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## Adeno-associated virus in the liver: natural history and consequences in tumor development

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Abbreviation : AAV, Adeno-associated virus; AdV, adenoviruse; AAP, assembly-activating protein; BWA, Burrows-Wheeler Aligner; CCK, cholangiocarcinoma; CNA, copy number alteration; FLC, fibrolamellar carcinoma; FNH, focal nodular hyperplasia; HBV, hepatitis B virus; HCV, hepatitis C virus; HB/TLCT, hepatoblastoma or transitional tumor; HCA, hepatocellular adenoma; HCC, hepatocellular carcinoma; HHV1 or HSV1, herpes simplex virus type 1; HHV2 or HSV2, herpes simplex virus type 2; HHV4 or EBV, Epstein-Barr virus; HHV5 or CMV, Cytomegalovirus; HHV8 or KSHV, Kaposi's sarcoma-associated herpesvirus; HHV6, human herpesvirus type 6; HHV7, Human betaherpesvirus 7; HHV, human herpesviruses; HPV16, human papillomavirus type 16; HVR, hypervariable region; IGV, Integrative Genomics Viewer ; IRB, institutional review board; ITR, inverse tandem repeat; NT, non-tumor; rAAV, recombinant AAV; shHCA, qRT-PCR, quantitative Real-Time Polymerase Chain Reaction; sonic hedgehog molecular adenoma; TFBS, transcription factor binding site; TSS, transcription start site; T, tumor.

Key words: Adeno Associated Virus, AAV2, AAV13, hepatocellular carcinoma, hepatocellular adenoma, cyclin, telomerase, insertional mutagenesis.


#### Abstract

Objective: Adeno-associated virus (AAV) is a defective mono-stranded DNA virus, endemic in human population $(35-80 \%)$. Recurrent clonal AAV2 insertions are associated with the pathogenesis of rare human hepatocellular carcinoma (HCC) developed on normal liver. This study aimed to characterize the natural history of AAV infection in the liver and its consequence in tumor development. Design: Viral DNA was quantified in tumor and non-tumor liver tissues of 1461 patients. Presence of episomal form and viral mRNA expression were analyzed using a DNAse/TaqMan based assay and quantitative RT-PCR. In silico analyses using viral capture data explored viral variants and new clonal insertions. Results: AAV DNA was detected in $21 \%$ of the patients, including $8 \%$ of the tumor tissues, equally distributed in 2 major viral subtypes: one similar to AAV2, the other hybrid between AAV2 and AAV13 sequences. Episomal viral forms were found in $4 \%$ of the non-tumor tissues, frequently associated with viral RNA expression and human herpesvirus type 6 (HHV6), the candidate natural AAV helper virus. In 30 HCC , clonal AAV insertions were recurrently identified in CCNA2, CCNE1, TERT, TNFSF10, KMT2B and GLII/INHBE. AAV insertion triggered oncogenic overexpression through multiple mechanisms that differ according to the localization of the integration site. Conclusion: We provided an integrated analysis of the wild type AAV infection in the liver with the identification of viral genotypes, molecular forms, helper virus relationship and viral integrations. Clonal AAV insertions were positive selected during HCC development on noncirrhotic liver challenging the notion of AAV as a non-pathogenic virus.


## Significance of this study

## What is already known about this subject?

- The seroprevalence of AAV in general population is $40-80 \%$ and AAV2 is the most frequent serotype in human.
- AAV has a biphasic life cycle characterized by latent and lytic phases. The presence of a helper virus is required for the AAV replication.
- It is commonly believed that Adenovirus is the natural AAV helper virus.
- Although AAV is considered a non-pathogenic virus, recurrent clonal AAV2 insertions were associated with HCC development.


## What are the new findings?

- Two viral subtypes are present in 21\% of the liver tissues: AAV2 and hybrid AAV2/13 sequences.
- Episomal AAV forms are found in 4\% of non-tumor liver tissues, mainly in young, female patients without liver fibrosis.
- Human herpesvirus type 6 (HHV6) is the most frequent AAV helper virus in the liver.
- The $2 \%$ of HCC patients displayed clonal AAV integration in cancer driver genes.
- AAV clonal insertion in HCC activates oncogenes using various mechanisms.

How might it impact on clinical practice in the foreseeable future?

- These findings are important to understand wild type AAV biology and its association with hepatocarcinogenesis. Our data are particularly relevant considering the large usage of AAV vector in liver-targeted gene therapy.
- Even if rare, AAV insertional mutagenesis is a new risk factor of HCC development, therefore the notion of AAV as non-pathogenic virus should be reviewed.


## INTRODUCTION

Adeno-associated virus (AAV) is a small non-enveloped DNA virus with an icosahedral capsid that contains a 4.7 kb linear single-stranded genome. ${ }^{1,2}$ AAV genome codes for non-structural proteins (Rep78, 68, 52 and 40), capsid proteins (VP1, VP2, VP3) and the assembly-activating protein (AAP). ${ }^{3,4}$ At the extremities, inverse tandem repeats (ITR) are important for the integration in host genome. ${ }^{5,6} \mathrm{AAV}$ is a defective virus that requires a helper virus for an active infection, otherwise it can establish a latent infection through integration into host genome or maintenance as circular episomal form..$^{7-9}$ AAV seroprevalence showed that the infection is endemic in human populations ( $30-80 \%$ ) starting during childhood. ${ }^{10-12}$ Twelve distinct serotypes and more than 100 natural variants have been identified, among which AAV2 is the most frequent type in human. ${ }^{13-16}$
This small virus is attractive for gene therapy because of the lack of identifiable associated disease and the remarkable ability of recombinant AAV (rAAV) vectors to transduce dividing and non-dividing cells with high efficiency, long-term transgene expression, low immunogenicity and specific tissue tropism. ${ }^{17}$ Although AAV was discovered in 1965, many questions regarding the natural history of AAV infection in human remain unanswered. ${ }^{2}$ It is well known that the vector predominantly persists in the nucleus as episomal form with sustained RNA expression raising question on putative episomal AAV form in wild type infection. ${ }^{8}$ Several helper viruses have been identified but their precise association with wild type liver AAV infection remain unclear. The frequency of the different AAV genotypes in the human population and AAV persistence in tissues after first infection remains to be determined. ${ }^{18}$ Moreover, AAV link with tumor development is controversial, with some studies reporting an oncogenic effect of AAV infection in animal model and others suggesting a tumor suppressive role. ${ }^{19-24}$
Recently, we reported the involvement of AAV2 in the pathogenesis of human hepatocellular carcinoma (HCC) developed on normal liver in the absence of classical HCC risk factors such as infection with hepatitis B or C viruses (HBV and HCV), high alcohol intake, hemochromatosis or aflatoxin B1 exposure. ${ }^{25}$ Similarly to HBV, recurrent AAV2 clonal insertions were described in TERT, CCNE1 and CCNA2 cancer driver genes, leading to their overexpression. ${ }^{25-28}$ The AAV insertions can activate oncogenes located nearby in the human genome by a liver promoter recently identified within the minimal common AAV inserted sequence adjacent to the 3 'ITR of the virus. ${ }^{29}$
In this work, we investigated the natural history of wild type AAV infection in the liver and its consequences in tumor development in a large cohort of 1461 patients with benign or malignant liver tumors.

## MATERIALS AND METHODS

## Patients and tissue samples

A series of 1461 patients was included in the study approved by our local institutional review board (IRB) committees (CCPRB Paris Saint-Louis, 1997 and 2004; Bordeaux 2010-A0049831, Ile-de-France VII: projects C0-15-003 and PP 16-001). Liver tissues were frozen immediately after surgery in French hospitals. Tumor and non-tumor counterparts were analyzed in 1269 patients, only the tumor or non-tumor tissues were investigated for 138 and 54 patients respectively. The present series included HCC ( $\mathrm{n}=936$ ), hepatocellular adenomas (HCA, $\mathrm{n}=225$ ), focal nodular hyperplasia ( $\mathrm{FNH}, \mathrm{n}=97$ ), hepatoblastoma or transitional tumors (HB/TLCT, $n=87$ ), cholangiocarcinoma (CCK, $n=46$ ), fibrolamellar carcinoma (FLC, $n=36$ ) and other tumors ( $\mathrm{n}=34$, Supplementary table 1).

## Viral DNA screening

Genomic DNA were analyzed for the presence of viral DNA by quantitative PCR on Fluidigm 96.96 dynamic arrays using the BioMark Real-Time PCR system with TaqMan probe sets designed with Primer3Plus software (Supplementary figure 1A and supplementary table 2). Results were analyzed using the Fluidigm Real-Time PCR Analysis software (4.1.3) and reported to a reference gene, HMBS. The quantification was expressed in viral copy number/cell. Copy number/cell values were tested for unimodal and bimodal distribution using normalmixEM function of mixtools package in R. ${ }^{30}$

## Isolation of human AAV using viral capture sequencing

Viral capture of genomic DNA was performed for tumor and matched normal sample, sequence as previously described using 120-mer primers recognizing all AAV genotypes 1 to 13 already described with around 305 probes/genotype. ${ }^{25}$ Viral reads were mapped to all AAV1- to 13 reference sequences using BWA (Burrows-Wheeler Aligner, version 0.7.15). ${ }^{31}$ The number of AAV reads correlates with the number of viral copies/cell (Supplementary figure 1B). Read pairs with at least one read aligned on the virus were extracted using samtools (v1.3), ${ }^{32}$ and aligned to a custom reference genome including human chromosomes and virus sequences. We calculated the number of reads mapping the AAV/human chimeric and mate regions in each samples by generating a 20 k -bin size bed for hg 19 genome which was used for computations with bedtools multicov utility. ${ }^{33}$ For each bin, we calculated the mean of coverage in the samples displayed in a pan genomic plot. We used chimeric reads to identify insertion breakpoints at base resolution by mapping sequences on both sides of the junctions. Clonal events were considered when more than 25 reads overlapped the same locus, putative subclonal insertions when 4 to 24 overlapping reads were identified. All viral insertions were validated by visual inspection on IGV (Integrative Genomics Viewer). Sequences have been deposited in the Genbank database MK231253 to MK231264 and KT258720 to KT258730.
The analysis of full-length human-AAV sequences is detailed in Supplementary Material and Methods. Sequences have been deposited in the Genbank database MK139243 to MK139299 and MK163929 to MK163942.

## RNAseq

Samples enriched in poly(A)+ RNA were sequenced using Illumina ${ }^{\circledR}$ TruSeq Stranded mRNA kit on HiSeq2000 sequencer, yielding approximately 45 million 100-base-pair (bp) paired-end reads (IntegraGen, Evry). ${ }^{34}$ Reads were aligned and chimeric sequences reconstructed with TopHat2 ${ }^{35}$ and Cufflinks v2.2.1. ${ }^{36}$ We used ElemeNT ${ }^{37}$ to predict transcription start sites (TSS), Alamut Visual software (Interactive Biosoftware) to identify splicing signals on the chimeric DNA sequence, ATGpr ${ }^{38}$ to identify translation initiation sites and Poly(A) Signal Miner to identify PolyA sites. ${ }^{39}$ Sequences were deposited in EGA database (EGAS00001002879, EGAS00001001284 and EGAS00001003310).

## Detection of viral episomal form

A specific DNAse/TaqMan based assay was adapted from Werle-Lapostolle's protocol ${ }^{40}$ to detect AAV episomal form (detailed procedures in Supplementary Material and Methods). Junctions of the circular AAV were amplified using 2 couples of primers surrounding the ITRs (Supplementary table 2) in $2.5 \%$ glycerol and $5 \%$ DMSO. PCR products were sequenced by Sanger after ExoSAP-IT (Applied Biosystem) purification. ${ }^{41}$

## Quantitative RT-PCR

AAV mRNA and inserted target genes expressions were analyzed using quantitative RealTime Polymerase Chain Reaction (qRT-PCR). Specifically, we used 7 AAV custom made and human catalog TaqMan probes (Supplementary table 2) with AB7900HT PCR System (Applied Biosystem) and BioMark Real-Time PCR system. Expression data were normalized with the $2^{-\Delta \mathrm{Ct}}$ method relative to ribosomal 18S (Hs03928990_g1). Five normal tissues were used as reference.

## Site Directed Mutagenesis

The role of the viral poly-A signal in AAV-induced gene over-expression was investigated in 2 plasmids containing AAV insertions in the $3^{\prime}$ UTR of TNFSF10. ${ }^{25}$ QuikChange Lightning site-directed mutagenesis kit (Agilent) was used to introduce 4 point mutations in the viral poly-A signal (NC_001401: $4424 \mathrm{~A}>\mathrm{C}, 4426 \mathrm{~T}>\mathrm{G}, 4427 \mathrm{~A}>\mathrm{C}, 4429 \mathrm{~A}>\mathrm{C}$ ). All mutations were verified using Sanger sequencing.

## Cell Culture, transfection and dual luciferase assay

HuH7, HepG2 and HuH6 cells were purchased from ATCC and cultured in DMEM supplemented with $10 \%$ FBS and $100 \mathrm{U} / \mathrm{mL}$ penicillin/streptomycin. Cells were tested for mycoplasma contamination. Identity was verified by exome sequencing. Cells were transfected using Lipofectamine 3000 (Life Technologies) with pmirGLO plasmid (Promega) containing wild-type TNFSF10 3'UTR, the 3'UTR with AAV2 insertions or scrambled AAV2 sequence downstream a luciferase reporter gene. Luminescence from firefly luciferase was normalized on the corresponding renilla luciferase activity. Fold change was calculated relative to the wild type TNFSF10 3'UTR construct.

## Statistical analysis

Statistical analyses were performed using RStudio (v1.0.136) and GraphPad Prism (v6.0a). Relationship between AAV and clinical, histological features of the patients was investigated using Chi-square test. $P$-values adjustment was computed for a Monte Carlo test with 2,000 permutations. Statistical significance of quantitative variable was determined by Wilcoxon test. Association among variables was modelled by a multinomial logistic regression. Luciferase activity of transfected vs control cells was compared using Student's t-test. All tests were 2tailed and a $P$-value $<0.05$ was considered as significant.

## RESULTS

## Identification of two major AAV genotypes in the liver

Screening of frozen liver tissues from 1,319 patients with 6 Taqman probes distributed along the genome that collectively recognize all AAV genotypes 1 to 13 identified AAV DNA in $18 \%(\mathrm{n}=233)$ of non-tumor liver tissues (Supplementary figure 1). For viral AAV DNA capture of all known genotypes 1 to 13 , we selected 80 non-tumor liver samples including 68 positive samples ranging from $2 \times 10^{-4}$ to 0.18 copy number/ cell. After sequencing, a full-length AAV sequence was reconstructed in 57 samples and two major AAV subtypes were identified (Figure 1A-B). The first subtype ( $\mathrm{n}=25$ ) is highly similar to AAV2 reference sequence (NC_001401) and to VP1 Clade B genotype isolated in human ${ }^{14,42}$ (Supplementary figure 2). The second subtype ( $\mathrm{n}=32$ ), showed hybrid sequences including various parts of the AAV13 capsid (similar to Clade $\mathrm{C}^{14,42}$ ) and c-ter in the context of an AAV2 5 'part, it was named AAV2/13 (Figure 1B and Supplementary figure 2). We identified along the viral genome 42 silent variants shared by both AAV subtypes, but different from the AAV2 reference NC_001401 (Figure 1C). In contrast, several nucleotide variants leading to amino acid substitutions in AAV2/13 sequences were located in the hypervariable regions (HVRs) 5, 67 and 10 and originated from AAV13 sequence (Figure 1B-C). Screening the overall series of 1,319 samples with two probes specific of AAV2/13 subtype and located in the CAP2 region (Supplementary figure 1), identified 47.6\% AAV2 and 52.4\% AAV2/13 genotypes among 143 samples positive for the variable region.

## AAV infection and episomal form

In the 233 AAV positive liver samples, quantification of the viral DNA showed a bimodal distribution: $97 \%$ of the tissues exhibited a low number of copy/cell (ranging from $4.6 \times 10^{-5}$ to 0.04 ) and only 8 patients showed a higher quantity of AAV ranging from 0.07 to 0.18 copy/cell (Figure 2A). AAV was significantly enriched in female ( $\mathrm{p}<0.001$ ), young patients ( $\mathrm{p}=0.016$ ) and occurred more frequently in a background of non-fibrotic liver ( $\mathrm{p}<0.001$; Figure 2B).
In 64/233 (27.5\%) of the tissues positive for AAV, all the genomic AAV regions were amplified suggesting the presence of the entire viral genome. We designed a DNAse/TaqMan based assay (Supplementary figure 3A), which allowed to detect episomal AAV in 60 patients, corresponding to $26 \%$ of AAV positive samples and $4.6 \%$ of all patients. Using in silico analyses of the AAV capture sequencing, among the 57 cases with a complete reconstructed AAV genomic sequence, we identified 14 cases with $3^{\prime}$ ITR-5'ITR junctions. Circularized concatemeric structures may escape from our experimental method to identify episomal form, ${ }^{43}$ however, we did not identified insertion of concatemer in silico. The 3'ITR-5'ITR junctions showed various sequences presenting a double-D ITR structure, in flip or flop configuration, with a 125 bp deletion confirmed by Sanger sequencing (Supplementary figure 3C-D and 4).

## AAV transcription is associated with episomal form

Then, we screened for AAV RNA expression in 101 non-tumor liver tissues positive for AAV by qRT-PCR. AAV transcript was identified in $64 \%$ of the tested liver tissues. Either AAV

REP or CAP expression were enriched in liver tissues with episomal form ( $\mathrm{p}<0.001$ ) and both transcripts were more frequently associated in presence of episomal than not-episomal AAV form ( $\mathrm{p}=0.022$ ), defining a population of patients with an "episomal-expressed AAV" (Figure 2C). A higher AAV copies per cell was identified in liver tissues with episomal-expressed AAV, supporting the hypothesis of a viral active infection in these liver samples (Figure 2D). Episomal AAV were also more frequent in female ( $p<0.001$ ) and non-cirrhotic patients ( $\mathbf{p}<0.001$; Supplementary figure 5A). Analysis of AAV positivity in function of age showed a peak of frequency at $25 \%$ in the $30-40$ years class. AAV episomal form was more frequent in young patients ( $<40$ years old) reaching the highest frequency level in the twenties (Figure 2E and Supplementary figure 5B). These results suggest that AAV active infection is more frequent in the second and third decade during life, while inactive not-episomal forms subsist after the primary infection.

## Co-infection with AAV helper viruses

As AAV is a defective virus, we searched for the presence of potential AAV helper viruses by screening the entire cohort of 1,319 liver tissues for human adenoviruses (AdV types A to F), human herpesviruses (HHV type 1, 2, 4, 5, 6, 7 and 8) and human papillomavirus type 16 (HPV16) by quantitative PCR. At least one of these viruses was detected in $43 \%$ of the patients ( $\mathrm{n}=570$ ), and only one per patient in $39 \%(\mathrm{n}=520)$. HHV6 was the most frequent (39\%), then HHV4 (Epstein-Barr virus, EBV, 6\%), while HHV7 and adenovirus were only rarely detected ( $2 \%$ and $0.5 \%$ respectively, Figure 3A). No HPV16 and HHV type 1 (HSV1), 2 (HSV2), 5 (CMV) and 8 (KSHV) were found in our cohort of liver tissues. HHV6 was the only helper virus enriched in AAV positive patients ( $37.3 \%$ versus $44.8 \%, \mathrm{p}=0.039$ ), in particular in patients with episomal or expressed-episomal forms ( $52.5 \%$ and $67.9 \%$ respectively, p $<0.001$; Figure 3B).
To identify independent features associated with AAV infection in the overall cohort of patients, we performed a multivariate analysis (Figure 3C). Female gender (odds ratio, $\mathrm{OR}=1.83, \mathrm{p}<0.001$ ), the age ( $\mathrm{OR}=1.42, \mathrm{p}=0.044$ ), non-cirrhotic liver ( $\mathrm{OR}=1.96, \mathrm{p}<0.001$ ) and co-infection with HHV6 ( $\mathrm{OR}=1.15, \mathrm{p}=0.031$ ) were independently associated with AAV positivity. Three factors were also significantly associated to the presence of episomal and expressed AAV: female gender ( $\mathrm{OR}=4.71, \mathrm{p}=0.013$ ), non-fibrotic liver ( $\mathrm{OR}=12.13, \mathrm{p}=0.018$ ) and co-infection with HHV6 ( $\mathrm{OR}=1.61, \mathrm{p}=0.01$ ).

## AAV in tumor tissues

AAV DNA positivity was less frequently identified in the tumor tissues ( $\mathrm{n}=109,8 \%$ ) compared to non-tumor liver tissues ( $\mathrm{n}=233,18 \%$ ) with only $4.7 \%$ of patients presenting AAV in both tumor and non-tumor compartments (Figure 4A). Twenty out of the 109 positive tumors showed a high number of AAV copies/cell ranging from 0.07 to 6.08 . This value might be underestimated considering both potential contamination by normal cells and ploidy of tumor hepatocytes. The vast majority ( $\mathrm{n}=83,76 \%$ ) had only 1 or 2 amplified viral regions with an enrichment for the 3'ITR region of the virus (Supplementary figure 6A-B). AAV was detected with a similar frequency in malignant and benign tumors, but with a higher number of copies/cell in malignant tumors corresponding to the clonal AAV insertion events (Figure 4B-

C; Supplementary table 3). Conversely, in all patients with benign tumors except one with focal nodular hyperplasia (FNH), AAV was more highly positive in the non-tumor counterpart than in the corresponding tumor (Figure 4C). Finally, viral episomal forms were rarely identified in tumors ( $\mathrm{n}=8,0.6 \%$ ), mostly in benign tumors ( 4 HCA and 2 FNH ) and only 2 HCC (Supplementary table 3).

## AAV insertion in liver tissues

We identified 7 novel clonal insertions in 6 HCCs, in GLII/INHBE, TERT and CCNA2. Only one clonal insertion was identified in a benign focal nodular hyperplasia, it occurred in an intergenic region of chromosome 10 without consequences on the expression of the nearest genes (Figure 4D and 5). Combining with AAV insertions identified in TCGA and ICGC sequenced $\mathrm{HCC}^{44,45}$ and previously described cases in our cohort, ${ }^{25,34}$ we re-analyzed a total of 30 independent AAV insertions in liver tumors (Supplementary table 4). Viral insertions occurred in both directions, AAV2 and AAV2/13 subtypes were equally represented ( $55 \%$ versus $45 \%$ of the interpretable cases, respectively) and the minimal AAV region commonly inserted (nucleotide 4390-4570) was identified in 25 out of the 30 insertions.
Six oncogenes were recurrently activated by AAV (Supplementary figure 7). Insertions in GLII/INHBE (4 adenomas transformed into HCC), TERT (2 HCC), CCNE1 (7 HCC), TNFSF10 $(2 \mathrm{HCC})$ and $K M T 2 B(2 \mathrm{HCC})$ led in almost all the cases to an overexpression of full-length coding region of these oncogenes by a promoter and/or a enhancer cis mechanism (Figure 5). CCNA2 was inserted in 9 HCC ; all insertions but one clustered in CCNA2 intron 2, they resulted in an abnormal AAV-CCNA2 transcript leading to a stable oncogenic truncated protein lacking the N-terminal regulatory domain (Figure 5D). ${ }^{34}$ The 3'UTR of TNFSF10 showed AAV insertions in two HCC inducing TNFSF10 overexpression with transcripts that prematurely ended at the viral polyadenylation (Figure 5F). Here, using site-directed mutagenesis of both insertions, we demonstrated that the viral poly-A signal is required to ensure a strong luciferase overexpression in 3 different tested cell lines (Supplementary figure 8).

In the non-tumor liver tissues, no clonal AAV insertions were identified; non-clonal insertions were significantly associated to the presence of episomal AAV ( $\mathrm{p}<0.001$ ), in contrast to the tumor samples. In both non-tumor and tumor tissues, non-clonal AAV insertions were randomly distributed along the genome (Figure 4D and Supplementary figure 9). No specific enrichment was found in major target of AAV previously described in cell lines. ${ }^{46,47}$

## AAV features and tumor heterogeneity

We explored inter-tumor heterogeneity by analysing multi-nodules ( $\mathrm{n}=475$ ) from 186 patients for the presence of viral DNA, clonal insertions and episomal form. Of those, AAV DNA was detected in 25 patients (Supplementary figure 6C), including 4 patients with clonal AAV insertion in at least one nodule. Two HCC patients displayed clonal AAV integrations in all nodules. Thanks to the NGS data, we were able to predict the evolution of these tumors by looking at the common and private somatic mutations and copy number alterations (CNA) in each nodule. Interestingly, the 2 tumors from patient \#2557 showed the same viral insertion in

TNFSF10, similar gene mutations and CNA profiles, demonstrating that AAV insertion is a truck alteration occurring before intra-hepatic metastasis (Figure 6A). Conversely, the three tumors from patients \#1919, resulting from a malignant transformation of adenoma in carcinoma, harboured 3 different clonal insertions all targeting GLII, with different gene mutation profile and no CNA suggesting that the three nodules have an independent origin (Figure 6B).

## DISCUSSION

In this study, we provided a comprehensive description at large scale of the different AAV viral forms in the liver and of its oncogenic consequences, contributing to better understand the natural history of AAV infection in human.
The prevalence of AAV was observed in $21 \%$ of patients in non-tumor and/or tumor liver in agreement with the seroprevalence of antibody against AAV identified in 30 to $80 \%$ of the general population. ${ }^{10-12,48}$ Our result showed that one out of 5 patients demonstrates persistent AAV DNA in the liver during life, mainly in the population of young and female patients without liver fibrosis (Figure 7). However, since most of our liver tissues were sampled from patients with liver diseases, the exact prevalence of AAV DNA in the liver of healthy individuals remains to be evaluated.
Only two AAV genotypes, AAV2 and hybrids AAV2/13, were identified in our cohort equally distributed among the patients. AAV2/13 sequences were hybrids between AAV2 in the 5'part and AAV13 in the 3 ' corresponding to the previous clade C of the VP1 classification. ${ }^{14}$ Since only one full-length AAV sequence from clade C was publicly available ${ }^{42}$, our work significantly increased the number human AAV full-length sequences enlightening the genomic variants associated with an efficient natural AAV infection in the liver. In contrast to previous serological analysis, ${ }^{10,11,49}$ we did not identified other AAV genotypes in the liver, even if AAV5 and 8 were frequent in circulating monocytes. ${ }^{48}$
AAV episomal form was identified in the non-tumor tissues of $4.6 \%$ of the patients, representing $26 \%$ of all AAV positive liver samples, whereas episomal AAV has only be described in human tonsil and adenoid previously. ${ }^{9}$ It was frequently associated to viral mRNA expression suggesting that the episomal AAV are also transcriptionally active in a significant proportion of the population in the liver (Figure 7). Several viruses ${ }^{50,51}$ are able to support AAV replication in vitro, and it was commonly admitted that adenovirus is the natural AAV helper. Here, we identified HHV6 as the virus most frequently associated with episomal and transcribed AAV in the liver. This co-occurrence was previously described in healthy blood donors ${ }^{48}$ and HHV6 is able to infect hepatocytes. ${ }^{52-54}$ The increased frequency of HHV6 in patients with episomal-expressed AAV form could indicate an ongoing active infection in the liver of $2.1 \%$ of the patients. In contrast, only very rare patients showed an association with adenovirus or other candidate helper viruses even in livers with episomal and expressed AAV (Figure 7). All these results may suggest the role of HHV6 as the natural helper virus of AAV in the liver. However, co-infection with other helper viruses could occur at the initial acute AAV infection, followed by its clearance. Replication-competent infectious AAV has been rescued from human tonsil and adenoid tissue and lymphocytes, it remain to be searched in fresh liver tissues. ${ }^{48,}{ }^{55}$ Viral clones were isolated and their infectivity was tested in vitro in Hela cells showing that only AAV clones with a complete double-D ITR structure were able to replicate and gave rise to infectious virus. ${ }^{55}$ Interestingly, the analysis of the ITRs junctions of the episomal form in our series highlighted the presence of the same double-D structure supporting its role in an active AAV infection. Moreover, here a peculiar link between episomal-expressed AAV in the liver and age suggested that AAV active infection occurs during the first 3 decades of life and then remains latent.

Analyses of the tumor tissues confirmed the selection of clonal AAV insertion in HCC development in non-cirrhotic liver. Recurrent somatic viral integrations were identified in $2 \%$ of our HCC cohort, targeting CCNA2 (33.3\%), CCNE1 (27.8\%), GLII/INHBE (11.1\%), TERT (11.1\%), TNFSF10 (11.1\%) and KMT2B (5.6\%). AAV insertion induced the overexpression of the target genes through multiple mechanisms that differ according to the target and the localization of the integration. Clonal insertions upstream the TSS or within the $5^{\prime}$ region of the gene lead to the gain of a positive regulatory mechanism such as the usage of viral enhancers and transcription factor binding sites (TFBS). Interestingly, a recent work by Logan and collaborators has described a liver specific enhancer-promoter element in wild-type AAV genome within the common inserted region in HCC tumors. ${ }^{29}$ It consists of 124 nucleotides sequence that contains TFBSs for HNF1- $\alpha$, HNF6 and GATA6. Noteworthy, this region is absent in many AAV vectors currently in use and should raise a biosafety flag or be deleted in the remaining. In line with our finding, this result strongly supports the mechanism of AAV induced over-expression of the target gene. In addition, viral insertions in CCNA2 and TNFSF10 genes led the expression of a truncated protein or the premature ending of the transcript within the viral poly-A, respectively.
AAV oncogenic integrations were not only identified in our cohort of European HCC patients. They were also observed in the ICGC-Japan cohort in 3 HCC cases out of 268 HCC (1.1\%), ${ }^{45}$ in 4 out of $334 \mathrm{HCC}(1.2 \%)$ of the TCGA cohort ${ }^{34}$ and in 2 out of $289 \mathrm{HCC}(0.7 \%)$ from Korea. ${ }^{56}$ Interestingly the most frequent AAV integrated oncogenes are similar to HBV, i.e. CCNA2, CCNE1, TERT and KMT2B. The lower prevalence of AAV could be due to the lack of chronic liver disease associated to active AAV replication in contrast to chronic HBV infection. In the present series, we reinforced the link between AAV oncogenic insertion and the occurrence of HCC in normal liver, including recurrent AAV insertions in the malignant transformation of hepatocellular adenoma in carcinoma targeting GLII that defines the activated sonic hedgehog molecular subgroup of adenoma, shHCA. ${ }^{57}$ In the same line, AAV insertions in cyclin A2 or E1 in HCC are associated with unique chromosomal rearrangement signature and poor prognosis mainly occurring in HCC developed in normal liver. ${ }^{34}$ These results underline the role of AAV insertion in the development of a specific subgroup of HCC without other etiologies.

In conclusion, we provided a portrait of AAV infection in the liver with a description of viral genotypes, molecular forms and helper virus paving the way for a renovated interest in wild type AAV biology. New highlights on the understanding of the oncogenic consequences of AAV integration in HCC tumors emerged from this work. However, further studies are necessary to clarify the impact of AAV infection in additional cohort of patients and the frequency of insertional mutagenesis across different countries.

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## Author contributions

Study design: JCN, JZR, TLB, SI
Generation of experimental data: TLB, SI, CP, IM, SD
Analysis and interpretation of data: TLB, SI, CP, IM, SD, QB, SC, TZH, EL, JCN, JZR
Collection of samples and related histological and clinical data: JCN, JZR, JC, GM, CG, VP, GA, AL, LP, LC, PBS, JFB and investigators.
Drafting of the manuscript: JZR, TL, SI
Revision of the manuscript and approval of the final version of the manuscript: JZR, JCN, TLB, SI, IM, SD, QB, SC, TZH, EL, JC, GM, CG, VP, GA, AL, LP, LC, PBS, JFB.

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Data availability: The sequencing data reported in this paper have been deposited to Genbank (accessions: KT258720-KT258730, MK139243-MK139299, MK163929-MK163942 and MK231253-MK231264) and EGA (European Genome-phenome Archive) database (RNA-seq accessions: EGAS00001002879, EGAS00001001284 and EGAS00001003310). All supplemental data and sequences are available at http://zucmanlab.com/wp-content/uploads/2019/05/Zucman-CaptureVirusProbes.xlsx

Figure 1. AAV Full-length sequences in $\mathbf{5 7}$ human liver tissues. A) Schematic representation of AAV genome (reference NC_001401) with location of the two open reading frames encoding replication proteins (Rep78, Rep68, Rep52 and Rep40), structural proteins (VP1, VP2 and VP3) and AAP protein. Inverted terminal repeats (ITR) are represented on the 5 ' and 3' ends. Promoters (p5, p19 and p40) are indicated with arrows. B) Nucleotides sequences ( 4679 bp ) from 57 full-length AAV isolated from human liver tissues (ID number indicated with \#) multi-aligned with the ClustalW algorithm compared to reference sequences on the top, AAV2 (NC_001401, in white), AAV3 (NC_001729.1) and AAV13 (EU285562.1). Two distinct viral genotypes, AAV2 and AAV2/13 were identified. Color bars indicated nucleotide divergence with the AAV2 reference genome similar to AAV3 and/or AAV13 genomes (green) or not (grey), similarities with NC_001401 are in white. Variations due to flip-flop ITR configurations compared to AAV2 reference are labeled in light grey. The liver-specific enhancer-promoter element (LSP) described by Logan et al. is indicated. ${ }^{29}$ C) Amino acid variations compared to the AAV2 reference are indicated. The triangles indicate genome location of specific AAV2/13 (top) or AAV2 (middle) variants in the series of 57 human liver AAV isolates. Common variants shared by both genotypes are shown (bottom). Grey and black colors refer to silent and missense AAV variants, respectively; numbers correspond to wildtype AAV2 nucleotide sequence coordinates (NC_001401).

Figure 2. AAV DNA in non-tumor tissues and viral episomal form. A) Copy number/cell distribution in 233 samples. The density line defines the low and high positivity groups in blue and red, respectively. B) Contingency analysis of AAV positive and negative patients according to gender, age and Metavir fibrosis score. Frequency of AAV positive patients is displayed ( $\chi^{2}$ test with Monte Carlo simulation and $\chi^{2}$ test for trend in proportions for Metavir score). C) Frequency of RNA expression according to REP and CAP viral transcripts in patients with episomal and not-episomal AAV ( $\chi^{2}$ test with Monte Carlo simulation). D) Viral copy number/cell $\left(\log _{10}\right)$ in AAV positive samples according to the episomal status and the transcriptional activity of the episome (Wilcoxon rank-sum test). E) Distribution of the
 * $\mathrm{P}<0.05$.

Figure 3. Helper viruses according to AAV status. A) Frequency of helper viruses' infections and co-infection in non-tumor tissues ( $\mathrm{N}=1319$ ). B) Global frequency of HHV6, EBV, HHV7 and AdV infection according to AAV presence and form ( $\chi^{2}$ test for trend in proportions). C) Multivariate analysis for global AAV positivity (left) including the variables closely related to AAV presence in the univariate analysis (logistic regression). The same analysis was performed for the presence of episomal AAV (middle) and episomal and expressed form (right). ${ }^{* * * \mathrm{P}<}$ $0.001,{ }^{* *} \mathrm{P}<0.01,{ }^{*} \mathrm{P}<0.05$.

Figure 4. AAV in tumor tissues and non-tumor liver counterparts. A) Copy number/cell ( $\log _{10}$ ) of paired tumor (T) and non-tumor (NT) tissues of each patient ( $\mathrm{n}=1269$ ). Solid and dashed line define respectively the threshold of positivity and the boundaries between high and low number of viral copies per cell. The frequency of patients with AAV in both tumor and non-tumor counterparts or only in one of them is indicated. B) Frequency of AAV in tumor and non-tumor tissues of patients with malignant and benign tumors ( $\chi^{2}$ test with Monte Carlo simulation and Cochran-Mantel-Haenszel for gender adjustment). C) AAV copy number/cell of paired tumor and non-tumor tissues of 270 AAV positive patients grouped in malignant and benign tumor patients. Triangles represent the tumors with clonal AAV insertions (Wilcoxon rank-sum test). D) Pan-genomic views of genomic location of the human/virus matching chimeric and mate reads in tumor (top) and non-tumor (bottom) samples. A line corresponds to a 20k-bin region, color refers to the average number of reads counted per bin. The height of the lines corresponds to the frequency of presence of reads in the series of samples, considering
 * $\mathrm{P}<0.05$.

Figure 5. AAV clonal integration sites and transcripts consequences in tumors. Genes structure are schematized with boxes referring to exons and lines to introns regions. TSS location is shown on $5^{\prime}$ of the gene. Arrows indicate viral insertion sites in our series, in red, and in TCGA and ICGC tumors, in green. Asterisks refers to new inserted cases. Top lines refer to inserted AAV viral regions and arrows to 5' $>3$ ' sequence orientation. Flip or flop 3'ITR are indicated. Observed transcripts are represented at the bottom of the gene structure with fusion viral sequences in red.

Figure 6. Tumor development in patients with multiple nodules and clonal AAV insertions. The relation between the tumors is determined according to gene mutation profile and copy number alteration (CNA) of each nodule. The number of shared and private alterations is indicated above each branch. The major alterations with amino acid consequences are listed; mutations in driver genes and main CNAs are in bold. The AAV status, diagnosis
and sources of genomic information (WGS, WES) are specified for each nodule. The thickness of the branch indicates the number of alterations. The position of the nodules for each patient is represented on the right. A) The two HCC nodules of patients \#2557 display the same AAV insertion in TNFSF10 and they share 199 somatic mutations and several CNAs. This profile suggests that the nodules originate from the same primary tumor. B) The three nodules of patient \#1919 are heterogeneous for mutation profile and AAV insertions suggesting an independent origin of the tumors.

Figure 7. AAV and helper viruses in the general population and in human liver. Frequency of different AAV genotypes and seroprevalence of $\mathrm{AAV}^{10-12}$ and helper viruses ${ }^{50,51}$ in the general population are showed in the upper panel. The error bar in the histogram represents the range of helper viruses seroprevalence according to the literature. The bottom panel summarizes the results found in this study, with estimated frequencies in the general population. For men and women, the global AAV frequency, the presence of episomal transcribed AAV and the prevalence of oncogenic clonal AAV insertions are indicated. *This prevalence is normalized according to the frequency of clonal AAV insertion in HCC (2\%) and the prevalence of HCC in France (0.013\%).


Figure 1
A. Non-tumor tissues $(\mathrm{N}=233 / 1319)$

B.



C.

D.



Figure 2
A.

B.

C.


Figure 3


Figure 4


Figure 5


Figure 6


Figure 7
A. Position of TaqMan probe sets

B. Comparison between qPCR and viral capture


AAV copy number/cell $\left(\log _{10}\right)$

A. Experimental design for detection of episomal AAV form
1.Selection of AAV positive samples
C. Scheme of $3^{\prime}$ ITR-5 $5^{\prime}$ ITR junction amplification

D. PCR amplification of ITRs junction

B. Restriction enzyme map


3' ITR

E. PCR amplification of ITR junction in \#367N








B. Probability of AAV episomal form according to age

A.

C.

E.

B.

D.

F.

A.

TNFSF10 3'UTR constructs

B.



TNFSF10 3'UTR constructs


TNFSF10 3'UTR constructs


TNFSF10 3'UTR constructs
A. AAV insertion in non-tumor liver tissues $(\mathrm{N}=82)$


## Supplementary Information

# Adeno-associated virus in the liver: natural history and consequences in tumor development <br> La Bella T, Imbeaud S. et al. 

## Supplementary Tables

Supplementary Table 1 : Description of the series ( $\mathrm{n}=1461$ patients)
Supplementary Table 2: List of probe setes and primers
Supplementary Table 3: Results of the viral DNA screening
Supplementary Table 4: List of AAV clonal inserted sites in liver tumors

## Supplementary Figures

Supplementary figure 1. AAV detection using quantitative PCR and viral capture.
Supplementary figure 2. Phylogenetic tree on VP1 coding protein region.
Supplementary figure 3. Viral episomal form investigation.
Supplementary figure 4. Viral 3'ITR-5'ITR episomal junction determined by in silico analysis.
Supplementary figure 5. AAV presence in tumor tissues and comparison with non-tumor counterparts.
Supplementary figure 6. AAV presence in tumor tissues and comparison with non-tumor counterparts.
Supplementary figure 7. Impact of clonal AAV integration on the expression of the target oncogenes.
Supplementary figure 8. Viral polyadenylation signal usage in TNFSF10.
Supplementary figure 9. Description of AAV insertions in non-tumor and tumor liver tissues.

## Supplementary Materials and Methods

Computational analysis of human-AAV sequences
Experimental procedure to search for episomal forms of AAV

Supplementary table 1. Description of the series ( $n=1461$ patients)

|  |  |  | Available data | $\begin{aligned} & \text { W(\%) or meoran } \\ & \text { (range) } \end{aligned}$ |
| :---: | :---: | :---: | :---: | :---: |
| 000$I I$$\vdots$00000000 | Gender (female) |  | 934 | 163 (17.5\%) |
|  | Age |  | 930 | 63 (0-90) |
|  | Transformed HCA | (HCC on HCA) | 936 | 17 (1.8\%) |
|  | Largest nodule | ameter ( $>5 \mathrm{~cm}$ ) | 909 | 425 (46.8\%) |
|  | Number Nodule | $(\geq 2)$ | 871 | 244 (28\%) |
|  | Preoperative se | um AFP (>20ng/ml) | 727 | 293 (40.3\%) |
|  |  | Alcohol | 895 | 393 (43.9\%) |
|  |  | HBV | 907 | 164 (18.1\%) |
|  | Risk factors | HCV | 896 | 224 (25\%) |
|  |  | Metabolic syndrome | 843 | 201 (23.8\%) |
|  |  | Without etiology | 912 | 128 (14\%) |
|  |  | F0-F1 | 929 | 264 (28.4\%) |
|  | Metavir score | F2-F3 | 929 | 236 (25.4\%) |
|  |  | F4 | 929 | 439 (46.2\%) |
|  |  | G1 | 596 | 44 (7.4\%) |
|  |  | G2 | 596 | 47 (7.9\%) |
|  | G1-G6 | G3 | 596 | 105 (17.6\%) |
|  | classification | G4 | 596 | 210 (35.2\%) |
|  |  | G5 | 596 | 129 (21.6\%) |
|  |  | G6 | 596 | 61 (10.2\%) |
|  | Tumor | Edmonson I-II | 869 | 381 (43.8\%) |
|  | differentiation | Edmonson III-IV | 869 | 488 (56.2\%) |
|  | Vascular | Macrovascular | 827 | 127 (15.4\%) |
|  | invasion | Microvascular | 827 | 287 (34.7\%) |
| $\text { HCA and FNH patients }(n=322)$ | Gender (female) |  | 320 | 270 (84.4\%) |
|  | Age |  | 312 | 37 (2-68) |
|  | Borderline tumors (HCA/HCC) |  | 322 | 14 (4.3\%) |
|  | Largest nodule diameter ( $>5 \mathrm{~cm}$ ) |  | 221 | 136 (61.5\%) |
|  | Number Nodules ( $\geq 2$ ) |  | 216 | 100 (46.3\%) |
|  | BMI ( $>25 \mathrm{~kg} / \mathrm{m}^{2}$ ) |  | 182 | 69 (37.9\%) |
|  | Children (women only) |  | 132 | 100 (75.8\%) |
|  | Oral contraception (women only) |  | 147 | 128 (87.1\%) |
|  | Diabetes |  | 174 | 19 (10.9\%) |
|  | Glycogenesis |  | 160 | 7 (4.4\%) |
|  | Metavir score | F0-F1 | 229 | 210 (91.7\%) |
|  |  | F2-F3 | 229 | 11 (4.8\%) |
|  |  | F4 | 229 | 8 (3.5\%) |
|  | Molecular subgroups | HHCA | 314 | 62 (19.7\%) |
|  |  | $\mathrm{b}^{\square \wedge 1,0}$-HCA | 314 | 7 (2.2\%) |
|  |  | $\mathrm{b}^{\text {^^, }}$ - IHCA | 314 | 14 (4.5\%) |
|  |  | IHCA | 314 | $66(0,21)$ |
|  |  | $\mathrm{b}^{\text {c^0}}$-IHCA | 314 | 24 (7.6\%) |
|  |  | $\mathrm{b}^{\text {®^v }}$-HCA | 314 | 19 (6.1\%) |
|  |  | shHCA | 314 | 10 (3.2\%) |
|  |  | UHCA | 314 | 15 (4.8\%) |
|  |  | FNH | 314 | 97 (30.9\%) |
|  | Histological tumor type | HB/TLCT | 203 | 87 (42.9\%) |
|  |  | CCK | 203 | 46 (22.7\%) |
|  |  | FLC | 203 | 36 (17.7\%) |
|  |  | others* | 203 | 34 (16.7\%) |

*DMN, LGDN, HGDN, angiomyolipoma, liver carcinosarcoma, liver rhabdoid tumor, solitary fibrous tumor, mesenchymal Hamartoma, embryonal sarcoma, leiomyoma, Yolk-salk-tumor, neuroendocrine carcinoma, neuroblastoma, pecoma, nephoblastoma, malignant peripheral nerve sheath tumor

Supplementary table 2. List of probe setes and primers

| Probe Name | Forward sequence 5'-3' | Reverse sequence 5'-3' | Probe sequence 5'-3' | Target | used for |
| :---: | :---: | :---: | :---: | :---: | :---: |
| AAV2 ORF1 | CGGCATTTCTGACAGCTTTG | GGGTGCCTGCTCAATCA | TGGCCGAGAAGGAATGGGAGTTG | AAV | qPCR, DNase/TaqMan assay |
| AAV2 2 NEW | CTTCTACGGGTGCGTAAACT | GACCTTGGCGGTCATCTT | AGATGGTGATCTGGTGGGAGGAGG | AAV | qPCR, DNase/TaqMan assay |
| AAV2 3 NEW | AGACGCAGACTCAGTACCT | CCCTCGTTATTGTCTGCCAT | AATACGATGGCTACAGGCAGTGGC | AAV | qPCR, DNase/TaqMan assay |
| AAV2 4 NEW | TGACATTCGGGACCAGTCTA | TAGCTCCAGTCCACGAGTATT | TTACCGCCAGCAGCGAGTATCAAA | AAV2 | qPCR, DNase/TaqMan assay |
| AAV2 ITR3 NEV | CCTGACTCGTAATCTGTAATTGC | ACGTAGCCATGGAAACTAGATAAG | TCGTTTCAGTTGAACTTTGGTCTCTGC | AAV | qPCR, DNase/TaqMan assay |
| AAV2 ITR3 | GGTCTCTGCGTATTTCTTTCTTATC | GTGGCCAACTCCATCACTA | ACGTAGATAAGTAGCATGGCGGGT | AAV | qPCR, DNase/TaqMan assay |
| AY6 2 | CTATGGCCAGCCACAAAGA | GTCGTTGGCATTTGTTCCTT | CCCCATGCATGGAACCCTGATA | AAV2/13 | qPCR, DNase/TaqMan assay |
| AY6 1 | CCACCAGCATGTCTCTTCAA | ATACTTTGTAGCCGCAGTCCA | AACTGGCTGCCTGGACCTTGCTA | AAV2/13 | qPCR, DNase/TaqMan assay |
| AAV HidIII | CCCCAGTGACGCAGATATAAGT | CCACGTGACGAGAACATTTG | CAGACGCGGAAGCTTCGATCA | AAV | DNase/TaqMan assay |
| AAV Xmnl | TGGAACTGAACGGGTACGAT | ACAGCCAGATGGTGTTCCTC | TCTGGGATGGGCCACGAAAA | AAV | DNase/TaqMan assay |
| AdV hexon1C | GCTACCCCTTCGATGATGC | ACCGTGGGGTTTCTAAACTTG | AGTGGTCTTACATGCACATCTCGGG | AdV | qPCR |
| AdV hexon2C | CACGCGCTAGACATGACTTTT | ACCACGTCAAAGACTTCAAACA | CATGGACGAGCCCACCCTTCTTT | AdV | qPCR |
| AdV hexonACF | CGCAGTGGTCTTACATGCAC | ACCGTGGGGTTTCTAAACTTG | CAGGACGCCTCGGAGTACCTGA | AdV | qPCR |
| AdV hexon1B | CCGTGCAACAGACACCTACTT | TGTAAGAGTATGTATTGTCCTCCCG | ACCCACGATGTGACCACCGAC | AdV | qPCR |
| AdV hexon2B | GGACATGACTTTTGAGGTGGA | GTGGCTGGTGCACTCTGA | CCCACCCTGCTTTATCTTCTTTTCGA | AdV | qPCR |
| AdV hexon1F | AACACGGAGCTGTCTTACCAGT | GTCTGGGTCATAGCTGTCCAC | TCGATACTTCTCCATGTGGAACCAGG | AdV | qPCR |
| AdV hexon2F | TCCTTTGGACAAGCTCCCTA | GCTCCGGTTGGTACGTTTTAT | CAAGTGGGCTCAGACTCCAACAATC | AdV | qPCR |
| AdV hexon1A | CATACCAGTTAATGCTGGATGCT | CATCCTCTACCCCGTGATTCT | ACGACCCTGACGTTCGCGTTATT | AdV | qPCR |
| AdV hexon2A | CTCCCACCCATGATGTTACC | GCGTAAAGCGAGCCTTGTAG | TGCGTTTTGTGCCCGTGGAT | AdV | qPCR |
| AdV hexon1D | GGTCTGGTGCAGTTTGCC | ACCGTGGGGTTCCTAAACTT | CCACCGACACGTACTTCAGCCTG | AdV | qPCR |
| AdV hexon2D | GAGTTCCCTCGGAAACGAC | TTGAAGGACTGGTCGTTGGT | AACCTCTACGCCACATTCTTCCCCA | AdV | qPCR |
| AdV hexon1E | AGTGCAACATGACCAAGGACT | AGTTGCGGAAGAAGGAGTACAT | CTGGCCCACTACAACATCGGCT | AdV | qPCR |
| AdV hexon2E | CGCTTCGGAGTACCTGAGTC | TGGGGTTCCTAAACTTGTTCC | CGCGCCACAGACACCTACTTCAGT | AdV | qPCR |
| AdV polBE | CCCATCCAGGTGTAGGTTTC | CACATCAACAGCCATTCCTC | AAGAACTGGATCTCCTGCCACCAGT | AdV | qPCR |
| AdV polD | CCCATCCAGGTGTAGGTTTC | TTCATCACATCAACAGCCACT | AAGAACTGGATTTCCTGCCACCAGT | AdV | qPCR |
| AdV polA | CCCATCCAGGTGTAGGTTTC | GATCCACTTTTTCCCAATCG | AAGGCGCTCAGTGCGAGGATG | AdV | qPCR |
| AdV polF | CCAGCTGTTCGGGTGAGTAT | ATCAAATCCACCTCGTTTGTG | CGCGTTGAAAGGTGGGCATAAC | AdV | qPCR |
| AdV polC | GCGGTTGAGGACAAACTCTT | TTCTACATGCTAGGCTCTTACCG | TCCAGTACTCTTGGATCGGAAACCC | AdV | qPCR |
| HSV 1.1 | TCCTGGCTCTGCGAGTAGTT | GTTCGTGTCGGTCAAGGAGT | CGTTGGCCGTGAGCCACTTT | HSV1/2 | qPCR |
| HSV 1.2 | TCTGGGAGTAGTTGGTGATGC | CGTTTGTGTCGGTCAAAGAGT | GCGTTGGCCGTGATCCACTT | HSV1/2 | qPCR |
| HSV 2.1 | TTTGACTACGACCAGAAGTTGC | CTCCGTGACATACAGGGTCAT | CCCCTACGTCGACCATAGCCAATC | HSV1/2 | qPCR |
| HSV 2.2 | ACTGCTGATCGACCTGTGTG | TTATATGCGTGGACGAGAAGG | CCCCCTATGTTGATCACAGCCAA | HSV1/2 | qPCR |
| HSV 3 | AGGCAGACGTTTGACTTTGG | TGGGTTGTAGCGTGCTGTC | GCGTGCGTGCTGATGGTGAA | HSV1/2 | qPCR |
| HSV 4 | GAGGGACATCCAGGACTTTGT | CGGGCCATGAGCTTGTAA | ACCGCCGAACTGAGCAGACAC | HSV1/2 | qPCR |
| HHV4 1 | TGGAGCGAAGGTTAGTGGTC | GGGGAAAATTGTCACATTGG | TGCAGTGCCTGGTGCTGCTTTA | EBV/HH | qPCR |
| HHV4 2 | CTGAGGCCCTTCTTCCTTTT | CCTGAACAGCCTTGGATAGC | TTTGAGGGGTGGGGGAATATGG | EBV/HH | qPCR |
| HHV4 3 | CAGCAGTGAGCGGTAAAACA | CCTACAAGGACCTGGTCAAGAG | CGCAAAGGGGTTGCACGAGT | EBV/HH | qPCR |
| HHV4 4 | TAGTGTCCGGGAATAGGGTCT | CCACTACCAGGAGGGAGAACTA | TCATGTAGGGCCCGTTGATGATG | EBV/HH | qPCR |
| HHV5 1 | AGGCTTTCTACCTCATCATCCA | TGGGAATCCGTAACCACAAC | GGAAACGCGTCGATGCTTTTATCC | CMV/HH | qPCR |
| HHV5 2 | GTTAGGTGACACGGCAACACT | ATTTTATCCTGCCCAACCACT | TTTCGGGCACCGTCGTACCTTT | CMV/HH | qPCR |
| HHV5 3 | TGGCCAAACGTTCGAGTT | ACGTGTCCGTCTTTGAAACC | TGCCAGAACACTACCAAACCACCA | CMV/HH | qPCR |
| HHV5 4 | TCAAACGTGCGCTTATCTTG | AAGACGTACAGCAGCGGATT | CGAGTCGCTCGCCTTTTGTCACT | CMV/HH | qPCR |
| HHV5 5 | CATCTCCGTACTTGAGGGTAGTG | CTCTCAACGCGTAACTTCTTCC | CGTTAACACCATGGCTGACCGTTT | CMV/HH | qPCR |
| HHV6 1 | GATAGTATCCCTCTTCTCCCCATC | ACGGTTAACTTTTGAGGACGAA | CCAGAATCGAGAAGTGCGCCAG | HHV6 | qPCR |
| HHV6 2 | CATCTCCTCCGTTATGTCTTTCA | GGAGTTATTGGACCACGACATT | AGCGAGAGATAGGGATGGTTGGGA | HHV6 | qPCR |
| HHV6 3 | TCTAATAGAGCTTGGTTGGATGAA | GCGAAATACAATACTCGTGCTCT | GGCAGAGCGTTTTGTAAGAACTGGC | HHV6 | qPCR |
| HHV6 4 | CCGCACTATGTCGTGGATTAG | ACTGGATCTGTACTGTAGGAATCGTT | TATAAGTTCGGGGCCGTATGGGTG | HHV6 | qPCR |
| HHV6 5 | CCGCACTATGTCGTGGATTAG | GGATCTGTACCGTAGGAATCGTT | TAAGTTCGGGGCCGTAGGGGT | HHV6 | qPCR |
| HHV7 1 | CATCCAGAGCGTAGACAGCA | GCCGTGGTTATCGGAAAGT | AAGACCACGACCGAGGCATCTTC | HHV7 | qPCR |
| HHV7 2 | GTCCGTTAGAACCTCCATCAAC | TTGGCTGTACCACGAATCAC | TCAAGGCCTGAAAAAGCGAACGT | HHV7 | qPCR |
| HHV7 3 | GGATTTAGGTAGAGTTGTGGCG | CATTTAGTGGCTGTTCACTTTCC | TGCGGATGTCATTCCGTATAGAGAGG | HHV7 | qPCR |
| HHV7 4 | AGTTGGCCGATACGACACA | TCACCGGTTCTTCTGTTCCTAC | CCGGAAGGCTGGATGGTAACTCTAGG | HHV7 | qPCR |
| HHV8 1 | AGAGTCCGCCATCACCAA | ACCCCGTTGACATTTACCTTC | ACCCGTGCCACTCTATGAGATAAGCC | HHV8 | qPCR |
| HHV8 2 | CTGGGCAAGCAGTTTTTCA | TTCGGTAGGTGAGGTCTTTGTC | TCAGGAAGACGGCCTAGAGCGATAC | HHV8 | qPCR |
| HHV8 3 | ATCTCGTCTTCCATCCTTTCC | GTTCCAGTTACCCACCCAAA | TTGTGGCCTAGCTTTCGCAGGAC | HHV8 | qPCR |
| HHV8 4 | GTCTTCCATCCTTTCCCAAAA | ACCGGTCCCTTACAGACAGATA | TGGCCTAGCTTTCGCAGGACA | HHV8 | qPCR |
| HMBS | GTCCAGCCTGTTGGTGAG | GGCCACAATTCAGATCTTCCTA | CTCTTGCAGTCATTCCAGAGCCCT | human | qPCR |
| RHO | CCACACAGAAGGCAGAGAAG | TGGTGGGTGAAGATGTAGAATG | TCATCGCTTTCCTGATCTGCTGGG | human | qPCR |
| HPV E1 |  | Vi03453396 s1 |  | HPV16 | qPCR |
| ANKRD49 |  | Hs06279676 cn |  | human | qPCR |
| 18S |  | Hs03928990 gl |  | human | RT-qPCR |
| ACTB |  | Hs01060665 gl |  | human | RT-qPCR |
| CCNA2 |  | Hs00996788 ml |  | human | RT-qPCR |
| CCNE1 |  | Hs01026536 ml |  | human | RT-qPCR |
| TERT |  | Hs00972656 ml |  | human | RT-qPCR |
| GLI1 |  | Hs00171790 ml |  | human | RT-qPCR |
| KMT2B |  | Hs00207065 ml |  | human | RT-qPCR |
| TNFSF10 |  | Hs00921974 ml |  | human | RT-qPCR |
| Primer name |  | Sequence 5'-3' |  | Target | used for |
| AAV2 tot 6 F b | ACAGTACTCCACGGGACAGG |  |  | AAV | ITRs junction PCR and seque |
| AAV2 epi R 2 | GCTGGGGACCTTAATCACAA |  |  | AAV | ITRs junction PCR and seque |
| AAV2 6F NEW | CCTGACTCGTAATCTGTAATTGC |  |  | AAV | ITRs junction PCR and seque |
| AAV2 ITR5 F int | GTGGCCAACTCCATCACTAG |  |  | AAV | ITRs junction PCR and seque |

Supplementary table 3. Results of the viral DNA screening


Supplementary table 4. List of AAV clonal inserted sites in liver tumors

| Series | Sample | Ian target | Virus | Breakpoint 1 on human genome (hg19) | Breakpoint 2 on human genome (hg19) | Breakpoi nt 1 on viral genome | Dreakp oint 2 <br> on <br> viral | $\begin{gathered} \text { Orienta } \\ \text { tion } \\ \left(5^{\prime}>3^{\prime}\right) \end{gathered}$ | Orient ation <br> (Flip/FI <br> $\mathrm{op})$ | Genotype | Publication |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| LiC1162 | \#2128T | CCNA2 | AAV2 | chr4:122,743,475 | chr4:122,743,452 | 2934 | 1493 | $3>5$ | ND | AAV2 | Nault et al. 2015 |
| LiC1162 | \#313T | CCNA2 | AAV2 | chr4:122,742,417 | chr4:122,742,409 | 2611 | 4585 | $5>3$ | Flop | AAV2 | Nault et al. 2015 |
| LiC1162 | \#2206T | CCNA2 | AAV2 | chr4:122,742,478 | chr4:122,742,456 | 3560 | 4596 | $5>3$ | Flip | AAV2 | Nault et al. 2015 |
| LiC1162 | \#2848T | CCNA2 | AAV2 | chr4:122,742,948 | chr4:122,742,929 | 4630 | 3730 | $3>5$ | Flip | AAV2/13 |  |
| LiC1162 | \#129T | CCNA2 | AAV2 | chr4:122,743,844 | chr4:122,743,835 | 4597 | 4316 | $3>5$ | Flip | AAV2/13 | Bayard et al. 2018 |
| LiC1162 | \#2112T | CCNA2 | AAV2 | chr4:122,742,667 | chr4:122,742,660 | 4389 | 4608 | $5>3$ | Flip | AAV2/13 | Nault et al. 2015 |
| TCGA | TCGA-G3-AAUZ | 2 CCNA 2 | AAV2 | ND | chr4:122,743,570 | ND | 4613 | $5>3$ | Flop | AAV2/13 | Bayard et al. 2018 |
| TCGA | TCGA-ZS-A9CF | CCNA2 | AAV2 | chr4:122,742,400 | chr4:122,742,166 | 3407 | 4514 | $5>3$ | ND | AAV2 | Bayard et al. 2018 |
| TCGA | TCGA-BC-A10Y | CCNA2 | AAV2 | chr4:122,743,756 | chr4:122,743,742 | 4064 | 4586 | $5>3$ | ND | AAV2/13 | Bayard et al. 2018 |
| LiC1162 | \#2557T, \#2558T | TNFSF10 | AAV2 | chr3:172,224,150 | chr3:172,302,191 | 4388 | 4597 | $5>3$ | Flop | AAV2 | Nault et al. 2015 |
| LiC1162 | \#1602T | TNFSF10 | AAV2 | chr3:172,224,027 | chr3:172,224,026 | 4270 | 4571 | $5>3$ | Flop | AAV2/13 | Nault et al. 2015 |
| LiC1162 | \#1185T | KMT2B | AAV2 | chr19:36,212,635 | chr 19:36,212,644 | 4602 | 4247 | $3>5$ | Flip | ND | Nault et al. 2015 |
| LiC1162 | \#2141T | CCNE1 | AAV2 | chr19:30,287,313 | chr 19:30,287,316 | 4599 | 4379 | $3>5$ | Flop | AAV2 | Nault et al. 2015 |
| LiC1162 | \#1591T | CCNE1 | AAV2 | chr19:30,303,035 | chr 19:30,303,053 | 4340 | 4598 | $5>3$ | Flip | AAV2/13 | Nault et al. 2015 |
| LiC1162 | \#2208T | CCNE1 | AAV2 | chr19:30,304,532 | chr 19:30,304,542 | 4604 | 4237 | $3>5$ | Flop | AAV2 | Nault et al. 2015 |
| LiC1162 | \#M257T | CCNE1 | AAV2 | chr19:30,303,740 | chr 19:30,303,743 | 4590 | 4253 | $3>5$ | Flop | AAV2/13 | Bayard et al. 2018 |
| LiC1162 | \#3641T | CCNE1 | AAV2 | chr19:30,291,515 | chr 19:30,291,518 | 4239 | 4534 | $5>3$ | ND | ND | Bayard et al. 2018 |
| TCGA | TCGA-BC-A10T | T CCNE1 | AAV2 | chr19:30,302,864 | ND | 4626 | ND | ND | ND | ND | Bayard et al. 2018 |
| LiC1162 | \#985T | TERT | AAV2 | chr5:1,295,308 | chr5:1,295,291 | 4390 | 4597 | $5>3$ | Flip | AAV2/13 | Nault et al. 2015 |
| LiC1162 | \#2102T | TERT | AAV2 | chr5:1,295,238 | chr5:1,295,235 | 4288 | 4597 | $5>3$ | Flip | AAV2 |  |
| LiC1162 | \#1919T | GLI1 | AAV2 | chr12:57,856,202 | chr 12:57,856,230 | 4619 | 4108 | $3>5$ | Flip | AAV2 |  |
| LiC1162 | \#1920T | GLI1 | AAV2 | chr12:57,856,195 | chr 12:57,856,212 | 4202 | 4042 | $3>5$ | Flip | AAV2 |  |
| LiC1162 | \#1921T | GLI1 | AAV2 | chr12:57,854,317 | chr 12:57,854,407 | 3940 | 4679 | $3>5$ | Flip | AAV2 |  |
| LiC1162 | \#3765T | 3LI1/INHBE | AAV2 | chr12:57,850,368 | chr 12:57,850,370 | 4071 | 4679 | $3>5$ | Flip | AAV2 |  |
| LiC1162 | \#1920T | H2AFY2 | AAV2 | chr10:71,864,210 | chr 10:71,864,240 | 4579 | 3629 | $3>5$ | Flip | AAV2 |  |
| LiC1162 | \#1344T | IGR chr10 | AAV2 | chr10:61,519,721 | chr 10:61,520,465 | 4342 | 2447 | $3>5$ | ND | AAV2 |  |
| LiC1162 | \#2141T | NKAIN3 | AAV2 | chr8:63,681,461 | chr8:63,681,478 | 4608 | 4570 | $3>5$ | Flop | AAV2 |  |
| ICGC-JP | HX032 | CCNE1 | AAV2 | chr 19:30,304,511 | chr 19:30,304,517 | 4600 | 4386 | $3>5$ | ND | ND | Fujimoto et al. , 2016 |
| ICGC-JP | RK112 | KMT2B | AAV2 | chr 19:36,213,603 | chr 19:36,213,955 | 3320 | 4438 | $5>3$ | ND | ND | Fujimoto et al. , 2016 |
| ICGC-JP | RK236 | IGR chr5 | AAV2 | chr5:18,813,512 | chr5:18,813,398 | 82 | 2982 | $3>5$ | ND | ND | Fujimoto et al. , 2016 |



Supplementary figure 1. AAV detection using quantitative PCR and viral capture. A) Schematic representation of the 8 TaqMan probe sets used in qPCR screening mapped on AAV2 reference genome (NC_001401). The 5 genomic regions targeted by the probe sets are defined at the top of the scheme. The color of the probe sets indicates the specificity for the viral genotypes. B) Correlation between the number of AAV copies per cell determined using qPCR and the number of AAV reads in viral capture normalized on human reads.


Supplementary figure 2. Phylogenetic tree on VP1 coding protein region. This was constructed with (1) in black 73 human AAVs, 1 avian AAV and a Goose Parvovirus, described in Chen et al. ${ }^{42}$, (2) all AAV sequences described therein that to the AAV2 group of sequences in red or (3) to the AAV2/13 group of sequences in blue. A neighbor-joining method on the basis of the Jules-Cantor model was used to derive phylogenetic distances based on 735 aa of VP1 sequence. Goose parvovirus was used as the outgroup. Previously described AAV clade nomenclature described in Gao et al. ${ }^{14}$ was adopted and organized by vertical brackets. The scale for genetic distance is indicated in the bottom left corner.
A. Experimental design for detection of episomal AAV form

B. Restriction enzyme map

C. Scheme of $3^{\prime} I T R-5^{\prime} I T R$ junction amplification

D. PCR amplification of ITRs junction

E. PCR amplification of ITR junction in \#367N







Supplementary figure 3. Viral episomal form investigation. A) Experimental design of the DNase/TaqMan assay for episomal form detection. The $\Delta \mathrm{Ct}$ (Digested - Not digested DNA) is used to define the presence or absence of episomal AAV form. An increased $\Delta \mathrm{Ct}$ indicates the digestion of AAV DNA due to the presence of an integrated not-episomal form (top), whereas a low $\Delta \mathrm{Ct}$ results from the protection of the viral DNA due to the presence of an episomal form (middle). An increased $\Delta \mathrm{Ct}$ is also observed as consequence of linearization of the episomal AAV form prior to DNase digestion (bottom). A probe set (HMBS) targeting the human genome (in blue) is used as control of DNase digestion efficiency. B) AAV map with positions of restriction enzymes (HindIII and XmnI) used to linearize viral episomal form. C) Schematic representation of the primers used to amplify the 3'ITR-5'ITR junction. Two different couples of primers were used: F1-R1 and F2-R2. D) Junction's amplification in 7 patients with confirmed viral episomal form (from line 3 to 9 ) using 2 different couples of primers. \#2206 is used as negative control. E) PCR amplification of the 3'ITR5'ITR junction before and after DNase digestion in patient \#367. When the PCR is preceded by the linearization of episomal AAV, no amplification is detected after DNase digestion. The arrows indicate the 3'ITR-5'ITR junction in digested DNA without linearization of the episomal form. High-resolution capillary electrophoresis was performed using Qiaxcel with individual lanes of the same migration figured on the photo in D and E. F) Correlation between Ct value of HMBS and AAV probe sets before and after DNA pre-amplification.


Supplementary figure 4. Viral 3'ITR-5'ITR episomal junction determined by in silico analysis in 14 patients. ITR is composed of seven regions: A, $\mathrm{A}^{\prime}, \mathrm{B}, \mathrm{B}^{\prime}, \mathrm{C}, \mathrm{C}^{\prime}$ and D . The B-B‘ and C-C' regions exist in two palindromic configurations, "flip" (10 patients) and "flop" (4 patients) oriented DNA (grey arrows). Rep-binding element (RBE) motif is boxed; the arrow indicates the positions of the terminal resolution site (trs).


Supplementary figure 5. Correlation between AAV form and features of the patients. A) Frequency of episomal AAV (top) and episomal and expressed AAV form (bottom) according to gender, age, Metavir fibrosis score and associated tumor histology. The histological tumor types are grouped according to their malignancy. Frequency of AAV positive patients is displayed ( $\chi^{2}$ test with Monte Carlo simulation and $\chi^{2}$ test for trend in proportions for Metavir score). ${ }^{* * *} \mathrm{P}<0.001$; ${ }^{* *} \mathrm{P}<$ 0.01 ; ${ }^{*} \mathrm{P}<0.05$. B) Frequency of episomal and not-episomal AAV form according to age of the patients. Logistic regression model was used to predict the probability to have an episomal form according to the age, where 1 indicates the highest probability and 0 the lowest. Regression curve of the probability with standard deviation is represented.


Supplementary figure 6. AAV presence in tumor tissues and comparison with non-tumor counterparts. A) Viral copy number/cell distribution in 109 tumor samples. The density line defines the low and high positivity groups in blue and red respectively. B) Number of amplified viral regions according to the 5 different genomic regions in non-tumor (top) and tumor tissues (bottom) of patients with benign (left) and malignant (right) tumors. C) Inter-tumor heterogeneity in patients with multiple nodules analyzed for AAV presence. Each column represents one patient. The 26 patients are ordered according to the copy number/cell in the non-tumor tissues. In case of negative nontumor tissue, the order is determined by the copy number/cell in tumor. The color indicates the molecular form of the virus: episomal and expressed AAV (Expr-epi; red), not-expressed episomal AAV (Not expr-epi; green), not-episomal (Not-epi; blue) and negative (grey). The border and the pattern indicates the tumor type (malignant or benign) and the presence of clonal insertions.


Supplementary figure 7. Impact of clonal AAV integration on the expression of the target oncogenes: GLI1 (A), TERT (B), CCNA2 (C), CCNE1 (D), TNFSF10 (E) and KMT2B (F). The level of expression was assayed using qPCR in HCC with AAV insertions, within the tested gene and other target genes, in comparison to HCC without AAV insertion and non-tumor liver (NTL) tissues. Gene expression is presented relative to the expression in normal liver tissue on the $y$ axis $\left(\log _{10}\right)$. The black line in each boxplot corresponds to the mean values. A significant difference in expression was defined by Wilcoxon rank-sum test: ${ }^{* * *} \mathrm{P}<0.001$; **P $<0.01 ; * \mathrm{P}<0.05$.


Supplementary figure 8. Viral polyadenylation signal usage in TNFSF10. A) TNFSF10 3'UTR constructs into a pmirGLO vector controlling the expression of Firefly luciferase gene under PGK promoter. Site of insertions with \#2557T and \#1602T AAV sequences (in red), with and without mutated viral poly-A signal, or with the scrambled viral sequence are represented. B) Sanger validation of the mutations in viral poly-A signal. Nucleotides position refers to AAV2 (NC_001401). C) Impact of AAV integration in the 3'UTR of TNFSF10 in presence of wild type and mutated viral poly-A signal was evaluated using luciferase assays in Huh7, Huh6 and HepG2 liver cell lines. The $3^{\prime}$ UTR of TNFSF10 with either of the two AAV insertions identified in \#2557T and \#1602T or a scrambled sequence cloned into the pmirGLO vector was compared to vector encoding the wild-type $3^{\prime}$ UTR (WT). Error bars, s.d. of triplicate experiments corresponding to three independent transfections for each plasmid in each cell line. t tests were performed; $* * * \mathrm{P}<0.001$; ** $\mathrm{P}<0.01$; * $\mathrm{P}<0.05$.
A. AAV insertion in non-tumor liver tissues ( $\mathrm{N}=82$ )

B. AAV insertion in tumor liver tissues $(\mathrm{N}=94)$


Supplementary figure 9. Description of AAV insertions in non-tumor (A) and tumor liver tissues (B). AAV insertions are represented according to the type (clonal, subclonal and non-clonal). Number of samples refers to multi-samples. Annotations related to patients features, AAV presence and helper virus infections are reported. The histograms indicate the number of AAV insertion per sample (on the top) and the number of AAV insertion per genomic locus (on the left). The latter histogram is not shown for in the non-tumor tissues graph because each locus presents only unique insertion event.

## Supplementary Materials and Methods

## Computational analysis of human-AAV sequences

Paired-end read sets, for which samples we have confirmed the presence of the virus, were further consider to assemble the whole viral genome using an overlap layout consensus (OLC) assembling strategy. Both circular and linear contigs were generated with the Genious Pro 11.1.5 (http://www.geneious.com, Biomatters Ltd, Auckland, New Zealand) using the de novo assembler with high sensitivity threshold, considering a minimum overlap of 25 bases and $80 \%$ of identity, a maximum gap size of 5 bases, less than $20 \%$ gaps per read, and maximum ambiguity of 16 bases. Consensus sequences were generated, based on the major base distribution, and confirmed on reads alignment. Sequences have been deposited in the Genbank database.
From all sequence contigs, VP1 open reading frames were used to segregate our human isolates into individual molecular forms (or clades) as described in Chen et al. ${ }^{1}$ The coding protein region was derived from the nucleotide sequences. A neighbor-joining method ${ }^{2}$ on the basis of the Jules-Cantor model was used to derive phylogenetic distances based on 735 amino acids of VP1 sequence from our 58 human isolates and 73 human AAV plus 1 avian AAV. Goose parvovirus was used as the outgroup.
The whole circular and linear AAV DNA structures ( 4679 bp ) from respectively 14 and 57 isolates were compared using multi-alignment with the ClustalW algorithm ${ }^{3}$ using default parameter. A Neighbor-Joining method ${ }^{2}$ on the basis of the Tamura-Nei method ${ }^{4}$ was used to derive phylogenetic distances based on the nucleotides sequences. The tree is drawn to scale, with branch lengths measured in the number of substitutions per site. Evolutionary analyses were conducted in Genious Pro 11.1.5 software using Treebuilder. Sequence variations with wild-type AAV2 sequences and among human AAV isolates were identified considering a minimum variant frequency of $20 \%$. The approximate $p$-value represents the probability of a sequencing error, which is calculated using the binomial distribution, resulting in observing bases with at least the given sum of qualities.
The assessment of the circular structures of AAV on episomal junction, allowed us to define the overlapping region of 3 ' and $5^{\prime}$ inverted terminal repeats (ITRs) and determine the existence of a flip or flop sequence in each human isolate.

## Experimental procedure to search for episomal forms of AAV

240ng of genomic DNA were digested by incubation with 10 U of Plasmid-Safe DNase (Epicentre) in a final volume of $16 \mu \mathrm{~L}$ for 16 h at $37^{\circ} \mathrm{C}$, followed by heat inactivation of the nuclease. 20ng of DNase-digested and not-digested control DNA were pre-amplified by TaqMan PreAmp Master Mix (Applied Biosystem) using 14 preamplification PCR cycles. Real time quantitative PCR was performed on 10 ng of DNA before preamplification and $5 \mu \mathrm{~L}$ of preamplification product (diluted 1:10 in TE buffer) using custom made AAV probes (Supplementary Table 2) and AB 7900HT Fast Real-Time PCR System (Applied Biosystem). Expression data ( Ct values) were acquired using SDS Software (v2.3). The efficiency of the nuclease digestion was determined using HMBS probe as control of the genomic DNA digestion. The difference between AAV Ct without and with PS-DNase digestion allowed to determine the presence of viral episomal form, or the digestion of the linear viral DNA.

In order to validate the results, an additional step of linearization of the viral genome was added before PS-DNase digestion. 600ng of gDNA were first digested in a double enzymatic digestion (1h using 12U of enzyme and 1 h with additional 10 U at $37^{\circ} \mathrm{C}$ ) with restriction enzyme (XmnI or HindIII from New England Biolabs) that cuts only one site within AAV sequence. A specific probe set (Supplementary Table 2) that overlapped the cutting site was used to check the efficiency of the digestion. Digested DNA was tested for the presence of episomal form with the DNAse/TaqMan based assay previously described (Supplementary Figure 3).
A first set of 10 samples including 8 tissues with at least 4 amplified genomic regions and 2 controls positive only for 2 regions was tested and used to set up the protocol. In addition, a single cutter restriction enzyme was used to linearize the viral DNA prior to DNase digestion. The combination of the DNase digestion with or without the previous linearization of the viral DNA allowed to determine the presence of an episomal form according to the final TaqMan results on digested DNA. If the virus was in the episomal form, the DNase was not able to digest the viral genome and the sample was still positive for the virus in the TaqMan assay. Conversely, if the virus was in linear form, the viral DNA was digested giving a negative TaqMan results. We found the presence of episomal form in $7 / 8$ non-tumor tissues and none of the controls was positive. In all the cases we observed a digestion of the linearized AAV DNA demonstrated by the increased Ct value.
The sample \#367N was tested for 3'ITR-5'ITR junction amplification after DNase treatment with or without previous linearization of the viral genome. Interestingly, the ITR junction was protected from the DNase treatment showing that the $3^{\prime}$ 'ITR-5'ITR junction belonged to the circular AAV episomal form (Supplementary Figure 3E).
Sure of the reliability of the technique, we enlarged the investigation of viral episome in all nontumor samples with 3 or more amplified genomic regions, which represented the $58 \%$ of AAV positive non-tumor samples. A step of pre-amplification of viral DNA after DNase digestion was added in order to assess the episomal status even in case of low number of viral copies. Ct values of each probe set before and after pre-amplification were strongly correlated (Supplementary Figure 3 F ), therefore qPCR results after pre-amplification were used to determine the episomal status.

## References Supplementary Materials and Methods

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