# 1 Nanopore-based native RNA sequencing provides insights into

# 2 prokaryotic transcription, operon structures, rRNA maturation and

# 3 modifications

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#### 34 Abstract (186 words)

35 The prokaryotic transcriptome is shaped by transcriptional and posttranscriptional events that 36 define the characteristics of an RNA, including transcript boundaries, the base modification status, 37 and processing pathways to yield mature RNAs. Currently, a combination of several specialised 38 short-read sequencing approaches and additional biochemical experiments are required to 39 describe all transcriptomic features. In this study, we present native RNA sequencing of bacterial 40 (E. coli) and archaeal (H. volcanii, P. furiosus) transcriptomes employing the Oxford Nanopore 41 sequencing technology. Based on this approach, we could address multiple transcriptomic 42 characteristics simultaneously with single-molecule resolution. Taking advantage of long RNA 43 reads provided by the Nanopore platform, we could accurately (re-)annotate large transcriptional 44 units and boundaries. Our analysis of transcription termination sites revealed that diverse 45 termination mechanisms are in place in archaea. Moreover, we shed light on the poorly understood rRNA processing pathway in archaea and detected new processing intermediates. One of the key 46 47 features of native RNA sequencing is that RNA modifications are retained. We could confirm this 48 ability by analysing the well-known KsgA-dependent rRNA methylation sites. Notably, our analysis 49 suggests that rRNA modifications are more abundant in a hyperthermophilic organism.

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## 53 Introduction

In the last decade, next-generation sequencing (NGS) technologies<sup>1</sup> revolutionized the field of 54 55 microbiology<sup>2</sup>, which is not only reflected in the exponential increase in the number of fully 56 sequenced microbial genomes, but also in the detection of microbial diversity in many hitherto 57 inaccessible habitats based on metagenomics. Using transcriptomics, important advances were also possible in the field of RNA biology<sup>3,4</sup> that shaped our understanding of the transcriptional 58 59 landscape<sup>5,6</sup> and RNA-mediated regulatory processes in prokaryotes<sup>7</sup>. RNA sequencing (RNA-seq) 60 technologies can be categorized according to their platform-dependent read lengths and necessity 61 of a reverse transcription and amplification steps, to generate cDNA<sup>8</sup>. Illumina sequencing yields 62 highly accurate yet short sequencing reads (commonly 100-300 bp). Hence, sequence information 63 is only available in a fragmented form, making full-length transcript- or isoform-detection a 64 challenging task<sup>9,10</sup>. Sequencing platforms developed by Pacific Bioscience (PacBio) and Oxford 65 Nanopore Technologies (ONT) solved this issue. Both sequencing methods are bona fide singlemolecule sequencing techniques that allow sequencing of long DNAs or RNAs<sup>11,12</sup>. However, the 66 base detection differs significantly between the two methods. PacBio-sequencers rely on 67 68 fluorescence-based single-molecule detection that identifies bases based on the unique fluorescent 69 signal of each nucleotide during DNA synthesis by a dedicated polymerase<sup>11</sup>. In contrast, in an ONT 70 sequencer, the DNA or RNA molecule is pushed through a membrane-bound biological pore with 71 the aid of a motor protein that is attached to the pore protein called a nanopore (Fig. 1a). A change 72 in current is caused by the translocation of the DNA or RNA strand through this nanopore, which 73 serves as a readout signal for the sequencing process. Due to the length of the nanopore (version 74 R9.4), a stretch of approximately five bases contributes to the current signal. Notably, only ONT 75 offers the possibility to directly sequence native RNAs without the need for prior cDNA synthesis 76 and PCR amplification<sup>13</sup>. As RNAs are directly "read", RNA modifications are maintained and first 77 attempts have been made to use ONT sequencing to identify RNA base modifications (e.g. 78 methylations<sup>14,15</sup>). As ONT-based native RNA-seq holds the capacity to sequence full-length transcripts, to identify RNA base modifications and to detect molecular heterogeneity in a 79 80 transcriptome, the technology found widespread attention<sup>16</sup>. Recently, the technology was exploited to sequence viral RNA genomes<sup>17-20</sup> to gain insights into viral and eukaryotic 81

transcriptomes<sup>19,21-23</sup> and to detect RNA isoforms in eukaryotes<sup>24,25</sup>. However, prokaryotic transcriptomes have not been characterized on the genome-wide level by native RNA-seq approaches so far as prokaryotic RNAs lack a poly(A) tail which is required to capture the RNA and feed it into the nanopore.

86 Here, we present a native RNA sequencing study of bacterial and archaeal transcriptomes using 87 Nanopore technology. We employed an experimental workflow that includes the enzymatic 88 polyadenylation of prokaryotic RNA to make them amenable for ONT's direct RNA sequencing kit. 89 We evaluated the accuracy and reliability of native RNA-seq in comparison to published Illumina-90 based sequencing studying prokaryotic transcriptomes of bacterial (E. coli) and archaeal 91 (Haloferax volcanii, Pvrococcus furiosus) model organisms<sup>26-31</sup>. The transcriptomic analysis 92 included determination of transcript boundaries, providing, among others, insights into 93 termination mechanisms in archaea. We moreover demonstrate that the long RNA reads gathered 94 on the ONT platform allow reliable transcriptional unit assignment. Strikingly, we gained insights 95 into the so far poorly understood ribosomal RNA (rRNA) maturation pathway in archaea and 96 detected putative new rRNA processing intermediates. As RNA modifications are retained when 97 sequencing native RNAs, we explore rRNA modifications in prokaryotes. Notably, by expanding 98 the approach, our analysis suggests that rRNA modifications are more abundant in an 99 hyperthermophilic organism.

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# 102 Material and Methods

### 103 Strains and growth conditions

- 104 Escherichia coli K-12 MG1655 cells were grown in LB medium (10 g tryptone, 5 g yeast extract, 10
- g NaCl per liter) to an OD<sub>600nm</sub> of 0.5 and harvested by centrifugation at 3,939 x g for 10 min at 4°C.
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*Pyrococcus furiosus* strain DSM 3638 cells were grown anaerobically in 40 ml SME medium<sup>32</sup>
supplemented with 40 mM pyruvate, 0.1 % peptone and 0.1 % yeast extract at 95°C to midexponential phase and further harvested by centrifugation at 3,939 x g for 45 min at 4°C.

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111 Markerless deletion of *Haloferax volcanii* KsgA (Hvo\_2746) was obtained using the pop-in/pop-112 out procedure<sup>33</sup>. Deletion candidates were verified by Southern blot and PCR analyses. Full 113 characterization of this strain will be described elsewhere (Knüppel and Ferreira-Cerca, *in* 114 *preparation*). Wildtype (H26) and  $\Delta ksgA$  strains were grown in Hv-YPC medium at 42°C under 115 agitation as described previously<sup>34</sup>.

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# 117 RNA isolation

*E. coli* total RNA was purified using the Monarch® Total RNA Miniprep Kit (New England Biolabs)
 according to manufacturer's instructions including the recommended on-column DNAse
 treatment.

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*P. furiosus* cell pellets were lysed by the addition of 1 ml peqGOLD TriFast<sup>™</sup> (VWR) followed by
shaking for 10 min at room temperature. After adding 0.2 ml 2 M sodium acetate pH 4.0, total RNA
was isolated according to the manufacturer's instructions. Contaminating DNA was removed using
the TURBO DNA-free<sup>™</sup> Kit (Thermo Fisher Scientific).

126

127 H. volcanii

*H. volcanii* total RNA was purified using the RNA easy kit (Qiagen) according to the manufacturer's
 instructions. Alternatively, total RNA was isolated according to the method described by

Chomczynski and Sacchi<sup>35</sup>, including a DNA-removal step with RNase-free DNase I (Thermo
Scientific).

132

The Integrity of total RNA from *E. coli* and *P. furiosus* was assessed via a Bioanalyzer (Agilent) run using the RNA 6000 Pico Kit (Agilent). To evaluate the extent of remaining buffer and DNA contaminations, the RNA preparation samples were tested using standard spectroscopic measurements (Nanodrop One) and using the Qubit 1X dsDNA HS assay kit (Thermo Fisher Scientific). RNA was quantified using the Qubit RNA HS assay kit.

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#### 139 Primer extension analysis

140 5'ends determination of mature 16S and 23S rRNAs from *H. volcanii* by primer extension was 141 performed as described previously (Knüppel et al, Method in Molecular Biology in press). In brief, 142 reverse transcription was performed with the indicated fluorescently labeled primers (oHv396-143 DY682: 5'-CCCAATAGCAATGACCTCCG; oHv622-DY782: 5'-GCTCTCGAGCCGAGCTATCCACC) and 144 SuperScript III reverse transcriptase using 1 µg of total RNA as template. The resulting cDNAs and 145 reference dideoxy-chain termination sequencing ladder reactions were separated on a denaturing 146 14 % TBE-Urea (6 M)-PAGE. Fluorescence signals (700nm and 800nm) were acquired using a Li-COR Odyssey system. 147

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### 149 RNA treatment and poly(A)-tailing

150 To prevent secondary structure formation, the RNA was heat incubated at 70°C for 3 min and 151 immediately put on ice before TEX-treatment or poly(A)-tailing of the RNA samples. Partial 152 digestion of RNAs that are not 5'-triphosphorylated (e.g. tRNAs, rRNAs) was achieved by incubation of the RNA with the Terminator 5'-Phosphate-Dependent Exonuclease (TEX, Lucigen). 153 154 For this purpose, 10 µg of RNA was incubated with 1 unit TEX, 2 µl TEX reaction buffer (Lucigen) 155 and 0.5 µl RiboGuard RNase Inhibitor (Lucigen) in a total volume of 20 µl for 60 minutes at 30°C. 156 The reaction was stopped and the RNA was purified using the RNeasy MinElute Cleanup Kit 157 (Qiagen). For P. furiosus and E. coli RNA samples, control reactions lacking the exonuclease (NOTEX) were treated as described for TEX-containing samples. In the next step, a poly(A)-tail was added using the *E. coli* poly(A) polymerase (New England Biolabs) following a recently published protocol<sup>36</sup>. Briefly, 5 µg RNA, 20 units poly(A) polymerase, 2 µl reaction buffer and 1 mM ATP were incubated for 15 min at 37°C in a total reaction volume of 50 µl. To stop the reaction and to remove the enzyme, the poly(A)-tailed RNA was purified with the RNeasy MinElute Cleanup Kit (Qiagen).

164 **Direct RNA library preparation and sequencing** 

165 Libraries for Nanopore sequencing were prepared from poly(A)-tailed RNAs according to the SQK-166 RNA001 Kit protocol (Oxford Nanopore, Version: DRS\_9026\_v1\_revP\_15Dec2016) with minor 167 modifications for barcoded libraries (see Supplementary Fig. 1a). In this case, Agencourt AMPure 168 XP magnetic beads (Beckman Coulter) in combination with 1 µl of RiboGuard RNase Inhibitor 169 (Lucigen) were used instead of the recommended Agencourt RNAclean XP beads to purify samples 170 after enzymatic reactions. The total amount of input RNA, the barcoding strategy and the number 171 of flowcells used can be found in Supplementary Table 1. The efficiency of poly(A)-tailing was low. 172 However, this could be compensated with a higher amount of input RNA. We added the ONT 173 control RNA (RCS, yeast) to detect problems that arise from library preparation or sequencing. For 174 the barcoded libraries, the RTA adapter was replaced by custom adapters described in https://github.com/hyeshik/poreplex and reverse transcription (RT) was performed in individual 175 176 tubes for each library. After RT reactions, cDNA was quantified using the Qubit DNA HS assay kit 177 (Thermo Fisher Scientific) and equimolar amounts of DNA for the multiplexed samples were used 178 in the next step for ligation of the RNA Adapter (RMX) in a single tube. Subsequent reactions were 179 performed according to the protocols recommended by ONT. The libraries were sequenced on a 180 MinION using R9.4 flow cells and subsequently, FAST5 files were generated using the 181 recommended script in MinKNOW.

182

183 Data analysis

184 Demultiplexing of raw reads, basecalling and quality control of raw reads

185 As some bioinformatic tools depend on single-read files we first converted multi-read FAST5 files 186 from the MinKNOW output to single-read FAST5 files using the ont fast5 api from Oxford 187 Nanopore (https://github.com/nanoporetech/ont fast5 api). To prevent actual good-quality reads from being discarded (this issue was reported previously<sup>13,37</sup>), we included both failed and 188 189 passed read folders in the following steps of the analysis. Demultiplexing was done by poreplex 190 (version 0.4, <u>https://github.com/hyeshik/poreplex</u>) with the arguments --trim-adapter, --191 symlink-fast5, --basecall and --barcoding, to trim off adapter sequences in output FASTQ files, 192 basecall using albacore, create symbolic links to FAST5 files and sort the reads according to their 193 barcodes. However, to ensure consistency between non-multiplexed and multiplexed samples and 194 because of some major improvements in the current basecalling software (guppy), albacore files 195 were not used. Instead demultiplexed FAST5 reads and raw FAST5 reads from non-multiplexed 196 runs were locally basecalled using Guppy (Version 3.0.3) with --reverse\_sequence, --hp\_correct, --197 enable trimming and --calib\_detect turned on. After that, relevant information from the 198 sequencing\_summary.txt file in the Guppy output was extracted to analyse properties of raw reads 199 (see Supplementary Fig. 2, see Supplementary Table 1).

200

# 201 Mapping of reads and quantification

202 Files were mapped to reference genomes from *Escherichia coli* K12 MG1655 (GenBank: 203 U00096.2)<sup>38</sup>, Haloferax volcanii (NCBI Reference Sequence NC\_013967)<sup>39</sup> and Pyrococcus furiosus 204 DSM3638 <sup>31</sup> using minimap2 (Release 2.17-r941, <u>https://github.com/lh3/minimap2</u>)<sup>40</sup>. Output 205 alignments in the SAM format were generated with the recommended options for noisy Nanopore 206 Direct RNA-seq (-ax splice, -uf, -k14) and also with (1) -p set to 0.99, to return primary and 207 secondary mappings and (2) with --MD turned on, to include the MD tag for calculating mapping 208 identities. Alignment files were further converted to bam files, sorted and indexed using 209 SAMtools<sup>41</sup>. Strand-specific wig and bigwig files were finally created using bam2wig (Version 1.5, 210 https://github.com/MikeAxtell/bam2wig). To evaluate the alignments, we first calculated the 211 aligned read length by adding the number of M and I characters in the CIGAR string<sup>13</sup>. Based on 212 this, the mapping identity was defined as (1-NM/aligned\_reads)\*100, where NM is the edit 213 distance reported taken from minimap2. Read basecalling and mapping metrics can be found in 214 Supplementary Table 1.

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#### 216 Gene expression analysis

217 For transcript abundance estimation we applied featureCounts (Rsubread 1.32.4) allowing that a 218 read can be assigned to more than one feature (allowMultiOverlap = TRUE) and applying the 219 setting for long reads (isLongRead = TRUE)<sup>42</sup>. Calculations were performed based on the genome 220 coordinates of genomic feature types (tRNA, rRNA, protein-coding genes). For the abundance 221 comparison to Illumina-sequencing, we applied a regularized log transformation from the DESeq2 222 package that transforms counts on a log2 scale, normalizing for the library size and minimizing 223 differences between samples with small counts<sup>43</sup> (raw count data for TEX samples in 224 Supplementary Table 2).

225

226 Poly(A) tail analysis

Poly(A) tail length was estimated by nanopolish following the recommended workflow (Version
 0.10.2, <u>https://nanopolish.readthedocs.io/en/latest/quickstart\_polya.html</u>)<sup>44</sup>.

229

Detection of transcriptional units and annotation of transcription start sites and transcription
 termination sites

232 The definition of transcriptional units (TU) and our strategy to detect and annotate them was 233 based on a recent study that re-defined the bioinformatical search for transcriptional units (TU)<sup>29</sup>. 234 The TU annotation was performed in a two-step process in the following way: First, TU clusters 235 were defined by collapsing all reads that overlap and fulfill certain criteria that are commented on 236 extensively the for this in available code study 237 (https://github.com/felixgrunberger/Native RNAseq Microbes). In short, reads were filtered out 238 that did not align protein-coding genes (CDS) or tRNAs, had a mapping identity below 80%, were 239 spliced, were shorter than 50% of the gene body and did not cover either the 5' or the 3' 240 untranslated region. The remaining overlapping reads were collapsed in a strand-specific manner 241 and merged.

Finally, the collapsed reads that represent the TU cluster, were split according to the coverage drop at the 3' region of a gene. This was achieved by calculating the sequencing depth in a window of 20 nt upstream and downstream of the corresponding TTS and applying a deliberately low threshold of 1.5x (higher coverage upstream compared to downstream, see transcriptional unittable in Supplementary Table 5).

TSS were predicted by calculating the median start position of all reads that map to one gene and cover the 5' part of a CDS. To address the 3' coverage bias and the underrepresentation of reads that map to the 5' end and also for the 12 missing nucleotides at the TSS in general, all reads starting at least 20 nt downstream of the annotated gene start were included. To not exclude too many reads, the position of TTS were predicted similarly, by also including reads that have end positions starting from 20 nt upstream of a gene end (TSS table in Supplementary Table 3, TTS table in Supplementary Table 4).

254 For the analysis of prokaryotic promoter elements, the sequences from 58 bases to 11 bases 255 upstream of all uncorrected TSS that are starting a TU were extracted, to identify relevant motifs 256 using MEME with default options except for a custom background file, calculated from intergenic 257 sequences of the respective organism<sup>45</sup>. The analysis of terminator sequences was performed 258 comparably by extracting all TTS that are located at the end of a TU and searching for terminators 259 in a sequence window from -45 to +45 from the TTS using MEME and the custom background 260 model. Heatmap analysis of motif positioning was performed by importing MEME FASTA 261 information into R. Metaplots of the nucleotide enrichment analysis (compare<sup>26,46</sup>) were calculated 262 by comparing the genomic sequences surrounding a TTS in a window from -45 to 45 to randomly 263 selected intergenic positions (subsampled, n = 10000).

264 Modified base detection

The performance of two different approaches (Tombo vs. error and basecalling properties) for the
detection of modified bases was evaluated:

(1) We used Tombo (Version 1.5, <u>https://nanoporetech.github.io/tombo</u>) to identify modified 267 268 bases based on a comparison to a theoretical distribution (de novo model) and based on the 269 comparison to a reference data set (sample-compare model)<sup>47</sup>. Briefly, for Fig. 6a reads mapping 270 to 16S rRNA were preprocessed, resquiggled and the raw signal plotted at a specific genomic 271 coordinate using the respective plotting command (tombo plot genome locations). In addition, the 272 probability of modified bases was calculated using the detect\_modification de\_novo command. For 273 Fig. 6b the signals were calculated for both samples (wildtype and deletion mutant) and compared 274 using the *control-fast5-basedirs* and *overplot Boxplot* option. For Fig 6c a reference data set was

created by sorting the reads mapping to the 16S rRNA based on the position of the read start
(before or after gene start), thereby dividing the data set in reads that belong to mature and
unprocessed 16S rRNAs. The two read sets were used as input for the sample-compare method.
The two different models (*de novo* and sample-compare using non-mature 16S reads as a reference
set) were applied to the complete 16S, base-modification-probabilities extracted from the tombo
output and plotted using a custom R script.

281 (2) For calculating the frequency of correct, deleted and wrong nucleotides at a genomic position 282 the function pileup from the Rsamtools package was used (https://rdrr.io/bioc/Rsamtools/). 283 Plots were generated using custom R scripts. The results were compared to known modification 284 sites in 16S rRNA for Escherichia coli48 and Haloferax volcanii49. Given the high degree of 285 conservation of the modifying enzymes in archaea and because there was no reference set 286 available for Pyrococcus furiosus, the results were compared to the five modified positions that are 287 described for *H. volcanii* (910, 1352, 1432, 1450/1451 correspond to 938, 1379, 1469, 1486/1487 288 in *P. furiosus*).

289

#### 290 Public data

In addition to the in-house generated data, we made use of other published sequencing data setsand data repositories that are described in the following.

293

#### 294 Transcriptional start sites

For all three model organisms, global transcriptional start sites were mapped recently using differential RNA sequencing<sup>27,30,31</sup>. Position data were extracted from the Supplementary data of the publications and compared with the TSS described in the ONT data sets given that a start site was found in both data sets.

299

300 Transcriptional termination sites

So far there are no transcription termination data sets available for *H. volcanii* and *P. furiosus*. The
3' UTR lengths of the *E. coli* ONT set were compared to TTS predicted based on the Term-Seq
method <sup>26</sup>

# 305 Transcriptional units

- 306 The widely used database DOOR2<sup>50</sup> was used to compare the TU annotation for both archaeal sets.
- 307 For *E. coli* a more recent, but also purely bioinformatical prediction, served as a reference set<sup>29</sup>.

- 309 Gene expression comparison
- 310 For P. furiosus gene abundances from ONT data were compared to fragmented RNA sequencing data of mixed growth conditions (conditions, library, sequencing, mapping described in<sup>31</sup>), by 311 312 applying a regularized log transformation as described earlier<sup>43</sup>. For *H. volcanii* comparison, raw 313 reads of a mixed RNA sequencing were extracted from the SRA (SRR7811297)<sup>28</sup> trimmed using trimmomatic<sup>51</sup>, (leading:20, trailing:20, slidingwindow:4:20, minlen:12), mapped to the reference 314 315 genome using bowtie2 (-N 0, -L 26)<sup>52</sup>, converted to sorted bam files using samtools<sup>41</sup> and compared 316 to ONT data as described for P. furiosus. Illumina RNA sequencing data for E. coli were also 317 extracted from the NCBI (SRP056485, 37°C LB), analysed as described for *H. volcanii* Illumina data 318 and also compared to the ONT reference data.

#### 319 Results

### 320 Library preparation for Nanopore native RNA sequencing of bacterial and archaeal transcriptomes

321 We performed whole-genome native RNA sequencing using the Nanopore sequencing technology 322 (referred to as Nanopore native RNA sequencing in this work) that can be applied to any 323 prokaryotic organism. The key steps of the library preparation are shown in Fig. 1a: after 324 enzymatic polyadenylation, the RNA is reverse transcribed to increase sequencing throughput 325 (recommended by ONT)<sup>16</sup>. Subsequently, a motor protein is added that feeds the RNA into the 326 Nanopore. Following this workflow, native RNAs from prokaryotic organisms can be sequenced. 327 Depending on the necessary sequencing depth, the libraries were barcoded using poreplex 328 (https://github.com/hyeshik/poreplex), since this is not yet supported by the official kits and 329 protocols from Oxford Nanopore. To identify primary and processed sites in both mRNA and rRNA, 330 we partially digested 5'-monophosphorylated transcripts using the terminator exonuclease (TEX) 331 and compared them to non-treated samples (see Supplementary Fig. 1a). In contrast to many 332 Illumina sequencing-based approaches that make use of a specialised library preparation design 333 to tackle a well-defined question<sup>8</sup>, we evaluated the potential of native RNA sequencing to analyse 334 multiple transcriptomic features simultaneously including the identification of *cis*-regulatory 335 elements that govern transcription, the analysis of operon structures and transcriptional 336 boundaries, rRNA processing and 16S rRNA modification patterns (see Supplementary Fig. 1b).

337

### 338 Sequencing yield and quality control of raw Nanopore reads

339 Native RNA sequencing was performed for three prokaryotic organisms: the bacterial model 340 organism Escherichia coli, the halophilic archaeon Haloferax volcanii and the hyperthermophilic 341 archaeon Pyrococcus furiosus. In order to show that native RNA sequencing can be applied to a 342 wide variety of prokaryotic organisms, we specifically chose (i) organisms from the bacterial and 343 archaeal domain of life with P. furiosus and H. volcanii belonging to the Euryarchaeota, (ii) organisms that are classified as mesophilic (E. coli, H. volcanii), hyperthermophilic (P. furiosus), or 344 345 halophilic organism (*H. volcanii*) and (iii) organisms that differ significantly in their GC-content (*E.* 346 coli: 50.8%<sup>53</sup>, *H. volcanii*: 65%<sup>39</sup>, *P. furiosus*: 40.8%<sup>31</sup>). The prepared libraries were sequenced on a

347 MinION device and reads were collected over 48 hours on R9.4 flow cells (see Supplementary Fig. 348 2a). The total number of reads in the TEX-treated libraries were sufficient to achieve good 349 coverage of the transcriptome (E. coli: 9.2x, P. furiosus: 15.0x, H. volcanii: 10.3x, see Supplementary 350 Table 1) to perform transcriptional unit annotation and accurate determination of transcript 351 boundaries. Before mapping the reads to the reference genomes, the quality of the sequencing runs 352 was evaluated based on raw read length distribution and quality of reads estimated by Guppy (see 353 Supplementary Fig. 2b,c). To verify that no problems occurred during sequencing or library 354 preparation a poly-adenylated spike-in control (yeast enolase) was used. The control showed a 355 uniform length distribution (median lengths between 1212 and 1306 nucleotides) and a very good 356 read quality (median quality between 10.8 and 12.2) in all samples, therefore, excluding any bias 357 (see Supplementary Fig. 2b,c, Supplementary Table 1). Due to large differences in the composition 358 of the RNAs used to train the basecaller and the sequenced reads, that contain mostly ribosomal 359 RNAs known to harbor base modifications, the overall quality is lower than for the spike-in control 360 in every data set<sup>54</sup>. To prevent useful reads from being discarded, we decided to also include reads 361 that fall below the standard quality score threshold of 7 and continued with the mapping of the 362 reads to the reference genomes<sup>13</sup>.

363

#### 364 Analysis of mapped reads

365 An advantage of the long-read Nanopore sequencing technique is that native RNA strands can be 366 sequenced directly as near full-length transcripts<sup>55</sup>. This is also reflected in the sequenced data 367 sets as aligned lengths up to 7864 nt can be observed (see H. volcanii NOTEX sample with a median 368 read length of 1390 nt, Supplementary Fig. 3c). The majority of reads from E. coli and H. volcanii 369 samples mapped to the 23S rRNA (Fig. 1b, see Supplementary Fig. 3a). In general, the read identity 370 of CDS-mapping reads is higher than for rRNA mapping reads, but lower than the spike-in control 371 (see Supplementary Fig. 3b,c). It is noteworthy, that a minimum aligned length of about 100 nt 372 appears in the data sets (see Supplementary Fig. 3d) when using the native RNA sequencing protocol and minimap2 as mapping tool $^{16,40,56}$ . Unaligned reads had a median read length of 191 373 374 nt, in contrast to 572 nt for aligned reads (all data sets combined) suggesting that short reads could 375 not be aligned properly. As small RNAs, CRIPSR-RNAs or tRNAs fall below this threshold, we

376 excluded these RNAs from further analysis. While short transcripts are a problem, longer RNAs are 377 sequenced without loss in quality (see Supplementary Fig. 3e). As the raw read quality correlates 378 with the mapping identity of the reads, problems during sequencing can be live-monitored in 379 MinKNOW and the run can be canceled allowing the loading of a new library (see Supplementary 380 Fig. 3f). Since the subsequent analysis of transcriptional units is heavily dependent on the integrity 381 of the data, we verified the data integrity in the next steps. Sources for bias could emerge (i) from 382 the poly(A)-tailing efficiency that might differ between transcripts and (ii) from the loss of certain 383 transcripts during library preparation or sequencing problems. Comparing the initial amount of 384 RNA with the reverse transcribed DNA, we observed that the enzymatic addition of a 3' poly(A)-385 tail is not very efficient (~10%). In general, the addition of  $poly(A)_{20}$  (length of the reverse 386 transcription adapter) is sufficient to allow for the annealing of the poly(T)-adapter required for 387 reverse transcription and sequencing. This goes in line with the shortest median length we 388 observed for the 5S rRNA (see *E. coli* TEX sample) (see Supplementary Fig. 4). For most of the 389 transcripts, a tail with 50 to 100 nt was detected. The overall correlation of transcript abundances 390 calculated from sequencing data using Nanopore or Illumina technology was very high given that 391 only mixed conditions could be compared in the case of H. volcanii and P. furiosus (see 392 Supplementary Fig. 5a,b,c, transcript abundance data for TEX samples in Supplementary Table 2). 393

394 Mapping of transcriptional boundaries

### 395 Transcription start sites

396 Transcription start site (TSS) and transcription termination site (TTS) detection was based on the 397 determination of transcriptional units (TU) (compare material and methods section)<sup>29</sup>. In total, we 398 found substantial overlap between TTS detected by Illumina d(ifferential) RNA-seq<sup>2-4</sup> and 399 Nanopore native RNA-seq (Fig. 2a)(positions of TSS derived from ONT TEX-treated samples in 400 Supplementary Table 3). The portion of ONT only and Illumina only is mostly caused by the 401 different algorithms used and the limited sequencing depth in the ONT data sets. Strikingly, the 402 median 5' untranslated region (UTR) lengths were very similar when data from ONT native and 403 Illumina-based RNA sequencing were compared (E. coli: 68 ONT vs. 62 Illumina; P. furiosus: 23 404 ONT vs. 13 Illumina; H. volcanii: 1 ONT vs. 0 Illumina). Please note that TSS-mapping based on

405 Nanopore native RNA-seq data must be corrected by 12 nucleotides (Fig. 2b). It has been observed 406 previously that about 12 nt are missing at the 5'-end of the sequenced RNAs. This observation can 407 be explained by a lack of control of the RNA translocation speed after the motor protein falls off the 5' end of the RNA (see Supplementary Figure 6a)<sup>56,57</sup>. Promoter analysis confirmed the 408 409 presence of well-known sequence motifs of bacterial and archaeal promoters<sup>27,31,58</sup>. This includes 410 the TATA-box and B-recognition element (BRE) characteristic for archaeal promoters and the -10 411 element in bacterial promoters (Fig. 2d). The -35 element in *E. coli* has been previously shown to 412 be less enriched compared to the -10 site<sup>5</sup>, which might explain why this element cannot be 413 detected in the Nanopore data set. To analyse TSSs in more detail, we compared the 5' UTR lengths 414 for all genes with predicted TSS in ONT and Illumina data sets (see Supplementary Figure 6b,c,d). 415 The overall correlation between the two techniques was very high (see Supplementary Fig. 6). As 416 expected, the correlation improves with increasing sequencing depth for a gene (>5 reads). While 417 TEX-treatment is a common way of predicting TSS in Illumina sequencing, we observed that it is not necessary for ONT data as very similar TSS are found in both TEX and NOTEX data sets ( $\rho$  = 418 419 0.86) (see Supplementary Figure 6e).

420

## 421 Transcription termination sites

422 Native RNA reads are sequenced in the 3' to 5' direction, which is a major advantage in the 423 detection of termination sites as any bias introduced after polyadenylation can be excluded. 424 Currently, no reference data sets for the archaeal organisms were available, the distribution of 3' 425 untranslated regions (3'UTRs) in E. coli ONT data closely resembles the data from a previous Term-426 seq study<sup>26</sup>. Untranslated regions at the 3'end of an annotated transcript are longer and more 427 uniformly distributed in *E. coli* than in the two archaeal species (Fig. 2c). In total, 1321 TTS in *E.* 428 coli, 856 in *P. furiosus* and 1461 in *H. volcanii* were analysed (positions of TTS in TEX-treated 429 samples in Supplementary Table 4). A meta-analysis of all TTS surrounding regions revealed 430 different sequence-dependent termination mechanisms that were confirmed using motif scanning (Fig. 2e, see Supplementary Fig. 7a-d). Our data suggest that transcription in P. furiosus is 431 432 terminated by a double-stretch of Uridines that are distributed over a length of 22 nt, a finding that 433 is in line with the terminator sequences detected by Term-Seq in *S. acidocaldarius*<sup>46</sup> and similar to

434 the U<sub>(8)</sub> sequence in *Thermococcus kodakarensis* by an *in vivo* reporter assays<sup>59</sup>. The termination 435 motif found in *H. volcanii* is a (U)4-sequence and located right before the TTS (see Supplementary 436 Fig. 7d). The motif locations for both Haloferax and Pyrococcus ONT sets suggest that accurate TTS 437 detection of transcripts terminated by poly(U) stretches is currently not possible. We observed 438 that homopolymer sequences are removed during trimming of the reads, which leads to TTS 439 positions that are positioned upstream of the poly(U) signal. Analysing individual transcripts in H. 440 volcanii and P. furiosus, we found that a single transcript can exhibit diverse 3' ends. This is true 441 for the Pilin transcript in *H. volcanii* and the Alba transcript in *P. furiosus*, respectively 442 (Supplementary Fig. 8). Both genes are highly expressed and some transcripts carry extended 3' 443 UTRs. While the majority of transcripts are terminating at the first poly(U) stretch, a subset of 444 transcripts is substantially longer and terminates at a second poly(U) termination signal 445 (Supplementary Figure 8). Interestingly, homogeneous short poly(U) signals are found both at the 446 canonical termination site and the termination site of the elongated 3'UTR in the case of the Pilin 447 transcript in *H. volcanii*. In contrast, the Alba gene transcripts in *P. furiosus* are terminated at both sites via long consecutive poly(U) stretches. Surveying the heterogeneity of the transcripts with an 448 449 extended 3'UTR, we found a heterogeneous distribution in the length of the transcripts, which 450 possibly indicates a step-wise trimming of the 3'UTR to yield the mature RNAs.

As observed for *E. coli* termination sequences, Cytosines are enriched over Guanosine adjacent to the TTS in *P. furiosus* (Fig. 2e). Termination motifs detected in the *E. coli* data set cover both intrinsic (poly(U)) and Rho-dependent termination signatures (see Supplementary Fig. 7a,b)<sup>26</sup>. We classified the stem-loop forming motif as Rho-dependent signatures, as these were not enriched in the poly(U) terminated genes. However, the stem-loops could potentially also represent processing or pause sites.

457

#### 458 Annotation of large transcriptional units

Long-read sequencing of native full-length RNAs has the potential to improve and facilitate genome-wide transcriptional unit (TU) annotation, which can be visually explored in a genome browser coverage track (Fig. 3a). For whole-genome analysis, the annotation strategy was based on two major observations: First, during RNA preparation, RNA processing or degradation can

463 occur, which limits the probability of sequencing an RNA in its native form as the percentage of 464 full-length transcripts decreases with expected gene size (see Supplementary Fig. 9a). Secondly, 465 we detected a decrease in coverage from the 3' to 5'end of the RNA in all RNA classes except for 466 the spike-in control (see Supplementary Fig. 9b), which is a limitation reported in the 467 literature<sup>13,60,61</sup>. Therefore, we assume that not Nanopore sequencing but library preparation 468 causes this problem. Based on this information, we developed a strategy that first collapses all 469 overlapping reads and then splits them according to a significant coverage drop on the 3' ends 470 (annotation of TUs based on this strategy in Supplementary Table 5). We compared the results to 471 database annotations and found that most of the differences are either caused by the low 472 sequencing depth or by single-unit operons that have been collapsed and are now two-unit 473 operons in the ONT data sets (see Supplementary Fig. 10a,b)<sup>29,50</sup>. Even though limited read 474 availability is a concern in all data sets, many large operons were detected for all organisms (see 475 Supplementary Fig. 10c). In case of limited bioinformatical resources, TUs can be explored visually 476 in a genome browser, which is mostly not possible for Illumina reads (Fig. 3, see Supplementary 477 Fig. 11,12). It further allows a quantitative analysis of individual transcripts in relation to other elements of the TU and performs much better than pure bioinformatical prediction or molecular 478 479 biology methods (RT-PCR) as shown for the archaellum operon in *P. furiosus* (Fig. 3)<sup>50,62</sup>. Here, it 480 was possible to (i) detect multiple transcription units forming this cluster, (ii) confirm 481 transcriptional start sites and (iii) to confirm that flaB0, the protein that is referred to as the major 482 archaellin in *P. furiosus* <sup>2,6</sup>, is transcribed in large excess over the other archaellum genes. The 483 largest TU cluster in H. volcanii consists of 25 ribosomal protein genes. Based on the native RNA-484 seq data, the analysis shows that this operon is split into two transcription units. This shows that 485 the ONT native RNA sequencing method provides the opportunity to correctly annotate 486 transcriptional units thereby outperforming the bioinformatics-only prediction as well as the 487 visual inspection of Illumina coverage (see Supplementary Fig. 11). Besides, we confirmed the 488 complex transcription pattern of the major ribosomal protein gene cluster in *E. coli* that stretches 489 over more than 10 kB, including the accurate determination of TSS and TTS and a putative cleavage 490 site in the secY gene (see Supplementary Fig. 12) <sup>63</sup>.

#### 491 Detection and confirmation of rRNA processing in *E. coli*

492 Next, we aimed to analyse the multi-step rRNA processing pathway which is the major RNA 493 maturation pathway in any prokaryotic cell. We first focus on the *E. coli* data set as the processing 494 of bacterial rRNAs is well characterized<sup>64–66</sup>. Ribosomal RNA in *E. coli* is transcribed from 7 495 independent rDNA operons, containing the mature rRNAs (16S, 23S and 5S rRNAs) and some 496 tRNAs which are intersped by RNA spacers elements<sup>67</sup>. In agreement with a previous study, 497 transcription of *rrnC* from two promoters (transcription start sites at -293 and -175) was detected 498 accurately (Fig. 4a,b)<sup>68</sup>.

499 The rRNA maturation process, which requires the action of well-defined ribonuclease activities, 500 culminates by the formation of stoichiometric amounts of mature 16S, 23S, and 5S rRNAs<sup>64-66</sup>. 501 Unexpectedly, the sequencing efficiency of mature 16S rRNA was lower than the 23S rRNA (Fig. 502 4a). Moreover, although we could properly detect RNA of similar size or longer (see above), the 503 short-lived full rDNA operon transcript detected in RNase III deficient strain<sup>69</sup>, is not observed 504 using our experimental set-up. In contrast, the downstream pre-rRNAs which are generated by the 505 action of RNAse III were detected (Fig.4). Among these intermediates, the 17S pre-rRNA with 115 506 additional nt at the 5' end and 33 nt at the 3' end of the 16S rRNA, was identified (Fig. 4b). 507 Additional 16S rRNA processing sites (RNase E: -66, RNase G: 0 5'mature) are also detected (Fig. 508 4 b,c). Recent studies were suggesting that the 3'end of the mature 16S rRNA is generated by 3'-5' 509 ribonucleases activity and/or endonucleolytic cleavage<sup>70,71</sup>. In addition to the mature 16S rRNA 510 3'end, we could observe reads of decreasing length spanning from +33 nt (RNaseIII) to 0 (related 511 to 16S rRNA 3'end), that could account for 3'-5' exonuclease processing activity (or degradation 512 during sample preparation). Together we could accurately identify all the known processing sites 513 at nucleotide resolution in wildtype E. coli.

514

#### 515 Insights into archaeal ribosomal RNA processing

In comparison to bacteria or eukaryotes, ribosomal RNA processing in archaea is still poorly understood<sup>70,72-74</sup>. Our current knowledge suggests that the primary polycistronic rRNA precursor contains processing stems formed by the 5'-leader and 3'-trailer sequences surrounding the 16S and 23S rRNAs<sup>72,73,75,76</sup>. In Euryarchaeota, the 16S and 23S rRNAs are additionally separated by the presence of an internal tRNA. In most archaea, the 16S and 23S rRNA processing stems contain a bulge-helix-bulge motif which is, in the context of intron-containing tRNA, recognized by the splicing endonuclease endA<sup>75–77</sup>. Similar to intron-containing tRNA maturation, processing at the bulge-helix-bulge motifs results in the ligation of the resulting extremities, thereby generating the archaeal specific circular pre-16S and circular pre-23S rRNAs<sup>73,76,78,79</sup>. The molecular mechanisms by which the circular pre-rRNA intermediates are further processed into linear mature rRNA are unknown<sup>73,76</sup>.

527 By analysing single reads, we aimed to confirm and expand our knowledge on the poorly 528 characterized multi-step ribosomal maturation process in P. furiosus and H. volcanii (Fig. 5a,b,c, 529 see Supplementary Fig. 13a,b)<sup>49,73,75,80</sup>. Due to a more limited number of reads in the multiplexed 530 H. volcanii samples, we have mostly focused on the P. furiosus dataset. As expected, almost all reads 531 are categorized as fully maturated transcripts of the single 16S/23S rRNA cluster that do not 532 contain an extended 5' or 3' region (see Supplementary Fig. 13c). Surprisingly, 5' and 3'end 533 did availablle NCBI positions not precisely match the annotations at 534 (https://www.ncbi.nlm.nih.gov/genome/) or the archaeal genome browser (AGB, http://archaea.ucsc.edu). In contrast, these mature rRNA extremities did match our independent 535 536 experimental validations by primer extension analysis of the 5'ends of the 16S and 23S rRNAs of 537 *H. volcanii* (Supplementary Fig. 15f). In addition, the majority of the expected processing sites, 538 notably at the predicted or known bulge-helix-bulge motifs<sup>78</sup>, were faithfully observed in P. 539 furiosus and H. volcanii (see Supplementary Fig. 14,15).

540 Despite the high sequencing depth of the (pre-)rRNA, we did not detect a full-length precursor 541 consisting of the 16S leading-16S-tRNA-23S- 23S trailing elements in P. furiosus and H. volcanii, 542 suggesting that early rRNA processing occurs rapidly in these cells. The remaining reads were 543 grouped according to their 5' leading and 3' trailing lengths into five additional categories that are 544 less abundant (with less than 1600 counts in each group): (1) a processing variant that entails the 545 16S rRNA leading/trailing sequence-tRNA-23S rRNA leading/trailing sequence, (2) probably 546 fragmented full-length precursor rRNAs, (3) 16S rRNA leading/trailing sequence-tRNA, (4) 16S 547 rRNA leading/trailing sequence-tRNA-23S rRNA and (5) tRNA-23S rRNA (Fig. 5, see 548 Supplementary Fig. 13). The early 16S rRNA leading/trailing sequence-tRNA-23S rRNA trailing 549 sequence precursor (1) or 16S rRNA leading/trailing sequence (3) generated by cleavage and

550 reciprocal ligation of the pre-16S and pre-23S rRNAs at the predicted bulge-helix-bulge motifs 551 were detected very accurately, and are reminiscent of previous observations<sup>76</sup> (Fig. 5, see Supplementary Fig. 13d). Given the number of reads, the direction of ONT sequencing from 3' to 552 553 5' and the accurate mapping, it is unlikely that the additional putative rRNA precursors (variants 554 4, 5) carrying the leading sequence in combination with 23S rRNA and tRNA-23S rRNA are all 555 arising from experimental artifact (Fig. 5a,b) (see also Discussion). This processing variation could 556 have been overlooked in the past in the analysed archaea, as these are only minor fractions of the 557 transcripts present in the cell or are specific to P. furiosus. Shortened 23S rRNA reads (variants 4, 558 5) and the overall visible 3' to 5' coverage drop can most likely be explained by fragmentation and 559 degradation during library preparation, secondary structures that prevent efficient loading into 560 the nanopore or truncation of RNA reads caused by physical artifacts that have been described 561 before and include problems during RNA translocation or disruptions of the ionic current 562 signal<sup>13,52,56</sup>. Furthermore, it cannot be excluded that non-mature reads are categorized as 563 fragmented reads and will be assigned as mature 16S or 23S rRNA.

564 Highly enriched positions that differ from the annotation of the mature rRNAs and cannot be assigned to a processing site may represent a wrong annotation of the rRNA locus or currently 565 unknown processing sites in the two archaeal species<sup>31,39</sup>. To provide further examples that show 566 567 the potential to describe maturation and processing events for prokaryotic rRNA, we sequenced 568 an *H. volcanii* wildtype strain grown under low salt conditions (see Supplementary Fig. 15b,c)<sup>28</sup>. 569 Under these conditions, a 16S rRNA precursor with an extended 5'UTR (position -121 – 5'bulge) 570 appears that is only enriched in this condition. Quantification by comparison with the NOTEX 571 wildtype set confirms the previous detection of this rRNA variant in a gel-electrophoretic analysis 572 of the rRNA (see Supplementary Fig. 15b)<sup>28</sup>.

573

#### 574 Towards mapping of RNA base modifications

575 More than 160 types of modified bases have been described in RNAs so far<sup>48</sup>. In contrast to other 576 sequencing techniques, Nanopore-based sequencing offers the possibility to detect base 577 modifications directly, as these modifications lead to an electric current signal that differs from the 578 expected theoretical distribution obtained by the unmodified nucleotides sequence<sup>14,15,20,81</sup>. Based

579 on this approach, we benchmarked the potential to detect known modification sites in 16S rRNA. 580 Before expanding the analysis to the full-length mature rRNA, we focused on the dimethylation 581 (m<sup>6</sup><sub>2</sub>A) introduced by the enzyme KsgA at position 1450/1451 in *H. volcanii*<sup>49,82</sup>. Using the *de novo* 582 model in Tombo, a suite of tools for the identification of modified nucleotides from nanopore 583 sequencing data (updated version from Stoiber et al.<sup>47</sup>), the calculated probability of a modification 584 was very high for the stretch of Guanosines adjacent to position 1450 (Fig. 6a). Mapping to single-585 nucleotide resolution is difficult as more than one base contributes to the actual electric current 586 signal in the nanopore<sup>83</sup>. In the next step, a comparison of a wildtype sample to a deletion mutant 587 of KsgA confirmed the absence of the dimethylation in the deletion strain and confirmed that the 588 m<sup>6</sup><sub>2</sub>A modifications and not the homopolymer-G-stretch are responsible for the altered current 589 signal (Fig. 6b). The analysis further revealed a reduced signal variability at non-modified 590 positions between the two samples in comparison to the theoretical distribution, which leads to 591 less false positives in the statistical analysis. As the *de novo* model has a higher error rate 592 compared to the sample-compare model, we generated two read sets by sorting full-length 16S 593 rRNA transcripts according to their 5' leading length to mature (n: 2744) and pre-rRNAs (n: 102) 594 in the Haloferax wildtype data set (Fig. 6c). The calculated base modification probabilities and 595 electric current signal distributions for this model are very similar to the wildtype/ $\Delta ksgA$  set, 596 indicating that the two m<sup>6</sup><sub>2</sub>A modifications were not quantitatively introduced in the pre-16S-597 rRNA reads (Fig. 6d). This finding is in line with a proposed "quality control" function of KsgA 598 during late biogenesis of the small ribosomal subunit<sup>84–86</sup> and further highlights the potential to 599 detect the introduction of base modifications at a different stage of rRNA maturation.

600 Next, we applied the described de novo and sample-compare model to the full 16S rRNA of all three 601 organisms and compared the results to positions known from literature<sup>48,49</sup>. Applying a probability 602 threshold of 0.5, we found that 60% (de novo) and 1.89% (sample-compare, 28 bases) of the bases 603 in the 16S rRNA are modified in *H. volcanii* (Fig. 6e), which emphasizes the better performance of 604 the sample-compare model by the vastly reduced number of false-positivly detected RNA 605 modifications. 10 of the 28 predicted bases (please note that approximately five bases contribute 606 to the signal in the nanopore and that a base single modification therefore influences the current 607 signal at the surrounding bases as well) can be assigned to known base modifications at positions 608 910, 1430 and 1450/1451<sup>49</sup>. Using the same threshold for *E. coli* (*de novo*: 50.5%, sample-compare:

609 0.1%, Fig. 6f) and *P. furiosus (de novo*: 64.9 %, sample-compare: 17.7 %, Fig. 6g), better accuracy
610 of the sample-compare model could be confirmed. Moreover, these data support the long-standing
611 hypothesis that hyperthermophilic organisms might stabilize their rRNAs by a higher degree of
612 RNA modifications<sup>87,88</sup>.

613 It is noteworthy that the predicted large number of modifications lead to a loss in read quality. This 614 is for example seen when analysing the *Pyrococcus* data set, as the quality score is also based on 615 the comparison of detected to theoretical read signal (compare Supplementary Fig. 3c). To look at 616 this observation in more detail, we compared the results from the raw squiggle Tombo approach 617 that is not dependent on mapping of the reads to the mapping properties of the reads. This 618 methodology is based on an approach that was recently used to identify m6A RNA modifications 619 from native RNA reads with an accuracy of  $\sim 90\%^{14}$ . After mapping, the frequency for the 620 respective nucleotide at every position in the 16S rRNA to be correct, wrong or deleted was 621 calculated. Homopolymer stretches in the RNA increase the likelihood that the correct number of 622 nucleotides is not correctly identified and this, in turn, leads to an increased number of deleted 623 nucleotides, which is also visible in the *Haloferax* data sets at the G-stretch adjacent to the m<sup>6</sup><sub>2</sub>A 624 modifications (Supplementary Fig, 16a,b). The overall frequency of wrongly assigned and deleted 625 nucleotides was much higher in *P. furiosus* (16.4%) than in *E. coli* (10.7%) and *H. volcanii* (10.4%) 626 (Supplementary Fig. 16c). Interrogating the full-length 16S rRNA, we found that miscalled 627 positions are equally distributed among the whole transcript (Supplementary Fig. 16d,e,f). 628 Statistical analysis of miscall-frequencies revealed a significant difference between already known 629 modification sites and non-modified positions in *Haloferax* and *Escherichia* suggesting that even a 630 very simple model can detect RNA base modifications when wrongly assigned bases considered. 631 The situation is different for *Pyrococcus*: Native Nanopore data suggest that the rRNA is heavily 632 modified. However, the number, exact positions and chemical identity of these modifications are 633 currently unknown. Hence, an analysis of how often base modifications lead to wrongly identified 634 nucleotides in the 16S rRNA sequence cannot be performed (Supplementary Fig. 16c,g).

635

## 637 Discussion

Performing whole-genome native RNA-seq study in prokaryotes provided us with a wealth of information on transcriptional and post-transcriptional processes in *E. coli* and the archaeal model organisms *H. volcanii* and *P. furiosus*. Here, we will mostly discuss new biological insights that emerged from our study. Additionally, we will reflect on the advantages and disadvantages of Nanopore native RNA-seq.

#### 643 Insights into transcriptional processes

644 Bacterial and archaeal transcription is an intensely studied molecular process and the mechanisms 645 of basal transcription are well understood<sup>89</sup>. Native RNA sequencing allowed us to retrieve 646 accurate information of transcript boundaries on both 5' and 3' ends. Our data show that 3' UTRs 647 length distributions are comparable between E. coli, P. furiosus and H. volcanii with the majority of mRNAs showing a length between 30 -70 nt. Similar to bacteria, archaea encode large numbers of 648 649 small non-coding RNAs<sup>90</sup>. However, many regulatory events that involve the regulation via small 650 RNAs take place at bacterial 5' UTRs<sup>91</sup>. We and others found that 5' UTRs are significantly shorter 651 in archaea supporting the idea that post-transcriptional regulation is mediated via the 3' rather 652 than the 5' UTR in archaea<sup>92</sup>. Additionally, we determined transcription termination sites, which 653 are well analysed for bacterial species but only a few studies focused on archaeal termination 654 mechanisms, especially on the genome-wide level. In both archaeal species, poly(U) stretches were overrepresented at termination sites agreeing well with termination sequences found in Sulfolobus 655 656 and Methanosarcina<sup>46</sup>. Interestingly, the majority of TTS found in Pyrococcus transcripts is 657 composed of two U-stretches with at least five consecutive uridine bases while a subclass of 658 Haloferax transcripts is almost exclusively terminated by a single U-stretch with four uridine 659 bases. It has been shown that a five base U-stretch is sufficient to induce termination in vitro 59,93,94. 660 Similar observations were described in a recent study by Berkemer et al, which identified a  $poly(U)_4$  stretch to be the termination signal in intergenic regions<sup>95</sup>. However, the current data set 661 662 suggests that this short termination signal might be a specific feature for a subclass of *Haloferax* 663 transcripts resembling the poly(U) termination motif found in E. coli. All other archaeal organisms 664 (P. furiosus, M. mazei, S. acidocaldarius) investigated so far terminate transcription at multiple

665 consecutive poly(U) stretches. Possibly, *Haloferax* relies on additional termination signals or yet unknown termination factors. A putative candidate is archaeal CPSF1 (aCPSF1), a recently 666 described archaeal termination factor<sup>96</sup> that is widespread in archaea. aCPSF1 acts as ribonuclease 667 668 that cleaves transcripts after a poly(U) stretch to trim transcripts and facilitates transcription 669 termination in Methanococcus maripaludis. The arising 3' UTR isoforms were detected using Term-670 seq analysis<sup>96</sup>. We also observed heterogeneity in the case of the Pilin and Alba transcripts, 671 respectively, that are distinguished by varying lengths of the 3' UTR suggesting that aCPSF1 might 672 trim a subset of genes in *H. volcanii* and *P. furiosus*. It is noteworthy that 3' UTR isoforms were also 673 detected in Term-seq studies with *Sulfolobus* and *Methanosarcina*<sup>46</sup>. However, in contrast to the 674 Pilin and Alba transcripts, the 3' UTR isoforms arise from termination at different sites of a single 675 continues poly(U) stretch suggesting that the isoforms arise from a stochastic termination process 676 of the RNA polymerases at an extended poly(U) stretch at the end of the gene. Taken together, 677 these data demonstrate that a variety of termination mechanisms (that can even co-occur in the 678 same cell) can be found in archaea ranging from stochastic intrinsic termination at extended 679 poly(U) stretches (Pyrococcus, Sulfolobus, Methanosarcina), to abrupt termination at short uridine 680 tracts (H. volcanii) and factor-dependent termination that results in trimming of the 3'UTR (H. 681 volcanii, P. furiosus, M. maripaludis).

682 In the context of transcription, the long and overlapping native RNA reads helped us to analyse the 683 transcriptional landscape at multigene operons. More specifically, we focused on the archaellum 684 operon as the transcription unit assignment remained ambiguous so far<sup>62</sup>. In contrast to 685 bioinformatical and Illumina RNA-seq-based predictions and attempts to unravel the TU via 686 primer extension experiments, we found that the archaellum operon in *P. furiosus* is transcribed 687 in multiple units with highly diverse abundances. The *fla*B0 gene encodes the major flagellin 688 protein that forms the filament of the archaellum and therefore, the organism has to produce this 689 protein in large quantities as apparent from the expression level<sup>62</sup>. Interestingly, FlaD is expressed 690 at comparably high levels as well as supporting the idea that FlaD is a major constituent of the 691 archaellum in P. furiosus. It has been speculated that FlaD forms the cytosolic ring of the archaellum 692 that anchors the filament in the outer membrane <sup>97</sup>. The identity and functional role of FlaD are, 693 however, not known so far.

#### 695 Insights into rRNA processing in archaea

696 In this study, we have assessed the suitability of native RNA sequencing to obtain information on 697 the rRNA maturation pathway of different prokaryotes. Ribosomal RNA maturation proceeds via 698 the coordinated and defined order of ribonucleases action (exonucleolytic and/or endonucleolytic 699 cleavages) which generate pre-rRNA intermediates with defined premature rRNA 700 sequences<sup>66,74,98,99</sup>. The establishment of faithfull rRNA maturation maps in model organisms, like 701 E. coli, S. cerevisiae or human cell culture has required numerous analyses over the past decades 702 <sup>66,74,98,99</sup>, and remains a technical challenge. Therefore, methodologies that might accelerate the 703 systematic analysis of rRNA maturation pathways across the tree of life, thereby enabling to 704 unravel the diversity of rRNA maturation strategies need to be established. Beyond the 705 identification of processing sites, the order of the processing events which can be, in part, deduced 706 from co-occurrence analysis of the 5' and 3' extremities is of biological relevance 66,74,98,99. Whereas 707 we could confirm and extend our general view on the rRNA maturation pathway in archaea, the 708 3'-5' processivity of Nanopore native RNA sequencing observed for rRNA impedes the accurate 709 analysis of pre-rRNA extremities co-segregation (see Fig. 5 and Supplementary Fig. 9b). 710 Nevertheless, we could confirm the presence of processing sites and pre-rRNA intermediates in 711 the different organisms analysed, with the exception of the archaea specific circular-pre-rRNA 712 intermediates<sup>73,76,78,79</sup>, which escape analysis due to the lack of 5'/3' extremities. Among the 713 identified pre-rRNA intermediates, precursor (4) observed in *P. furiosus*, which include ligation at 714 the bbb motif of the upstream region of the 16S leader and downstream region of the 16S trailer 715 sequences continuous to the downstream tRNA/23S sequences is of particular interest. The 716 presence of this intermediate suggests that the 16S rRNA bulge-helix-bulge processing occurs 717 prior to internal tRNA and 23S rRNA maturation. This observation is also in agreement with our recent cis-acting element analysis performed in H. volcanii 73,76,79. In fact, based on this analysis we 718 719 have proposed a model by which 16S rRNA maturation proceeds and is required for the 720 downstream maturation of the internal tRNA and 23S rRNA. Moreover, we have hypothesized that 721 ligation of the 16S rRNA leader/trailer resulting from the 16S rRNA bulge-helix-bulge maturation 722 process generates a putative new pre-rRNA intermediate which we could observe for the first time 723 in *Pyrococcus* using native RNA sequencing. In addition, the presence of intermediates (1) and (3)

support the idea that the maturation of the co-transcribed internal tRNA is inefficient or inhibited
and may preferentially occur after processing of the 16S and 23S rRNA bulge-helix-bulge
[suggested in<sup>76,78</sup>].

The biological relevance of the additionally identified intermediates for rRNA maturation is yet unclear and will need to be appraised in the light of additional functional analysis. In conclusion, despite some intrinsic limitations, direct RNA sequencing can be a useful tool to approach intricated maturation pathway like rRNA maturation, and expand our understanding of RNA maturation in prokaryotes.

732

## 733 Towards the mapping of rRNA modification patterns

734 RNA modifications have been described already in the 50-60s, and has gained significant attention 735 over the last years, under the generic term of epitranscriptome<sup>100-102</sup>. The high-throughput 736 analysis of these post-transcriptional modifications remains challenging and mostly relies on 737 indirect methods, like primer extension stops analysis or chemical recoding/derivation 738 strategies<sup>103,104</sup>. Native RNA sequencing may fill an important gap to systematically analyse RNA 739 modifications on a genome-wide scale. However, global strategies enabling the faithful 740 determination of RNA modification identity and position needs to be developed. Several recent 741 focused analyses have explored different strategies to evaluate the capacity of ONT to accurately 742 detect RNA modifications (e.g. m6A)<sup>14,15,55,105,106</sup>. In this study, we focused on the 16S rRNA which is known to carry different types of RNA modifications which are introduced at different positions 743 and different stages of the small ribosomal subunit maturation<sup>73,107</sup>. Our study provides evidence 744 745 that RNA modification detection benefits of the use of unmodified/hypo-modified references (in 746 agreement with recent studies<sup>15,106</sup>). In this study, we have used a sample-compare approach 747 analysing pre-rRNAs, which are expected to contain incomplete modification patterns, in 748 comparison to mature rRNAs, which are expected to harbor a completed modification pattern. To 749 validate our approach we have first focus on the almost universally conserved KsgA-dependent 750 dimethylations of the 16S rRNA<sup>15,82,85</sup>. Using our sample-compare strategy and KsgA deletion 751 strain we could unambiguously provide in vivo evidence that the archaeal KsgA-dependent 752 methylations of the 16S rRNA are completed at a late stage of the small ribosomal subunit 753 biogenesis. This result is in agreement with previous studies done in yeast and bacteria<sup>84-86</sup>.

754 Moreover, our sample-compare approach also suggests an increased amount of rRNA 755 modifications in the hyperthermophile P. furiosus, and a decrease amount of predicted rRNA 756 modifications in halophile *H. volcanii* in comparison to *E. coli*. These differential modification 757 patterns across archaea are in good agreement with previous studies and may reflect adaptation to the environmental conditions that these extremophilic archaea encounter<sup>49,87,88</sup>. Unfortunately, 758 759 the exact nature of these modifications can not be unveiled yet. To facilitate their high-throughput 760 identification, future studies will require to develop and train algorithms improving the 761 identification confidence of diverse RNA modifications.

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### 763 Benefits and limitations of Nanopore-based native RNA sequencing

764 Taken together, a key advantage of the native RNA-seq approach is that multiple features can be 765 addressed at once distinguishing the technique from the Illumina sequencing technology or 766 biochemical assays. ONT sequencing does not require large scale equipment and is a fast method. 767 Moreover, the method does not necessitate a reverse transcription step or PCR amplification 768 thereby avoiding biases introduced by these enzymes. Due to the limitations of the sequencing 769 read analysis platform, ONT sequencing does not accurately detect small RNAs yet. Additional 770 limitations of the native RNA-seq technique are currently (i) the high amount of input RNA 771 required (2-5  $\mu$ g) to reach good coverage of the transcriptome without rRNA depletion, (ii) the 3' 772 bias during RNA sequencing (iii) limited throughput and (iv) limited possibilities for multiplexing. 773 Although ONT sequencing has a comparably low sequencing accuracy, this did not pose a limitation 774 for our analysis. Due to the extraordinary read length and the sensitivity to base modifications, 775 ONT-based native RNA-seq can provide valuable insights into (r)RNA processing, (r)RNA 776 modifications patterns and the transcription of large operons. Strikingly, ONT-based sequencing 777 is a *bona fide* single-molecule method and hence molecular heterogeneity in the transcriptome can 778 be analysed so that even minor RNA populations can be detected that are inevitably lost in 779 ensemble sequencing approaches.

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# 782 Data availability

783 Sequencing data sets (gzipped raw FAST5 files) will be deposited in the Sequence Read Archive784 (SRA).

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### 786 Code availability

- 787 A detailed documentation and code of all essential analysis steps (used tools and custom Rscripts)
- 788 are available from <u>https://github.com/felixgrunberger/Native\_RNAseq\_Microbes</u>.

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# 790 Author contributions

F.G. established the nanopore workflow and performed all the bioinformatic analysis. F.G., R.K., M.J., R.R. and A.B. performed RNA extractions. M.F. helped to optimize the RNA treatment protocol. F.G. carried out library preparations and performed sequencing. F.G., R.K., M.J. carried out *H. volcanii* wildtype/ $\Delta ksgA$  library preparations and sequencing. R.K. and S.F.-C. generated the KsgA deletion strain. R.K. performed primer extension analysis. F.G., S.F.-C. and D.G. designed the study, analysed and interpreted the data, and wrote the manuscript with the input of all authors. J.S., W.H., S.F.-C. and D.G. supervised the experiments. S.F.-C. and D.G. initiated and supervised the project.

798

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- 804
- 805

# 806 Figure and figure legends



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808 Figure 1 | Nanopore-based native RNA sequencing of prokaryotes. a, Key steps of library preparation: (1) native RNA 809 is polyadenylated, which allows library preparation using the direct RNA kit from Oxford Nanopore and sequencing 810 on a MinION device. (2) 3' ligation is performed to add the an adapter carrying the motor-protein (red square), 811 which unzips the RNA-cDNA hybrid and pulls the RNA through the Nanopore (detailed description see 812 Supplementary Fig. 1a). b, Data sets for three prokaryotic model organisms (Ecoli: Escherichia coli, Pfu: Pyrococcus 813 furiosus, Hvo: Haloferax volcanii) with (+) and without (-) Terminator 5'-Phosphate-Dependent Exonuclease (TEX) 814 treatment were collected and mapped to their respective reference genome. Transcript abundances of genomic 815 features (protein coding genes (CDS): red, 5S rRNA: green, 16S rRNA: purple, 23S rRNA: light-purple) were estimated 816 using featurecounts<sup>42</sup>.





819 Figure 2: Detection of transcript boundaries. a, Primary transcription start sites (TSS) were predicted based on 820 Nanopore reads and compared to Illumina d(ifferential) RNA-Seq data from published data sets for E. coli <sup>30</sup>, P. 821 furiosus <sup>31</sup> and *H. volcanii<sup>27</sup>*. The total number of all genes with a detected TSS is shown as grey barplots and results 822 from the sum of Nanopore-only predicted TSS and the intersection to the Illumina data. b, Position of TSS is 823 corrected for 12 nucleotides to calculate the length of 5' untranslated regions (UTR) in the Nanopore data sets 824 (purple). 5' UTRs are compared to d(ifferential) RNA-Seq Illumina data sets (light-green). Median values are indicated 825 by a black bar inside the distribution (compare Supplementary Fig. 6). **c**, Length of 3' UTRs is based on the prediction 826 of transcription termination sites (TTS) and the comparison to annotated gene ends. Distribution of lengths is shown 827 for Nanopore data sets (purple) and compared to a Term-Seq E. coli Illumina data set (light-green)<sup>108</sup>. d, MEME 828 analysis <sup>45</sup> of extracted sequences upstream of Nanopore-predicted TSS reveals bacterial (position -10) and archaeal-829 specific promoter elements (BRE: B-recognition element, recognized by transcription factor B, TATA: TATA-box 830 bound by the TATA-binding protein TBP), therefore validating the positions of predicted TSS. e, Nucleotide 831 enrichment meta analysis was carried out by comparing the genomic sequences surrounding the TTS (-45 to +45) 832 to randomly selected intergenic positions of the respective organism (n: 10000) (Terminator motifs in 833 Supplementary Fig. 7).

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835

836 Figure 3 | Transcription unit (TU) annotation of the archaellum-operon in P. furiosus. a, Coverage of Nanopore reads 837 is shown in the top panel. TU prediction is performed by detection and linkage of overlapping reads and splitting 838 them according to a 3' drop in coverage (see Supplementary Fig. 8). Predicted TUs are drawn with green boxes 839 according to scale. **b**, Comparison to bioinformatical prediction using the DOOR2 database<sup>50</sup>. **c**, Genome annotation 840 with abbreviated gene names, boxed drawn to scale and strand indicated by triangles<sup>31</sup>. **d**, Comparison to results 841 from published RT-PCR experiments<sup>62</sup>. All transcripts detected are drawn by arrows. **e**, Operon prediction based on 842 mixed Illumina-Seq (coverage in lower panel) and predicted by ANNOgesic<sup>31,109</sup>. The primary transcription start site 843 (TSS) of the large transcriptional unit is highlighted.



846 Figure 4 | Detection and confirmation of rRNA processing sites in E. coli. a, Transcription of the rDNA locus (rrnC) is 847 starting from two promoters (transcription start sites at -293 and -175)<sup>49</sup>. Precursor RNAs are cleaved by RNases (brown) at depicted positions <sup>64,65,73,80</sup>. Nanopore coverage is shown for TEX (+, blue) and NOTEX (-, blue) samples. 848 849 b, Single-read analysis of precursor and mature rRNAs. Reads were filtered according to read start and stop positions 850 and are color-coded by mature rRNAs (blue), RNaseIII-processed precursors (brown) and precursor rRNAs starting 851 from the TSS (red). For each category the 40 longest reads were selected and are shown here as single lines. c, 852 Histograms of read start positions and d, read end positions of 16S, 23S and 5S rRNA relative to annotated 853 boundaries of mature rRNAs of TEX (+) and NOTEX (-) samples. Cleavage sites, transcription start sites and 854 transcription boundaries are indicated by dashed lines.



857 Figure 5 | Ribosomal RNA processing variation in P. furiosus. a, Nanopore coverage of the rDNA locus in P. furiosus 858 containing the tRNA-Ala. Single reads were filtered according to their 5' and 3' lengths (couting from 16S and 23S 859 rRNA annotation) and are shown in the example read track from a snapshot taken with the integrated genome 860 browser (IGV)<sup>110</sup>. Besides mature 16S rRNA and 23S rRNA, the remaining reads were classified as (1) a processing 861 variant that entails leading sequence-tRNA-trailing sequence, (2) probably fragmented full-length precursor rRNAs, 862 (3) leading sequence-tRNA, (4) leading sequence-tRNA-23S rRNA and (5) tRNA-23S rRNA (quantification shown in 863 Supplementary Fig. 13c). Illumina coverage from mixed RNA-Seq is shown in the bottom panel<sup>31</sup>. b, Read classes are 864 shown as processing sketches and color-coded as on the left. c, Maturation steps of the rRNA processing pathway as proposed for Archaeoglobus fulgidus<sup>49</sup> with cleavage sites indicated by red arrows (full proposed pathway in 865 866 Supplementary Fig. 13a). Processing variants found in P. furiosus (4, 5) potentially represent intermediate steps that 867 refine the current rRNA maturation model in archaea (Supplementary Fig. 13b).



Figure 6 | Detection of modified bases in 16S rRNA based on raw signal comparisons. a, Raw signal of reads (blue squiggles) mapping to 16S rRNA in H. volcanii are compared to the theoretical distribution of native non-modified RNA (grey distribution) using the de novo detection model in tombo in the upper track<sup>47</sup>. The m<sup>6</sup><sub>2</sub>A modification at position 1450/1451 (from 16S start) is indicated by an asterisks in the sequence track. The probability of each base to be modified (in %) is calculated and shown in the lower panel for the selected sequence. b, Position-specific boxplot comparison of signals from sequences surrounding the m<sup>6</sup><sub>2</sub>A modification in *H. volcanii* wildtype (blue) and the ΔKsgA mutant. The theoretical distribution of read signal is indicated by a grey distribution curve for every base. The probability is computed based on the comparison of the two samples. c, Strategy for generating a comparison data set: Reads mapping to the 16S rRNA are categorized according to their read start position from the mature annotated rRNA as mature or pre-16S-rRNAs. d, Sample comparison model as shown in panel b based on mature (blue) and pre-rRNAs (red). e, Heatmap for the probability of a base to be modified (blue, light-green, red) shown for the mature 16S rRNA. Probabilities were calculated bases on a de novo (D) model, a sample comparison model (S) using the strategy described in panel c and plotted for already known modification sites  $(L)^{49}$ . Three of those modifcations in *H. volcanii* are shown enlarged in the upper panel. Data are summarized for *H. volcanii* , **f**, *E. coli*<sup>48</sup> and g, P. furiosus.

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