + 03	+	5,676,372	2,873,451	506,213
	Enterovirus D68	LoD	5.00E + 00	+		5,660	997
M11	Human parainfluenza virus 1	LoD	5.00E + 00	+	2,687,212	2,394	891
	SARS-CoV-2	High	5.00E + 03	+		2,530,082	941,527
M12	Human parainfluenza virus 1	High	5.00E + 04	+	21,726,230	7,880,254	362,707
	SARS-CoV-2	LoD	5.00E + 01	+		31,929	1,470
M13	Influenza A virus	High	5.00E + 04	+	25,261,588	72,567	2,873
	Respiratory syncytial virus	High	5.00E + 04	+		6,748,813	267,157
	Influenza B virus	High	5.00E + 04	+		143,347	5,675
	SARS-CoV-2	High	5.00E + 04	+		8,634,842	341,817

by VirCapSeq-VERT analysis. Accordingly, we conducted additional qPCR tests to examine whether discordance represented the failure of VirCapSeq-VERT. Ten of eleven discordant samples were found to be negative in subsequent CE or FDA EUA qPCR assays. These results suggest that discordance was due to sample degradation between the initial tests and later VirCapSeq-VERT and qPCR analyses. One of the discordant samples was positive for adenovirus sequence in qPCR after 36 cycles, demonstrating a low viral load

TABLE 5 Data demonstrating diagnostic concordance with qPCR assay for plasma specimens

Virus	# of specimen tested (true clinical +contrived)	VirCapSeq results (positive/tested)	In-house qPCR results on discordant samples (positive/tested)
Adenovirus 1	10 (0 + 10)	10/10	
BK polyomavirus	10 (8 + 2)	10/10	
Coxsackievirus B4	5 (0 + 5)	5/5	
Enterovirus A71	6 (0 + 6)	6/6	
Human herpesvirus 4 ^a	4 (4 + 0)	1/4	0/3
Human herpesvirus 5	4 (4 + 0)	4/4	
Human herpesvirus 1	10 (0 + 10)	10/10	
Human herpesvirus 6 ^a	4 (4 + 0)	4/4	
Hepatitis B virus	14 (4 + 10)	12/14	0/2
Hepatitis C virus ^a	2 (2 + 0)	2/2	
Human parvovirus B19	8 (4 + 4)	8/8	
Zika virus	11 (0 + 11)	11/11	

^aIncluded based on clinical specimen availability but not part of the validation test.

TABLE 6 Data demonstrating diagnostic concordance with BioFire FilmArrays for the respiratory specimens

Virus in specimen	BioFire results (positive/tested)	VirCapSeq-VERT results (positive/tested)	In-house qPCR results on discordant samples (positive/tested)
Adenovirus	12/12	9/12	1/3
Coronavirus OC43	3/3	3/3	
SARS-CoV-2	1/1	0/1	0/1
Enterovirus/rhinovirus	14/14	13/14	0/1
Influenza A virus	5/5	4/5	0/1
Human metapneumovirus	4/4	4/4	
Human parainfluenza virus 3	5/5	4/5	0/1
Respiratory syncytial virus	15/15	12/15	0/3

in the specimen. Table 6 and S4 summarize the results of the clinical specimen testing and concordance between the BioFire assay and VirCapSeq-VERT, and results of CE or FDA EUA confirmation qPCR assays for negative discordant specimens. Viral genome coverages across a range of viral reads for a few clinical specimens are displayed in Fig. S1.

VirCapSeq-VERT provided insights that were not achieved with PCR assays and in two instances detected coinfections (RSV in one sample and influenza C in another, Table S4) that were not indicated by the initial tests. For nasal swab testing VirCapSeq-VERT demonstrated significant concordance for valid specimens with a clinical sensitivity of 98% and specificity of 100%.

DISCUSSION

NGS has transformed the field of pathogen discovery and surveillance (39–42). It has nonetheless not been widely applied in clinical microbiology laboratories due to cost, complexity, insensitivity, and lengthy turnaround times. Capture sequencing addresses each of these limitations. Through positive selection, relevant targets are enriched, while nonrelevant nucleic acids from the host and environment are substantially reduced. This approach results in two to three orders of magnitude enhancement in sensitivity at a reduced cost. An additional advantage of capture sequencing is that it mitigates Health Insurance Portability and Accountability Act (HIPAA) concerns because host sequence data are not collected.

In previous studies, VirCapSeq-VERT has enabled differential diagnosis of unexplained febrile illnesses in Tanzania, clusters of severe respiratory infections in Uganda, as well as meningitis in the UK, and myocarditis in Canada and Switzerland (19, 23, 25, 29). These studies were conducted under the research use only designation because, at the time the work was conducted, NGS-based infectious diseases assays, including VirCapSeq-VERT, were not certified as diagnostic tests. A critical step in the transition of NGS from research facilities to clinical microbiology laboratories is validation by regulatory agencies based on the demonstration of assay performance. We report here the validation of the VirCapSeq-VERT platform for detecting viral nucleic acid in plasma and nasal swabs. With LoDs established at ≤ 50 copies/mL it has sensitivity comparable to qPCR, is highly reproducible, can detect multiple viruses in a single sample, and matches the results obtained with accepted gold standard assays such as qPCRs and FilmArrays.

A key challenge we encountered in our validation efforts was accurate quantitation of the viral cultures. Other groups have reported sensitivity in terms of plaque forming units or 50% tissue culture infectious dose (43–46). Both of these methods are cumbersome and subjective, and at times yield conflicting results for identical starting cultures in a direct comparison (47, 48). Other methods used for virus quantitation include qPCR and western blots (47). Though faster and easier to use, qPCRs nevertheless pose a similar challenge where two independent assays targeting the same virus can yield differing titers (46, 49). We observed this discrepancy firsthand when we used multiple PCR assays in parallel. For consistency, we used titers quantified by regulatory approved

assays. One limitation of our validation is that we did not have the resources to conduct additional 2-fold dilutions or Probit analyses to determine LoDs with better accuracy and established them based on our current data for the 10-fold dilutions.

VirCapSeq-VERT achieved results that are highly concordant with other molecular platforms currently used in clinical microbiology laboratories. We do not have information about the nature of the PCR assays that were used for the initial tests on plasma samples procured from ARUP Labs. The respiratory specimens were previously tested using BioFire FilmArrays. It has been reported that the BioFire FilmArray is unable to differentiate between adenovirus species and between entero- and rhinoviruses (43). As anticipated, VirCapSeq-VERT detected as well as enabled species identification for these viruses in clinical specimens. Additionally, VirCapSeq-VERT identified coinfections that were not indicated in the clinical tests.

Clinical samples also included sequences of anelloviruses, herpesviruses HHV-6, HHV-7, HHV-8, papillomaviruses, and endogenous retroviruses. Their significance is uncertain as they are not known to be associated with the acute febrile illness that led to clinical analysis.

VirCapSeq-VERT is designed to detect all vertebrate viruses. It is not feasible to test all known viruses; however, the representative viruses we did test varied in genome structure and length and included both RNA and DNA viruses. The strength of this platform is that it is not limited to pathogens with DNA genomes (50), a limited repertoire of pathogens (51), and that it has sensitivity comparable to qPCR and has obtained regulatory approval for clinical testing from the NYSDOH. Additionally, although we have not yet obtained regulatory approval for expedited processing, we have preliminary data to indicate that the time required from sample receipt to agent identification can be reduced from the current 24–36 hours to around 12 hours. As the NGS field continues to evolve, we anticipate that clinicians will have access to actionable data in a time frame that reduces mortality, morbidity, and healthcare costs.

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ADDITIONAL FILES

The following material is available [online](#).

Supplemental Material

Figure S1, Tables S1 to S4 (JCM00612-23-S0001.docx). Supplemental figure and tables.

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