A modular CRISPR screen identifies individual and combination pathways contributing to HIV-1 latency

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Abstract

Transcriptional silencing of latent HIV-1 proviruses entails complex and overlapping mechanisms that pose a major barrier to *in vivo* elimination of HIV-1. We developed a new latency CRISPR screening strategy, called Latency HIV-CRISPR, which uses the packaging of guideRNA-encoding lentiviral vector genomes into the supernatant of budding virions as a direct readout of factors involved in the maintenance of HIV-1 latency. We developed a custom guideRNA library targeting epigenetic regulatory genes and paired the screen with and without a latency reversal agent – AZD5582, an activator of the non-canonical NFκB pathway – to examine a combination of mechanisms controlling HIV-1 latency. A component of the Nucleosome Acetyltransferase of H4 histone acetylation (NuA4 HAT) complex, ING3, acts in concert with AZD5582 to activate proviruses in J-Lat cell lines and in a primary CD4+ T cell model of HIV-1 latency. We found that the knockout of *ING3* reduces acetylation of the H4 histone tail and BRD4 occupancy on the HIV-1 LTR, and only in the combination of *ING3* knockout with the activation of non-canonical NFκB via AZD5582 is there dramatic increase in initiation and elongation of RNA Polymerase II on the HIV-1 provirus in a manner that is nearly unique among all cellular promoters.

Introduction

Effective antiretroviral therapy (ART) can drive HIV-1 viral loads to undetectable

levels [1]. However, ART does not eliminate the virus from people living with HIV-1.

Upon interruption of ART, there is a rapid rebound of virus replication from a long-lived

latent reservoir primarily found in memory CD4+ T cells among other cell types [2]. This

latent reservoir of replication-competent HIV-1 proviruses is a significant obstacle to the

complete clearance of HIV-1 [3], and purging or managing this latent reservoir is

essential to achieve a functional cure.

The latent HIV-1 reservoir is often transcriptionally silent but can produce

infectious virus upon T-cell activation [4]. The transcriptional silencing of the provirus in

HIV-1 latency is dependent on integration site [5, 6] and a breadth of host factors that

limit transcriptional initiation and elongation of the HIV-1 proviral genome (reviewed in

[7]). Small molecule inhibitors or activators, known as latency reversal agents (LRAs),

have been shown to activate HIV-1 viral transcription in cell line models of HIV-1 latency

[8] and in primary cell cultures derived from people living with HIV-1 [9, 10]. AZD5582 is

a second mitochondria-derived activator of caspases (SMAC) mimetic that is an

example of an LRA that provides some specificity for latency reversal by activating the

non-canonical NFκB pathway [11]. Many LRAs have shown success at reactivating

latent HIV-1 in HIV-1 latency models, but even the most well-established LRAs have

modest or no effect in clinical trials on their own [12]. This highlights the complexity of

mechanisms involved in maintaining the HIV-1 latent state, and the need to identify

novel epigenetic factors and transcriptional mechanisms controlling HIV-1 latency.

Studies on the functional role of host epigenetic regulation of HIV-1 transcription

(reviewed in [7, 13, 14]) has resulted in the identification of some specific host

epigenetic regulatory genes that are involved in maintaining HIV-1 latency. For

example, KAT5 of the Nucleosome Acetyltransferase of H4 histone acetylation (NuA4

HAT) complex deposits a uniquely high profile of acetylated lysine residues on the H4

histone tail (H4Ac) found at the HIV-1 provirus LTR [9]. This results in the recruitment of

the long isoform of the *Bromodomain Containing 4* (*BRD4*) gene [9, 15, 16].

Additionally, the long BRD4 isoform in *in vitro* experiments serves as a competitor for

positive transcription elongation factor b (P-TEFb) binding to the HIV-1 transactivator,

Tat [16]. *BRD4* also encodes a short isoform that recruits the repressive BAF complex

to the HIV-1 provirus [17]. Another set of genes implicated in HIV-1 latency through

repression of HIV-1 transcription, encode components of the Polycomb Repressive

Complex 2 (PRC2) [10, 18, 19]. PRC2 catalyzes the methylation of histone H3 Lysine

27 to maintain transcriptional repression of genes, including throughout development.

The use of genetic screens has been effective in revealing pathways involved in

HIV-1 latency in a single-gene manner [10, 20-27]. Here, we sought to create a novel

CRISPR-based screening platform with the capacity to allow for rapid, parallel

assessment of multiple pathways that contribute to the maintenance of HIV-1 latency

both with and without the presence of additional LRAs. We reasoned that by combining

LRAs of one mechanism with a CRISPR screen that targets a different mechanism, we

could uncover latency reversal pathways with increased potency and specificity for the

HIV-1 LTR. We established a novel HIV-based latency CRISPR screening strategy that

uses J-Lat cells [28, 29] in combination with our recently developed HIV-CRISPR

screening methodology [30] to use reactivation of the latent provirus as the reporter for

the screen. To identify epigenetic pathways that act with and without LRAs to activate

latent proviruses, we generated a custom CRISPR library targeting epigenetic

regulatory genes and performed the screen in the absence and presence of a low-

activating dose of AZD5582. In the absence of AZD5582, we found *CUL3*, a scaffold for

an E3 ubiquitin ligase, as a novel HIV-1 latency maintenance and establishment factor

in both J-Lat cells and a primary CD4+ T cell model of HIV-1 latency. Moreover, we

identified the NuA4 HAT complex to be of importance to HIV-1 latency, specifically two

complex subunit members – ACTL6A and ING3. In particular, *Inhibitor of Growth Family*

Member (ING3) knockout combined with AZD5582 treatment resulted in enhanced viral

reactivation in the J-Lat cells and a primary CD4+ T cell model of HIV-1 latency. By

using automated CUT&Tag to investigate genome-wide chromatin occupancy [31], we

found that *ING3* knockout alone and in combination with AZD5582 treatment results in

the reduction of H4Ac and BRD4 levels at the HIV-1 LTR. However, only in the

presence of AZD5582 in the *ING3* knockout cells, do we see a substantial increase in

RNA Polymerase II Serine 5 phosphorylation (RNA-Pol2-S5p) occupancy at the LTR

and this dramatic increase is nearly unique among all promoters in the human genome.

Simultaneously, the combination of *ING3* knockout and AZD5582 treatment results in

increases in RNA-Pol2-S5p and RNA-Pol2-S2p within the body of the provirus, which

indicates increased transcription initiation and elongation and correlates with the

increase of viral reactivation. Our novel HIV-CRISPR screening approach provides an

avenue to explore factors that act in combination to promote HIV-1 latency.

Results

<u>Latency HIV-CRISPR identifies novel epigenetic factors involved in maintaining HIV-1</u>

<u>latency</u>

Our aim was to establish a high throughput CRISPR-Cas9 knockout strategy for

investigating the complexities of epigenetic regulation of HIV-1 latency. We leveraged a

previously described HIV-CRISPR vector [30] which is a lentiviral based vector with two

intact LTRs, a packaging signal, Cas9, and a library of single guide RNAs (sgRNAs).

The unique feature of the HIV-CRISPR vector is that in the presence of replication-

competent HIV-1, the genome of the HIV-CRISPR vector is transcribed into RNA and

packaged *in trans* into HIV-1 virions. We reasoned that in J-Lat cells, an *in vitro* T-

lymphocyte HIV-1 latency model which harbors a near full-length HIV-1 provirus, any

sgRNAs encoded in HIV-CRISPR genomes that target candidate HIV-1 latency genes

will be packaged into the reactivated virus particle, secreted, and enriched in the viral

supernatant (**Figure 1A**). Consequently, the RNA of the viral supernatant from the HIV-

CRISPR latency screen can undergo next-generation sequencing to determine sgRNAs

that are enriched in the viral particles and thereby identify candidate genes involved in

HIV-1 latency maintenance. This results in a direct readout for the gene knockout which

incorporates functional, reactivation activity.

To specifically investigate host epigenetic regulators involved in the maintenance

of HIV-1 latency, we generated a custom human epigenome specific sgRNA CRISPR

library (HuEpi). This library contains sgRNAs targeting epigenome factors such as

histones, histone binders (e.g., histone readers and chaperones), histone modifiers

(e.g., histone writers and erasers), and general chromatin associated factors (e.g., RNA

and DNA modifiers) (**Figure 1B, C**). Most of the genes targeted in this library are

derived from the EpiFactor database [32]. To this set we also added histones and other

hand-selected gene regulatory complexes. The total library contains 5,309 sgRNAs

targeting 841 genes (6 sgRNAs per gene with a few exceptions) and 252 non-targeting

controls (NTCs) [33] (**Supplemental Table 1**). The small size of the library improves the

likelihood of high coverage of all the sgRNAs throughout the CRISPR screening

process relative to a whole-genome screen.

The sgRNA sequences from the HuEpi library were cloned in bulk into the HIV-

CRISPR vector and the lentiviral library was subsequently transduced into J-Lat cells at

a low MOI (MOI = 0.4) (**Figure 1D-1**). We transduced two independent J-Lat cell clones,

the J-Lat 10.6 [28] and J-Lat 5A8 [29] cells, which each have different proviral

integration sites and the latter of which responds to LRAs more similarly to primary

CD4+ T cell HIV-1 latency models compared to other cell line models [34]. Transduced

cells were then subjected to 10-14 days of puromycin selection after which the cells and

viral supernatant were harvested and processed by next-generation sequencing of the

sgRNAs to identify the candidate HIV-latency genes (**Figure 1D-3**). Genomic DNA was

extracted from the cell pellet to determine the baseline representation of each sgRNA in

the transduced sgRNA library. Viral RNA was extracted from the concentrated viral

supernatant to identify the sgRNA population that facilitated latent HIV-1 provirus

transcription reactivation (**Figure 1D-4**). Using the MAGeCK pipeline [35], we identified

candidate HIV-1 latency maintenance factors by selecting genes in which the sgRNA

counts of the viral RNA were enriched compared to the sgRNA counts in the genomic

DNA. Genes with an increased sgRNA count in the viral RNA, which equates to an

increase in the fold change, are predicted to play a role in maintaining HIV-1 latency.

Overall, the Latency HIV-CRISPR screen results for both J-Lat 10.6 and J-Lat

5A8 cell lines demonstrated a significant enrichment in specific sgRNAs compared to

the NTCs. We compared the distribution of the log fold change (LFC) of NTCs against

the gene targeting sgRNAs. While the LFC of most gene targeting sgRNAs clustered

around the median LFC of the NTCs, we observed that a subset of the gene targeting

sgRNAs were significantly enriched compared to the NTC population. These sgRNAs

are the sgRNAs of interest that target potential HIV-1 latency maintenance factor genes

(**Figure 2A**).

To determine top candidate genes from the Latency HIV-CRISPR screen, we

ranked the genes by MAGeCK gene score. For both J-Lat cell lines, we observe that

there are many genes that are significantly enriched compared to the NTCs. We

identified eight previously unreported epigenetic HIV-1 latency maintenance genes,

defined by a false discovery rate (FDR) less than 10% in both J-Lat 10.6 and J-Lat 5A8

cell lines, as our top hits (**Figure 3A**). BRD4 and KAT5 are two host factors previously

reported to silence HIV-1 transcription ([16, 17, 36] and [9], respectively), and in our

screen, the sgRNAs targeting *BRD4* and *KAT5* are significantly enriched compared to

the sgRNAs targeting NTCs in both J-Lat cell lines (**Figure 2B; Supplemental Table 2**).

In addition to individual genes, the Latency HIV-CRISPR screen also identified genes

encoding subunits of protein complexes important to HIV-1 latency. PRC2 has also

been previously reported to silence HIV-1 transcription [8, 10] and members of the

complex including *EZH2*, the catalytic component, and *SUZ12* and *EED* showed a trend

of enrichment in our screen (**Figure 2B; Supplemental Table 2**). Thus, our Latency

HIV-CRISPR screen system identifies bona fide HIV-1 latency maintenance factors.

<u>The Latency HIV-CRISPR screen identifies multiple members of the NuA4 complex and</u>

<u>CUL3</u>

To identify the top candidate HIV-1 latency genes, we integrated the guideRNA

data to a gene level using MAGeCK analysis [35] (**Figure 3A; Supplemental Table 3**).

As we were primarily interested in hits that are independent of integration site, we

considered the top gene hits as those that that have an FDR < 10% and also are shared

between both J-Lat 10.6 and J-Lat 5A8 cell lines (**Figure 3B**, middle of Venn diagram).

We observed that multiple members of the Nucleosome Acetyltransferase of H4 (NuA4)

complex scored highly in the screen (**Figure 3A**). The NuA4 complex is highly

conserved in eukaryotes [37] and acetylates histone H4 [38] and has been implicated in

many genomic processes including DNA damage repair and transcription [39]. Many

proteins that are part of the NuA4 complex also overlap with the SNF2-Related CBP

Activator Protein (SRCAP) complex which exchanges the H2A of the canonical

nucleosome with the H2A.Z variant [40-42]. A gene ontology (GO) enrichment analysis

[43] of the top gene hits (FDR <10% for each J-Lat cell line) demonstrated that the

SRCAP-associated chromatin remodeling complex is highly enriched in both J-Lat cell

lines (**Figure 3C**) and is different from the overall GO distribution of the total HuEpi

library (**Figure 1C**), demonstrating the screen specifically enriched for specific

pathways. Based on the MAGeCK gene scores, six of the seven genes (*BRD8*, *DMAP1*,

RUVBL1, *RUVBL2*, *ACTL6A*, *VPS72*, and *YEATS4*) that encode proteins overlapping

between the NuA4 HAT and SRCAP complexes scored higher than the median

MAGeCK score for the NTCs (**Figure 3D**). The only exception is *RUVBL1* in the J-Lat

10.6 screen, which scored below the NTC median MAGeCK score (RUVBL1 = 0.318 vs

NTC median = 0.518). Additionally, most genes unique to each complex also had

MAGeCK scores above the NTC median in both cell lines. Genes unique to the NuA4

HAT complex included *TRRAP*, *EP400*, *EPC2*, *KAT5*, *ING3*, *MORF4L1*, *MORF4L2*,

MEAF6, and *MBTD1* and genes unique to the SRCAP complex included *SRCAP* and

ZNHIT1 (**Figure 3D**). This analysis suggests that the Latency HIV-CRISPR screen

strategy can extend beyond identification of single genes of interest to groups of genes

encoding complexes of relevance, which can further shed light on the mechanisms

involved in maintaining HIV-1 latency.

To validate the top screen hits, we generated four individual J-Lat 10.6 and 5A8

knockout cell lines for each gene (two sgRNAs per gene). To avoid clone-to-clone

differences, each of these knockout cell lines represents a pool of knockout cells rather

than clones. As positive controls, we used two sgRNAs targeting *NFκBIA*, an inhibitor

for NFκB, and a gene that was not included in the HuEpi library. Upon knockout of

NFκBIA in the J-Lat cells, we expect an increase in HIV-1 transcriptional activity, which

leads to virus production. As negative controls, we used two NTC sgRNAs that do not

target human loci. To assess latency reversal in the J-Lat cells, we measured HIV-1

reverse transcriptase activity in the supernatant, which is a readout after the viral

transcription, translation, and budding steps have occurred. Because the transduced

cells were assayed as a pool of gene knockouts, we simultaneously measured CRISPR

editing efficiency in bulk using the program Inference of CRISPR Edits (ICE) [44]. The

knockout efficiency for the heterogenous cell lines we generated varied between 32% to

83% (**Figure 4A**). A recent study demonstrated that a median knockout of 35% was

less efficient, but still had a meaningful effect [45].

229   Compared to the cell lines transduced with NTC sgRNAs, we found that

individually knocking out all eight novel candidate gene hits resulted in significant

latency reversal in at least one of the J-Lat cell lines we tested (**Figure 4A**). In fact,

some of the reverse transcriptase measurements from the gene knockout cell lines are

comparable to the positive control knockout of *NFκBIA*. In addition, we confirmed that

knockout of a top scoring gene hit in our screen, *KAT5*, a previously reported HIV-1

latency maintenance factor [9], results in viral reactivation in both J-Lat cell lines (**Figure

4A**). Moreover, genes encoding protein components of the NuA4 HAT and SRCAP

complexes described above, *ACTL6A*, *DMAP1*, *VPS72*, and *YEATS4* also all validated

as latency maintenance factors in J-Lat cells (**Figure 4A**). *ACTL6A* knockout results in a

particularly high level of HIV-1 reactivation, which may be a result of *ACTL6A* encoding

a protein that is a subunit of both NuA4 HAT and SRCAP complexes (**Figure 3D**). Other

genes validated in this functional investigation include *DMAP1* which encodes a protein

that forms a complex with DNMT1 to mediate transcriptional repression [46] and has

been described to play a role in HIV-1 latency in some studies [14] and *TAF5* which

functions in scaffold formation and is a critical subunit of the general transcription factor

TFIID.

As *CUL3* was the top gene hit in our Latency HIV-CRISPR screen in both J-Lat

10.6 and J-Lat 5A8 cell lines and validated as a latency maintenance factor in J-Lat

cells, we further characterized *CUL3* in the context of a primary CD4+ T cell HIV-1

latency model system. CUL3 is part of the cullin family and serves as the scaffold for

Cullin-RING E3 ligase complexes, which ubiquitinate proteins [47]. For our primary cell

HIV-1 latency model system, we used a dual HIV-1 reporter virus (pNL4-3-Δ6-dreGFP-

CD90) that is derived from previously established systems [48, 49]. Here, the reporter

virus has been modified to encode a destabilized eGFP gene and a mouse Thy1.2

(CD90.2) gene, which are separated by an IRES and both reporters are under control of

the HIV-1 LTR [50]. As the mouse Thy1.2 reporter has a long half-life and is slow to turn

over, it serves as a marker to determine the cells that have been infected by the

reporter virus (Thy1.2+). Amongst the infected cells (Thy1.2+), the eGFP reporter,

which has a short half-life, serves as a marker to determine the cells that are actively

transcribing or actively infected (Thy1.2+, GFP+) versus minimally transcribing or

latently infected (Thy1.2+, GFP-). We knocked out *CUL3* in the primary CD4+ T cell

HIV-1 latency model using Cas9-gRNA ribonucleoproteins (RNPs) including 3 different

sgRNAs. As a negative control, the *AAVS1* gene is targeted for knockout, which is in a

"safe harbor" locus in which disruption of this gene does not have adverse effects on the

cell [51].

We expected that if CUL3 plays a role in HIV-1 latency establishment, there will

be a higher reactivated population in the *CUL3* knockout cells compared to the negative

control (*AAVS1*) knockout cells. We acquired CD4+ T cells from four healthy donors and

infected the cells with the dual reporter virus. Indeed, upon performing the described

CRISPR/Cas9-mediated knockout and measuring the functional output of the reporter

virus, we observed that *CUL3* knockout in all four donors resulted in significant HIV-1

reactivation and subsequent decrease in the latent population compared to *AAVS1*

knockout (**Figure 4B; Supplemental Figure 1A**). This suggests that post-translational

ubiquitin modification of a substrate by CUL3 may facilitate the establishment and

maintenance of HIV-1 latency. Our data is consistent with previous work as CUL3 has

been demonstrated to negatively regulate HIV-1 transcription during productive infection

directly or indirectly through the NFκB pathway as NFκB/NFAT binding sites at the LTR

are critical for regulating viral transcription [52]. Moreover, these data demonstrate that

the Latency HIV-CRISPR screening strategy is effective in identifying novel epigenetic

HIV-1 latency maintenance genes that have been validated in multiple systems.

<u>An LRA Latency HIV-CRISPR screen reveals regulatory changes that act in</u>

<u>combination during reactivation of HIV-1 latency</u>

A critical extension of this HIV-CRISPR latency screen methodology is the ability

to examine other transcriptional mechanisms in conjunction with epigenetic regulatory

factors. Thus, to address HIV-1 latency as a state of multiple, parallel mechanisms, we

modified the screen by treating the pool of human epigenome knockout cells with a low-

activating dose of LRA. The goal was to identify instances of combinations between the

gene knockout and LRA resulting in a significant increase in viral reactivation (i.e. a top

hit in the screen). As a proof of principle, we used the recently identified LRA, AZD5582,

which is a SMAC mimetic and non-canonical NFκB activator [11]. We first determined

10 nM AZD5582 as the low-activating dose of LRA to use by performing an HIV-1 viral

reactivation dose curve using both J-Lat cell lines (**Supplemental Figure 2A**). The

same HuEpi knockout pool of cells used in the Latency HIV-CRISPR screen described

in **Figure 3** were in parallel treated for 24 hours with 10 nM of AZD5582 (**Figure 1D-2**).

This allows for the identification of epigenetic regulatory genes that upon knockout,

combine with the transcriptional initiation pathway targeted by AZD5582, to result in a

significant increase in viral reactivation.

The most prominent hit of the AZD5582 LRA Latency HIV-CRISPR screen in

both J-Lat cell lines was *Inhibitor of Growth Family Member 3* (*ING3*), a novel HIV-1

latency factor (**Figure 5A; Supplemental Table 4, 5**). To confirm that *ING3* was a top

gene hit unique to the LRA condition, we compared the LRA Latency HIV-CRISPR

screen results to the Latency HIV-CRISPR screen results in the absence of LRA.

Overall, many gene hits overlapped between the Latency HIV-CRISPR screen in the

presence and absence of AZD5582 (**Figure 5B**). For example, the previously identified

KAT5 gene and genes that we validated in **Figure 4** including *DNMT1*, *YEATS4*, and

ACTL6A were still amongst the top gene hits, which suggests that these genes broadly

play a role in HIV-1 latency maintenance regardless of activation of the non-canonical

NFκB pathway. We verified that *ING3* was the top gene hit unique to the screen in the

presence of AZD5582 and sought to perform additional validation for this gene. We also

observed that *CUL3*, the top hit unique to the screen in the absence of AZD5582, was

relatively depleted in the screen conducted in the presence of AZD5582 (**Figure 5B**).

This suggests a potential overlap between AZD5582 non-canonical NFκB function and

CUL3 function in the context of HIV-1 latency reversal.

To validate *ING3*, the top hit enriched in the AZD5582 LRA Latency HIV-CRISPR

arm of the screen, we generated *ING3* knockout cell lines in both J-Lat 10.6 and 5A8

cells. Simultaneously, cell lines transduced with the NTC sgRNAs were generated as a

negative control. The pools of knockout cells were treated with or without a low

reactivating dose (10 nM) of AZD5582 for 24 hours and then viral reactivation was

measured by HIV-1 reverse transcriptase activity. Based on screen results, we

hypothesized that knockout of *ING3* alone would result in some level of viral reactivation

compared to the transduction of NTC sgRNAs, but upon treatment with a low

reactivating dose of AZD5582, viral reactivation would become even more pronounced.

Consistent with our hypothesis, we observed that in both J-Lat cell lines, low

reactivating dose AZD5582 treatment of the cell lines transduced with the NTC sgRNAs

results in minimal viral reactivation, but treatment of the *ING3* knockout cell lines results

in significant, increased viral reactivation (**Figure 6A**). These results suggest a

mechanistic interplay between *ING3* inhibition and AZD5582 treatment during the

reactivation of HIV-1 transcription. Moreover, we observed a similar trend in the primary

CD4+ T cell HIV-1 latency model described previously. In healthy donor samples of

CD4+ T cells in which the latency model was established, we performed a total of four

independent *AAVS1* and *ING3* knockouts (three independent knockouts with one donor

and one knockout with a second donor), followed by 1 µM AZD5582 treatment, and

observed significant viral reactivation in the combination condition of *ING3* knockout and

AZD5582 treatment (**Figure 6B, C**). This enhancement of viral reactivation in two

latency models suggests that there may be interplay between the function of *ING3* and

the non-canonical NFκB pathway, which is targeted by AZD5582, both in cell lines and

in primary CD4+ T cells.

As AZD5582 activates the non-canonical NFκB pathway, it is possible that *ING3*

knockout could either enhance this activity or act through an independent pathway in

the context of HIV-1 viral reactivation. To distinguish between these two possibilities, we

measured the protein levels of NFκB2 products which includes p100, the cytoplasmic

NFκB2 protein, and p52, the cleaved and active subunit that translocates to the

nucleus. As expected, activation of the non-canonical NFκB upon AZD5582 treatment

results in an increase in the cleaved p52 product and a decrease in the p100 product in

the control (NTC) cells (**Figure 6D**). We find that p52 levels are similar in the control

and *ING3* knockout J-Lat cell lines (**Figure 6D**) suggesting that another pathway

besides the non-canonical NFκB is the main driver resulting in HIV-1 reactivation.

Altogether the LRA Latency HIV-CRISPR screen demonstrates the powerful potential

for examining multiple mechanisms simultaneously to gain a more comprehensive

understanding of the mechanisms underpinning HIV-1 latency and to further improve

existing LRAs.

<u>The combination of ING3 knockout and AZD5582 treatment uniquely results in</u>

<u>significant increases of RNA-Pol2-S5p levels at the HIV-1 provirus</u>

To better understand how AZD5582 treatment and *ING3* knockout act in

combination to promote reactivation of latent HIV-1 proviruses, we examined the

chromatin-related changes to the HIV-1 provirus by performing automated CUT&Tag

[31]. Specifically, we performed genome-wide profiling of the J-Lat 10.6 cell line under

four different conditions: (i) Transduction of NTC sgRNA with a treatment of DMSO

(NTC + DMSO), the negative control (ii) Transduction of NTC sgRNA with a treatment of

10 nM AZD5582 (NTC + AZD5582) (iii) *ING3* knockout with a treatment of DMSO (ING3

KO + DMSO) (iv) *ING3* knockout with a treatment of 10 nM AZD5582 (ING3 KO +

AZD5582).

ING3 is a known member of the NuA4 HAT complex, which functions to acetylate

the histone H4 tail [53]. BRD4 interacts with acetylated H4 [9] and both isoforms of

BRD4 are known to negatively regulate HIV-1 transcription [16, 17]. Therefore, our

hypothesis is that significant viral reactivation identified only in the combination of *ING3*

knockout and AZD5582 treatment would be correlated with changes in levels of H4

acetylation, BRD4, and active RNA polymerase at the integrated provirus. As a result,

we performed automated CUT&Tag using antibodies that recognized acetylated histone

H4 (pan-H4Ac), BRD4, RNA-Pol2-S5p, RNA-Pol2-S2p, as well as a non-specific IgG

negative control, at both the HIV-1 provirus genome and globally across the human

genome.

We observed no change in pan-H4Ac signal over the HIV-1 LTR upon 10 nM

AZD5582 treatment, but consistent with the known function of ING3, upon *ING3*

knockout, there was a significant decrease in pan-H4Ac signal at the HIV-1 LTR

(p=0.0061) (**Figure 7A, B**). Additionally, the combination of *ING3* knockout with

AZD5582 treatment, resulted in a significant decrease in pan-H4Ac signal at the HIV-1

LTR (p=0.0415). Notably, in the *ING3* knockout condition alone, we observed a

significant decrease in pan-H4Ac signal over both the U3 region of the HIV-1 LTR

(p=0.0070) as well as a significant decrease in the pan-H4Ac signal in the R and U5

region of the HIV-1 LTR (p=0.0126) containing the HIV-1 provirus transcription start site

(**Figure 7A, B**). When the *ING3* knockout is combined with AZD5582 treatment, there is

only a significant decrease in the R and U5 region of the HIV-1 LTR (p=0.0016). Thus,

ING3 knockout appears to be the main driver of the change in pan-H4Ac levels on the

HIV-1 LTR in the presence and absence of AZD5582. We also find that that the

reduction in pan-H4Ac levels we observed on the HIV-1 LTR in the *ING3* knockout

condition correlate with reduced recruitment of BRD4. Indeed, as compared to NTC +

DMSO, AZD5582 treatment alone did not affect BRD4 levels over the HIV-1 LTR;

however, BRD4 levels were significantly decreased over the LTR both in the condition

of *ING3* knockout alone and in combination with AZD5582 treatment (p=0.0235,

p=0.0349, respectively) (**Figure 7C, D**). In the absence of AZD5582, the *ING3* knockout

results in a significant decrease in the occupancy of BRD4 only over the U3 region of

the LTR (p=0.0219), while in the presence of AZD5582 combined with the *ING3*

knockout, the decrease in BRD4 levels was only significant over the R and U5 region of

the HIV-1 LTR (p=0.0159) (**Figure 7C, D**). Altogether, our CUT&Tag results

demonstrate that the pan-H4Ac and BRD4 levels are correlated at the HIV-1 LTR upon

ING3 knockout with and without AZD5582 treatment.

399   In contrast to the pan-H4Ac and BRD4 CUT&Tag levels at the HIV-1 LTR that

change upon knockout of *ING3*, independent of LRA treatment, we find a striking

difference in markers for transcription initiation and elongation as mediated by the

phosphorylation of RNA Polymerase II C-terminal domain of Rpb1 (RNA-Pol2-S5p and

RNA-Pol2-S2p, respectively) [54] only in the condition when the *ING3* knockout is

combined with activation of the non-canonical NFκB pathway through AZD5582

treatment (**Figure 7E-H**). Specifically, we find that there is a striking, significant increase

in RNA-Pol2-S5p signal at the HIV-1 LTR (p=4.2827E-5), body of the provirus ("provirus

body") (p=8.943E-5), and the region downstream of the integrated HIV-1 provirus

("downstream") (p=2.03E-5) only in the condition where cells that are knocked out for

ING3 are additionally treated with AZD5582 (**Figure 7E, F**). In contrast, for the RNA-

Pol2-S2p signal in cells with a combination of *ING3* knockout and AZD5582 treatment,

we observed a significant increase in the RNA-Pol2-S2p signal in the provirus body

(p=0.0458) and downstream region (p=3.89E-5), but not over the LTR (**Figure 7G, H**).

Interestingly, in the intermediate condition of only *ING3* knockout, the signal of RNA-

Pol2-S2p is significantly reduced at the HIV-1 LTR (p=0.00583) (**Figure 7G, H**). This

reduction in RNA-Pol2-S2p signal might be partially explained by the concomitant

reduction we see in pan-H4Ac signal at the HIV-1 LTR in the *ING3* knockout condition

alone. The striking increase in HIV-1 reverse transcriptase activity in the combination

condition is concordant with our CUT&Tag results and suggest that the knockout of

ING3 combines with stimulation of the non-canonical NFκB pathway by AZD5582 to

promote a potent increase in the RNA-Pol2-S5p and RNA-Pol2-S2p on the HIV-1

proviral genome.

As we observed the most significant RNA-Pol2-S5p level changes in the

combined *ING3* knockout and AZD5582 treatment condition, we next asked whether the

increasing RNA-Pol2-S5p levels was specific to the HIV-1 provirus or if this was

occurring genome-wide. We compared the RNA-Pol2-S5p signal in the combined *ING3*

knockout cells treated with AZD5582 to the control (NTC + DMSO) condition. We found

the RNA-Pol2-S5p peaks over the HIV-1 LTR, provirus body, and downstream region

were amongst the peaks with the most significant increase in RNA-Pol2-S5p signal

(**Figure 8A**). We then rank ordered all the RNA-Pol2-S5p peaks by Log_2-fold change

and found that out of the 2,547 total RNA-Pol2-S5p peaks, the top three peaks arranged

from highest to lowest fold change were the HIV-1 provirus body, the region

downstream of the HIV-1 integration site, and the HIV-1 LTR (**Figure 8B**). The two

RNA-Pol2-S5p peaks with a significant increase in signal and the next highest fold

change cover HCG27, a long non-coding RNA, and HIST2H4A – HIST2H4B, part of

histone cluster 2 in the human genome. The RNA-Pol2-S5p peak with the strongest

reduction in RNA-Pol2-S5p signal in *ING3* knockout cells treated with AZD5582 covers

PCGF3, a part of the Polycomb group PRC1-like complex (**Figure 8B**). Overall, this

suggests the increase in transcription of the HIV-1 provirus caused by *ING3* knockout in

combination with AZD5582 treatment, as correlated to the RNA-Pol2-S5p mark, is

highly specific and nearly unique in the human genome. Thus, the CUT&Tag data

reveal that *ING3* knockout results in a reduction in H4Ac and BRD4 levels over the HIV-

1 LTR and that *ING3* knockout acts in combination with AZD5582 treatment to

dramatically increase the transcriptional initiation and transcription elongation of the

HIV-1 provirus leading to latency reversal.

Discussion

The hypothesis underlying this work is that modulating multiple overlapping

mechanisms that control HIV-1 LTR-driven transcription will increase the potency and

specificity of HIV-1 latency reactivation. That is, the goal is to find pathways that target

potent transcriptional activation of latent HIV-1 proviruses with minimal global effects.

We designed and validated a modular CRISPR screening approach which uses the

incorporation of HIV-CRISPR genomes encoding sgRNAs into budding virions as a

direct readout of activation of the latent provirus. The Latency HIV-CRISPR screen uses

a sgRNA library of epigenetic regulatory genes and is paired with and without an LRA,

AZD5582, to identify HIV-1 latency factors that act independently and in combination

with AZD5582. We identified *ING3* as a gene whose knockout resulted in an enhanced

increase of viral reactivation only in the presence of AZD5582. Using automated

CUT&Tag, we observed that this enhancement is associated with active transcription

marks as demonstrated by increased levels of RNA-Pol2-Ser5p and RNA-Pol2-Ser2p at

the HIV-1 genome and mechanistically may be directly or indirectly dependent on a

reduction in histone H4 acetylation and BRD4 occupancy over the HIV-1 LTR. We also

identified CUL3 and multiple members of the NuA4 HAT complex as important for HIV-1

latency maintenance.

Combinations of pathways with specificity for activating HIV-1 transcription

We find that two independent mechanisms - _ING3_ knockout and low-activating

dose of AZD5582 – which when combined, have unique, specific effects on the HIV-1

LTR and function together to efficiently activate HIV-1 transcription by increasing the

presence of initiated and elongating RNA-Pol2 at the LTR and within the body of the

HIV-1 provirus (**Figure 7**). Under these conditions used in our study, the RNA-Pol2-S5p

peaks with the highest fold change throughout the entire genome were at the HIV-1 LTR

and the provirus body (**Figure 8**). By CUT&Tag, RNA-Pol2-S5p appears as the primary

marker for HIV-1 transcription in the J-Lat 10.6 cell line and this may be a result of P-

TEFb, the major elongation factor for HIV-1 transcription, is a CTD kinase that can

phosphorylate Ser5 and Ser2 individually, but not simultaneously [55]. Our model

suggests that a reduction in NuA4 acetylation and BRD4-dependent occupancy at the

HIV-1 LTR is associated with enhanced transcription in response to _ING3_ knockout and

activation of the non-canonical NFκB pathway.

We observed a reduction in histone acetylation and BRD4 recruitment to the HIV-

1 LTR that is concomitant with enhanced RNA-Pol2 initiation and elongation only upon

a combination of _ING3_ knockout and AZD5582 treatment. This suggests the HIV-1

provirus may be subject to unexpected transcriptional control. In most mammalian

482 transcriptional units driven by RNA-Pol2, NuA4 HAT is predominantly localized to

483 promoters of active genes, specifically around the transcription start sites [56-58]. The

484 NuA4 HAT preferentially acetylates histone H4 [59] and this activity often impacts the

485 regulation of gene expression by activating transcription. Additionally, BRD4 binds to

486 acetylated chromatin [60], remains chromatin bound during mitosis [61, 62], and

487 positively regulates mammalian transcription elongation through interaction with P-TEFb

488 [36, 63]. Moreover, recruitment of other HAT complexes such as p300/CBP and P/CAF

489 to the HIV-1 LTR followed by subsequent acetylation is associated with stimulation,

490 rather than silencing, of HIV-1 transcription [64-70]. Additionally, using *in vitro*

491 nucleosome-assembled templates in a Tat-independent system, the NuA4 HAT

492 activates HIV-1 transcription [71]. Conversely, in the presence of Tat, the NuA4 HAT

493 complex has been implicated in silencing of HIV-1 transcription. For example, in both a

494 primary CD4+ T cell model and cells from ART-treated people living with HIV-1, the

495 absence of KAT5, the catalytic component of the NuA4 HAT complex, promotes

496 activation of HIV-1 transcription as a result of reduced H4 acetylation and BRD4 long

497 isoform occupancy, and increased levels of the Super Elongation Complex (SEC)

498 members at the HIV-1 LTR [9]. Furthermore, BRD4 has been demonstrated to not be

499 required for HIV-1 transcription in the presence of Tat in HeLa cells [36] and has the

500 potential to compete with Tat for binding to P-TEFb [16, 36]. Perhaps a competition

501 model could explain why the reduced levels of acetylation and BRD4 we observed upon

502 *ING3* knockout and AZD5582 treatment are associated with increases in HIV-1

503 transcription. Importantly, loss of BRD4 is not correlated with any changed in the

binding of CDK9, a subunit of P-TEFb [72], thus the reduced levels of BRD4 are unlikely

to be directly impacting P-TEFb binding. Instead, we propose a model in which the

knockout of *ING3* leads to a decrease of H4 acetylation and BRD4, which enhances Tat

recruitment of P-TEFb to TAR due to an increase in spatial opportunity for chromatin

binding. In addition, the treatment of a low-activating dose of AZD5582 leads to

recruitment of poised and active RNA-Pol2 at the HIV-1 LTR. Thus, upon the unique

combination of *ING3* knockout and AZD5582 treatment, we observe the potent and

nearly specific increase in viral transcription. Interestingly, our findings are consistent

with this observation as our Latency HIV-CRISPR screen identified multiple members of

the NuA4 HAT complex, including KAT5, as top candidates and all the candidates were

validated as latency maintenance factors through individual knockouts. In fact, our

screen suggests that not only the catalytic subunit, but the NuA4 HAT complex

altogether regulates HIV-1 transcription negatively.

We observed a reduction in H4 acetylation across the entire HIV-1 LTR in

response to *ING3* knockout, but in the presence of AZD5582 we see the most

significant reduction of H4Ac signal and BRD4 occupancy at the R and U5 region which

includes the HIV-1 transcription start site. This observation suggests, the increase in

accessibility of the HIV-1 transcription start site when *ING3* knockout combined with

AZD5582 treatment likely promotes both transcription initiation and elongation,

culminating in the enhanced viral reactivation we observe in both J-Lat cells and primary

CD4+ T cell HIV-1 latency models. Additionally, the dosage of AZD5582 used was a

low-reactivating dose, suggesting that by inhibiting the NuA4 complex in parallel, it may

be possible to efficiently activate HIV-1 transcription while causing minimal disruptions

to a host system. HIV-1 is subject to complex transcriptional regulation, and these

results highlight the importance of simultaneously examining multiple mechanisms to

identify opportunities to specifically stimulate transcription of latent HIV-1 proviruses.

These results are similar in concept to a recent study that found that the combination of

AZD5582 and I-BET151 uniquely activated HIV-1 transcription in a Jurkat model of

latency [73].

In support of the hypothesis that these mechanisms are nearly unique to the HIV-

1 LTR, relatively few loci in the host genome showed a significant increase in RNA-

Pol2-S5p occupancy when *ING3* knockout is combined with a low-activating dose

treatment of AZD5582. One of these regions is downstream of the HIV-1 provirus

integration site in J-Lat 10.6 cells and part of the *SEC16A* gene (**Figure 8**). Activation of

human genes near or at the integrated provirus due to active transcription from an

integrated provirus is a likely scenario as HIV-1 preferentially integrates into highly

transcribed genes [74], and would be an unavoidable consequence of any reactivation

strategy used for eradicating the latent HIV-1 reservoir. In the combined condition of

ING3 knockout and AZD5582 treatment, two other loci, a region of histone cluster 2

spanning HIST2H4A – HIST2H4B and a region overlapping with the long-noncoding

RNA, HCG27, also showed statistically significant, large fold changes in RNA-Pol2-S5p

levels, but these changes were not as prominent as those observed over the HIV-1

provirus (**Figure 8**). In addition, we observed the gene PCGF3 had significantly reduced

RNA-Pol2-S5p occupancy which could potentially to contribute to latency reversal as it

is part of the non-canonical Polycomb group RING finger 3/5-PRC1 complex with

silencing function [75] and is involved in the recruitment of PRC1 and PRC2 which have

been shown to contribute to HIV-1 proviral silencing [8, 10, 76].

Comparison to other HIV latency screens

Our Latency HIV-CRISPR screening strategy is a unique approach to identify

factors involved in HIV-1 latency. However, previous screens have also explored HIV-1

latency factors using gene knockout, knockdown, or silencing screening [10, 20-27].

Generally, these previous screens used whole genome sgRNA libraries which make

them unbiased for specific pathways, but this also limits the strength in statistical power

to determine gene hits. Nonetheless, these previous screens have uncovered an

exciting breadth of HIV-1 latency factors from the mTOR pathway [20] to proteasome

related genes [23, 25] to the non-canonical NFκB pathway [27]. As epigenetics plays an

important role in HIV-1 latency and it is still under investigation, we focused our Latency

HIV-CRISPR screen for epigenetic regulatory factors by using a small, custom designed

sgRNA library. Additionally, a smaller library can increase the dynamic range of a

screen [77]. Our screen also relies on the HIV-CRISPR vector [30] to perform a high-

throughput screen, which uses HIV-1 replication, rather than another reporter, as the

direct readout of the screen. The difference in readout from other screens including

screens with epigenetic hits [10, 22, 26] can result in different gene hits being

highlighted. Another challenge of studying mechanisms of HIV-1 latency is the

interaction of complex mechanisms in parallel and to address this using a CRISPR

screen approach, we combined the screen with a low-activating dose of LRA treatment.

By focusing our sgRNA library on epigenetic regulators and performing our screen with

and without AZD5582 treatment, we identified a unique combination of modifications

that synergize to stimulate HIV-1 transcriptional initiation and elongation.

A paper published while this manuscript was being prepared used a similar

strategy of CRISPR screening in the presence of low-activating doses of LRA, but with

a whole-genome guideRNA library [78]. Dai et al found that *BRD2* knockout synergized

with AZD5582 [78], which likely falls within the same pathway identified in our study. In

fact, in our screen results, *BRD2* also was a highly ranked gene hit in the presence of

AZD6682 (rank #19 in the J-Lat 5A8 cell screen and #55 in the J-Lat 10.6 cell screen)

(**Supplementary Table 5**). Thus, by exploring the combination of low-activating doses

of LRAs with CRISPR based screens, the field can identify pathways leading to

improvements in the specificity and potency of novel LRAs towards a curative treatment

strategy that eradicates the HIV-1 latent pool.

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Figure Legends

Figure 1. The Latency HIV-CRISPR screen.
(A) Schematic summarizing the Latency HIV-CRISPR screen in J-Lat cell lines showing the latent, integrated provirus and the HIV-CRISPR vector which delivers Cas9 and a sgRNA and produces a packageable genomic RNA. Red boxes represent the gene or sgRNA targeting the gene of interest; gray boxes represent functional HIV-1 LTRs at both sides of the vector and provirus; triangles represent internal promoters for sgRNA and Cas9 transcription. **(B)** Categorical distribution of the genes targeted by the Human Epigenome (HuEpi) sgRNA library. **(C)** Metascape Gene Ontology (GO) analysis [43] of the genes targeted by the HuEpi sgRNA library. **(D)** Summary of workflow from the generation of the pool of J-Lat HuEpi knockout cells to the sequencing and comparison of the abundance of guideRNAs found in the viral RNA (vRNA) pool versus the genomic DNA (gDNA) pool. GuideRNAs enriched in the viral supernatant RNA relative to the genomic DNA represent the gene(s) that upon knockout result in latency reversal.

Figure 2. GuideRNA level enrichment for known and novel genes of interest in the Latency HIV-CRISPR screen.
(A) GuideRNA enrichment ($\log_2$ of fold change) in both J-Lat cell lines for the genes targeted by the HuEpi sgRNA library compared to the Non-Targeting Control (NTC) guides. For statistical analysis, the HuEpi gene sgRNAs are compared to the NTC control. Welch's t-test, p-value < 0.0001. **(B)** GuideRNA level enrichment of known HIV-1 latency maintenance factors BRD4, KAT5, and PRC2 complex members (EZH2, SUZ12, and EED) in the Latency HIV-CRISPR screen. For statistical analysis, all conditions are compared to the NTC control. Welch's t-test, p-value =<0.05 = *, =<0.05 = **, =<0.001 = ***.

Figure 3. The Latency HIV-CRISPR screen in J-Lat 10.6 and J-Lat 5A8 cells identifies a set of mutual, novel hits.
(A) The -$\log_{10}$ of the MAGeCK scores for each gene targeted by the HuEpi sgRNA library (black circles and red triangles) and NTCs (gray squares) are calculated and displayed. Gene names are labelled for hits that have a <10% false discovery rate (FDR) in both J-Lat cell lines (center of Venn diagram in (B)); red triangles represent members of the NuA4 HAT complex and SRCAP complex. NTCs are artificial NTC genes designed by iterative binning of NTC sgRNA sequences (see Methods). Genes are randomized on the x-axis, but the same order is used for both right and left panels. The y-axis is the inverse $\log_{10}$ of the MAGeCK score. **(B)** Top hit genes (cut off of <10% FDR) in common and unique to each J-Lat cell line are ordered by significance and FDR with the top of the list having the highest significance and lowest FDR. **(C)** Metascape GO analysis [43] of the gene hits with a <10% FDR in each J-Lat cell line. **(D)** Analysis of the -$\log_{10}$ of the MAGeCK scores of the genes overlapping and unique to the NuA4 HAT and SRCAP complex compared to the NTCs. The higher the number, the more statistically significant it is of a hit. Red font is for genes that score higher than the average NTC score.

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Figure 4. Validation of top hits from Latency HIV-CRISPR screen.
(A) Validation of the top 9 gene hits of the Latency HIV-CRISPR screen was performed
by individually knocking out each J-Lat cell line with two different guide RNAs and
measuring viral reactivation by quantifying HIV-1 reverse transcriptase activity of the
viral supernatant. *NFκBIA* knockout is a positive control. The reverse transcriptase
activity from released virions was normalized to basal activity from the NTC knockout.
For each for the knockout cell lines, ICE analysis was performed and the average
knockout is shown in pie charts. Multiple unpaired t-tests, p-value =<0.05 = *. **(B)** *CUL3*
knockout resulted in significant viral reactivation in a primary CD4+ T cell model of HIV-
1 latency using cells from four healthy donors. Viral reactivation was measured by flow
cytometry and normalized to the *AAVS1* knockout cells. Paired t-test, p-value =<0.05 =
*, =<0.05 = **.
663
Figure 5. LRA Latency HIV-CRISPR screen identifies ING3 in combination with
AZD5582 as a HIV-1 latency maintenance factor.
(A) *ING3* is the top hit of the LRA Latency HIV-CRISPR screen. The Latency HIV-
CRISPR screen HuEpi knockout cells were treated with a low activating dose (10 nM) of
AZD5582. The -$\log_{10}$ of the MAGeCK score (on the y-axis) for each gene targeted by
the HuEpi sgRNA library (black circles) and NTCs (gray squares) are calculated and
displayed. NTCs are artificial NTC genes designed by iterative binning of NTC sgRNA
sequences (see Methods). Genes are randomized on the x-axis, but the same order is
used for both right and left panels. **(B)** Comparison of the Latency HIV-CRISPR screen
by MAGeCK score in the presence (y-axis) and absence of AZD5582 (x-axis) with
HuEpi genes (circles) and NTCs (gray squares). The data for the screen without an LRA
(x-axis) is from Figure 3 as these two screens were performed in parallel. The genes
unique to each screen are closest to the respective axis and the genes that are in
common to both screens are at the center. *ING3* is highlighted in periwinkle and *CUL3*
in green.
679
Figure 6. Validation of ING3 in combination with AZD5582 as a HIV-1 latency
maintenance factor.
(A) HIV-1 reverse transcriptase activity (y-axis) of the viral supernatant of NTC sgRNA
transduction or *ING3* knockout in J-Lat 10.6 and 5A8 treated with 10 nM AZD5582 or an
equivalent volume of DMSO. *ING3* knockout and AZD5582 treatment combine to result
in a significant increase in viral reactivation. Paired t-test, p-value =<0.05 = *, =<0.05 =
. **(B) Representative flow cytometry plots of primary CD4+ T cell HIV-1 latency model
cells that are *AAVS1* or *ING3* knockouts treated with DMSO or 1 μM AZD5582
treatment. Thy1.2-, GFP- cells (quadrant 4) are uninfected; Thy1.2+, GFP- (quadrant 3)
cells are infected with the dual reporter HIV-1 virus and latent; Thy1.2+, GFP+ cells
(quadrant 2) are infected and reactivated. **(C)** Four independent knockouts of *AAVS1*
and *ING3* in primary CD4+ T cell HIV-1 latency model cells were performed in two
healthy donors (three knockouts in one donor, one knockout in another donor) and each
pool of knockout cells were treated with DMSO or 1 μM AZD5582. Knockout of *ING3*

and AZD5582 treatment combined resulted in significant reactivation compared to
knockout of *AAVS1*. Paired t-test, p-value =<0.05 = *. **(D)** Western blot showing similar
p52 levels are detected in the control and ING3 knockout J-Lat 10.6 and 5A8 cell lines
upon treatment of 10 nM AZD5582. Activation of the non-canonical NFκB (NFκB2)
pathway is marked by a decrease in p100 and an increase in the cleaved product of
p52.
700
Figure 7. *ING3* knockout decreases pan-H4Ac and BRD4 levels and stimulates
HIV-1 transcriptional initiation and elongation upon addition of AZD5582.
(A) Genome browser tracks centered over the HIV-1 LTR showing the pan-H4Ac signal
decreases in the *ING3* knockout alone and in combination with AZD5582 conditions.
The y-axis represents read count. Because the HIV-1 LTR sequence is identical
between 5' LTR vs. the 3' LTR, the CUT&Tag reads are combined onto one LTR. The
LTR is subdivided into three regions: U3, R (containing the transcription start site), and
U5. As quality control, we determined the signal levels of pan-H4Ac from the CUT&Tag
data and confirmed the replicates of the antibody was most highly correlated amongst
the pan-H4Ac replicates (**Supplemental Figure 3A**). **(B)** Box plot showing the pan-
H4Ac levels quantified over the full LTR including the U3 region and the R+U5 regions
that include the transcriptional start site. The y-axis is the pan-H4Ac base pair coverage
normalized to the total base pair coverage across the genome. Blue represents the
transduction of NTC sgRNA with treatment of DMSO; yellow represents the
transduction of NTC sgRNA with a treatment of 10 nM AZD5582; orange represents
ING3 knockout with treatment of DMSO; red represents *ING3* knockout with treatment
of 10 nM AZD5582. Replicates for IgG n=18 and pan-H4Ac n=24. For statistical
analysis, all conditions are compared to the NTC knockout and DMSO treatment
control. P-value <0.05 = *, <0.005=**. **(C)** Genome browser tracks showing BRD4 levels
decrease in the *ING3* knockout alone and in combination with AZD5582 conditions. As
quality control, we determined the signal levels of BRD4 from the CUT&Tag data and
confirmed the replicates of the antibody was most highly correlated amongst the BRD4
replicates (**Supplemental Figure 3A**). **(D)** Same as (B) but quantifying BRD4 levels.
Replicates for BRD4 n=16. **(E)** Genome browser tracks showing RNA-Pol2-S5p levels
increase at the HIV-1 LTR, as well as the body of the provirus downstream of the 5' LTR
("provirus body"), and the region of the host genome downstream of the 3' LTR of the
integrated provirus ("downstream") upon *ING3* knockout and AZD5582 treatment
combined. As quality control, we determined the signal levels of RNA-Pol2-S5p from the
CUT&Tag data and confirmed the replicates of the antibody was most highly correlated
amongst the RNA-Pol2-S5p replicates (**Supplemental Figure 3B**). **(F)** Box plot showing
the quantification of the RNA-Pol2-S5p CUT&Tag signal over the HIV-1 LTR, as well as
the body of the provirus, and the region of the host genome downstream of the provirus.
The y-axis is the RNA-Pol2-S5p base pair coverage normalized to the total base pair
coverage across the genome. Blue represents the transduction of NTC sgRNA with
treatment of DMSO; yellow represents the transduction of NTC sgRNA with a treatment
of 10 nM AZD5582; orange represents *ING3* knockout with treatment of DMSO; red
represents *ING3* knockout with treatment of 10 nM AZD5582. Replicates for RNA-Pol2-

S5p n=13. For statistical analysis, all conditions are compared to the NTC knockout and
DMSO treatment control. P-value <0.05 = *, <0.005=**, <0.0005=***. **(G)** Genome
browser tracks showing RNA-Pol2-S2p levels increase over the body of the HIV-1
provirus as well as the host genome downstream of the provirus upon *ING3* knockout
and AZD5582 treatment combined. As quality control, we determined the signal levels
of RNA-Pol2-S2p from the CUT&Tag data and confirmed the replicates of the antibody
was most highly correlated amongst the RNA-Pol2-S2p replicates (**Supplemental
Figure 3B**). **(H)** Same as (F) but quantifying RNA-Pol2-S2p levels. Replicates for RNA-
Pol2-S2p n=17.

**Figure 8. Changes in RNA-Pol2-S5p levels upon *ING3* knockout combined with
AZD5582 treatment are nearly unique to the HIV-1 provirus.**
(A) Volcano plot comparing RNA-Pol2-S5p peaks between the NTC KO + DMSO
(negative control) and ING3 KO + AZD5582 conditions. Highlighted peaks over the HIV-
1 LTR (magenta circle), the body of the provirus (purple circle), and downstream region
of HIV-1 provirus (teal circle) are the regions of the highest RNA-Pol2-S5p fold change
and are highly significant. Other regions with an absolute $\log_2$ fold change greater than 1
and a -$\log_{10}$ adjusted p-value > 2 are highlighted in red. **(B)** Scatter plot showing all of
the RNA-Pol2-S5p peaks rank ordered by fold change. Peaks are colored as in (A). The
top three regions are the HIV-1 LTR, body of the HIV-1 provirus, and downstream
region of the HIV-1 provirus. The next two regions overlap *HCG27* and the histone
cluster 2 spanning HIST2H4A-HIST2H4B. The region with the greatest reduction in
RNA-Pol2-S5p signal overlaps *PCGF3*.

762 **Materials and Methods**
763
J-Lat wildtype, clonal knockout, and pooled knockout cells
The HIV-1 latency cell line J-Lat 5A8 [29] and J-Lat 10.6 [28] were grown in RPMI-1640
medium (Thermo Fisher Scientific) supplemented with 10% Fetal Bovine Serum (FBS),
Penicillin-Streptomycin (Pen/Strep), and 10 mM HEPES. In order to use these cells for
screening with HIV-CRISPR, we performed CRISPR/Cas9-mediated knockout of Zinc
Antiviral Protein (ZAP) [30] by electroporation of the J-Lat 10.6 and 5A8 cells with a
Gene Knockout v2 kit (GKOv2) for ZAP (Synthego, Redwood City, CA) complexed with
1 μL of 20 μM Cas9-NLS (UC Berkeley Macro Lab). 5 days post electroporation, the
cells were single cell sorted into a 96-well U-bottom plate (Sony MA900 Multi-
Application Cell Sorter – Fred Hutch Flow Cytometry shared resource) and individual
clones with biallelic knockouts of ZAP were used for subsequent Latency HIV-CRISPR
screens. J-Lat cells with HIV-CRISPR KO pools targeting NFKBIA, KAT5, CUL3,
ACTL6A, VPS72, DNMT1, DMAP1, SRCAP, YEATS4, and two non-targeting controls
(**Supplemental Table 6**) were generated by transduction of lentivirus and subsequent
0.4 μg/mL puromycin selection for 10-14 days. To generate the CRISPR/Cas9-edited
knockout pools, the sgRNAs that were the most overrepresented in the viral
supernatant (highest combined p-value) of the Latency HIV-CRISPR screen were
selected. Cell lines were determined to be mycoplasma free by the Fred Hutch
Specimen Processing/Research Cell Bank shared resource.
783
Plasmids
HIV-CRISPR plasmid was previously described [30]. HIV-CRISPR constructs targeting
genes of interest were cloned by annealing complementary oligos (**Supplemental
Table 6**) with overhangs that allow directional cloning into HIV-CRISPR using the
BsmBI restriction sites. pMD2.G and psPAX2 plasmids were gifts from Didier Trono
(Addgene #12259 and #12260, respectively). pMD2.Cocal plasmid was a gift from
Hans-Peter Kiem [79]. lentiCRISPRv2 plasmid was a gift from Feng Zhang (Addgene
#52961). The pNL4-3-Δ6-dreGFP-CD90 was previously described [50].
792
Human Epigenome CRISPR/Cas9 sgRNA Library Construction
The Human Epigenome (HuEpi) sgRNA library is composed of 841 genes of which 778
genes derive from the database Epifactor [32] and 63 genes were hand selected. For
most genes, six sgRNA sequences were generated using GUIDES (Graphical User
Interface for DNA Editing Screens) [80]. Two genes (HEATR1 and MCM2) have
fourteen guides and one gene (UBE2N) has one guide. 252 non-targeting sgRNAs
sourced from GeCKO v2.0 library [33] were also included resulting in a generated
library of a total of 5,309 guides. The HuEpi sgRNA was synthesized (Twist
Biosciences, San Francisco, CA) and cloned into HIV-CRISPR. Oligo pools were
amplified using Phusion High-Fidelity DNA Polymerase (NEB) combined with 1 ng of
pooled oligo template, primers ArrayF and ArrayR (ArrayF primer:
TAACTTGAAAGTATTTCGATTTCTTGGCTTTATATATCTTGTGGAAAGGACGAAACA
CCG and ArrayR primer:

ACTTTTTCAAGTTGATAACGGACTAGCCTTATTTTAACTTGCTATTTCT

AGCTCTAAAAC), an annealing temperature of 59°C, an extension time of 20 s, and 25

cycles. Following PCR amplification, a 140 bp amplicon was gel-purified and cloned into

BsmBI (NEB; R0580) digested HIVCRISPR using Gibson Assembly (NEB; E2611S).

Each Gibson reaction was carried out at 50°C for 60 min. Drop dialysis was performed

on each Gibson reaction according to the manufacturer's protocol using a Type-VS

Millipore membrane (VSWP 02500). 5 µl of the reaction was used to transform 25 µl of

Endura electrocompetent cells (Lucigen; 60242-2) according to the manufacturer's

protocol using a Gene Pulser (BioRad). To ensure adequate representation, sufficient

parallel transformations were performed and plated onto carbenicillin containing LB

agarose 245 mm x 245 mm plates (Thermo Fisher) at 300-times the total number of

oligos of each library pool. After overnight growth at 37°C, colonies were scraped off,

pelleted, and used for plasmid DNA preps using the Endotoxin-Free Nucleobond

Plasmid Midiprep kit (Takara Bio; 740422.10). The HuEpi library was sequenced and

contains all 5,309 sgRNAs included in the synthesis (GSE215430).

Lentivirus Production

293T cells (ATCC;CRL-3216) cultured in DMEM (Thermo Fisher Scientific)

supplemented with 10% FBS and PenStrep were plated at 2E5 cells/mL in 2 mL in 6-

well plates one day prior to transfection. Transfection is performed using TransIT-LT1

reagent (Mirus Bio LLC; MIR2300) with 3 uL of transfection reagent per µg of DNA. For

lentiviral preps, 293Ts were transfected with 667 ng lentiviral plasmid, 500 ng psPAX2,

and 333 ng pMD2.G. One day post-transfection, media was replaced. Two- or three-

days post-transfection, viral supernatants were filtered through a 0.2 µm filter (Thermo

Scientific; 720-1320). For HuEpi library lentiviral preps, the same transfection of 293Ts

was performed and supernatants from forty 6-well plates were combined and

concentrated by ultracentrifugation. About 30 mL of supernatant are aliquoted into a

polypropylene tube (Beckman Coulter; 326823) and underlaid with sterile-filtered 20%

sucrose (20% sucrose, 1 mM EDTA, 20 mM HEPES, 100 mM NaCl, distilled water).

Each of the polypropylene tubes are placed in a swinging bucket and spun in a SW 28

rotor at 23,000 rpm for 1 hour at 4°C in a Beckman Coulter Optima L-90K

Ultracentrifuge. Supernatants were decanted and pellets are resuspended in DMEM or

RPMI over several hours at 4°C. Concentrated lentivirus was used immediately or

aliquots were made and stored at -80°C. All lentiviral transductions were performed in

the presence of 20 µg/mL DEAE-Dextran (Sigma-Alrdich; D9885). For generating pNL4-

3-Δ6-dreGFP-CD90 stocks, the procedure was the same as the lentiviral preps except

that 293Ts were transfected with 900 ng lentiviral plasmid, 450 ng psPAX2, and 150 ng

pMD2.Cocal.

LRA and no LRA Latency HIV-CRISPR Screening

The HuEpi library lentiviral preps were titered by a colony-forming assay in TZM-bl cells

(NIH AIDS Reagent Program; ARP-8129) and used to transduce J-Lat 10.6 and J-Lat

5A8 cells at an MOI of 0.4. For the transduction, 3E6 cells per replicate (>500x

coverage of the HuEpi library) was used and the spinoculation was performed at

1100xg for 30 min in the presence of 20 µg/mL DEAE-Dextran. Cells were selected in
puromycin (0.4 µg/mL) for 10-14 days. In preparation for the LRA screen, AZD5582
dihydrochloride (Tocris; 5141) was resuspended in DMSO to 1 mM stocks. Subsequent
dilutions are performed in RPMI and used immediately. Upon completion of selection,
for the LRA screen, 3E6 cells per replicate per cell line were treated with 10 nM
AZD5582 for 24 hours. Cells and supernatants were collected post selection or post
treatment. Cells were washed once with DPBS (Gibco; 14190144) and cell pellets were
stored at -20°C. Genomic DNA was extracted from cell pellets with the QIAamp DNA
Blood Midi Kit (Qiagen; 51183) and genomic DNA was eluted in distilled water. Viral
supernatants were spun at 1100xg to remove cell debris, filtered through a 0.22 µm filter
(Millipore Sigma, SE1M179M6), overlaid on a 20% sucrose cushion, and concentrated
in a SW 28 rotor for 1 hour at 4°C. The pellet is resuspended in RPMI and stored at -
80°C. Viral RNA was extracted from the concentrated virus with the QIAamp Viral RNA
Mini Kit (Qiagen, 52904). The sgRNA sequences found in the genomic DNA and viral
RNA samples were amplified by PCR (Agilent; 600677) and RT-PCR (Invitrogen;
18064014), respectively, using HIV-CRISPR specific primers. A second round of PCR is
performed to barcode and prepare the libraries for Illumina sequencing (**Supplemental
Table 6**). Each amplicon was cleaned up using double-sided bead clean-up (Beckman
Coulter; A63880), quantified with a Qubit dsDNA HS Assay Kit (Invitrogen; Q32854),
and pooled to 10 nM for each library. Library pools are sequenced on a single lane of an
Illumina HiSeq 2500 in Rapid Run mode (Fred Hutch Genomics and Bioinformatics
shared resource).
872
Screen Analysis
Raw sequencing data is available as a GEO DataSet (GSE215430). Library pools are
demultiplexed, reads are assigned to respective samples, trimmed, and aligned to the
HuEpi library via Bowtie [81]. An artificial NTC sgRNA gene set the same size as the
HuEpi library was generated by iteratively binning the NTC sgRNA sequences. Analysis
of the screen to determine relative enrichment or depletion of the sgRNAs and genes
were performed using the MAGeCK statistical package [35].
880
Western Blotting/Immunoblotting
Cells were harvested and washed once with ice cold phosphate-buffered saline (PBS)
and pelleted by centrifugation (300 x g for 3 min). Whole cell lysate was extracted on ice
by first resuspending the cell pellet with Pierce IP Lysis Buffer (ThermoFisher Scientific;
87787) supplemented with cOmplete protease inhibitor cocktail (Roche; 11697498001).
The samples were then incubated on ice for 10 min with brief vortexing every 2-3 min
and followed by a centrifugation at 16,000 x g for 20 min at 4°C. To prepare the
samples, add 4x NuPAGE LDS Sample Buffer (ThermoFisher Scientific; NP0008)
containing 5% 2-Mercaptoethanol (Millipore Sigma; M3148) and boil the samples at
95°C for 5 min. Lysates were resolved on a NuPAGE 4-12% Bis-Tris pre-cast gel
(ThermoFisher Scientific; NP0336) and transferred to nitrocellulose membranes (Biorad;
1620115). Blocking was performed for 1 hr at room temperature using 5% milk/0.1%
Tween-20 added to Tris-buffered saline (TBS) (20 mM Tris base and 150 mM NaCl at

pH 7.6). Immunoblotting was performed using the primary antibodies CUL3 (Cell
Signaling; 2759) at 1:1000, NFkB2 (Cell Signaling; 4882) at 1:1000, and viniculin (Santa
Cruz; sc-25336) at 1:5000. Membranes were washed with TBST 6 times for 5 min each.
The following secondary antibodies were used at a 1:5000 dilution: goat anti-rabbit IgG-
HRP (R&D Systems; HAF008) and goat anti-mouse IgG-HRP (R&D Systems; HAF007).
Membranes were developed with SuperSignal West Femto Maximum Sensitivity
Substrate (Thermo Fisher; 34095) and visualized on a BioRad Chemidoc MP Imaging
System.
902
Genomic Editing Analysis
Knockout cells were harvested and DNA was extracted using the QIAamp DNA Blood
Mini Kit (Qiagen; 51104). Primers from each targeted locus (**Supplemental Table 6**)
were used to amplify the edited loci and the PCR was performed with either Platinum
Taq DNA Polymerase High Fidelity (ThermoFisher Scientific; 11304011) or Q5 High-
Fidelity DNA Polymerase (NEB; M0491S). Sanger sequencing was performed on PCR
amplicons (Fred Hutch Genomics shared resource) using a sequencing primer
(**Supplemental Table 6**) and results were analyzed by Inference of CRISPR Edits (ICE)
[44] to determine gene editing outcome.
912
913 **Virus Release (RT assay)**
914 Clarified viral supernatants are harvested and reverse transcriptase activity was
915 measured using the HIV-1 reverse transcriptase (RT) activity assay as previously
916 described [82, 83]. A standard curve is generated for all assays using a titered stock of
917 HIV-1$_{LAI}$ that was aliquoted at and stored at -80°C.
918
Ethics Statement
All primary cell data is from anonymous blood donors and is classified as "human
subjects exempt" research by the Fred Hutchinson Cancer Center Institutional Review
Boards, according to National Institutes of Health (NIH) guidelines
(http://grants.nih.gov/grants/policy/hs/faqs_aps_definitions.htm). No animal work was
done.
925
Primary CD4+ T Cell Latency Model and Knockout
Used leukocyte filters from healthy donors were obtained from Bloodworks Northwest
and total peripheral blood mononuclear cells (PBMCs) were isolated by purification over
Ficoll (Millipore Sigma; GE17-1440-02). CD4+ T cells were isolated using magnetic
negative selection (StemCell Technologies; 17952) and used immediately or frozen for
storage in liquid nitrogen. CD4+ T cells were activated using anti-CD2, CD3, and CD28
beads (Miltenyi Biotec; 130-091-441) for 2 days and grown in RPMI-1640 medium
(Thermo Fisher Scientific) supplemented with 10% Fetal Bovine Serum (FBS),
Penicillin-Streptomycin (Pen/Strep), 1x GlutaMAX (ThermoFisher Scientific; 35050061),
10 mM HEPES, 100 U/mL human interleukin-2 (Millipore Sigma; 11011456001), 2
ng/mL human interleukin-7 (Peptrotech; 200-07), and 2 ng/mL human interleukin-15
(Peprotech; 200-15). The beads were then removed by magnetic separation and cells

were spinoculated with HIV-GFP-Thy1.2 (pNL4-3-Δ6-dreGFP-CD90) and 8 ug/mL
polybrene (Millipore Sigma; TR-1003-G) for 2 hrs at 1100 x g. Spinoculated cells were
then resuspended in fresh media with IL-2, IL-7, and IL-15 and incubated for 3 days
before actively infected cells (Thy1.2+) were isolated by magnetic positive selection
(Stem Cell Technologies; 18951). Infected cells (Thy1.2+) are maintained for 2 days
before knockout of AAVS1, CUL3, and ING3 using GKOv2 kits from Synthego. crRNPs
for each gene of interest were generated as described previously in the Knockout Cell
Clones and Pools section except that supplemented P3 buffer (Lonza; V4SP-3096) is
used instead of SE buffer. For each electroporation, 1.5E6 cells were pelleted by
centrifugation at 100 x g for 10 min at 25°C, washed once with PBS, pelleted again by
centrifugation, PBS was removed, and resuspended with a crRNP complex. The
resuspended cells were immediately transferred into the cuvette of the P3 Primary Cell
Nucleofector Kit (Lonza; V4SP-3096) and electroporated using code EH-100 on the
Lonza 4D-Nucleofector. 80 μL of prewarmed supplemented RPMI media with IL-2, IL-7,
and IL-15 was added and cells were allowed to recover for 10 min in the 37°C
incubator. 300 μL of fresh media was added and cells are transferred to a 96-well plate.
200 μL of additional supplemented media was added 2 days later. The knockout cells
are maintained at 1E6 cells/mL with fresh media supplemented with IL-2, IL-7, and IL-
15. At 14 days post infection, cells are co-cultured with H80 feeder cells and maintained
at 2E6 cells/mL in media supplemented with 20 U/mL IL-2. If AZD5582 treatment
applies, cells are treated 1 uM AZD5582 media for 24 hours. At 19 days post infection,
cells were stained with Thy1.2 antibody (Biolegend; 140323), fixed with 4% PFA, and
underwent flow cytometry analysis (CD FACS Celesta – Fred Hutch Flow Cytometry
shared resource).
962
Automated CUT&Tag Profiling
We prepared nuclei from J-Lat 10.6 cells under four conditions: (i) NTC knockout with a
treatment of DMSO (negative control) (ii) NTC knockout with a treatment of 10 nM
AZD5582 (iii) ING3 knockout with a treatment of DMSO (iv) ING3 knockout with a
treatment of 10 nM AZD5582. Up to 10 million cells were pelleted in 1.5 mL microfuge
tubes spun at 300 x g for 10 min. Cells were then resuspended in 1 mL of ice cold NE1
Buffer (20 mM HEPES-KOH pH 7.9, 10 mM KCl, 0.5 mM Spermidine, 0.1% TritonX-
100, 20% Glycerol, with Roche complete EDTA-free protease inhibitor tablet), and
incubated on ice for 10 min. Nuclei were then centrifuged at 4°C at 1,300 x g for 4 min.
Nuclei were then resuspended in 1 mL of Wash Buffer (20 mM HEPES pH7.5, 150 mM
NaCl, 0.5 mM spermidine, supplemented with Roche complete EDTA-free protease
inhibitor tablet). 10 μL was used to determine the concentration of native J-Lat 10.6
nuclei, and nuclei were diluted to a concentration of 1 million nuclei/900 μL of Wash
Buffer and 900 μL aliquots of this suspension was mixed with 100 μL of DMSO in
Cryovials, which were then sealed and placed inside a Mr. Frosty isopropanol chamber
for slow freezing at -80°C. Nuclei were then stored at -80°C until use. For automated
CUT&Tag processing, nuclei were thawed at room temperature, washed in wash buffer,
and bound to concanvalin-A (ConA) paramagnetic beads (Bangs Laboratories; BP531)
for magnetic separation as described on the protocols.io website

(https://doi.org/10.17504/protocols.io.bgztjx6n).Samples were then suspended in
antibody binding buffer and split for overnight incubation with antibodies specific to
panH4Ac (Active Motif; 39925), BRD4 (Cell Signaling; 13440), RNA-Pol2-S5p (Cell
Signaling; 13523), RNA-Pol2-S2p (Cell Signaling; 13499), and IgG control(Abcam;
172730). Sample processing was performed in a 96 well plate using 100K Con-A bound
nuclei per reaction on a Beckman Coulter Biomek liquid handling robot according to the
AutoCUT&Tag protocol available from the protocols.io website
(https://doi.org/10.17504/protocols.io.bgztjx6n) and described previously [31] (Fred
Hutch Genomics shared resource).
991
CUT&Tag Sequencing Data Processing and Analysis
For AutoCUT&Tag sample pooling and sequencing, the size distribution and molar
concentration of libraries were determined using an Agilent 4200 TapeStation, and up to
96 barcoded CUT&Tag libraries were pooled at approximately equimolar concentration
for sequencing. Paired-end 2×50 bp sequencing was performed on the NextSeq 2000
platform by the Fred Hutchinson Cancer Research Center Genomics Shared
Resources. This yielded 5–10 million reads per antibody. Sequences the extended into
the 3' adapter were first removed using the adapter clipping tool by cutadapt 2.9 with
parameters:
-j 8 --nextseq-trim 20 -m 20 -a AGATCGGAAGAGCACACGTCTGAACTCCAGTCA -A
AGATCGGAAGAGCGTCGTGTAGGGAAAGAGTGT -Z.
To construct a reference reflecting integration of HIV-1 into J-Lat cells, we started with
the UCSC hg38 human reference sequence from the Illumina iGenomes collection
(https://support.illumina.com/sequencing/sequencing_software/igenome.html).
Sequence for the integrated HIV-1 genome, including flanking human sequence, was
obtained from accession MN989412.1 [84]. Accounting for flanking human sequence,
we excised chr9:136468439-136468594 from the reference Fasta file and inserted
MN989412.1 in its place. We also rewrote gene & exon annotations downstream of the
integration site, shifting all features in the associated GTF file by 10206bp to account for
newly inserted HIV-1 sequence. Indexes for Bowtie2 v2.4.1 [85] and STAR v2.7.7a [86]
were built using these modified Fasta and GTF files. The HIV-1 insertion is bounded by
a pair of LTRs that, because they comprise identical sequence, are difficult for some
alignment programs to interpret. To avoid these difficulties when needed, another
version of the reference sequence was prepared with the second copy of the LTR
sequence (634bp) masked by 'N's.
Fastq files were aligned to the custom hg38 genome with the HIV-1 genome inserted in
chromosome 9 using Bowtie2 version 2.4.2 with the following parameters: --very-
sensitive-local --soft-clipped-unmapped-tlen --dovetail --no-mixed --no-discordant -q --
phred33 -I 10 -X 1000. Raw sequencing data is available as a GEO DataSet
(GSE215430). Because the read depth and fraction of PCR duplicates varied
considerably between replicates, we removed all duplicate reads from the Bed files.
Peak calling was performed for the BRD4, pan-H4ac, RNA-Pol2-S5p, and RNA-Pol2-
S2p data sets on the pooled reads from all replicates and all conditions using SEACR
version 1.3 [87]. We called peaks using two settings, (1) in which using the IgG control

data with stringent settings, and (2) using a FDR of 0.01, and then used the FDR 0.01
peaks that overlapped with IgG peaks as our final peak set. For correlation analysis
between replicates, the BRD4 peak set was merged with the pan-H4ac peak set, and
the RNA-Pol2-S5p peak set was merged with the RNA-Pol2-S2p peak set. For
statistical comparisons presented in Figure 7, we quantified the base pair coverage of
pan-H4ac or BRD4 over the LTR, the U3 region, or the R + U5 region and these values
were normalized to the total base pair coverage across the genome for each replicate.
Similarly, for comparisons of the RNA-Pol2-S5p data and RNA-Pol2-S2p data, we
quantified the base pair coverage over the LTR, Provirus Body, and Downstream
Region of the HIV provirus these values were normalized to the total base pair coverage
across the genome for each replicate. For comparisons in Figure 7, p-values were
calculated using a two-sample t tests (two sided) with the SciPy.stats.ttest_ind() function
in Python; P values were not corrected for multiple-hypothesis testing. For global
comparison of RNA-Pol2-S5p data between the NTC + DMSO condition and the ING
KO + AZD5582 condition, presented in Figure 8, reads that overlapped RNA-Pol2-S5p
peaks were counted for each replicate and the log 2 Fold Change and adjusted p-
values were calculated using DESeq2 version 1.32.0 using the Wald test. The adjusted
p-values are corrected for multiple-hypothesis testing in a manner that is proportional to
the number of RNA-Pol2-S5p peaks. DESeq2 assigns peaks with extremely sparse
data are assigned an adjusted p-value of NaN, and these peaks were excluded form
downstream analysis.

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Figure 1

A

Gene of interest KO

HIV-CRISPR

J-Lat provirus

B

	Number of Genes
Histones	84
Histone binders	128
Histone modifiers	365
General chromatin associated	221
Other	43

C

Regulation of chromatin organization (GO:1902275)
Protein methylation (GO:0006479)
Protein acetylation (GO:0006473)
HATs acetylate histones (R-HSA-3214847)
DNA packaging (GO:0006323)
Chromatin organization involved in regulation of transcription (GO:0034401)
Chromatin remodeling (GO:0006338)
DNA repair (GO:0006281)
DNA modification (GO:006304)
Regulation of TP53 Activity (R-HSA-5633007)
Deubiquitination (R-HSA-5688426)
Demethylation (GO:0070988)
Protein deacetylation (GO:006476)
DNA recombination (GO:0006310)
Histone ubiquitnation (GO:0016574)
Regulation of cell cycle process (GO:0010564)
Histone H3-K4 methylation (GO:0051568)
The effect of progerin on the involved genes in Hutchinson-Gilford Progeria Syndrome (WP4320)
Regulation of PTEN gene transcription (R-HSA-8943724)
Histone H3-K9 modification (GO:0061647)

-150   -100   -50   0

Log_{10} (p-value)

D

① HIV-CRISPR + sgRNA library

② 1. No LRA
2. Low activating dose of LRA (AZD5582)

③

④ cells (gDNA)   virus (vRNA)

Figure 2

Figure 3

A

NuA4 HAT and SRCAP Complex ▲   NTC ◼

B

J-Lat 5A8

MBD2
AURKB
EXOSC9
CTCF
NSL1
SUZ12
TAF12
CDYL
ZNHIT1
MSL2
RNF20
DPY30

Shared (intersection)

CUL3
DNMT1
ACTL6A
TAF5
KAT5
YEATS4
SRCAP
DMAP1
VPS72

J-Lat 10.6

INTS12
WDR5
TAF7
EXOSC2
KAT8
EXOSC4
KMT2D
ING3
MCM2
ARID1A

FDR 0% – 10%

C

J-Lat 5A8

- Covalent chromatin modification (GO:0016569)
- SRCAP-associated chromatin remodeling complex (CORUM:304)
- Macromolecule methylation (GO:0043414)
- Regulation of TP53 Activity through Phosphorylation (R-HSA-6804756)
- Regulation of chromosome organization (GO:0033044)

Log_{10} (p-value)

J-Lat 10.6

- Histone acetylation (GO:001657)
- SRCAP-associated chromatin remodeling complex (CORUM:304)
- MOF complex (CORUM:1401)
- snRNA 3'-end processing (GO:0034472)
- Intracellular estrogen receptor signaling pathway (GO:0030520)
- Regulation of TP53 Activity through Phosphorylation (R-HSA-6504756)
- DNA modification (GO:0006304)
- TCF dependent signaling in response to WNT (R-HSA-201681)

Log_{10} (p-value)

D

$-\log_{10}$ (MAGeCK Gene Score)

	Gene	J-Lat 5A8	J-Lat 10.6
NuA4 HAT complex	TRRAP	2.45	1.85
	EP400	2.38	2.24
	EPC2	0.99	1.33
	EPC1	0.38	0.47
	KAT5	6.43	3.83
	ING3	1.88	4.11
	MRGBP	0.88	0.26
	ACTB	0.19	0.75
	MORF4L1	1.30	2.61
	MORF4L2	1.34	1.18
	MEAF6	2.67	1.54
	MBTD1	1.96	1.17
SRCAP complex / Shared	BRD8	1.62	1.54
	DMAP1	4.46	7.22
	RUVBL2	1.25	1.76
	RUVBL1	1.96	0.32
	ACTL6A	7.32	13.10
	VPS72	4.24	6.98
	YEATS4	5.71	5.06
	SRCAP	4.51	4.20
	ACTR6	0.38	2.44
	ZNHIT1	4.11	2.13

Figure 4

Figure 5

Figure 6

Figure 7

Figure 8