## Notes #1.5Removing Randomness From Nonuniform Adversaries

## Probabilistic Nonuniform Adversaries

The goal of this note is to prove the exercise from the bottom of Page 1 of Notes #1. We want to show that for adversaries against pseudo-randomness, nonuniform adversaries that use randomness are no more powerful than nonuniform adversaries that are deterministic – that is, that do not use randomness. (A similar theorem will be true about nonuniform adversaries in other settings.)

So let G be a number generator, where |G(s)| = l(|s|). What do we mean by a nonuniform adversary that uses randomness? We mean a family  $D = \{D_1, D_2, ...\}$  of circuits;  $D_n$  has l(n)input bits and one output bit; for some c and sufficiently large n,  $D_n$  has size  $\leq n^c$ . In addition to the usual gates,  $D_n$  is allowed to use *coin-tossing* gates, where a coin-tossing gate has no inputs and chooses its output bit *randomly* whenever the circuit is run.  $p_D(n)$  and  $r_D(n)$  now mean the obvious things. For example, to define  $p_D(n)$  we consider the following experiment:

Choose a random n-bit string s; compute G(s); run  $D_n$  on G(s), choosing the outputs of the coin-tossing gates randomly.

Then  $p_D(n)$  is the probability that D accepts (that is, outputs 1).

Say (w.l.o.g) that  $p_D(n) - r_D(n) > 0$ . We wish to show that there is a *deterministic* circuit D' that is no bigger than D, such that  $p_{D'}(n) - r_{D'}(n) \ge p_D(n) - r_D(n)$ . We will do this by fixing the outputs of the coin-tossing gates appropriately.

Say that  $D_n$  has m coin-tossing gates. For each m-bit string u, define  $p_D(n, u)$  to be the probability that D accepts in the above experiment when the coin-tossing gates are fixed to output u (that is, the first coin-tossing gate always outputs the first bit of u, the second one always outputs the second bit of u, etc.). Define  $r_D(n, u)$  similarly. We now have

$$p_D(n) = E_u(p_D(n, u))$$
 and  $r_D(n) = E_u(r_D(n, u))$ 

where  $E_u(\alpha)$  is the expected (or average) value of  $\alpha$  as u varies randomly over m-bit strings. We therefore have (by the additivity of expectations)

$$p_D(n) - r_D(n) = E_u(p_D(n, u) - r_D(n, u))$$

So there must be some u – call it  $u_0$  – such that

$$p_D(n, u_0) - r_D(n, u_0) \ge E_u(p_D(n, u) - r_D(n, u)) = p_D(n) - r_D(n)$$

We now form the deterministic circuit circuit D' by fixing the output wires of the coin-tossing gates to be  $u_0$ . We have

$$p_{D'}(n) - r_{D'}(n) = p_D(n, u_0) - r_D(n, u_0) \ge p_D(n) - r_D(n)$$

How can we find an appropriate  $u_0$ . In fact, we have no efficient, deterministic way to do this. The whole point of nonuniformity is that we don't *have* to have a way of finding  $u_0$ ;  $u_0$  is hardwired into the circuit.