## Off-chain Limit Orders for the LMSR/LS-LMSR

Jack Peterson www.augur.net

The user wants to make a buy limit order on outcome i. The user enters:

- Limit price  $p(q_i)$ .
- $\bullet$  Total number of shares to buy, N.
- Price cap for the stop order,  $\xi$ . This is the maximum price the user is willing to accept for this order.

What is the maximum number of shares (n) the user can buy such that the price  $p(q_i + n)$  does not rise above the price cap  $(\xi)$ ?

$$p(q_i + n) = \xi \tag{1}$$

To solve Eq. 1 for n, the price function p must be specified. First, use the LMSR's simple price function:

$$p(q_i) = \frac{e^{\beta q_i}}{\sum_j e^{\beta q_j}},\tag{2}$$

making the substitution  $\beta \equiv b^{-1}$  for readability. Plug Eq. 2 into Eq. 1 and rearrange to solve for n:

$$n = -q_i + \frac{1}{\beta} \log \left( \frac{\xi}{1 - \xi} \sum_{j \neq i} e^{\beta q_j} \right). \tag{3}$$

If  $n \ge N$ , this is just a stop order: it converts to a market order, is completely filled by the automated market maker, and nothing further happens. If n < N, a market order for n shares is submitted and filled by the market maker (bringing the price to  $\xi$ ). This leaves N - n total shares in the user's limit order. The order remains open until the market maker's price again drops to the limit price  $p(q_i)$ .

The LS-LMSR's price function can also be used, although since it is more complicated there is not a closed-form expression for n like Eq. 3. The LS-LMSR's price function is

$$p(q_i) = \alpha \log \left( \sum_{j} e^{q_j/b(q_i)} \right) + \frac{e^{q_i/b(q_i)} \sum_{j} q_j - \sum_{j} q_j e^{q_j/b(q_i)}}{\sum_{j} q_j \sum_{j} e^{q_j/b(q_i)}},$$
(4)

where  $b(q_i) \equiv \alpha \sum_j q_j$ . Plug Eq. 4 into Eq. 1:

$$b(q_i + n) = b(q_i) + n \tag{5}$$

$$\alpha \log \left( e^{\frac{q_{i}+n}{b(q_{i})+n}} + \sum_{j \neq i} e^{\frac{q_{j}}{b(q_{i})+n}} \right) + \frac{e^{\frac{q_{i}+n}{b(q_{i})+n}} \sum_{j \neq i} q_{j} - \sum_{j \neq i} q_{j} e^{\frac{q_{j}}{b(q_{i})+n}}}{\left(n + \sum_{j} q_{j}\right) \left(e^{\frac{q_{i}+n}{b(q_{i})+n}} + \sum_{j \neq i} e^{\frac{q_{j}}{b(q_{i})+n}}\right)} = \xi$$
 (6)

Eq. 6 is then numerically solved for n.

<sup>&</sup>lt;sup>1</sup>  $p(q_i)$  and  $b(q_i)$  are written as univariate functions because only  $q_i$  is varied here.

## Example implementation (Matlab)

```
% price cap
xi = 0.3;
% LMSR
beta = 1;
q = 10*ones(1,5);
i = 1;
qj = [q(1:i-1) q(i+1:end)];
n = -q(i) + \log(xi*sum(exp(beta*qj))/(1 - xi)) / beta
q(i) = q(i) + n;
p_lmsr = exp(beta*q) / sum(exp(beta*q))
% LS-LMSR
clear n
a = 0.0079;
q = 10*ones(1,5);
i = 1;
qj = [q(1:i-1) \ q(i+1:end)];
 F = @(n) \ a*log(exp((q(i) + n)/a/(n + sum(q))) + sum(exp(qj/a/(n + sum(q))))) + \dots \\ (exp((q(i) + n)/a/(n + sum(q)))*sum(qj) - sum(qj.*exp(qj/a/(n + sum(q))))) / \dots 
    ((n + sum(q))*(exp((q(i) + n)/a/(n + sum(q))) + sum(exp(qj/a/(n + sum(q)))))) - xi;
n0 = fsolve(F, 0.05)
q(i) = q(i) + n0;
b = a*sum(q);
p_1slmsr = a*log(sum(exp(q/b))) + ...
    (exp(q/b)*sum(q) - sum(q.*exp(q/b))) / sum(q) / sum(exp(q/b))
```

## Example implementation (JavaScript)

```
#!/usr/bin/env node
var Decimal = require("decimal.js");
var fzero = require("fzero");
// MSR parameters
var q = [new Decimal(10),
                             // outcome 1 shares
        new Decimal(10),
                            // outcome 2 shares
                            // outcome 3 shares
         new Decimal(10),
         new Decimal(10),
                              // outcome 4 shares
                              // outcome 5 shares
         new Decimal(10)];
var i = 1;
                               // outcome to trade
var a = new Decimal("0.0079"); // LS-LMSR alpha
var xi = new Decimal("0.3"); // price cap
// LS-LMSR objective function (Eq. 6)
function f(n) {
    n = new Decimal(n);
    var numOutcomes = q.length;
    var qj = new Array(numOutcomes);
    var sum_q = new Decimal(0);
    for (var j = 0; j < numOutcomes; ++j) {
        qj[j] = q[j];
        sum_q = sum_q.plus(q[j]);
    qj.splice(i, 1);
    var q_plus_n = n.plus(sum_q);
    var b = a.times(q_plus_n);
    var exp_qi = q[i].plus(n).dividedBy(b).exp();
    var exp_qj = new Array(numOutcomes);
    var sum_qj = new Decimal(0);
    var sum_exp_qj = new Decimal(0);
    var sum_qj_x_expqj = new Decimal(0);
    for (j = 0; j < numOutcomes - 1; ++j) {
        sum_qj = sum_qj.plus(qj[j]);
        exp_qj[j] = qj[j].dividedBy(b).exp();
        sum_exp_qj = sum_exp_qj.plus(exp_qj[j]);
        sum_qj_x_expqj = sum_qj_x_expqj.plus(q[j].times(exp_qj[j]));
    }
    return a.times(q[i].plus(n).dividedBy(b).exp().plus(sum_exp_qj).ln()).plus(
        exp_qi.times(sum_qj).minus(sum_qj_x_expqj).dividedBy(
            q_plus_n.times(exp_qi.plus(sum_exp_qj))
        ).minus(xi)
    );
console.log(fzero(f, [0.001, 10]).solution);
```