NADH-dependent biosensor in *Saccharomyces cerevisiae*: principle and validation at the single cell level

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Abstract

A reporter system was constructed to measure perturbations in the NADH/NAD\(^+\) co-factor balance in yeast, by using the green fluorescent protein gene under the control of the GPD2 promotor that is induced under conditions of excess of NADH. High fluorescence levels were obtained in a glycerol 3-phosphate dehydrogenase double deletion strain (\(gpd1\Delta gpd2\Delta\)), which is deficient in the ability to regenerate NAD\(^+\) via glycerol formation. The responsiveness of the reporter system to externally induced perturbations in NADH oxidation was also evaluated in the \(gpd1\Delta gpd2\Delta\) strain background by addition of acetoin, as well as by introduction of a set of heterologous xylose reductases (XRs) having different selectivities for NADH. Addition of acetoin during cell proliferation under oxygen-limited conditions resulted in a more than 2-fold decrease in mean fluorescence intensity as compared to the control experiment. Strains carrying XRs with different selectivities for NADH could be distinguished at the single cell level, so that the XR with the highest selectivity for NADH displayed the lowest fluorescence. In conclusion, the designed system successfully allowed for monitoring perturbations in the cellular redox metabolism caused by environmental changes, or by heterologous gene expression. The reporter system displayed high resolution in distinguishing cytosolic NADH oxidation capacity and hence has potential to be used for high-throughput screening based on the fluorescence of single cells.

Keywords: *Saccharomyces cerevisiae*; Redox balance; NADH biosensor; Single cell analysis

Introduction

The relative concentrations of NADH/NAD\(^+\) redox couple determine the thermodynamic feasibility of more than 100 reactions in cellular metabolism which places it at the core of the metabolic network of every organism including *Saccharomyces cerevisiae* (Förster et al. 2003). Efficient tools to measure the impact of redox enzymes or environmental perturbations on the cellular NADH levels are therefore needed (Murray et al. 2011). However quantification of redox couples in cells is complicated by several factors: the NADH and NAD\(^+\) are compartmentalized in *S. cerevisiae* and the cofactors are to a large extent in a protein bound form (Veech et al. 1969; Bücher et al. 1972). Fluorescence imaging enables the distinction between free and bound redox couples, but not between NADH and NADPH (Zhang et al. 2002). In mammalian cells, coupled enzymatic reactions have been used to determine the ratio between the cofactors NADH/NAD\(^+\) (Williamson et al. 1967; Theobald et al. 1997). A similar approach has been applied for *S. cerevisiae* where mannitol-1-phosphate 5-dehydrogenase (M1PDH) was introduced and the cytosolic free NADH/NAD\(^+\) ratio was determined by the ratio between fructose-6-phosphate (F6P) and mannitol-1-phosphate (M1P) and the equilibrium constant for the reaction M1P + NAD\(^+\) ↔ F6P + NADH + H\(^+\) (Canelas et al. 2008). The approaches are however often tedious and not applicable for high-throughput screening.

In *S. cerevisiae*, the cytosolic enzyme glycerol-3-phosphate dehydrogenase (GPD) 2 encoded by the GPD2 gene plays a central role in redox metabolism. Under anaerobiosis, GPD2 expression increases as the need for cytosolic reoxidation of NADH increases because Gpd2p acts as redox sink via the NADH-coupled reduction of dihydroxyacetone phosphate (DHAP) to glycerol 3-phosphate (G3P). G3P is further converted to
glycerol (Eriksson et al. 1995; Ansell et al. 1997). The need for NADH reoxidation is thought to be linked, indirectly or indirectly, to the NADH/NAD⁺ ratio (Ansell et al. 1997). Glycerol production can also be initiated by the isoenzyme Gpd1p encoded by GPD1. However, Gpd1p and Gpd2p are expressed under different growth conditions, as illustrated by their different cellular localization (Valadi et al. 2004). The physiological role of Gpd1p is also different from that of Gpd2p as GPD1 is induced under osmotic stress (Blomberg and Adler 1989). Although the genes can complement each other’s functions, a double deletion renders the yeast cell osmosensitive as well as incapable of anaerobic growth, due to the inability to reoxidize cytosolic NADH arising from biomass formation (van Dijken and Scheffers 1986; Nissen et al. 1997).

We used this knowledge to design a GFP-based biosensor for cytosolic NADH/NAD⁺ levels by coupling the GPD2 promoter (GPD2p) to the yEGFP3 gene encoding yeast enhanced green fluorescent protein, an established yeast reporter of the GFP class 2 (Cormack et al. 1996; Cormack et al. 1997; Zacharias and Tsien 2005). The applicability of fluorescent proteins as reporters has previously been demonstrated through the measurement of various user-specified cell properties. For example, GFP has been used for protein localization (Valadi et al. 2004), intracellular pH measurement (Valkonen et al. 2013), for monitoring cell growth mode and cell membrane robustness (Carlquist et al. 2012). Dardalhon et al. (2012) also implemented a fluorescent glutathione redox reporter in S. cerevisiae using a yellow fluorescent protein sensor that reports on the nuclear and cytosolic glutathione redox state i.e the glutathione/glutathione disulfide (GSH/GSSG) state, which is NADPH dependent.

The functionality of the NADH/NAD⁺-ratio biosensor developed in this work was first evaluated by introducing it into S. cerevisiae strains with reduced NADH reoxidation capacity due to the deletion of Gpd1,2p encoding genes. The biosensor potential was then validated by evaluating the impact on cell fluorescence of acetoin production, as illustrated by their different cellular localization (Valadi et al. 2004). The physiological role of Gpd1p and Gpd2p are expressed under different growth conditions, as illustrated by their different cellular localization (Valadi et al. 2004). The physiological role of Gpd1p is also different from that of Gpd2p as GPD1 is induced under osmotic stress (Blomberg and Adler 1989). Although the genes can complement each other’s functions, a double deletion renders the yeast cell osmosensitive as well as incapable of anaerobic growth, due to the inability to reoxidize cytosolic NADH arising from biomass formation (van Dijken and Scheffers 1986; Nissen et al. 1997).

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### Methods

#### Strains

*S. cerevisiae* strains used in the study are summarized in Table 1. *Escherichia coli* NEB 5α (New England BioLabs, Ipswich, MA, USA) was used for subcloning. All strains were stored in 20% glycerol at -80°C. Yeast cells from freshly streaked YNB plates (6.7 g/L yeast nitrogen base without amino acids, 20 g/L glucose, 2% agar) were used for all cultivations.

| Strains and plasmids | Relevant features | Reference |
|----------------------|------------------|-----------|
| YIpplac211 | URA3 | (Gietz and Sugino 1988) |
| p424 | TRP1 Mumberg vector | (Mumberg et al. 1995) |
| P425 | LEU2 Mumberg vector | (Mumberg et al. 1995) |
| YEpplacHXT | URA3 | (Karhunma et al. 2005) |
| pYGF3 | URA3 ADH1p-yEGFP3-ADH1t | (Cormack et al. 1997) |
| YplK01 | HIS3 GPD2p-yEGFP3-PGK1t | This study |
| YEpK01 | URA3 GPD2p-yEGFP3-PGK1t | This study |
| YlpOB8 | URA3 TDH3p-XYL1-ADH1t PGK1p-XYL2-PGK1t | This study |
| YlpDR7 | URA3 TDH3p-XYL1(N272D)-ADH1t PGK1p-XYL2-PGK1t | (Bengtsson et al. 2009) |
| YlpCR01 | URA3 TDH3p-XYL1-ADH1t | (Runquist et al. 2010) |
| YlpCR03 | URA3 TDH3p-XYL1 (N272D)-ADH1t | This study |

| S. cerevisiae strains | MAAta ura3-52 trp1-289 leu2-3, 112 his3A4 4 MAL2-8C SUC2 | EUROSCARF |
|----------------------|-------------------------------------------------|-----------|
| CEN.PK113-7D | MAAta, MAL2-S’- SUC2 | EUROSCARF |
| TMB4120 | CEN.PK2-1C YEpJK01 trp1:: TRP1 leu2-2a LEU2 his3::HIS3 | This study |
| TMB4121 | CEN.PK2-1C YEpJK01 gpd1:: TRP1 leu2-2a LEU2 his3::HIS3 | This study |
| TMB4122 | CEN.PK2-1C YEpJK01 gpd1:: TRP1 gpd2 leu2-2a LEU2 his3::HIS3 | This study |
| TMB4123 | CEN.PK2-1C YEpJK01 gpd1:: TRP1 gpd2 leu2-2a LEU2 his3::HIS3 | This study |
| TMB4132 | CEN.PK2-1C his3::YipJK01 trp1::TRP1 leu2-2a LEU2 ura3 | This study |
| TMB4133 | CEN.PK2-1C trp1::TRP1 gpd1::gpd2 leu2-2a LEU2 ura3 | This study |
| TMB4140 | TMB4132 ura3::Yipplac211 | This study |
| TMB4141 | TMB4132 ura3::YlpCR01 | This study |
| TMB4143 | TMB4132 ura3::YlpCR03 | This study |
| TMB4144 | TMB4133 ura3::Yipplac211 | This study |
| TMB4145 | TMB4133 ura3::YlpCR01 | This study |
| TMB4147 | TMB4133 ura3::YlpCR03 | This study |

### Molecular biology methods

Plasmid DNA was prepared using the GeneJET Plasmid Miniprep Kit (Thermo Scientific, USA). Restriction and modification enzymes as well as T4 DNA ligase were obtained from the same manufacturer. The QIAquick gel extraction kit (Qiagen, Hilden, Germany) was used for DNA extractions from agarose. All nucleotides were ordered at Eurofins (Germany). All genetic constructs were
checked by sequencing (Eurofins, Germany). The primers
used in the study are listed in Table 2.

Competent cells of E. coli NEB 5α were prepared and
transformed by the method of Inoue et al. (1990) and
yeast transformations were performed using the lithium
acetate method (Gietz and Woods 2002). The cells were
streaked out on selective medium afterwards. E. coli
transformants were selected on Lysogen Broth (LB) plates
(Sambrook and Russell 2001) with 50 μg/ml ampicillin
(IBI Shelton Scientific, Shelton, USA). S. cerevisiae trans-
formants were selected on YNB plates supplemented with
the requested amino acids or base.

Construction of deletion and insertion cassettes
The GPD1 deletion cassette was constructed by joining
three PCR fragments through overlap extension PCR
(Sandström et al. 2012). A nucleotide fragment homolo-
gous to the upstream region of GPD1 was PCR amplified

Table 2 Primers used in the present study

| Name                | Description                                      | Sequence                                           |
|---------------------|--------------------------------------------------|----------------------------------------------------|
| TRP1_gpd1Over_f     | Forward primer for amplification of TRP1 (p424 as template) with GPD1 overhangs | TCCACAACACAAAAATTGATAATAATAAAGAACGACATT ACTATATATATATAG |
| TRP1_gpd1Over_r     | Reverse primer for amplification of TRP1 (p424 as template) with GPD1 overhangs | AGTATGATATGTATATTTTCTCCTAATAAACGAGTGCACTAC |
| TRP1_gpd1_veri_f    | Amplification of the 5’ region of GPD1 (CEN.PK113-7D as template) | TCCATCCTACATTCGTGTTG |
|                     | + Verification of GPD1 deletions                 |                                                    |
| 5-OEGpd1_r          | Amplification of the 5’ region of GPD1 (CEN.PK113-7D as template) | TATATATCAATAATTTGTTG |
| 3-OEGpd1_f          | Amplification of the 3’ region of GPD1 (CEN.PK113-7D as template) | TTTATGGAGAAGATAACATACATAC |
| 3-OEGpd1_r          | Amplification of the 3’ region of GPD1 (CEN.PK113-7D as template) | ATTTTCTTAGGAGCAGCAGAAAAATAC |
| TRP1_gpd1_veri_r    | Verification of GPD1 deletions                   | GAGGAACCTTTGTATATTCGCGC |
| LEU2_gpd2Over_f     | Forward primer for amplification of LEU2 (p425 as template) with GPD2 overhangs | TCCCTTTTCTCCTCCTTCTTATCTGACTACG TCGTAAAGCCG |
| LEU2_gpd2Over_r     | Forward primer for amplification of LEU2 (p425 as template) with GPD2 overhangs | GATCAGAGGGGGGGGGGGGGAGGTGTCAGAG |
| LEU2_gpd2OO_f       | Forward primer for nested PCR for adding homology regions to the GPD2 deletion cassette | GTATTTGTTGATACATCTCTCTCTCTCTTCC |
| LEU2_gpd2OO_r       | Reverse primer for nested PCR for adding homology regions to the GPD2 deletion cassette | AAATGGTGGGGGAAAGAGGCAAGAGGAAAGGATA |
| LEU2_gpd2Veri_f     | Verification of GPD2 deletions                   | CGGTGATCTTCTAAGATCGTC |
| LEU2_gpd2Veri_r     | Verification of GPD2 deletions                   | CTATGTGTCGAATCTATATAG |
| GPD2p_Xbal_r        | Cloning of GPD2 from CEN.PK113-7D               | TTCCTAGATTAGAAGAGGGGAAG |
| GPD2p_Sacl_f        | Cloning of GPD2 from CEN.PK113-7D               | TCGAGCTCCGAATGGTTGG |
| yEGFP_Xbal_f        | Cloning of yEGFP3 from pyEGFP3                 | AATCTAGAAGCATTAATAGGAAGG |
| yEGFP_Pst_r         | Cloning of yEGFP3 from pyEGFP3                 | TTCCTCGAGATTATGGACCTACATCCTAC |
| HIS3_flank_f        | Cloning of HIS3 - Forward primer                 | CCGATGTCGATGAAACAG |
| HIS3_flank_r        | Cloning of HIS3 - Reverse primer                 | GCTCAGTTGACCTAATAG |
| LEU2_flank_f        | Cloning of LEU2 - Forward primer                 | GTAATATACTATTTCTCATC |
| LEU2_r              | Cloning of LEU2 - Reverse primer                 | TTAAGCAAGGATATTCTAAC |
| TRP1_f              | Cloning of TRP1 - Forward primer                 | ATGTGATATATTTATAC |
| TRP1_r              | Cloning of TRP1 - Reverse primer                 | CATATTCTACATTAGG |
| Yipac211_f          | Cloning of GPD2p-yEGFP3-PSK1t                   | TTTCTCTGTTCTGTCG |
| Yipac211_r          | Cloning of GPD2p-yEGFP3-PSK1t                   | AAACTAGTATTATAGAATAG |
| HIS3_O_f            | Cloning of HIS3- expression cassette, for change of auxotrophic marker. | TTATATATACAGTTTCTCAGG |
| HIS3_O_r            | Cloning of HIS3-expression cassette, for change of auxotrophic marker. | GGAACGCAGATAATAGTCGTCAGTGCAGC |

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from genomic DNA of CEN.PK113-7D strain using the primer couple TRP1_gpd1_veri_f, 5-OEGpd1_r. The promoter, ORF and terminator of TRP1 were PCR amplified from a Mumberg p424 vector using the primers TRP1_gpd1Over_f, TRP1_gpd1Over_r. The downstream region of GPD1 was PCR amplified from genomic CEN. PK113-7D DNA using the primer couple 3-OEGpd1_f, 3-OEGpd1_r. The three fragments were all purified before being combined into one fragment using the nucleotides TRP1_gpd1Over_f, 3-OEGpd1_r.

The GPD2 deletion cassette was constructed by nested PCR on a PCR fragment containing the promoter, ORF and terminator of LEU2. The template fragment was constructed using the primers LEU2_gpd2Over_f, LEU2_gpd2Over_r. The fragment was purified and then used as template using the primers LEU2_gpd2OO_f, LEU2_gpd2OO_r. The added regions contained around 50 bp regions homologous to the upstream and downstream region of GPD2, respectively.

Expression cassettes for curing cryptophan, leucine and histidine auxotrophies were constructed using CEN. PK113-7D as a template and corresponding primer couples (TRP1_f, TRP1_r, LEU2_flank_f, LEU2_r and HIS3_flank_f, HIS3_flank_r, respectively) to PCR amplify the promoter, gene and terminator of the respective genes.

**Plasmid construction**

Plasmid YEpJK01 was constructed by ligation of three DNA fragments using T4 DNA ligase: 1) A 1.4 kb region directly upstream of the GPD2 ORF that was PCR amplified from CEN.PK113-7D genomic DNA using the primers GPD2p_XbaI_r and GPD2p_SacI_f, digested with SacI and XbaI and purified, 2). The yEGFP3 fragment that had been PCR amplified from pYGFP3, using the primers yEGFP_XbaI_r and yEGFP_PstI_f, digested with XbaI and PstI and finally purified, and 3) YEpPlacHXT digested with SacI and PstI. The ligation mix was used to transform E. coli.

Plasmid YIpJK01 was constructed by excision of the GPD2p-yEGFP3-PGK1t cassette from YEpJK01 plasmid using the restriction enzymes Spbl and SacI. The fragment was purified from agarose gel and ligated to YIpPlac211 plasmid that was previously digested with the same restriction enzymes. The auxotrophic marker of the resulting plasmid was changed from URA3 to HIS3 by PCR amplifying the entire plasmid except for the URA3 region. The amplification was done using the primers YIpPlac211_f, YIpPlac211_r. The fragment was then recombined with a PCR fragment containing a HIS3 expression cassette using the In-Fusion® HD Cloning Kit. The HIS3 cassette was obtained from CEN.PK113-7D genomic DNA using the nucleotides HIS3_O_f, HIS3_O_r. The primers were designed according to the In-Fusion® HD Cloning Kit guidelines. The entire YEpJK01 plasmid was transformed into E. coli.
incubated at 30°C. Fermentation was performed in biological duplicates. Substrate consumption and product formation values were determined from samples withdrawn during 72 h of fermentation.

**Analyses**

Samples for OD$_{600}$ were analyzed directly while samples for HPLC were kept at −20°C. Growth was monitored by measuring OD at 620 nm.

Xylose, galactose, glycerol, ethanol and xylitol were separated and quantified by high-pressure liquid chromatography (HPLC) (Waters, Milford, MA, USA). The compounds were separated with a HPX-87P (Bio-Rad, Hercules, CA, USA) ion exchange column. Separation was performed at 80°C, with H$_2$O as mobile phase at a flow rate of 0.6 mL/min. A refractive index detector (RID-6A; Shimadzu, Kyoto, Japan) was used for quantification.

A BD Accuri$^\text{TM}$ C6 (Becton-Dickinson, NJ, USA) was used for the evaluation of the redox biosensor in the different deletions strains. Fresh cells were used. Samples for flow cytometry were centrifuged for 1 min at 3000g and 4°C, and resuspended in saline solution. The impact of the reporter gene copy number on fluorescence heterogeneity was evaluated on a BD FACSort (Becton-Dickinson, NJ, USA) flow cytometer. Fresh cells were harvested at the late exponential phase. Evaluation of the biosensor responsiveness to redox perturbations by heterologous expression of NADH-dependent oxidoreductases was performed with a BD FACSaria III (Becton-Dickinson, NJ, USA) flow cytometer. Fresh cells were harvested at the late exponential phase. Events were recorded with a rate of approximately 1,000 events per second. Excitation wavelength for the lasers used was 488 nm. Fluorescence emission levels were measured using a band pass filter at 530/30 nm (FI). Processing and analysis of flow cytometry raw data was performed by using MatLab'R2010b (The MathWorks, Inc, Natick, MA, USA). The measurement files, exported as fcs files by the flow cytometer FACSaria III, were imported into MATLAB, using a “fcs data reader” routine (by L. Balkay, University of Debrecen, Hungary), available on MATLAB W File Exchange website.

**Results**

**Construction and evaluation of the redox biosensor**

In order to construct a biosensor that responds to cytosolic NADH/NAD$^+$ ratio, a 1.4 kb region upstream of the $GPD2$ open reading frame that includes the whole $GPD2$ promoter region (Eriksson et al. 1995), was cloned 18 bp upstream of the start codon of the $yEGFP3$ gene (Cormack et al. 1997). The resulting $GPD2p$-$yEGFP3$ expression cassette was introduced in the multicopy vector YEplacHXT generating plasmid YEpJK01. The YEpJK01 plasmid was then introduced into a control laboratory strain as well as in redox engineered strains carrying either single or double deletion of $GPD1$ and $GPD2$ genes, thereby generating strains TMB4120 (control), TMB4121 ($gpd1\Delta$), TMB4122 ($gpd2\Delta$) and TMB4123 ($gpd1\Delta gpd2\Delta$).

Strains were cultivated in batch mode under oxygen-limited conditions for 5 hours in defined mineral medium with glucose as sole carbon source, after which the FI was measured (Figure 1). At this time point, cells were in exponential growth phase and could be considered as being in pseudo-steady state with regards to regulation of

![Figure 1 mean fluorescence intensities (FI) for the different strains (wild type, gpd1Δ, gpd2Δ and gpd1Δgpd2Δ) carrying either the multicopy (YEp)- or the integrative (Yip)-based GFP reporter. Fluorescence intensities are given in linear values. All values are normalized to the control strain TMB4120 carrying YEp-based GFP reporter. Acetoin was added at a concentration of 0.5 g/L.](image-url)
the glucose catabolic pathways. All redox engineered strain had higher FI than the control strain TMB4120. However the double deletion strain TMB4123 (gpd1Δ gpd2Δ) had the highest FI (21.5 fold higher than the control), whereas each single deletion had moderate increase in FI (1.5 and 1.2 fold for gpd1Δ and gpd2Δ, respectively) (Figure 1). To further evaluate the biosensor responsiveness to perturbations in NADH/NAD⁺ ratio, the FI of TMB4123 (gpd1Δ gpd2Δ) was measured after addition of acetoin (3-hydroxy-2-butanone) during respiro-fermentative growth under oxygen-limited conditions. Acetoin is an alternative redox sink to the glycerol shunt/pathway through its NADH-dependent conversion to 2,3-butanediol (Bruinenberg et al. 1983; Björkqvist et al. 1997). The reaction is catalyzed by a NADH-dependent 2,3-butanediol dehydrogenase encoded by BDH1 (Gonzalez et al. 2000). Indeed the addition of acetoin led to reduced FI as the relative fluorescence decreased from 21.5 to 8.0 (Figure 1). Altogether our results demonstrated that the constructed biosensor reported on the cells capacity to oxidize NADH, and more generally on the NAD(H) cofactor balance.

Impact of the reporter gene copy number on fluorescence intensity and heterogeneity
To investigate the impact of the copy number of the reporter gene yEGFP3 and only relate the expression level to the transcription step, the reporter cassette was also transferred to an integrative vector (YIp) and introduced into the same control and gpd1Δ gpd2Δ strain backgrounds, generating strains TMB4140 (control) and TMB4144 (gpd1Δ gpd2Δ). Strains were cultivated in shake flasks with YNB media and 2% glucose and FI was recorded. Similar trend was observed as for the YEp based reporter constructs. But the FI levels were lower, with strain TMB4140 (control- YIp) only emitting 4% of the FI signal of TMB4120 (control- YEp). However, a clear difference in FI was again observed between the wild type and the double mutant, as TMB4144 (gpd1Δ gpd2Δ- YIp) displayed 21.5 fold higher FI than its corresponding control TMB 4140 (Figure 1). Also the heterogeneity of the fluorescence signal that can be measured by the standard deviation of the population was lower in the YIp system (Figure 2). Standard deviations of 44 was measured in TMB 4144 (gpd1Δ gpd2Δ- YIp) whereas a standard deviation of 172 was obtained in TMB4123 (gpd1Δ gpd2Δ- YEp). Thus, to reduce the influence of gene copy number and plasmid replication kinetics on FI output in the population, further experiments were performed using the YIp based sensor.

Evaluation of the biosensor responsiveness to redox perturbations by heterologous expression of NADH-dependent oxidoreductases
The potential of the GPD2p-yEGFP3 redox biosensor to differentiate between reductases having different selectivities for NADH was also tested. For this purpose, two NAD(P)H-dependent xylose reductases (XR)s that reduces
xylose to xylitol using NADPH and NADH as cofactor were utilized: *Pichia stipitis* XR (wtXR) and the corresponding N272D mutant (mutXR) that display NADH/NADPH selectivity ratios of 0.04 and 0.80, respectively (Runquist et al. 2010). Both the non-engineered and the gpd1Δ gpd2Δ yeast backgrounds were chosen as hosts as they represent the two redox extremes i.e. the strain with the best ability to reoxidize cytosolic NADH and the one with the poorest. The Ylp-based reporter and XR constructs were introduced in these strains generating strains TMB4140 (control, no XR), TMB4141 (control, wtXR), TMB4143 (control, mutXR), TMB4144 (gpd1Δgpd2Δ, no XR), TMB4145 (gpd1Δgpd2Δ, wtXR) and TMB4147 (gpd1Δgpd2Δ, mutXR).

Strains were cultivated under oxygen-limited conditions in sealed vials containing minimal medium with galactose as the carbon source and xylose as the substrate for the XR-catalysed reduction. Galactose was used because *S. cerevisiae* has a specific galactose uptake system, Gal2p (Cirillo 1968) that also transports xylose, and whose expression benefits xylose utilization (Johnston 1987; Hamacher et al. 2002). So, even though the yeast does not metabolize galactose as fast as glucose, the use of galactose allows the cell to have co-consumption of hexose and xylose (Bro et al. 2005; Garcia Sanchez et al. 2010). The growth profiles of the different strains are shown in Figures 3A and B. During the first 24 hours, gpd1Δ gpd2Δ strains reached an OD of around 3, which was only slightly lower than the corresponding control strains. During the next 48 hours, however, TMB4147 strain (gpd1Δ gpd2Δ, mutXR) continued growing and reached an OD of 5.2 whereas strain TMB4145 (gpd1Δ gpd2Δ, wtXR) only reached OD 3.7 while the OD of strain TMB4144 (gpd1Δ gpd2Δ, no XR) decreased to 2 (Figure 3B). Also TMB4147 strain carrying the XR with the highest selectivity for NADH (mutXR) almost

Figure 3 Optical density measured at 620 nm (A, B) and mean fluorescence intensity (C, D) over time for the control background (A, C) or the gpd1Δgpd2Δ background (B, D) carrying no XR, wtXR or mutXR. Legend: TMB4140 (control, no XR “red dot”), TMB4141 (control, wtXR “blue x”), TMB4143 (control, mutXR “green square”), TMB4144 (gpd1Δgpd2Δ, no XR “red plus”), TMB4145 (gpd1Δgpd2Δ, wtXR “blue o”), TMB4147 (gpd1Δgpd2Δ, mutXR “green asterisk”).
reached the same OD as the corresponding control strain TMB4143 (control, mutXR) (Figures 3A, B), which was not the case for the other strains carrying either no XR or wtXR. Improved NADH reoxidisation was expected to be coupled to the NADH-dependent xylose reduction to xylitol. Indeed high xylitol production, between 3 and 5 g/L, was measured during the first 48 hours of cultivations in all strains harboring a heterologous XR (Figure 4). Also the deletion strains produced xylitol faster, and in larger quantities than the control strains. Within the first 48 hours, there was no significant difference in xylitol production between strains carrying wtXR and mutXR, neither in the control strain background (Figure 4A) nor in the gpd1Δ gpd2Δ background (Figure 4B). However, the strains carrying mutXR reached slightly higher xylitol concentrations at the end of the cultivations. Xylitol was also produced in strains lacking heterologous XR, but to a significantly lower degree (<0.8 g/L after 70h). Xylitol may actually arise from the NADPH-dependent conversion of xylose by endogenous NADPH-dependent XR, such as the one encoded by GRE3 gene (Träff et al. 2002). In the case of XR-carrying strains, xylitol may also originate from the NADPH-catalysed reaction of the introduced XR. Glycerol production was observed for the double deletion strains carrying the control or mutated XR (Figure 4C, D), which may be explained by the fact that P. stipitis XR can use DHAP as substrate, which leads to glycerol formation (Jeppsson et al. 2003).

Both the control and the gpd1Δ gpd2Δ strains showed the highest fluorescence at the beginning of the cultivation, followed by a gradual decrease until the end of fermentation. An inverse correlation was obtained between growth (Figure 3A, B) and the mean Fls (Figure 3C, D),

Figure 4 Extracellular xylitol (A, B) and glycerol (C, D) concentrations (in g/L) over time for the control background (A, C) or the gpd1Δ gpd2Δ background (B, D) carrying no XR, wtXR or mutXR. Legend: TMB4140 (control, no XR “red dot”), TMB4141 (control, wtXR “blue x”), TMB4143 (control, mutXR[green square]), TMB4144 (gpd1Δ gpd2Δ, no XR “red plus”), TMB4145 (gpd1Δ gpd2Δ, wtXR “blue o”), TMB4147 (gpd1Δ gpd2Δ, mutXR “green asterisk”).
with the best growing strains having the lowest fluorescence both in the control and the gpd1Δ gpd2Δ backgrounds. The difference in fluorescence was however less pronounced between the control strains than between the gpd1Δ gpd2Δ strains, which can be explained by the limited redox imbalance in the control strains.

The population histogram, i.e. the amount of single cells displaying a given FI, also clearly showed differences between the strains (Figures 5A, B). After 24 hours, the different populations displayed significantly different FIs, and were thus easily distinguished in an overlay plot. This was the case both in the control (Figure 5A) and in the gpd1Δ gpd2Δ (Figure 5B) strains, with mean FIs given in channel number units of 204 (control, no XR), 160 (control, wtXR), 70 (control, mutXR) or 325 (gpd1Δ gpd2Δ, no XR), 250 (gpd1Δ gpd2Δ, wtXR) and 171 (gpd1Δ gpd2Δ, mutXR), respectively. Some overlap between strains was observed in both strain backgrounds, but it was more pronounced for the wild type strains than for the deletions strains.

Discussion
Microbial populations exist in dynamic equilibrium with constantly changing conditions, which requires fast and fluid regulatory networks for optimizing cell functions. Among these, an accurate metabolic response is fundamental for the cell to maintain redox homeostasis. In S. cerevisiae, it is well known that a skewed ratio of cytosolic NADH/NAD⁺ can be compensated by glycerol production regulated by a fine-tuned expression of the GPD2 gene (Ansell et al. 1997; Björkqvist et al. 1997). This served as basis for the construction of our in vivo redox state reporter that enables green fluorescence to be used as an indicator of the cells ability to reoxidize NADH, i.e. to the NADH/NAD⁺ ratio of the cell. This

![Figure 5 Fluorescence plots after 24 hours of growth.](image-url)
is, to our knowledge, the first biosensor to use the GPD2 promoter as sensor for the cytosolic NADH/NAD⁺ cofactor balance.

By placing a GFP gene downstream of the GPD2 promoter, a direct relationship between green fluorescence intensity (FI) and glycerol formation or NADH accumulation was observed. In strains carrying double deletion of the GPD genes, the FI was significantly higher (21.5-fold) than for the control strain, indicating a strong activation of the GPD2 promoter, and thereby verifying the lack of other enzymes to counteract the lacking NADH oxidation functionality. In parallel, FIs were in the same order of magnitude in single GPD deletion strain and in the control strain, also confirming the previously observed compensatory pattern between Gpd isoenzymes in order to maintain NAD⁺ regeneration via glycerol production (Ansell et al. 1997). The FI signal of the gpdΔ strain was also slightly higher than the FI of the gpdΔ strain and the control strain: 25% and 50%, respectively, as expression of the GPD2, gene whose promoter is used in the constructed system, should be higher in the gpdΔ strain, as a consequence of GPD2 compensating for the lacking GPD1 functionality. Finally, the high responsiveness of the constructed reporter supported the hypothesis that GPD2 expression was directly connected to the cell need to oxidize NADH via glycerol formation. It cannot be excluded that FI may be correlated to more than the need for NADH oxidation via glycerol formation. Growth rate and the capacity to re-oxidise NADH are closely related and thus FI will always be indirectly correlated to growth rate. As an example of this, the rescued growth rate of the gpdΔ strain by increased NADH oxidation led to significantly lower FI. However the oxygen concentration, which reflects the cells ability to replace the need for glycerol formation by aerobic respiration, was probably a more important parameter in that strain. Cultivating cells under oxygen-limited conditions could also have had implications for the FI measurements as fluorescent proteins require oxygen to mature. However, GFP expression in S. cerevisiae could previously be measured in cells that were cultivated under strict anaerobic conditions, most probably due to exposure to oxygen during the aerobic handling of samples. (Hebisch et al. 2013) previously demonstrated that the average maturation time in E. coli for GFP is around 6 min, which is enough time for GFP to mature during the preparation for the FI measurement in the present study.

There was a clear difference between placing the reporter cassette on a multicopy plasmid or on a plasmid that gets integrated in the chromosome. Copy number per cell varies between 50 and 200 when using YEp vectors as opposed to one when using YIp vectors (Romanos et al. 1992). So placing the GFP-based reporter construct on YEp plasmids led to a significantly higher FI than when using YIp-based construct. However, more defined fluorescence peaks were obtained when using the YIp system as opposed to the YEp system. This is in accordance with previous findings illustrating the stability issues of YEp-based systems compared to YIp-based systems (Ishii et al. 2009) and indicates lower degree of cell population heterogeneity in chromosomally integrated biosensors as compared to the YEp-based systems, which may later facilitate the distinction between any underlying subpopulations. Promoters can also have different levels of noise in the respective gene expression (Blake et al. 2003), which can lead to a higher heterogeneity of the signal. The low degree of heterogeneity in the YIp-based system further stresses the suitability of the GPD2 promoter for analysis of populations at the single cell level.

A 2-fold lowering of the GFP levels was observed when acetoin was added to GPD double deletion strains, which can be attributed to the induced NADH-dependent reduction of acetoin (Gonzalez et al. 2000). Acetoin or acetaldehyde, that is reduced to ethanol with the concurrent oxidation of NADH, have previously been used to demonstrate the lack of alternative cytosolic reductive reactions in double deletion strain (Lidén et al. 1996; Ansell et al. 1997). In these studies, the involved oxidation reactions were efficient enough to recover sufficient redox balance for the cells to start growing. By monitoring FI instead, we wanted to investigate whether the constructed biosensor could monitor less drastic changes in the redox balance. To validate this hypothesis, we introduced XR enzymes with slightly different catalytic activity for NADH oxidation, namely two xylose reductases having NADH/NADPH selectivity ratios of 0.04 and 0.80 respectively (Runquist et al. 2010). As expected, the biggest difference in growth was observed in the double deletion strains between the control and the strain carrying the mutXR, since more carbon was made available for growth when xylitol formation from xylose was used as redox sink instead of glycerol formation from glucose. This is also part of the explanation for the lower glycerol formation in the TMB4141 and TMB4143 as opposed to the TMB4140, as the cells can produce xylitol as a redox sink in addition to glycerol. A higher xylitol production could have been expected for the mutXR than wtXR in the gpdΔ strain, if only considering the NADH-dependent activity. However wtXR also has a significant activity with NADPH as a cofactor (Rizzi et al. 1988), which led to a non-negligible NADH-independent xylitol production. The maximum difference in OD was 2.5-fold after 48 hours of growth whereas the difference between the control strain and the strain carrying the wtXR was only 1.5 fold. So, in theory, the reductases could be distinguishable by repeating batch cultivations and using
growth as selection. Assuming that after 48 hours one cell of TMB4144 (double deletion mutXR) grows to 2.5 times the cell density of the TMB4140 (double deletion no XR), it would take 27 batch cultivations of 48 hours each before one TMB4144 cell would outgrow 10⁹ TMB4140 cells by a factor of 1:100 (according to the following calculation: (1/2.5)²⁷·10⁹ = 0.01). Using fluorescence instead, the difference was clearly visible after a few hours. Increased xylitol formation and lower fluorescence were observed in strains carrying the wtXR and the mutXR. However, a clear difference in FIs was observed between the two strains whereas differences in xylitol levels were not that significant. The results, although qualitative, indicate that fluorescence was the more sensitive and faster method to discriminate between the two XR enzymes and their difference in NADH-catalyzed xylitol production and consequently their ability to affect the cytosolic NADH/NAD⁺ ratio. It also opens the possibility for high-throughput screening of enzymes with increased selectivity for NADH. In our cases, similar XR levels were measured (data not shown). However, in future screening, an enzyme with lower specificity for NADH, but expressed at a higher level and giving a higher activity/per cell for NADH oxidation will lead to a lower FI. This limitation in the screening will, however, occur in any method based on the NADH pool and not only in the FI-based one. Another element that can be further considered when using a GFP-based reporter system for screening or analysis of the NAD(H) cofactor imbalance is the half-life of the chosen protein. The yEGFP3 protein used in the present study has been reported to have a half-life of about 7.5 hours (Mateus and Avery 2000), and indeed the intracellular GFP level did not respond rapidly to dynamic changes in external conditions. This implies that rapid changes in NAD(H) cofactor balancing may not be monitored with the developed system. However alternative GFP variants with shorter half-life, such as the GFP fused with a fragment of the CLN2 (yeast G1 cyclin) protein having a half-life of 30 minutes (Mateus and Avery 2000), could then be used instead.

Lately, much attention has been drawn in using FACS for screening large genetic space (Dietrich et al. 2010) and the technique has already been applied for the screening of NADPH-dependent alcohol dehydrogenases in E. coli (Siedler et al. 2014). However, the combination of a NADH biosensor and single-cell analysis has, to our knowledge, not yet been implemented in S. cerevisiae. Our tool offers the first single-cell high-throughput NAD(H) cofactor balance sensor in S. cerevisiae. In contrast to previously reported methods where extraction of intracellular NAD(H) metabolites was performed (Canelas et al. 2008), the method presented in this work is faster and allows for analysis with single-cell level resolution. Therefore the constructed tool offers possible applications in the selection of new NADH-dependent enzymes based on single cell sorting. Additionally it could be applied in monitoring various metabolic engineering strategies on the cytosolic NAD(H) cofactor balance of the cell.

Competing interests
The authors declare that they have no competing interests.

Authors’ contribution
JDK, MC and MGG contributed equally in the design of the study. JDK performed the experimental work and wrote the manuscript. MC and MGG helped in drafting the manuscript. All authors have read and approved the submission of the manuscript.

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