

Supplementary materials:
DNA methylation changes in a pharmaco-epigenomic EWAS in depression: comparing fixed and response-guided dosing paradigms for ketamine in the KADS trial

1. Sample description

Figure S1: description of the sample during the RCT. Cohort 1 = fixed doses; Cohort 2 = flexible doses.

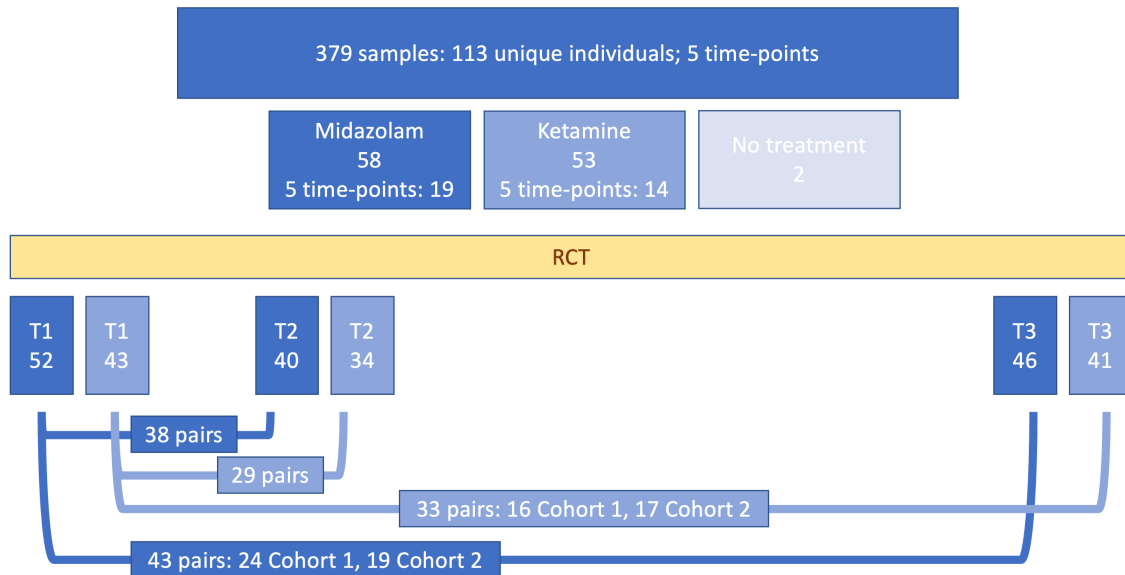
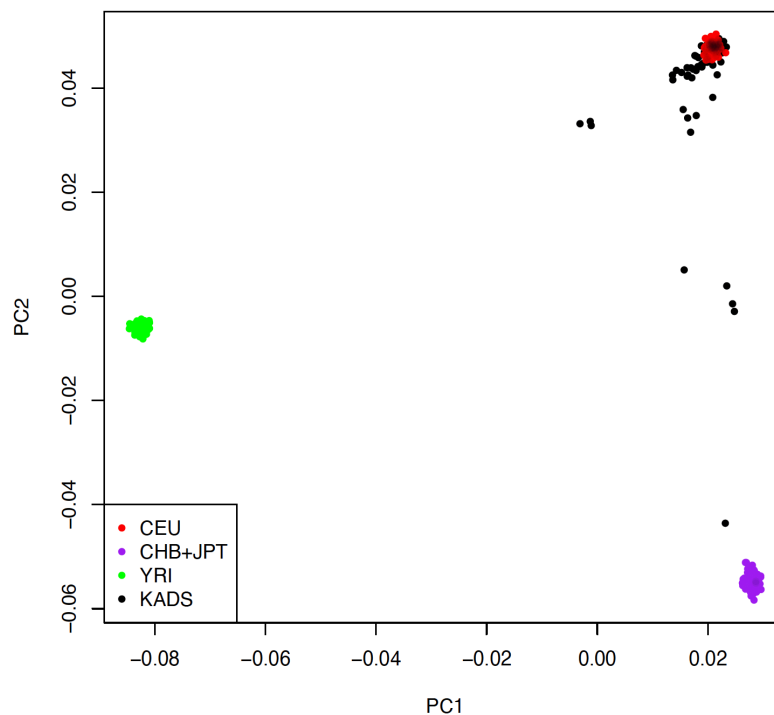


Figure S2: Genomic ancestry structure of the KADS-Sample. Ancestry was estimated using available SNP data. Data-preparation and principal component composition were performed using PLINK(1) and R according to the protocol by Anderson et al.(2).



2. QC of DNA methylation

- 388 samples available (5 Time-points)
- 4 Samples were removed due to overall DNA quality.
- Another 5 samples were removed in the DNA-methylation specific quality control steps.

Settings for preprocessing:

Normalisation method: dasen normalisation (Watermelon)

GreedyCut: detection p-value cut-off 0.05

Removal of: SNP-related CGs, Sex-related CGs, crossreactive probes

Table S1: A detailed description of the QC steps.

| | Probes at start | Samples at start |
|-------------------------------------|-----------------|------------------|
| Total at start preprocessing | 866 895 | 379 |

| Step (Filtering I) | Probes removed | Samples removed |
|----------------------------------|----------------|-----------------|
| Removal of SNP-enriched Probes | 139 721 | 0 |
| Removal of Cross-reactive Probes | 34 264 | 0 |
| GreedyCut | 8 529 | 0 |
| | | |
| <i>Total removed</i> | <i>182 514</i> | <i>0</i> |

| | Probes retained | Samples retained |
|-----------------------|-----------------|------------------|
| Total retained | 684 381 | 379 |

| Step (Filtering II) | Probes removed | Samples removed |
|--------------------------------------|----------------|-----------------|
| Context-specific Probes | 1 048 | 0 |
| Removal of Probes on Sex Chromosomes | 16 148 | 0 |
| Probes with Missing values > 90% | 158 | 0 |
| | | |
| <i>Total removed</i> | <i>17 354</i> | <i>0</i> |

| | Probes retained | Samples retained |
|-----------------------|-----------------|------------------|
| Total retained | 667 027 | 379 |

3. Confounding variables

Cell type deconvolution

Method: both the target dataset (KADS) and the dataset with the DNA methylation reference for the estimate of cell-type fractions were analysed from IDAT-files and parallel, but uniformly prepared and pre-processed with the same settings.

The IDAT-files from the 6 celltypes as discussed by Salas et al. (3), reference dataset GSE110554. For our estimates we discarded the artificial mixes and only used the six isolated cell-types for a total of 37 samples: Neutrophils (N=6), Monocytes (N=6), B lymphocytes (N=6), CD4+ T-cells (N=7), CD8+ T-cells (N=6), and natural killer cells (N=6)

Both datasets were combined for the estimate of cell type fractions using the RnBeads built-in function 'rnb.execute.ct.estimate()'.

Celltype estimates were added to the phenotype and included as confounding variables in the cross-sectional analyses, along with biological sex, age, ancestry (PC1 and PC2), and collection site of blood samples.

Surrogate variables as estimated by the RnBeads package were added as well:

- Cross-sectional analysis overall midazolam vs. ketamine: 18 surrogate variables
- Cross-sectional analysis flexible doses midazolam vs. ketamine: 7 surrogate variables
- Cross-sectional analysis fixed doses midazolam vs. ketamine: 9 surrogate variables
- Cross-sectional analysis fixed doses vs. flexible doses: 11 surrogate variables

4. Tables of cross-sectional analyses at T3 (Analyses 1, 3 and 4)

Table S2: Top 10 of CpGs in the overall cross-sectional analysis at end of RCT comparing midazolam and ketamine. CpGs are ranked by p-value.

| CpG | Position | Genomic context (UCSC) | Mean Mid. | Mean Ket. | Methylation difference | p-value | Fdr. p-value |
|------------|--------------------------------|--|-----------|-----------|-----------------------------------|-----------------------|--------------|
| cg11159519 | Chr1: 210857380 South Shore | KCNH1 gene body | 0.943 | 0.938 | 0.0041; Ketamine Hypomethylated | 2.38x10 ⁻⁶ | 0.70 |
| cg04677410 | Chr11: 95846117 Open Sea | MAML2 gene body | 0.79 | 0.77 | 0.022; Ketamine Hypomethylated | 2.58x10 ⁻⁶ | 0.70 |
| cg27376817 | Chr7: 75931888 Island | close to HSBP1 promotor/ regulatory elements | 0.06 | 0.08 | -0.015; Ketamine Hypermethylated | 4.42x10 ⁻⁶ | 0.70 |
| cg10930169 | Chr15: 91072047 North Shore | regulatory elements/closest gene: CRTC3 | 0.89 | 0.88 | 0.010; Ketamine Hypomethylated | 4.86x10 ⁻⁶ | 0.70 |
| cg26536813 | Chr4: 56502469 Island | Proximity of NMU promotor | 0.134 | 0.126 | 0.0080; Ketamine Hypomethylated | 5.37x10 ⁻⁶ | 0.70 |
| cg08898192 | Chr17: 8042067 Open Sea | Regulatory elements/closest gene: PER1 | 0.30 | 0.28 | 0.019; Ketamine Hypomethylated | 6.32x10 ⁻⁶ | 0.70 |
| cg01778908 | Chr16: 70759095 Open Sea | VAC14 gene body | 0.87 | 0.86 | 0.0079; Ketamine Hypomethylated | 1.41x10 ⁻⁵ | 1.00 |
| cg13296394 | Chr6: 119823058 Open Sea | ENSG00000287100 RNA gene | 0.64 | 0.67 | -0.032; Ketamine Hypermethylated | 1.51x10 ⁻⁵ | 1.00 |
| cg14560803 | Chr10: 123551439 Open Sea | ATE1 Gene body/regulatory elements (histones) | 0.928 | 0.933 | -0.0059; Ketamine Hypermethylated | 1.57x10 ⁻⁵ | 1.00 |
| cg16498879 | Chr2: 134149472 Open Sea | NCKAP5 gene body/ close to RN7SKP154 pseudogene | 0.86 | 0.87 | -0.012; Ketamine Hypermethylated | 1.87x10 ⁻⁵ | 1.00 |

Table S3: Top 10 of CpGs comparing both fixed dosing cohorts.

| CpG | Position | Genomic context (UCSC) | Mean Mid. | Mean Ket. | Methylation difference | p-value | Fdr. p-value |
|------------|-----------------------------|--|-----------|-----------|-----------------------------------|------------------------|--------------|
| cg04584009 | Chr19: 1826957 Island | <i>REXO1</i> gene body | 0.86 | 0.88 | -0.013; Ketamine Hypermethylated | 3.09x10 ⁻⁶ | 0.83 |
| cg01821429 | Chr3: 193922273 Island | <i>LINC00887/LINC02036/ENSG0000303507</i> body (*) | 0.20 | 0.22 | -0.024; Ketamine Hypermethylated | 3.35x10 ⁻⁶ | 0.83 |
| cg24863347 | Chr7: 116416245 Open Sea | <i>MET</i> gene body | 0.87 | 0.84 | 0.030; Ketamine Hypomethylated | 6.05x10 ⁻⁶ | 0.83 |
| cg10727879 | Chr4: 139846096 Open Sea | ENSG00000250195/LOC105377448 | 0.90 | 0.91 | -0.010; Ketamine Hypermethylated | 6.74x10 ⁻⁶ | 0.83 |
| cg01539483 | Chr4: 147164948 Open Sea | ENSG00000251010/regulatory elements | 0.44 | 0.38 | 0.058; Ketamine Hypomethylated | 7.02x10 ⁻⁶ | 0.83 |
| cg00604425 | Chr3: 193922370 Island | <i>LINC00887/LINC02036/ENSG0000303507</i> body (*) | 0.28 | 0.32 | -0.033; Ketamine Hypermethylated | 9.73x10 ⁻⁶ | 0.83 |
| cg20280170 | Chr1: 29101609 North Shore | Vicinity of <i>YTHDF2</i> | 0.53 | 0.50 | 0.025; Ketamine Hypomethylated | 1.19 x10 ⁻⁵ | 0.83 |
| cg15031763 | Chr19: 49631660 North Shore | <i>PPFIA3</i> gene body | 0.12 | 0.11 | 0.0094; Ketamine Hypomethylated | 1.30 x10 ⁻⁵ | 0.83 |
| cg27427514 | Chr3: 193922037 Island | <i>LINC00887/LINC02036/ENSG0000303507</i> body (*) | 0.10 | 0.15 | -0.042; Ketamine Hypermethylated | 1.34x10 ⁻⁵ | 0.83 |
| cg20749769 | Chr11: 130029961 Island | <i>ST14</i> promotor-linked | 0.068 | 0.072 | -0.0046; Ketamine Hypermethylated | 1.36 x10 ⁻⁵ | 0.83 |

Three CpGs from the top 10, marked (*), are part of the same region and linked to *LINC00887/LINC02036/ ENSG00000303507* body; ENCODE Candidate Cis-Regulatory Elements (cCREs): EH38E2270808. This region is expected to have a primarily regulatory function (see also Fig. S11).

Table S4: Top 10 of CpGs comparing fixed doses with higher, flexible doses (midazolam and ketamine combined).

| CpG | Position | Genomic context (UCSC) | Mean Mid. | Mean Ket. | Methylation difference | p-value | Fdr. p-value |
|-------------------|--------------------------------|--|-------------|-------------|--|-----------------------------|--------------|
| cg20023762 | Chr6: 11224219 Open Sea | <i>NEDD9</i> gene body | 0.92 | 0.91 | 0.0087; flexible hypomethylated | 1.11x10⁻⁷ | 0.074 |
| cg14548284 | Chr4: 10458049 North Shore | <i>ZNF518B</i> promotor-related island | 0.66 | 0.69 | -0.022; flexible hypermethylated | 2.28x10 ⁻⁶ | 0.68 |
| cg08919846 | Chr1: 3664586 South Shore | <i>GFOD3P/TP73-AS1</i> promotor-related island | 0.93 | 0.94 | -0.0091; flexible hypermethylated | 3.39x10 ⁻⁶ | 0.68 |
| cg11572381 | Chr19: 10827337 North Shore | <i>DNM2</i> promotor-related island | 0.76 | 0.77 | -0.0082; flexible hypermethylated | 4.88x10 ⁻⁶ | 0.68 |
| cg25725823 | Chr1: 1142254 South Shore | <i>TNFRSF18</i> promotor-related island | 0.35 | 0.34 | 0.012; flexible hypomethylated | 6.85x10 ⁻⁶ | 0.68 |
| cg01494075 | Chr17: 70103034 Open Sea | <i>SOX9-AS1</i> proximity | 0.74 | 0.71 | 0.028; flexible hypomethylated | 8.10x10 ⁻⁶ | 0.68 |
| cg09776772 | Chr7: 2150534 Open Sea | <i>MAD1L1</i> gene-body | 0.89 | 0.88 | 0.010; flexible hypomethylated | 8.70x10 ⁻⁶ | 0.68 |
| cg07891953 | Chr18: 76544456 South Shelf | gene desert | 0.89 | 0.90 | -0.0086; hypermethylated | 1.01x10 ⁻⁵ | 0.68 |

| | | | | | | | |
|------------|--------------------------------|---|-------|-------|-----------------------------------|-----------------------|------|
| cg12800939 | Chr3: 112734980 North Shelf | <i>NEPRO/NEPRO-AS1</i> promotor-linked island | 0.94 | 0.94 | 0.0035; flexible hypomethylated | 1.05×10^{-5} | 0.68 |
| cg21472506 | Chr2: 63283967 Island | <i>OTX1</i> gene body/regulatory elements | 0.060 | 0,065 | -0.0051; flexible hypermethylated | 1.12×10^{-5} | 0.68 |

5. QQ-plots cross-sectional analyses

Figure S3: Overall cross-sectional analysis Ketamine vs. Midazolam ($\lambda=0.97$).

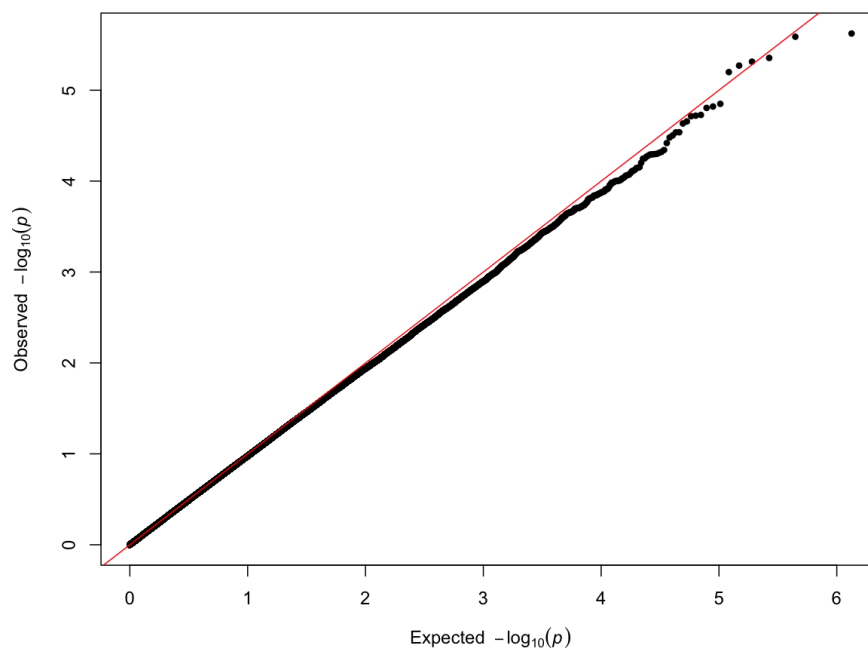


Figure S4: Cross-sectional analysis: flexible dose midazolam vs. flexible dose ketamine ($\lambda=0.99$).

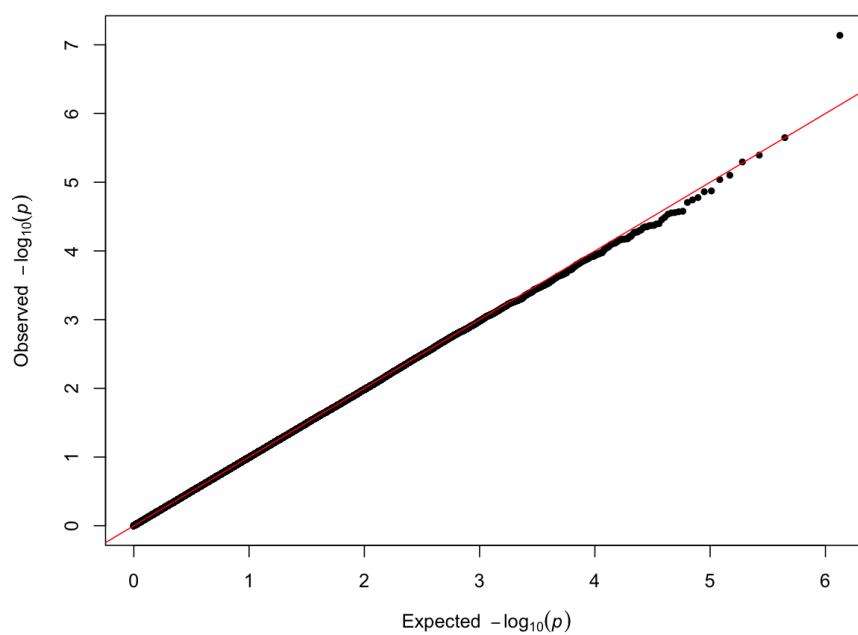


Figure S5: Cross-sectional analysis: fixed dose midazolam vs. fixed dose ketamine ($\lambda=0.98$).

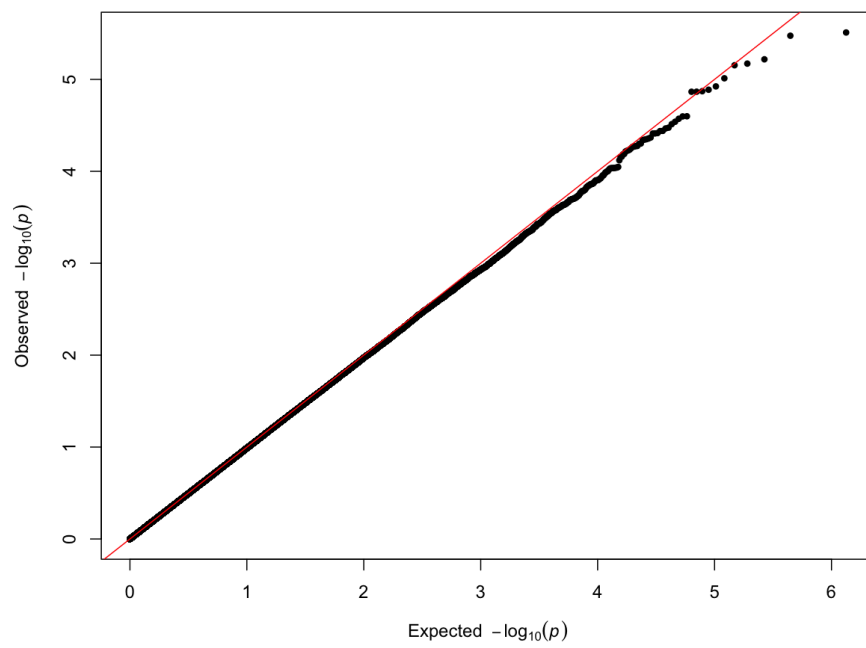
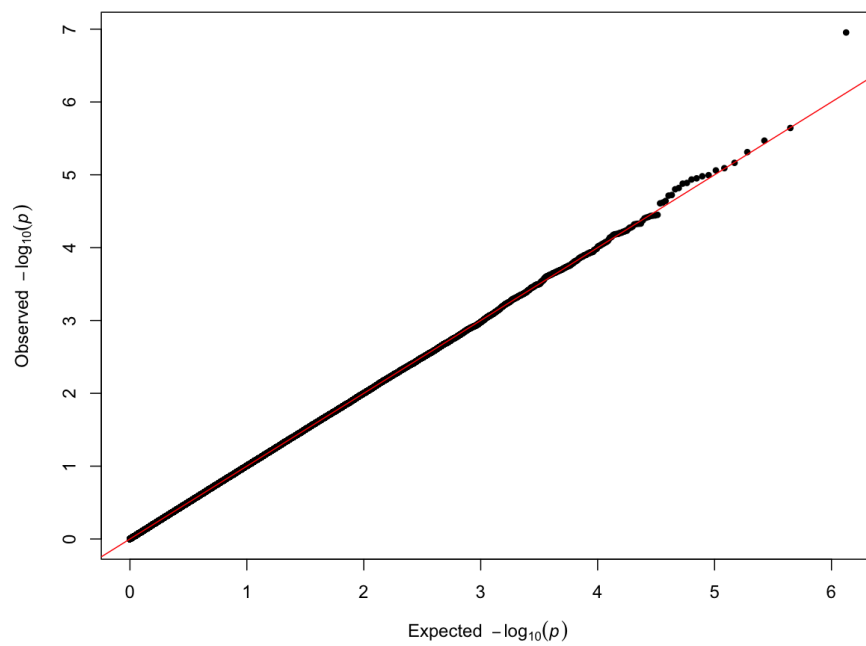


Figure S6: Cross-sectional analysis: Fixed doses vs. flexible doses; both therapies combined ($\lambda=1.01$).



6. QQ-plots paired longitudinal analyses.

Figure S7: Paired longitudinal analysis: all patients ($\lambda=0.93$).

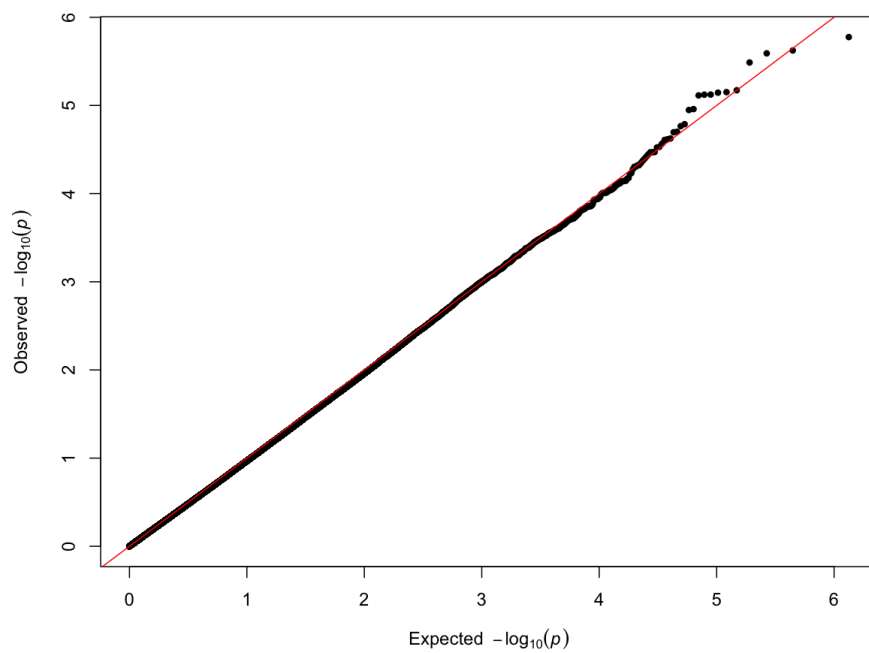


Figure S8: Paired longitudinal analysis: all Ketamine patients ($\lambda=1.07$).

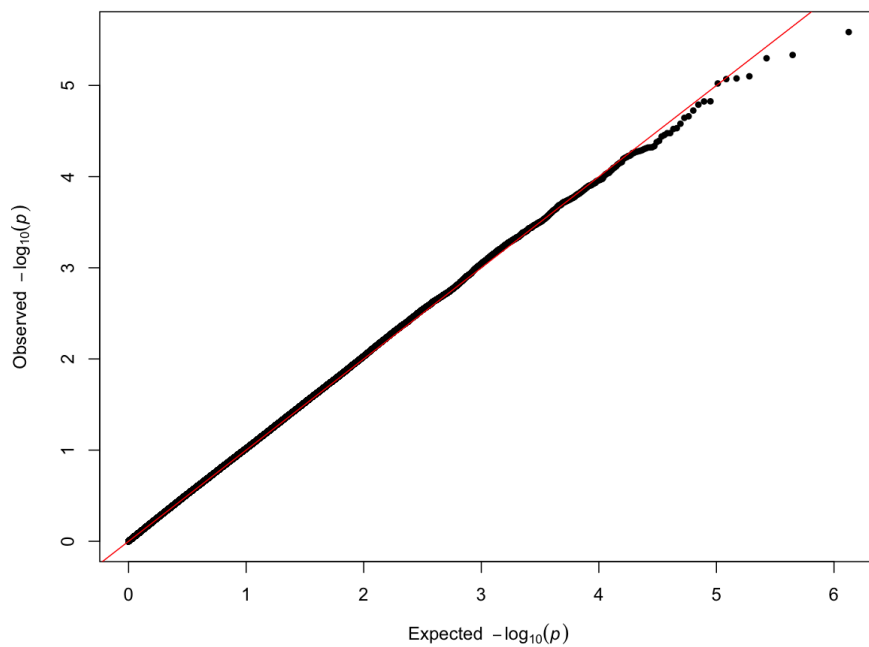


Figure S9: Paired longitudinal analysis: all Midazolam patients ($\lambda=0.87$)

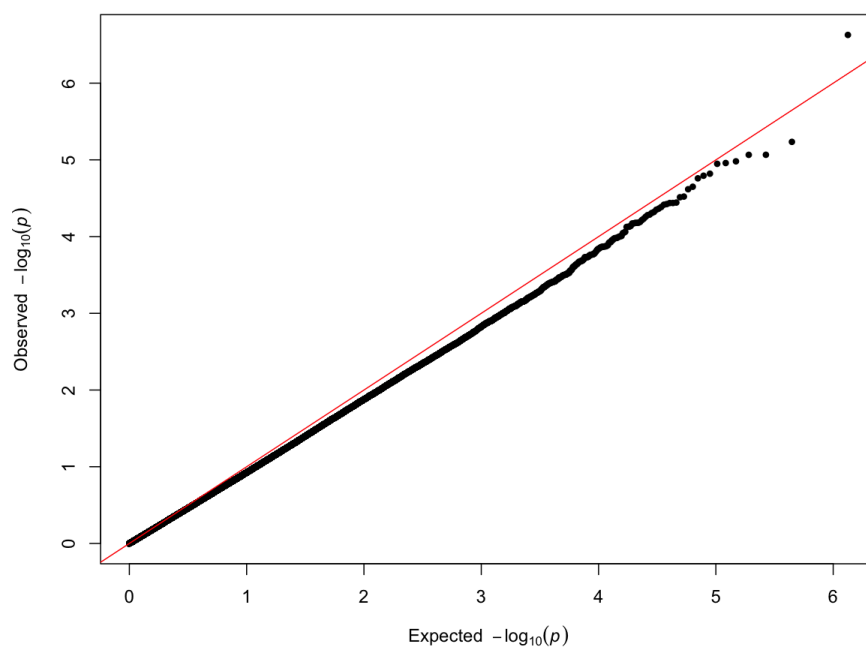


Figure S10: Paired longitudinal analysis: Ketamine flexible doses ($\lambda=1.00$).

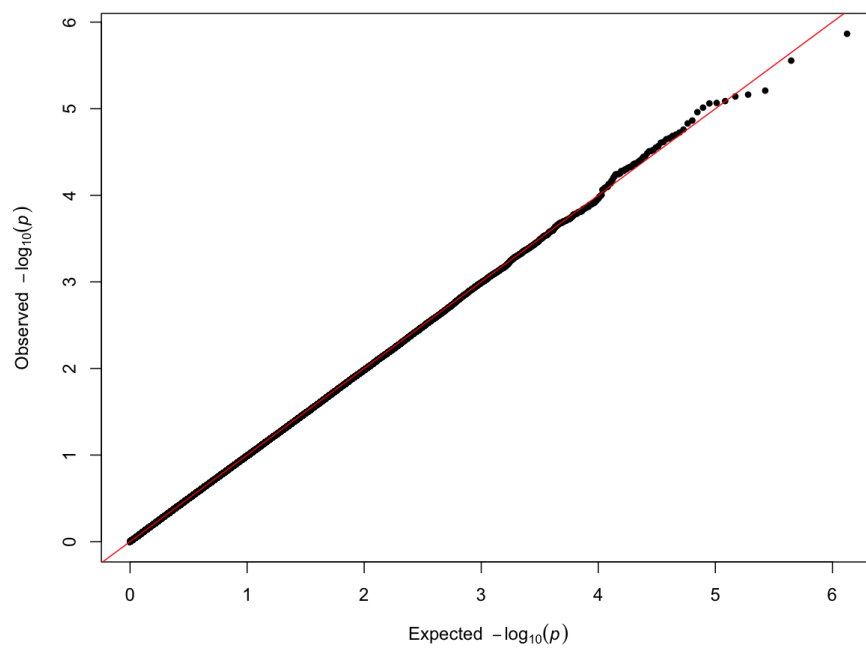


Figure S11: Paired longitudinal analysis: Ketamine fixed doses ($\lambda=0.99$).

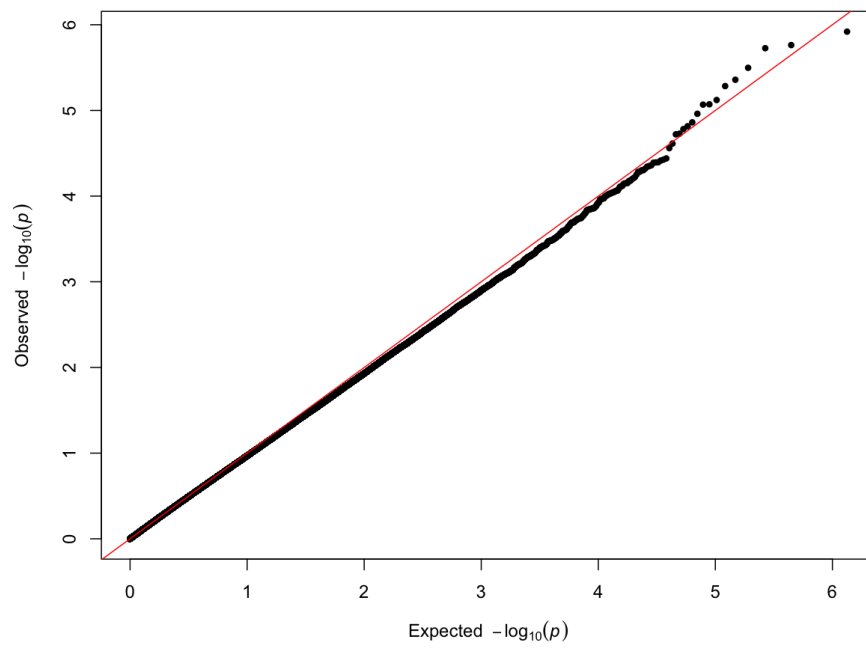


Figure S12: Paired longitudinal analysis: Midazolam flexible doses ($\lambda=0.99$).

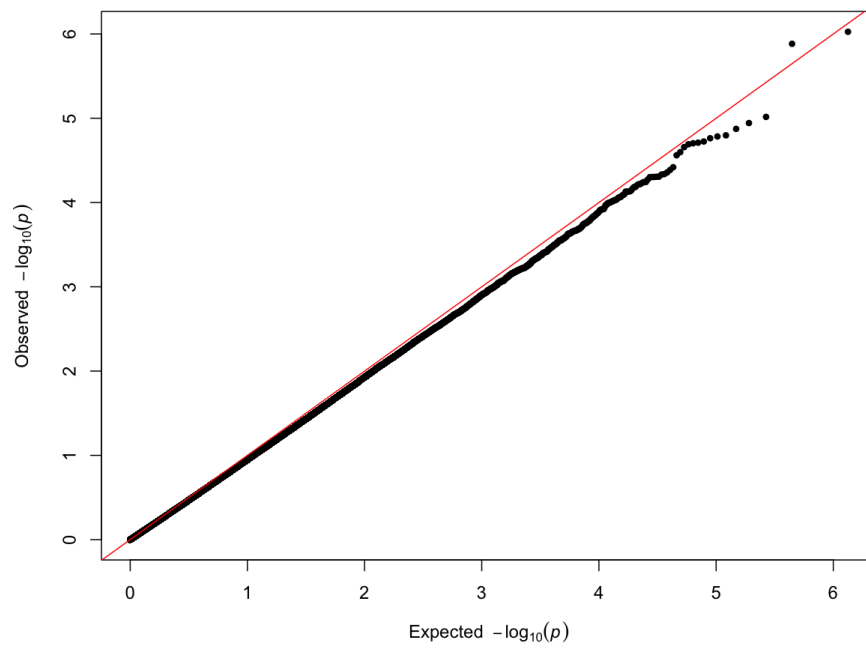
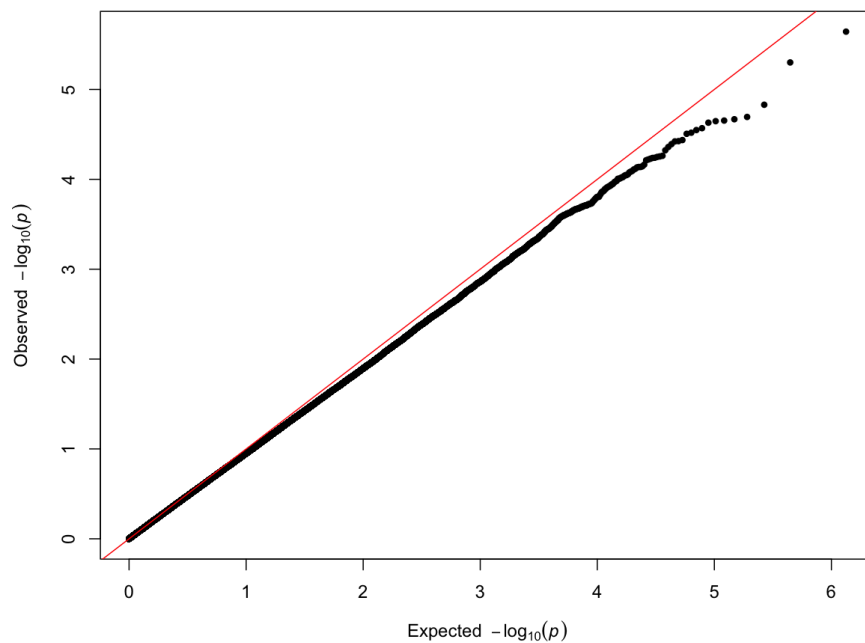
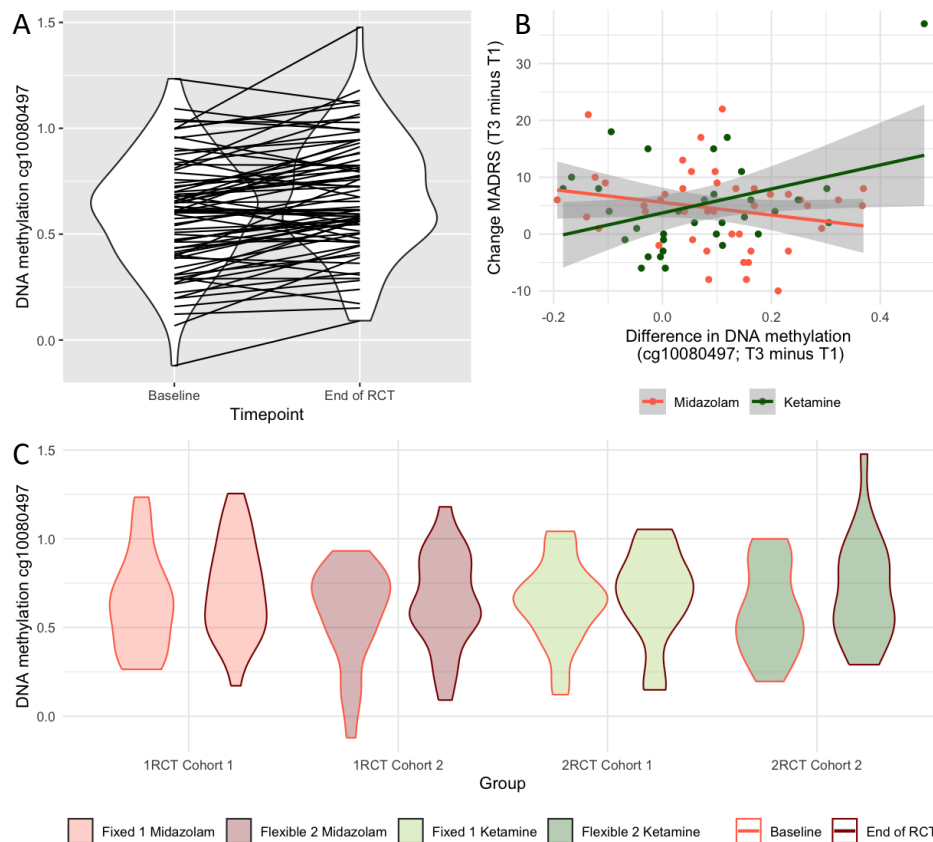


Figure S13: Paired longitudinal analysis: Midazolam fixed doses ($\lambda=0.94$).



7. Sensitivity analysis

Figure S14: Sensitivity analyses for the whole sample longitudinal analysis. Most significant CpG: cg10080497.

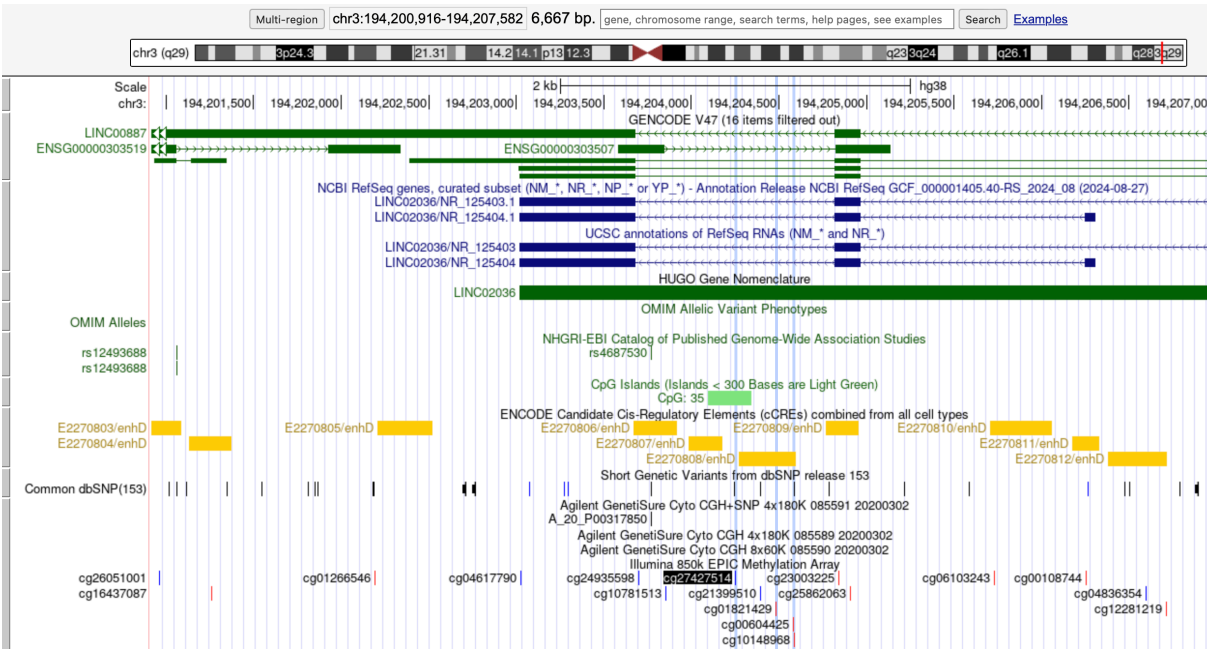


(A) Longitudinal whole-group effect (paired t-test: $t(75) = -5.14$; p -value = 2.15×10^{-6} ; Cohen's $D = 0.59$); (B) DNA methylation difference and MADRS difference between baseline and End of RCT. For ketamine patients: $r(31) = 0.36$, $p = 0.042$. For midazolam patients: n.s.; (C) DNA

methylation per treatment group and per time-point: Fixed doses combined: $t(39) = -3.33$; $p < 0.005$, Cohen's $D = 0.53$ (estimated mean difference = -0.068); Flexible doses combined: $t(35) = -3.91$; $p < 0.001$; Cohen's $D = 0.65$ (estimated mean difference = -0.098).

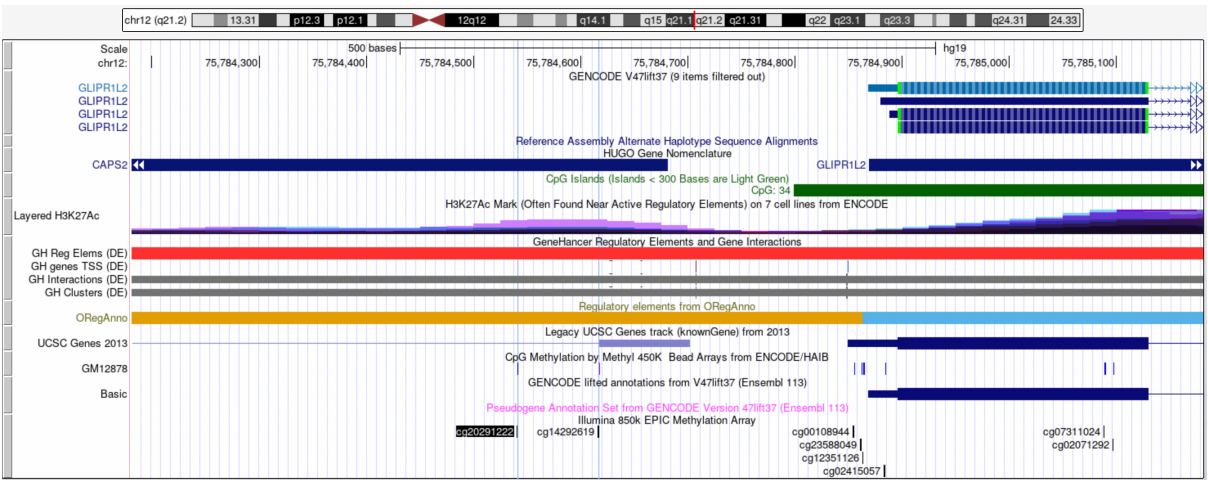
8. Genomic plots of results

Figure S15: Location of three CpGs from the top 10 of the cross-sectional fixed doses comparison between midazolam and ketamine. The region is linked to long non-coding and other regulatory genomic elements.



The three vertical blue lines represent the three CpGs within the 10 most statistically significant CpGs of the analysis (see also table S3). Source: UCSC Genome Browser

Figure S16: CAPS 2 and GLIPR1L2. Significant DMR for the flexible dosed ketamine paired longitudinal analysis (two CpGs).



The two vertical blue lines represent the two CpGs from the significant DMR for the longitudinal analysis of flexibly dosed ketamine. Source: UCSC Genome Browser

References

1. Purcell S, Neale B, Todd-Brown K, Thomas L, Ferreira MAR, Bender D, et al. PLINK: A Tool Set for Whole-Genome Association and Population-Based Linkage Analyses. *The American Journal of Human Genetics*. 2007;81(3):559–75.
2. Anderson C a, Pettersson FH, Clarke GM, Cardon LR, Morris AP, Zondervan KT. Data quality control in genetic case-control association studies. *Nature protocols*. 2010 Sep;5(9):1564–73.
3. Salas LA, Koestler DC, Butler RA, Hansen HM, Wiencke JK, Kelsey KT, et al. An optimized library for reference-based deconvolution of whole-blood biospecimens assayed using the Illumina HumanMethylationEPIC BeadArray. *Genome Biol*. 2018 May 29;19(1):64.