

# Properties of the Reverse Transcription Reaction in mRNA Quantification

ANDERS STÅHLBERG,<sup>1,2</sup> JOAKIM HÅKANSSON,<sup>3</sup> XIAOJIE XIAN,<sup>3</sup> HENRIK SEMB,<sup>3</sup> and MIKAEL KUBISTA<sup>1,2\*</sup>

**Background:** In most measurements of gene expression, mRNA is first reverse-transcribed into cDNA. We studied the reverse transcription reaction and its consequences for quantitative measurements of gene expression.

**Methods:** We used SYBR green I-based quantitative real-time PCR (QPCR) to measure the properties of reverse transcription reaction for the  $\beta$ -tubulin, glyceraldehyde-3-phosphate dehydrogenase, Glut2, CaV1D, and insulin II genes, using random hexamers, oligo(dT), and gene-specific reverse transcription primers.

**Results:** Experimental variation in reverse transcription-QPCR (RT-QPCR) was mainly attributable to the reverse transcription step. Reverse transcription efficiency depended on priming strategy, and the dependence was different for the five genes studied. Reverse transcription yields also depended on total RNA concentration.

**Conclusions:** RT-QPCR gene expression measurements are comparable only when the same priming strategy and reaction conditions are used in all experiments and the samples contain the same total amount of RNA. Experimental accuracy is improved by running samples in (at least) duplicate starting with the reverse transcription reaction.

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Gene expression reflects both the genetic predisposition and the physiologic condition of the individual. From measurements of gene expression, it is possible to diagnose an individual's state of health and also to monitor how an individual responds to medication, treatment,

and altered living conditions. The expression of virtually all genes in a sample can be roughly assessed by cDNA microarray techniques, and the expression of selected genes can be measured by real-time PCR with very high accuracy (1, 2). In studies of new systems or in search for drug targets, key marker genes are typically identified by cDNA microarray screening and then studied in greater detail by more sensitive real-time PCR.

Both real-time PCR and cDNA microarray measurements are highly reproducible (2–4), but before the expression of any gene can be measured, the mRNA in the sample must be copied to cDNA by reverse transcription. The reverse transcription reaction is not very well understood, and it is expected to be the uncertain step in gene expression analysis. It can introduce biases as a result of effects of the secondary and tertiary structure of mRNA, variation in priming efficiency, and properties of the reverse transcriptase. The yield of the reverse transcription reaction can also be affected by reaction inhibitors present in biological samples (5–10). To date, no published study has considered the accuracy and precision of the reverse transcription reaction.

Our aim was to study the properties of the reverse transcription reaction, using quantitative real-time PCR (QPCR)<sup>4</sup> as an analytical tool. We investigated the reproducibility, yield, dynamic range, sensitivity, and specificity of the reverse transcription reaction, using the  $\beta$ -tubulin, glyceraldehyde-3-phosphate dehydrogenase (GAPDH) (11, 12), Glut2, CaV1D, and insulin II genes, which are expressed differently in a pancreatic  $\beta$ -tumor mouse cell line (13). We also studied the effect of total RNA concentration on reverse transcription efficiency and compared priming with random hexamers, oligo(dT), and gene-specific primers.

<sup>4</sup> Nonstandard abbreviations: QPCR, quantitative real-time PCR; GAPDH, glyceraldehyde-3-phosphate dehydrogenase; dNTP, deoxynucleotide triphosphate; and Ct, threshold cycle.

<sup>1</sup> Department of Chemistry and Bioscience, Chalmers University of Technology, Gothenburg, Sweden.

<sup>2</sup> TATAA Biocenter, 405 30 Gothenberg, Sweden.

<sup>3</sup> Department of Medical Biochemistry, Gothenburg University, Gothenburg, Sweden.

\*Address correspondence to this author at: TATAA Biocenter, Medicinargatan 7B, 405 30 Gothenburg, Sweden. Fax 46-31-7733948; e-mail mikael.kubista@ataa.com.

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## Materials and Methods

### CELL CULTURE, RNA ISOLATION, AND DNASE TREATMENT

A pancreatic  $\beta$ -tumor cell line (a generous gift from Dr. Gerhard Christofori, Vienna, Austria) derived from primary tumors of the Rip1Tag2 mouse was grown to confluence in DMEM (Sigma-Aldrich) containing 200 mL/L fetal calf serum (PAN Systems), 100 kilounits/L penicillin (Invitrogen), 100 mg/L streptomycin sulfate (Invitrogen), and 2 mmol/L L-glutamine (Invitrogen). Total RNA was prepared from harvested cells with the RNeasy Midi Kit (Qiagen) and treated with RNase-free DNase (Qiagen) according to the manufacturer's instructions. The RNA concentration was measured by fluorescence (TD-360; Turner Designs) with the RiboGreen Quantitation Reagent (Molecular Probes) according to the manufacturer's instructions. RNA integrity was verified by electrophoresis in a 1% agarose gel containing 54 g/L formaldehyde.

### REVERSE TRANSCRIPTION

The SuperScript II (Invitrogen) reagent set was used for the reverse transcription reaction. We heated 13- $\mu$ L samples containing total RNA, ultrapure deoxynucleotide triphosphates (dNTPs; Amersham Pharmacia Biotech), and random hexamers (Promega), oligo(dT) (Amersham Pharmacia Biotech), or gene-specific primer (MWG-Biotech) designed to anneal to target mRNA at  $\sim$ 80 bp before the start of the PCR product at 65 °C for 5 min to denature the RNA and then chilled the samples on ice for 5 min. We then added Tris-HCl (pH 8.3), KCl, MgCl<sub>2</sub>, and dithiothreitol (Invitrogen) to a total volume of 19  $\mu$ L. The random hexamer-primed samples were incubated for 10 min at 25 °C. All samples were then heated to 42 °C for 2 min, and 1  $\mu$ L of SuperScript II was added to give a final volume of 20  $\mu$ L containing: 500  $\mu$ M dNTPs, 50 mM Tris-HCl, 75 mM KCl, 3 mM MgCl<sub>2</sub>, 5 mM dithiothreitol, 200 U of SuperScript II, and 0.1  $\mu$ g/ $\mu$ L random hexamers, 0.05  $\mu$ g/ $\mu$ L oligo(dT), or 1  $\mu$ M gene-specific primer (Table 1 in the Data Supplement that accompanies the online version of this article at <http://www.clinchem.org/content/vol50/issue3/>). The reverse transcription reaction was performed at 42 °C for 50 min and was stopped by heating to 70 °C for 15 min.

### QPCR

All real-time PCR assays contained 10 mM Tris (pH 8.3), 50 mM KCl, 1 U of *Taq* polymerase (Sigma-Aldrich), 200 ng/ $\mu$ L bovine serum albumin (MBI Fermentas), 3 mM MgCl<sub>2</sub>, 0.3 mM dNTPs (Sigma-Aldrich), 1:100 000 $\times$  SYBR Green I (Molecular Probes), and 400 nM each PCR primer (MWG-Biotech; Table 1 in the online Data Supplement) in 20  $\mu$ L. The reverse transcription and real-time PCR primers were designed using Primer3 ([http://www-genome.wi.mit.edu/cgi-bin/primer/primer3\\_www.cgi](http://www-genome.wi.mit.edu/cgi-bin/primer/primer3_www.cgi)).

Real-time PCR was performed in a LightCycler (Roche Diagnostics) starting with 3 min of preincubation at 95 °C

followed by 50 amplification cycles (Table 1 in the online Data Supplement). The threshold cycle (Ct) was determined by use of the maximum-second-derivative function of the LightCycler software. Formation of expected PCR product was confirmed by agarose gel electrophoresis (2%) and melting curve analysis (14).

## Results

Different reverse transcription priming strategies were compared as follows. cDNA was synthesized by use of random hexamer primers; oligo(dT) primers; one of the primers specific for the genes  $\beta$ -tubulin, GAPDH, CaV1D, insulin II, and Glut2; or a mixture of the five gene-specific primers. Reverse transcription without any primer was used as negative control. All reverse transcription reactions were performed in replicates of five on material from the same RNA pool. This eliminated sample-to-sample variation attributable to inhibition that may affect reaction efficiencies (2) as well as any deviations in efficiency attributable to variations in copy number, as has been reported in highly diluted samples (15). A schematic showing the experimental setup is shown in Fig. 1 in the online Data Supplement.

### QPCR ASSAYS

The yield and reproducibility of cDNA synthesis of the  $\beta$ -tubulin, CaV1D, GAPDH, insulin II, and Glut2 genes were measured by QPCR with SYBR Green I detection (detailed protocols are given in Table 1 in the online Data Supplement). PCR efficiencies (*E*) and the median and SD ( $SD_{QPCR}$ ) of the Ct values were calculated for the five genes (Table 1) (16). For the  $\beta$ -tubulin, CaV1D, GAPDH, and insulin II assays,  $SD_{QPCR}$  was  $<0.12$  cycles (Table 1). This corresponds to less than  $(1 + E)^{0.12} \approx (1 + 0.85)^{0.12} = 1.08$  (assuming an 85% PCR efficiency; Table 1) or  $<8\%$  variation in the estimated number of cDNA molecules. For Glut2, which is expressed to a lesser degree than the other genes,  $SD_{QPCR} = 0.36$ . This corresponds to a variation of 26% ( $1.91^{0.36}$ ) in the estimated number of cDNA molecules.

### EFFICIENCY AND REPRODUCIBILITY OF REVERSE TRANSCRIPTION

Shown in Table 2 are the mean Ct values measured by QPCR for the five genes when the different reverse transcription priming strategies were used. In general, a low Ct value corresponds to high gene expression in the biological sample. However, in our comparative study, the same starting material was used for all reverse transcription reactions; therefore, in this study, a low Ct value indicates a more efficient reverse transcription reaction. A difference of one cycle in Ct between two reverse transcription priming strategies for a particular gene corresponds to a  $(1 + E)$ -fold difference in reverse transcription yield. As the data in Table 2 indicate, no reverse transcription priming strategy was best for all five genes. For example, for  $\beta$ -tubulin, the highest reverse transcription

**Table 1. Reproducibility of QPCR and reverse transcription.**

	$\beta$ -Tubulin	CaV1D	GAPDH	Insulin II	Glut2
QPCR <sup>a</sup>					
SD <sub>QPCR</sub> , Ct	0.01	0.12	0.02	0.02	0.36
E, %	79	80	78	92	91
Median Ct	18.9	28.5	16.4	16.8	30.6
Reverse transcription priming <sup>b</sup>					
Random hexamers					
SD <sub>RT</sub> , Ct	0.16	0.21	0.13	<u>0.05</u>	0.60
SD <sub>mRNA</sub> , Ct	0.16	0.24	0.13	0.05	0.70
Oligo (dT)					
SD <sub>RT</sub> , Ct	0.14	<u>0.08</u>	0.12	0.11	0.48
SD <sub>mRNA</sub> , Ct	0.14	0.14	0.12	0.11	0.60
Gene-specific primers					
SD <sub>RT</sub> , Ct	<u>0.11</u>	0.21	<u>0.11</u>	0.06	– <sup>c</sup>
SD <sub>mRNA</sub> , Ct	0.11	0.24	0.11	0.06	0.23
Mixture <sup>d</sup>					
SD <sub>RT</sub> , Ct	0.28	0.43	0.47	0.06	<u>0.33</u>
SD <sub>mRNA</sub> , Ct	0.28	0.44	0.47	0.06	0.49

<sup>a</sup> Total number of samples was 20.

<sup>b</sup> SD<sub>RT</sub> is the SD of the reverse transcription step, and SD<sub>mRNA</sub> is the combined SD of the reverse transcription and QPCR steps Eq. 1. The priming strategy that yielded highest reproducibility lowest SD<sub>RT</sub> for each gene is underlined. The number of reverse transcription replicates was 5.

<sup>c</sup> SD<sub>mRNA</sub> was less than mean SD<sub>QPCR</sub>, and the contribution from SD<sub>RT</sub> could not be estimated.

<sup>d</sup> Mixture of the five gene-specific primers.

yield was obtained with oligo(dT) primer (Ct = 18.1), and random hexamers gave the lowest yield (Ct = 19.5). For CaV1D, the opposite was true: random hexamers gave the most efficient priming (Ct = 26.5), whereas oligo(dT) performed worst (Ct = 28.8). Also shown in Table 2 are the largest differences in Ct among the various priming strategies for the five genes. The difference ranged from 0.8 cycles for GAPDH to 4.4 cycles for Glut2. Expressed in terms of cDNA molecules, this corresponds to a 59% ( $1.78^{0.8} = 1.59$ ) difference in cDNA synthesis yield between the best and worst priming strategies for GAPDH and a 17-fold variation ( $1.91^{4.4} = 17.2$ ) for Glut2. Clearly,

**Table 2. Dependence of reverse transcription yield on priming strategy.**

Priming strategy	Ct <sup>a</sup>				
	$\beta$ -Tubulin	CaV1D	GAPDH	Insulin II	Glut2
Random hexamers	19.5	<u>26.5</u>	<u>15.8</u>	16.9	<u>27.5</u>
Oligo(dT)	<u>18.1</u>	28.8	16.6	<u>15.9</u>	28.4
Gene-specific primers	18.8	28.7	16.4	17.4	31.8
Mixture <sup>b</sup>	19.1	27.9	16.2	16.6	29.3
Maximum $\Delta$ Ct <sup>c</sup>	1.4	2.3	0.8	1.5	4.4

<sup>a</sup> The priming strategy that gave highest reverse transcription yield for each gene is underlined. For  $\beta$ -tubulin, CaV1D, and insulin II, the optimum priming strategy is better than its alternatives with 99% confidence.

<sup>b</sup> Mixture of the five gene-specific primers.

<sup>c</sup> Maximum difference in reverse transcription efficiency among the four priming strategies.

the choice of priming strategy can have profound effects on the yield of cDNA synthesis. The yields are evidently also gene dependent.

Reverse transcription yields when we used nonmatching or false primers were in all cases low (Table 2 in the online Data Supplement). For the highly expressed genes ( $\beta$ -tubulin, GAPDH, insulin II, and CaV1D), the reverse transcription yields with false primers were always much lower than with random hexamers, oligo(dT), individual gene-specific primers, or the mixture of the five gene-specific primers, but they were not negligible. In all cases, Ct with false primers was lower than the Ct of the negative control with no primers, indicating that priming of mRNA for reverse transcription is not a particularly stringent reaction. For the Glut2 gene, reverse transcription primers designed to be specific for the other genes gave lower Ct values than the Glut2-specific reverse transcription primer (Table 2 in the online Data Supplement). Clearly, the Glut2 reverse transcription primer hybridizes poorly to Glut2 mRNA under our conditions.

The reproducibility of the reverse transcription priming strategies can be estimated from the five replicates performed for each reverse transcription reaction (Fig. 1 in the online Data Supplement). The SD of a gene expression measurement, i.e., the SD of the determination of the amount of a particular mRNA (SD<sub>mRNA</sub>), is a weighted sum of the SDs of the QPCR (SD<sub>QPCR</sub>) and the reverse transcription (SD<sub>RT</sub>) reactions (16):

$$SD_{mRNA} = \sqrt{SD_{RT}^2 + SD_{QPCR}^2} \quad (1)$$

With use of the SD<sub>QPCR</sub> calculated above, SD<sub>RT</sub> for the different assays could be calculated from SD<sub>mRNA</sub> (Table 1). SD<sub>RT</sub> was in the range 0.05–0.60, which is 0.7- to 28-fold higher than the typical SD of optimized QPCR assays. When we compared SD<sub>RT</sub> and SD<sub>QPCR</sub>, most experimental variation in the determination of mRNA for the  $\beta$ -tubulin, GAPDH, and insulin II assays was in the reverse transcription step. For the CaV1D and Glut2 assays, SD<sub>QPCR</sub> and SD<sub>RT</sub> were comparable. When we evaluated the reproducibility of the priming strategies, we found that different strategies were best for different genes. No single priming strategy outperformed the others. For CaV1D, oligo(dT) priming gave highest reproducibility, whereas for  $\beta$ -tubulin and GAPDH, gene-specific priming was optimal. For Glut2, the mixture of the five gene-specific primers gave the highest reproducibility, and for insulin II, random hexamers performed best. To test the significance of the determined SD, we calculated the covariance between samples and gene expression and found it to be negligible.

#### ACCURACY OF MRNA QUANTIFICATION

The accuracy of the estimation of gene expression can be improved by running samples in replicate and averaging the measurement results. Because mRNA quantification is performed in two steps, reverse transcription and QPCR,

repeats can be done at either one or both steps. When designing experiments, one should consider the experimental accuracy of the two steps. Assuming that samples drawn from the target population are gaussian distributed, the true mRNA concentration ( $\mu$ ) is:

$$\mu = \bar{x} \pm \frac{tSD_{mRNA}}{\sqrt{n}} \quad (1)$$

where  $\bar{x}$  is the estimated mRNA concentration calculated as the mean of  $n$  measurements with standard deviation ( $SD_{mRNA}$ ), for a particular confidence ( $t$ ) (16). Rearranging Eq. 2 and substituting with the sampling error ( $\epsilon = \mu - \bar{x}$ ) gives:

$$\epsilon^2 = \frac{t^2SD_{mRNA}^2}{n} \quad (2)$$

where  $SD_{mRNA}^2$  and  $\epsilon^2$  are both expressed as either absolute uncertainties or relative uncertainties. Because both the reverse transcription and QPCR steps contribute to experimental variation, Eq. 3 may be rewritten:

$$\epsilon = t \left( \frac{SD_{RT}^2}{n_{RT}} + \frac{SD_{QPCR}^2}{n_{QPCR}} \right)^{1/2} \quad (3)$$

$n_{RT}$  and  $n_{QPCR}$  are the total number of replicates in the reverse transcription and QPCR steps, respectively. The samples can be divided into  $D_{RT}$  ( $D_{RT} = n_{RT}$ ) aliquots before the reverse transcription step to improve the estimation of the cDNA synthesis yield and into  $D_{QPCR}$  aliquots ( $n_{QPCR} = D_{QPCR} \cdot D_{RT}$ ) before the PCR step to improve the estimation of cDNA amplification efficiency. The variation between identical runs in QPCR (intraassay variation) was  $<0.12$  Ct for all genes but *Glut2*.

Although PCR is a cyclic reaction that accumulates errors, its reproducibility is significantly higher than that of the single-step reverse transcription reaction (Table 1). Using Eq. 4, we could estimate the sampling error for different experimental setups. As an example, for *GAPDH* with random hexamer priming ( $SD_{QPCR} = 0.02$ ;  $SD_{RT} = 0.13$ ), the sampling error when we divided the test sample into aliquots before QPCR ( $D_{RT} = 1$  and  $D_{QPCR} = 4$ ) was 0.30. If instead the samples were divided into aliquots before reverse transcription ( $D_{RT} = 4$  and  $D_{QPCR} = 1$ ), the sampling error was only 0.17. Hence, experimental accuracy was two times higher when the test sample was split into aliquots before the reverse transcription reaction than when it was split before the QPCR. The examples in Fig. 1 show how sampling error depends on

experimental design for the different cases of four QPCR aliquots. In general, experimental accuracy is higher when samples are split into aliquots before rather than after the reverse transcription step. The only circumstance in which splitting samples after reverse transcription appears to be advantageous is when  $SD_{QPCR}$  is greater than  $SD_{RT}$  and cost is an issue.

#### DYNAMIC RANGE OF REVERSE TRANSCRIPTION

QPCR analysis has in several studies been shown to have a large dynamic range (17, 18). For quantitative gene expression analysis, the yield of reverse transcription must also be independent of template amount. This was the focus of the present study.

The amount of mRNA as determined by reverse transcription-QPCR analyses is given by:

$$n_{Ct} = \eta \cdot n_0(1 + E)^{Ct - 1} \quad (1)$$

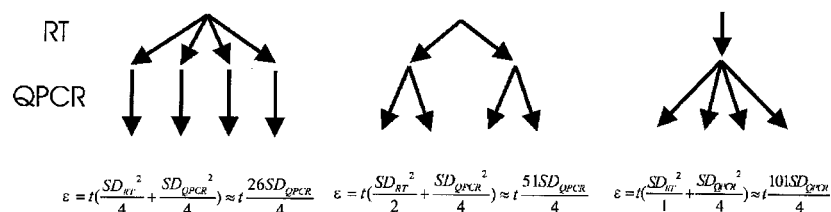
where  $n_{Ct}$  is the number of cDNA molecules after  $Ct$  amplification cycles,  $E$  is the PCR efficiency,  $n_0$  is the number of target mRNA molecules, and  $\eta$  is the reverse transcription efficiency defined as the fraction of mRNA molecules that are converted to cDNA in the reverse transcription reaction. The exponent in Eq. 5 is  $Ct - 1$  and not  $Ct$ , as in the case of regular QPCR (2, 3), because reverse transcription generates single-stranded cDNA that is copied to double-stranded template in the first PCR cycle. For  $n_{Ct}$  to correctly reflect the amount of mRNA,  $\eta$  must be independent of both the total RNA and target mRNA concentrations. This is generally assumed but rarely verified. We studied the dynamic range of reverse transcription using the setup shown in Fig. 2 on the online Data Supplement. A RNA stock solution (1024 ng of total RNA) was diluted in steps of 4 with either water or yeast tRNA, which kept the total RNA concentration constant. cDNA was synthesized with use of either random hexamers or oligo(dT) priming, and the samples were PCR-amplified. The  $Ct$  values of the amplification curves of the samples serially diluted with tRNA decreased linearly with dilution factor (Fig. 2), giving the constant  $\eta$  (Eq. 1). This was not the case for the samples diluted in water; for these samples, plots of  $Ct$  vs total RNA concentration were curved, and the most dilute samples gave no specific signal at all.

#### Discussion

In recent years real-time PCR- and cDNA microarray-based assays have been developed for molecular diagnos-

Fig. 1. Experimental setups that give four QPCR aliquots ( $n_{QPCR} = 4$ ).

From left to right, the samples were divided into four aliquots before reverse transcription ( $D_{RT} = 4$ ;  $D_{QPCR} = 1$ ), into two aliquots both before and after reverse transcription ( $D_{RT} = 2$ ;  $D_{QPCR} = 2$ ), and into four aliquots after reverse transcription ( $D_{QPCR} = 4$ ). Sampling error was calculated assuming  $SD_{RT} = 5(SD_{QPCR})$ .



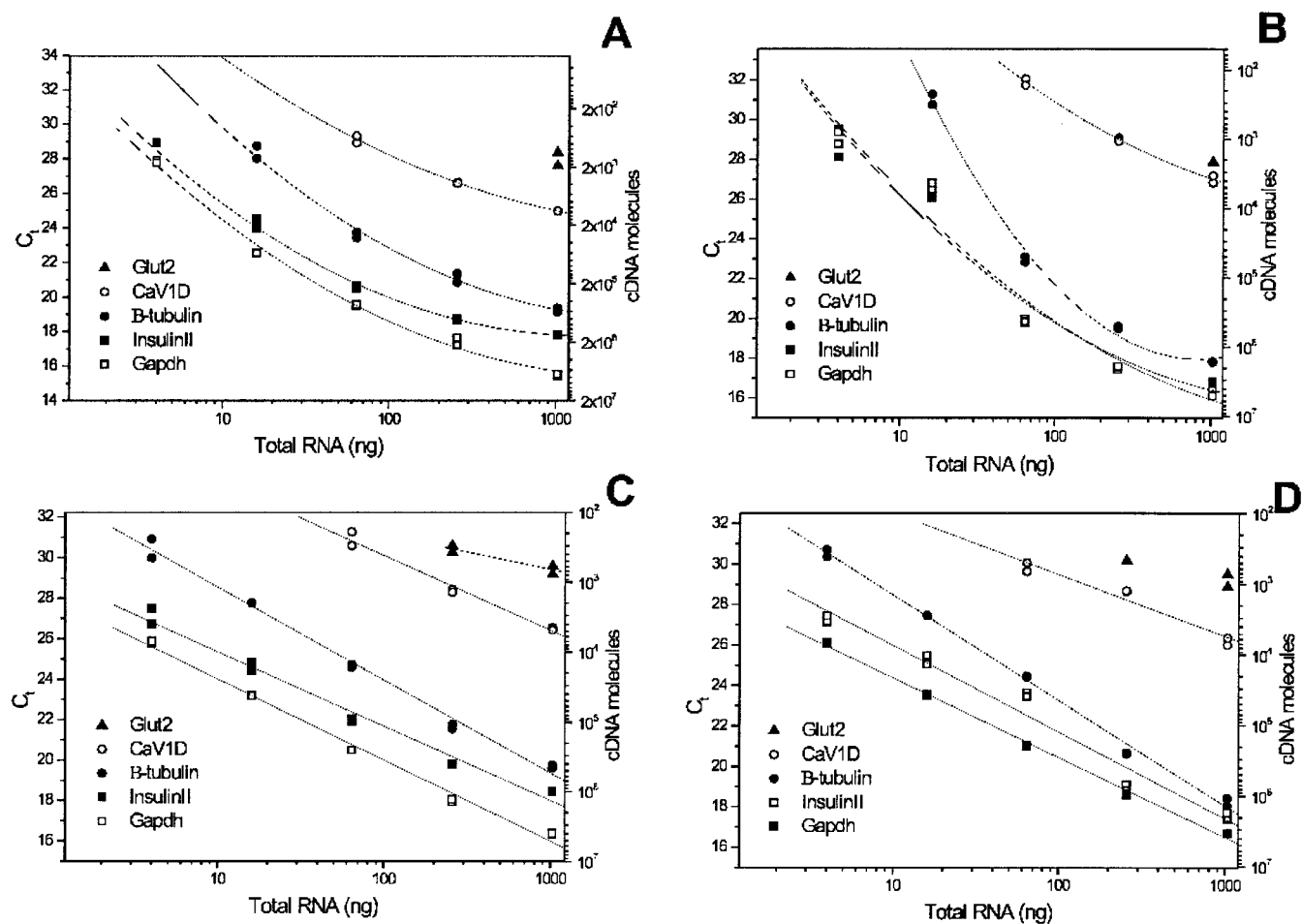


Fig. 2. Ct values determined by QPCR of cDNA produced by reverse transcription from RNA dilution series.

Samples were reverse transcription-primed with either random hexamers (A and C) or oligo(dT) (B and D). RNA samples were diluted with either water (A and B) or yeast tRNA (C and D). Ct values  $>32$  are excluded because these reactions produced mainly nonspecific products. Data points are fitted to a second-order polynomial in A and B and to straight lines in C and D. The *fit lines* serve only as visual guides. Initial amounts of cDNA molecules, estimated by QPCR assays of purified PCR products whose concentrations were determined spectrometrically (36), are indicated in logarithmic scale on the *right-hand y axis*. Ct values are shown on the *left-hand y axis*.

tics (19–22) and for transcriptional profiling (23, 24). Some tests are already used in clinical practice, but before these methods can reach their full capacity, all technical steps, including sampling, RNA isolation, reverse transcription, cDNA quantification, and data analysis, must be carefully optimized and validated (25). We therefore studied the reproducibility, dynamic range, specificity, and sensitivity of the reverse transcription reaction.

The experimental reproducibility of QPCR, as manifested by the low SD of Ct values, is usually very high for common detection chemistries such as SYBR Green I (3), TaqMan probes (12), LightUp probes (2), and Molecular Beacons (26). Only when the number of cDNA molecules is low does  $SD_{QPCR}$  increase as a result of interfering primer–dimer formation and statistical effects (15, 27). In the present study, primer–dimer formation was observed only in samples with Ct values  $>32$ . A Ct of 32 corresponds, under our conditions (SYBR Green I detection in LightCycler), to  $\sim 100$  cDNA molecules, which is where statistical effects start to become significant. Of the five

genes studied Glut2 had the highest Ct values with the lowest reproducibility (Tables 1 and 2). In a control experiment, larger amounts of Glut2 template were found to give Ct values as reproducible as the other QPCR assays [ $SD_{QPCR}(\text{Glut2}) = 0.065$ ]. Evidently, the poor quality of Glut2 data can be ascribed to low amounts of Glut2 cDNA. This in turn may be attributable to a low abundance of Glut2 mRNA or low reverse transcription yields for Glut2. Because all priming strategies gave rather high Ct values for Glut2 (Table 2), it is likely that the samples contained little Glut2 mRNA.

In general, when false primers were used, reverse transcription yields were higher than for the negative controls in which no primer was used (Table 2 in the online Data Supplement). This means that the false primers nonspecifically prime the reverse transcription reaction. Interestingly, the negative controls, which contained all reverse transcription components but no primers, gave some reverse transcription products. Evidently, reverse transcription can be primed by other RNA molecules

present in the sample or perhaps by dNTPs (28). The lower assay temperature for reverse transcription compared with PCR is likely to contribute to the low degree of sequence specificity in the priming event. This problem may be overcome by use of thermostable reverse transcriptases. Primer hybridization relies on access to the appropriate target site in the mRNA and may vary substantially because of mRNA folding (29, 30). In general, a higher reverse transcription annealing temperature improves reverse transcription yields by reducing formation of mRNA secondary structures (7, 8).

Our results clearly show that the Ct of a reverse transcription-QPCR assay depends not only on the amount of target mRNA but also on the total RNA concentration (Fig. 2). We speculate this is attributable to adsorption artifacts that can be eliminated, or at least reduced, by the addition of carrier nucleic acids. We showed that yeast tRNA can be used as carrier, but other polymers, such as linear polyacrylamide, also work well (data not shown).

Gene expression measurements are usually performed as relative measurements (3, 11, 12, 31). Most experimental strategies compare the expression of target genes with the expression of nonregulated reference genes (32). In some cases it has been possible to use the relative expression of two reporter genes as an indicator (2, 33). Calculating the expression ratios, estimated as  $(1 + E)^{Ct_{\text{gene 1}}}/(1 + E)^{Ct_{\text{gene 2}}}$  (3) for any two of the five genes studied here, we found that it depends on the priming strategy. For example, the expression of  $\beta$ -tubulin relative to Glut2 is  $1.91^{27.5}/1.79^{19.5} = 628$  when measured with use of random hexamers to prime reverse transcription and  $1.91^{31.8}/1.79^{18.8} = 15200$  when gene-specific reverse transcription primers were used. Hence, the expression ratio of the two genes differs  $15200/628 = 24$ -fold when measured with use of two different priming strategies. Clearly, one cannot compare relative gene expression measurements performed under different priming conditions. In fact, it may even be uncertain to compare relative gene expression measurements performed with different batches of random hexamers or oligo(dT) because of batch-to-batch variation. Relative measurements of expression ratios, i.e., comparing the expression of genes in different samples, are possible by compensating for sample-to-sample variation in PCR efficiency by, for example, in situ calibration (2) or kinetic PCR (34, 35). Absolute measurements of expression ratios, i.e., comparing the expression of two genes in a single sample, are not meaningful because of variation in reverse transcription yield unless the experimental system is properly calibrated by use of external standards.

In conclusion, we show that experimental variation in reverse transcription-QPCR is mainly attributable to the reverse transcription step. The efficiency of the reverse transcription reaction depends on the priming strategy and also varies among different genes. The efficiency also

depends on total RNA concentrations. When performing gene expression measurements by reverse transcription-QPCR we recommend (a) extensive optimization of the reverse transcription reaction, (b) running the experiment in at least duplicate starting with the reverse transcription step, (c) adjusting the total RNA concentrations to be the same in all samples by adding carrier, and (d) always using the same reverse transcription priming strategy and reaction conditions in experiments that are to be compared.

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## References

1. Yuen T, Wurmbach E, Pfeffer RL, Ebersole BJ, Sealfon SC. Accuracy and calibration of commercial oligonucleotide and custom cDNA microarrays. *Nucleic Acids Res* 2002;30:E48.
2. Ståhlberg A, Åman P, Ridell B, Mostad P, Kubista M. Quantitative real-time PCR method for detection of B-lymphocyte monoclonality by comparison of  $\kappa$  and  $\lambda$  immunoglobulin light chain expression. *Clin Chem* 2003;49:51–9.
3. Pfaffl MW. A new mathematical model for relative quantification in real-time RT-PCR. *Nucleic Acids Res* 2001;29:E45.
4. You H, Eastman PS, Wang BB, Minor J, Doctolero MH, Nuttall RL, et al. An evaluation of the performance of cDNA microarrays for detecting changes in global mRNA expression. *Nucleic Acids Res* 2001;29:E41.
5. Polumuri SK, Ruknudin A, Schulze DH. RNase H and its effects on PCR. *Biotechniques* 2002;32:1224–5.
6. Mayers TW, Gelfand DH. Reverse transcription and DNA amplification by *Thermus thermophilus* DNA polymerase. *Biochem* 1991;30:7661–6.
7. Brooks EM, Sheflin LG, Spaulding SW. Secondary structure in the 3'UTR of EGF and the choice of reverse transcriptases affect the detection of message diversity by RT-PCR. *Biotechniques* 1995;19:806–15.
8. Kuo KW, Leung M, Leung WC. Intrinsic secondary structure of human TNFR-I mRNA influences the determination of gene expression by RT-PCR. *Mol Cell Biochem* 1997;177:1–6.
9. Krug MS, Berger SH. First-strand cDNA synthesis primed with oligo(dT). *Methods Enzymol* 1987;152:316–7.
10. Lekanne Deprez RH, Fijnvandraat AC, Ruijter JM, Moorman AFM. Sensitivity and accuracy of quantitative real-time polymerase chain reaction using SYBR green I depends on cDNA synthesis conditions. *Anal Chem* 2002;307:63–9.
11. Bustin SA. Quantification of mRNA using real-time reverse transcription PCR (RT-PCR): trends and problems. *J Mol Endocrinol* 2002;29:23–39.
12. Bustin SA. Absolute quantification of mRNA using real-time reverse transcription polymerase chain reaction assays. *J Mol Endocrinol* 2000;25:169–93.
13. Hanahan D. Heritable formation of pancreatic  $\beta$ -cell tumours in transgenic mice expressing recombinant insulin/simian virus 40 oncogenes. *Nature* 1985;315:115–22.
14. Wittwer CT, Herrmann MG, Moss AA, Rasmussen RP. Continuous fluorescence monitoring of rapid cycle DNA amplification. *Biotechniques* 1997;22:130–8.

15. Peccoud J, Jacob C. Theoretical uncertainty of measurements using quantitative polymerase chain reaction. *Biophys J* 1996;71:101–8.
16. Harvey D. *Modern analytical chemistry*, 1st ed. New York: McGraw-Hill, 2000:179–225,705–21.
17. Klein D. Quantification using real-time PCR technology: applications and limitations. *Trends Mol Med* 2002;8:257–60.
18. Teo IA, Choi JW, Morlese J, Taylor S, Shaunak S. LightCycler qPCR optimization for low copy number target DNA. *J Immunol Methods* 2002;270:119–33.
19. Bernard PS, Wittwer CT. Real-time PCR technology for cancer diagnostics. *Clin Chem* 2002;48:1178–85.
20. Chung CH, Bernard PS, Perou CM. Molecular portraits and the family tree of cancer [Review]. *Nat Genet* 2002;32(Suppl):533–40.
21. Bijwaard KE, Aguilera NSI, Monczak Y, Trudel M, Taubenberger JK, Lichy JH. Quantitative real-time reverse transcription-PCR assay for cyclin D1 expression: utility in the diagnosis of mantle cell lymphoma. *Clin Chem* 2001;47:195–201.
22. de Kok JB, Ruers TJM, van Muijen GNP, van Bokhoven A, Willems HL, Swinkels DW. Real-time quantification of human telomerase reverse transcriptase mRNA in tumors and healthy tissues. *Clin Chem* 2000;46:313–8.
23. Gerhold DL, Jensen RV, Gullans SR. Better therapeutics through microarrays [Review]. *Nat Genet* 2002;32(Suppl):547–52.
24. Hui CH, Goh KY, White D, Branford S, Grigg A, Seymour JF, et al. Successful peripheral blood stem cell mobilization with filgrastim in patients with chronic myeloid leukaemia achieving complete cytogenetic response with imatinib, without increasing disease burden as measured by quantitative real-time PCR. *Leukemia* 2003;17:821–8.
25. Soong R, Ladanyi A. Improved indicators for assessing the reliability of detection and quantification by kinetic PCR [Technical Brief]. *Clin Chem* 2003;49:793–6.
26. Yang JH, Lai JP, Douglas SD, Metzger D, Zhu XH, Ho WZ. Real-time RT-PCR for quantitation of hepatitis C virus RNA. *J Virol Methods* 2002;102:119–28.
27. Morrison TB, Weis JJ, Wittwer CT. Quantification of low-copy transcripts by continuous SYBR Green I monitoring during amplification. *Biotechniques* 1998;24:954–62.
28. Agranovsky A. Exogenous primer-independent cDNA synthesis with commercial reverse transcriptase preparations on plant virus RNA templates. *Anal Biochem* 1992;203:163–5.
29. Southern EM, Kalim UM. Determining the influence of structure on hybridization using oligonucleotide arrays. *Nat Biotechnol* 1999;17:788–92.
30. Sohail M, Southern EM. Hybridization of antisense reagents to RNA. *Curr Opin Mol Ther* 2000;2:264–71.
31. Pfaffl MW, Horgan GH, Dempfle L. Relative expression software tool (REST) for group-wise comparison and statistical analysis of relative expression results in real-time PCR. *Nucleic Acids Res* 2002;30:E38.
32. Vandesompele J, Preter KD, Pattyn F, Poppe B, van Roy N, de Paepe A, Speleman F. Accurate normalization of real-time quantitative RT-PCR data by geometric averaging of multiple internal control genes. *Genome Biol* 2002;3:resesarch0034.
33. Niki T, Iba S, Tokunou M, Yamada T, Matsuno Y, Hirohashi S. Expression of vascular growth factors A, B, C, and D and their relationships to lymph node status in lung adenocarcinoma. *Clin Cancer Res* 2000;6:2431–9.
34. Bar T, Ståhlberg A, Muszta A, Kubista M. Kinetic outlier detection (KOD) in real-time PCR. *Nucleic Acids Res* 2003;31:E105.
35. Tichopad A, Dilger M, Schwarz G, Pfaffl M. Standardized determination of real-time PCR efficiency from a single reaction set-up. *Nucleic Acids Res* 2003;31:E122.
36. Gallagher SR. Quantitation of DNA and RNA with absorption and fluorescence spectroscopy. In: Ausubel FM, Brent R, Kingston R, Moore DD, Seidman JG, Smith J A, Struhl K, eds. *Current protocols in molecular biology*. New York: John Wiley & Sons, Inc., 2000: A.3D.2pp.