A Calibration Method for Nanowire Biosensors to Suppress Device-to-Device Variation

Fumiaki N. Ishikawa,† Marco Curreli,‡ Hsiao-Kang Chang,† Po-Chiang Chen,† Rui Zhang,‡ Richard J. Cote,§ Mark E. Thompson,‡ and Chongwu Zhou†,*

†Departments of Electrical Engineering, ‡Chemistry, and §Pathology, University of Southern California, Los Angeles, California 90089

Biological sensors based on nanowire/nanotube field effect transistors (FETs) are one of the most promising applications of bionanotechnology. As a proof of their promising capabilities, nanowire/nanotube sensors have been used to detect a large variety of biological molecules, ranging from proteins to nucleotide sequences,1–15 to monitor enzymatic activities,16 and to observe cellular signaling/responses,17–19 with sensitivity and response time comparable or better than conventional techniques (ELISA). An important challenge holding back the practical application of nanobiosensors to biological measurements is the device-to-device variation in the device properties such as conductance, threshold voltage, and transconductance. This variation exists between devices on different substrates as well as between devices within an array on a single substrate.20,21 This results in unreliable detection, making quantitative analysis difficult. This challenge must be addressed to bridge the gap between academic research and practical use of the technology.

While effort has been devoted to the fabrication of more uniform devices,5,9,22–40 there have been few reports tackling the problem with a data analysis approach. Recently it was reported that the Langmuir isotherm model can be used to calibrate the sensor performance of carbon nanotube biosensors.41 While this method is effective in reducing response discrepancies, it requires testing several different analyte concentrations for each device to use Langmuir fitting, thus developing a unique calibration curve for each device. We report herein an analytical method to calibrate nanowire biosensors, which gives significantly suppressed device-to-device variation in sensing response. We use the correlation between the biosensor gate dependence and the absolute responses (absolute change in current, \( I \)) as the basis of the calibration method. In\(_2\)O\(_3\) nanowire FET-based biosensors for streptavidin were used as a model system, to demonstrate that an electrostatic interaction is the dominant sensing mechanism. We developed a calibration method involving dividing the absolute response by \( \frac{I_{ds}}{V_g} \) for each device, which markedly improved the device-to-device variation, as verified by the much reduced coefficient of variance (CV) from 59% for the absolute response to 25% for the calibrated response, respectively. The superiority of this calibration method to the common normalization method is shown mathematically using a conventional transistor model, and experimentally confirmed. Our method is a significant step forward toward the broader application of nanowire biosensors.

KEYWORDS: nanowire · nanobiosensor · calibration method · sensing mechanism

ABSTRACT Nanowire/nanotube biosensors have stimulated significant interest; however, the inevitable device-to-device variation in the biosensor performance remains a great challenge. We have developed an analytical method to calibrate nanowire biosensor responses that can suppress the device-to-device variation in sensing response significantly. The method is based on our discovery of a strong correlation between the biosensor gate dependence (\( \frac{dI_{ds}}{dV_g} \)) and the absolute response (absolute change in current, \( \Delta I \)). In\(_2\)O\(_3\) nanowire-based biosensors for streptavidin detection were used as the model system. Studying the liquid gate effect and ionic concentration dependence of streptavidin sensing indicates that electrostatic interaction is the dominant sensing mechanism. Based on this sensing mechanism and transistor physics, a linear correlation between the absolute sensor response (\( \Delta I \)) and the gate dependence (\( \frac{dI_{ds}}{dV_g} \)) is predicted and confirmed experimentally. Using this correlation, a calibration method was developed where the absolute response is divided by \( \frac{I_{ds}}{V_g} \) for each device, and the calibrated responses from different devices behaved almost identically. Compared to the common normalization method (normalization of the conductance/resistance/current by the initial value), this calibration method was proven advantageous using a conventional transistor model. The method presented here substantially suppresses device-to-device variation, allowing the use of nanosensors in large arrays.
RESULTS AND DISCUSSION

Variation of as-Made Biosensors. Our sensing devices based on indium oxide nanowires were fabricated following a previously developed procedure. The only deviation from this procedure is a novel design of interdigitated source and drain electrodes that resulted in high yield of well-performing transistors (Figure 1a—c).

Details of the fabrication are in the method section. We note that this procedure allows inexpensive and scalable fabrication with a uniformity similar to the one obtained with the aid of Langmuir—Blodgett assembly. The uniformity of our device in terms of threshold voltage is shown in Supporting Information, Figure S1.

Figure 1a shows the photograph of a complete 3 in. wafer with multiple biosensor chips. Figure 1b shows one of the chips, and the inset displays a typical device with interdigitated electrodes, which serve to increase the effective channel width and subsequently the probability of contacting multiple nanowires for each device. In this design, we used three different effective channel widths of 480, 780, and 2600 μm, with fixed channel length of 2.5 μm. Typically one device of 780 μm channel width contains about 10 nanowires in the channel as shown in Figure 1c. The inset shows a magnified SEM image of one nanowire in the channel. The use of multiple nanowires per sensor offers high device yield (~70%) and small device-to-device variation (Supporting Information, Figure S1). The above-described procedure also allows for device fabrication on unconventional substrates, such as polyethylene terephthalate and glass. Moreover, biocompatible, FDA-approved materials such as parylene can be used as the substrate, allowing for in vivo, flexible sensors.

The transistor properties of the devices were characterized, with the Si substrate as a back gate and 500 nm SiO2 as a dielectric layer. Plots of drain-source current (I DS) under different V DS voltage (V DS) under different gate voltage (V G) for a typical transistor are shown in Figure 1d. The device exhibited a MOSFET-like transistor behavior, and the linear regime can be well described by the conventional MOSFET eq 1 (see also Supporting Information, Figure S2):

\[
I_{DS} = \frac{e \mu C V_D S}{d L} (V_G - V_T) = g_m (V_G - V_T)
\]

where e is the elementary charge, \( \mu \) is the device mobility, \( \varepsilon \) is the permittivity of vacuum, \( \varepsilon_r \) is the permittivity of SiO2, A is the area of the channel, d is the spacing of the capacitor, L is the channel length, \( V_D \) is the threshold voltage, and \( g_m \) is the transconductance of the device. The linearity of I DS at small V GS confirms the negligible contact resistance. The on/off ratio of this device reached ~10^5. By carefully optimizing the density of

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nanowires, we have demonstrated that about 70% of the devices showed an on/off ratio \( >10^2 \). Only those were used in the following experiments.

Throughout this paper, we employed liquid gate measurements in order to characterize and evaluate our devices under conditions as close as possible to the active sensing condition. This method was developed previously to gain insights on how biomolecules interact with sensors.\(^{44}\) Our experimental setup for active measurements using the liquid gate configuration is schematically illustrated in Figure 1e. A device-under-test was fitted with a Teflon cell and the cell was then filled with 1 mL of phosphate buffered saline (PBS) solution. An Ag/AgCl reference electrode was inserted in the buffer that served as a liquid gate.\(^{45}\) We confirmed that the leakage current is negligible compared to the current through the nanowires via control experiments (Supporting Information, Figure S3 and ref 44).\(^{46}\) For real-time biosensing experiments, after establishing a baseline, analyte solutions of interest were added to the buffer, and the change of the device characteristics was monitored over time. We note that for some of the measurements done as follows (Figures 1f, 2b, and 5), continuous mixing of the buffer was performed by applying a constant continuous flow of air to the surface of the buffer solution in order to (1) minimize the mechanical/electrical perturbation to the system due to the addition of the analytes and (2) accelerate the mixing of the solutions.

We used streptavidin (S-Av) as the analyte and biotin as the receptor, since the system has been studied extensively.\(^{47,48}\) Biotin was attached to the nanowire surface through previously developed chemical procedure for our In\(_2\)O\(_3\) nanowire biosensors.\(^{4}\) A typical result of a real-time biosensing measurement is shown in Figure 1f, where three devices functionalized with biotin were exposed to a solution of 100 nM streptavidin at \( t = 100 \text{ s} \) in 0.01 \( \times \) PBS. The change upon exposure, in terms of the absolute change in \( \Delta I_{ds} \), was 210, 95, and 35 nA for devices 2, 1, and 3, respectively. Clearly, there is a significant device-to-device variation.

**Elucidation of Sensing Mechanism.** We first investigated the physics leading to sensing signals for our In\(_2\)O\(_3\) nanowire biosensors using biotin and streptavidin (S-Av) as a receptor/analyte model system. The change in the \( I_{ds} - V_g \) characteristics upon exposure to streptavidin (100 nM) was examined.\(^{44}\) The experiment was carried out in 0.01 \( \times \) PBS. Figure 2a shows typical \( I_{ds} - V_g \) curves from a device before and after exposure to a solution of 100 nM streptavidin, where a clear difference was observed indicating successful sensing. The direction of the response is consistent with previous reports, which suggested that streptavidin contains amine groups closer to the binding pocket, resulting in bringing positive charges close to the nanowires.\(^{3,49}\) We found that the change of the \( I_{ds} - V_g \) after S-Av binding can be described as a parallel shift of the \( I_{ds} - V_g \) by \( \sim 14 \text{ mV} \) (Figure S4). These observations were consistently reproduced over a large number of devices. On the basis of these observations, we attributed the doping of nanowires by the analytes as the dominant sensing mechanism for In\(_2\)O\(_3\) nanowire biosensors in the conditions used here, since under other possible mechanisms proposed before, such as change in dielectric constant and mobility, it must be accompanied with a change in the transconductance.\(^{44,50}\) We note that the observed shifts in the \( I_{ds} - V_g \) are not due to device instability over time or a perturbation caused by adding a liquid, as verified by repeatedly measuring the \( I_{ds} - V_g \) and monitoring the change of on-current \( I_{ds} \) at \( V_g = 0.6 \text{ V} \) over time. The change in \( I_{ds} - V_g \) curves was only observed with the introduction of streptavidin (Figure S5), while the current was stable before the introduction of
were then exposed to 100 nM streptavidin, and the lute response (has a characteristic screening length (Debye length, the direct transfer of carriers through the interface, and ear fitting (black solid line) for five different devices.

The results described above show that “doping” is the dominant mechanism behind the generation of a sensing signal. Such doping can be classified into two categories: charge transfer\(^{30}\) and electrostatic interaction.\(^{44}\) The former depends on the alignment of the chemical potential between the analyte and the sensor\(^{31}\) as well as on the charge transfer resistance.\(^{52}\) In contrast, the electrostatic interaction does not require the direct transfer of carriers through the interface, and has a characteristic screening length (Debye length, \(\lambda_D\)) associated with the dielectric properties of the environment through which the electrostatic interaction takes place (buffer and \(\text{In}_2\text{O}_3\) nanowire in our case).\(^{53,54}\)

To establish which type of doping is at the origin of the sensing mechanism for our biosensors, the device response to 100 nM streptavidin was tested in buffers with three different electrolyte concentrations, thus different Debye lengths. Figure 2b shows \(I_d\) versus time plots in 1× PBS (black, \(\lambda_D = 0.7 \text{ nm}\)), 0.01× PBS (yellow, \(\lambda_D = 7 \text{ nm}\)), and 0.0001× PBS (blue, \(\lambda_D = 70 \text{ nm}\)), when the device was exposed to 100 nM streptavidin solution at \(t = 100 \text{ s}\). The extracted relative response is plotted versus ionic concentration in Figure 2c. The strong dependence of the responses to the ionic concentration indicates that the sensing is done by electrostatic interaction rather than charge transfer for our \(\text{In}_2\text{O}_3\) nanowires.

**Correlation between Transistor Performance and Biosensor Performance.** Based on the device characteristics described above, we propose a metric to predict/calibrate the biosensor performance in terms of the absolute response \((\Delta I)\). The metric \(\frac{dI_d}{dV_g}\) will correlate the absolute response \((\Delta I)\) with the change in effective gate voltage induced by binding of biomolecules. The correlation of \(\frac{dI_d}{dV_g}\) to the device sensitivity was investigated as follows: \(I_d - V_g\) measurements were performed on several devices using a liquid gate in 0.01× PBS, and \(dI_d/dV_g\) determined at \(V_g = 200 \text{ mV}\). The devices were then exposed to 100 nM streptavidin, and the \(I_d - V_g\) measurement was performed again. The absolute response \((\Delta I)\) for each device was calculated, and correlated to \(dI_d/dV_g\) by linear fitting. Data points at \(V_g = 0.6 \text{ V}\) were used for the analysis here. Shown in Figure 3 is a plot of the absolute response \(dI_d/dV_g\) with a linear fitting (black solid line) for five different devices. The fitting yielded a correlation coefficient of \(-0.98\), proving the solid correlation between those two values. We note that a similar analysis at different gate voltages also revealed consistent results. This correlation was used to calibrate the sensor responses as shown in the next section.

While it is not the main point of this paper, we note that the correlation can be also used to predict the behavior of a given transistor as a biosensor. As a consequence, a feedback loop can be used to design improved biosensors with shorter feedback time. An example of such feedback diagram is shown in the Supporting Information. In addition, the results indicate one can tune the magnitude of the response of a biosensor by applying an appropriate gate voltage to maximize the value of \(dI_d/dV_g\). In fact, the plot of \(dI_d/dV_g\) versus the absolute response revealed a clear correlation between them, and the gate voltage that gives the maximum \(dI_d/dV_g\) gives the maximum absolute response (Supporting Information, Figure S6). Further discussions can be found in the Supporting Information.

**Calibration of Sensor Response.** The metric \(dI_d/dV_g\) can be used to calibrate the sensor response. We have found that this calibration is achieved by dividing the absolute responses \((\Delta I)\) by \(dI_d/dV_g\), which is hereafter referred to as “calibrated response.” As an example, Figure 4a shows absolute responses plotted against the device identification numbers together with an average of the responses before the calibration. By performing the calibration, we significantly reduce the device-to-device variation as shown in Figure 4b. The improvement was statistically verified by calculating the coefficient of variation (CV) for each set of data, where CV is defined as

$$ CV = \frac{\sigma}{\mu} \quad \quad (2) $$

where \(\sigma\) is the standard deviation and \(\mu\) is the mean. CV was reduced from 59% for the absolute response to 16% for the calibrated response, confirming the much reduced device-to-device variation after calibration. For comparison, we also performed the conventional normalization method, where the current/
The resistance/conductance was normalized by the initial value. The result is shown in Figure 4c. CV of the normalized response is 25%, which is slightly higher than that of the calibrated response. This is as expected according to the analysis shown below.

We also performed the same calibration on the data shown in Figure 1d to show that the method works for real-time measurements. Figure 5 shows the plots of the resultant calibrated responses. It is clear that the large device-to-device variation observed in Figure 1d is significantly reduced by the calibration, confirming the applicability of our method to real-time biosensing. We note that the calibrated responses (change) of ~14 mV for the real-time measurement are consistent with the number observed for the $I_{ds}-V_g$ measurement (~14 mV).

The physical meaning of this calibration is to translate the response (change) in current to responses (change) in voltage that is delivered by the analyte. This translation leads to an advantage of our calibration method compared to the conventional method where the change was normalized by the initial conductance/current/resistance, as shown below. Applying the conventional MOSFET model eq 1,55

\[ I_{ds} \text{ before} = e\mu_f\epsilon_r A V_{ds} (V_g - V_T) \] (3a)

\[ I_{ds} \text{ after} = e\mu_f\epsilon_r A V_{ds} (V_g - V_{T2}) \] (3b)

where the characters with subscript 1 are for the parameters before exposure to biomolecules, and subscript 2 for the device after exposure to biomolecules. Our metric $dI_{ds}/dV_g$ can be expressed as

\[ \frac{dI_{ds}}{dV_g} = e\mu_f\epsilon_r A \frac{V_{ds}}{L} \] (4)

When electrostatic interaction is the dominant sensing mechanism, $I_{after}$ can be written as

\[ I_{after} = e\mu_f\epsilon_r A V_{ds} (V_g - (V_{T1} + \Delta V)) \] (5)

where $\Delta V$ is the equivalent gating voltage (potential) induced by the biomolecules. Using these equations, we can express the normalized response ($\Delta I/I_0$) as follows:

\[ \frac{\Delta I}{I_0} = \frac{B(V_g - V_{T1}) - B(V_g - (V_{T1} + \Delta V))}{B(V_g - V_{T1})} \] (6a)

while the calibrated response ($\Delta I/(dI_{ds}/dV_g)$) can be expressed as follows:

\[ \frac{\Delta I}{(dI_{ds}/dV_g)} \]
CONCLUSIONS

In summary, we have performed a comprehensive study on In$_2$O$_3$ nanowire biosensors, and successfully developed a calibration method to reduce the device-to-device variation in the sensor responses. The method is based on a correlation we found between the absolute responses and the gate dependence of the biosensors measured by means of a liquid gate. Our study of the sensing mechanism of In$_2$O$_3$ nanowire biosensors using streptavidin as a model analyte first revealed that electrostatic interaction is the dominant sensing mechanism, similar to other nanowire biosensors (mostly based on silicon nanowires). On the basis of the sensing mechanism, we proposed that there is a strong correlation between the responses of the biosensors and gate dependence of the devices, and the correlation was confirmed experimentally. Lastly, using the correlation, we developed a data analysis method to calibrate the sensor performance by dividing the absolute response by the gate dependence of each device. Then we successfully reduced the device-to-device variation in the sensor response as verified by the reduced CV from 59% before the calibration to 19% after the calibration. We believe our method will be useful for other nanowire and nanotube FET-based sensor arrays, making multiplexed sensor arrays a practical solution for measuring/monitoring multiple analytes (biomarkers) simultaneously.

METHOD

In$_2$O$_3$ nanowires were grown on a Si/SiO$_2$ substrate using the laser ablation method and dispersed in isopropyl alcohol by sonication. The suspension of nanowires in isopropyl alcohol was dropped onto a Si/SiO$_2$ substrate, typically a 3 in. wafer, generating a random distribution of nanowires, with roughly 1 nanowires per 100 µm$^2$. The thickness of the SiO$_2$ capping layer was 500 nm, unless otherwise stated. Following that was deposition of Cr (10 nm) and Au (40 nm) deposited onto the Si/SiO$_2$ substrate. Then, 500 nm of In$_2$O$_3$ was thermally deposited, with a thickness that was measured by stylus profilometry. A bilayer of 10 nm Cr and 40 nm Au was used as the contact for the nanowires, with the Au layer being intended as a liquid gate. Upon exposure to streptavidin, a new feedback loop for designing new nanobiosensors, stability of the device behavior through conventional MOSFET equation, measurement of leakage, change of $I_{ds}$ within small variation of $V_{ds}$ induced by binding of biomolecules. Even for the saturation regime, while $I_{ds}$ is proportional to $V_g^2$ over a large range, the $I_{ds}$ variation of small variation of $V_g$ can still be approximated with a linear curve.

REFERENCES AND NOTES


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