# INTERVAL BASED SAMPLE SIZE CALCULATION IN CASE-CONTROL STUDIES WITH MATCHED PAIRS UNDER INVERSE SAMPLING

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### **Abstract**

This paper provides a quantitative discussion on the effect resulting from the predetermined number of indexed matched pairs, defined as the pair in which the case is unexposed but the control is exposed, on the average length of the confidence interval. For a given ratio of the average length of the confidence interval relative to the underlying odds ratio, this paper provides a sample size calculation procedure to determine the required number of the indexed matched pairs under inverse sampling. To further facilitate use of the proposed sample size determination procedure and to help understanding of the effect due to the underlying mean and variation of the probability of exposure in the case group, this paper presents tables that summarize the required number of indexed matched pairs derived on the basis of the average length of the 95% confidence interval, the expected total number of matched pairs, and the minimum total number of matched pairs needed to obtain the required number of indexed matched pairs with a given probability in a variety of situations.

## 1. Introduction

Considering two independent samples under inverse sampling, in which we continue to sample subjects until we collect the desired number of index subjects (Haldane [7, 8], Finney [5, 6], Lui [15, 16, 17]). Barton

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[1] notes use of large sample approximation to calculate the required number of index subjects for a desired power to detect a specific alternative hypothesis at a given type I error. When the underlying disease is rare, Bennett [2] calculates the power of an approximate F-test procedure as a function of the number of index subjects under inverse sampling. Lui [13] discusses estimation and testing hypothesis for case-control studies with matched pairs under inverse sampling. Considering the case of two independent samples, Lui [14] further derives a sample size calculation procedure for a given power based on hypothesis testing under inverse sampling. On the other hand, interval estimation can often provide more information on the contents of data than hypothesis testing. None of these papers focuses, however, discussion on sample size calculation on the basis of the average length of the confidence interval for case-control studies with matched pairs under inverse sampling.

The purpose of this paper is to provide a quantitative discussion on the effect resulting from the predetermined number of indexed matched pairs, in which the case is unexposed but the control is exposed, on the average length of the confidence interval. For a given ratio of the average length of the confidence interval relative to the underlying odds ratio, this paper provides a sample size calculation procedure of the minimum required number of the indexed matched pairs under inverse sampling. To facilitate the use of the results presented here and to study the effect due to the underlying mean and variation of the probability of exposure in the case group, this paper presents tables that summarize the minimum required number of indexed matched pairs derived on the basis of the average length of the 95% confidence interval, the expected total number of matched pairs, and the minimum total number of matched pairs needed to obtain the required number of indexed matched pairs with a given probability in a variety of situations. To simplify the calculation procedure, we also derive a sample size formula based on large sample theory. A quantitative evaluation of the accuracy of this approximate sample size is also included.

# 2. Notations and Model Assumptions

For a randomly selected subject from the case group, let p denote the

probability of exposure to a risk factor. Note that because each selected case has distinct individual characteristics, the probability of exposure p may vary between cases. To account for this variation, we assume that p follows a beta distribution with mean  $\pi = \alpha/(\alpha + \beta)$  and variance  $\pi(1-\pi)/(T+1)$ , where  $T=\alpha+\beta$ , and  $\alpha>0$  and  $\beta>0$ , because this family is rich in shapes and is commonly used to model the Bernoulli responses (Johnson and Kotz [10], Lui [11, 18]). Note that for a fixed  $\pi$ , the parameter T may be regarded as a measure of the variation for p; the larger the value of T, the smaller is the variation of p. As T goes to  $\infty$ , the probability p converges to the constant  $\pi$ . For each randomly selected case, we form a matched pair by finding a control according to certain matching criteria. Let p' denote the corresponding probability of exposure for the matched control. As commonly assumed in matched pair studies (Jewell [9], Ejigou and McHugh [4], Cox [3]), we assume further that the odds ratio of exposure for the selected case versus the matched control, p(1-p')/[(1-p)p'], is equal to a constant Q across all matched pairs. Thus, for a given value of the common odds ratio Q, the corresponding probability p' to the matched control of a selected case with the probability of exposure p is then equal to p/[p+Q(1-p)]. Let  $\pi_{ii}$  (i = 1, 2, j = 1, 2) denote the probabilities for the following  $2 \times 2$ table.

Control

		Exposed	Non-exposed
	Exposed	$\pi_{11}$	$\pi_{12}$
Case	Non-exposed	$\pi_{21}$	$\pi_{22}$

With the above assumption, these  $\pi_{ij}$  are then given as follows:

$$\pi_{11} = \Gamma(\alpha + \beta) \left[ \int_0^1 p^{\alpha+1} (1-p)^{\beta-1} / [p + Q(1-p)] dp \right] / \Gamma(\alpha) \Gamma(\beta)$$

$$\pi_{10} = \Gamma(\alpha + \beta) \left[ \int_0^1 p^{\alpha} (1-p)^{\beta} Q / [p + Q(1-p)] dp \right] / \Gamma(\alpha) \Gamma(\beta)$$

$$\pi_{01} = \Gamma(\alpha + \beta) \left[ \int_0^1 p^{\alpha} (1 - p)^{\beta} / [p + Q(1 - p)] dp \right] / \Gamma(\alpha) \Gamma(\beta)$$

$$\pi_{00} = \Gamma(\alpha + \beta) \left[ \int_0^1 p^{\alpha - 1} (1 - p)^{\beta + 1} Q / [p + Q(1 - p)] dp \right] / \Gamma(\alpha) \Gamma(\beta). \tag{1}$$

Note that the odds ratio Q is equal to  $\pi_{10}/\pi_{01}$ .

Consider the inverse sampling, in which we continue sampling subjects from the case group to form matched pairs until we obtain the predetermined number  $c \geq 1$  of index matched pairs. For clarity, we summarize the resulting data by use of the following  $2 \times 2$  table:

Control

		Exposed	Non-exposed
	Exposed	A	В
Case	Non-exposed	c	D

where c is a positive integer and is predetermined, and random variables A, B and D denote the number of matched pairs falling into the corresponding categories before obtaining exactly the desired number c of the indexed matched pairs. As noted elsewhere (Lui [14]), the marginal distribution  $f_B(b \mid c, p)$  of B is the negative binomial distribution with parameters c and  $p = \pi_{01}/(\pi_{10} + \pi_{01}) = 1/(1 + Q)$ :

$$f_B(b|c, p) = \frac{(b+c-1)!}{b!(c-1)!} p^c (1-p)^b$$
, where  $b = 0, 1, 2, ...$  (2)

Therefore, with use of the confidence interval (Lui [12]) for p and the monotonically decreasing transformation of (1-x)/x, the exact  $100(1-\alpha)\%$  confidence interval for Q is then given by  $((1-u(b,c,\alpha/2))/u(b,c,\alpha/2), (1-\ell(b,c,\alpha/2))/\ell(b,c,\alpha/2))$ , where  $u(b,c,\alpha/2) = cf_{\alpha/2}(2c,2b)/[cf_{\alpha/2}(2c,2b)+b]$ ,  $\ell(b,c,\alpha/2) = c/[c+(b+1)f_{\alpha/2}(2(b+1),2c)]$ , and  $f_{\alpha/2}(df_1,df_2)$  denotes the upper  $100(\alpha/2)$  th percentile of the central F-distribution with degrees of freedom equal to  $df_1$  and  $df_2$ , respectively.

Note that if b were 0, then we would define the upper limit  $u(0, c, \alpha/2)$  = 1 by convention and this leads the lower limit for the common odds ratio Q to be 0. On the basis of the above interval estimation, the average length of the  $100(1-\alpha)\%$  confidence interval is then given by

$$L(Q, c, \alpha) = \sum_{b=0}^{\infty} [(1 - \ell(b, c, \alpha/2))/\ell(b, c, \alpha/2) - (1 - u(b, c, \alpha/2))/u(b, c, \alpha/2)] f_B(b \mid c, p).$$
(3)

$$n_2 = \min_n \sum_{i=c}^n {i-1 \choose c-1} \pi_{01}^c (1-\pi_{01})^{i-c} \ge p_r.$$

Note that since  $n_1$  and  $n_2$  are functions of probability  $\pi_{01}$ , which depends on  $\pi$ , T and Q and cannot be expressed explicitly in a closed form, we apply numerical procedures, such as trapezoidal rule or Monte Carlo integration to calculate  $\pi_{01}$  given in (1) (Thisted [19]).

For comparison purposes, we calculate the required number of indexed matched pairs using asymptotical approximation. As shown in Lui [13], the expectation and variance of B/c are E(B/c) = Q and Var(B/c) = Q(Q+1)/c. An asymptotic  $100(1-\alpha)\%$  confidence interval for

the odds ratio Q can be constructed by

$$(B/c - Z_{\alpha/2}\sqrt{Q(Q+1)/c}, B/c + Z_{\alpha/2}\sqrt{Q(Q+1)/c}),$$
 (4)

where  $Z_{\alpha/2}$  denotes the upper  $100(\alpha/2)$  th percentile of the standard normal distribution. With a predetermined confidence interval length  $\ell$ , odds ratio Q, and nominal level  $\alpha$ , the required c indexed matched pairs can be approximately calculated by

$$c^* = 4Z_{\alpha/2}^2 Q(Q+1)/\ell^2.$$
 (5)

To examine the accuracy of the sample size calculation procedure (5) based on large sample approximation, we also calculate the relative error defined as

$$RE = (L(Q, c^*, \alpha) - \ell)/\ell.$$
(6)

### 3. Results

To investigate the effect resulting from an increase in the number c of indexed matched pairs on the average length of a  $100(1-\alpha)\%$  confidence interval, we calculate the average length defined in (3) of the 95% confidence interval in the situation where the odds ratio ranges from .25 to 4.0 and the number c of indexed matched pairs ranges from 1 to 200 in Table 1. As one would expect, Table 1 shows that the average length of the confidence interval decreases as the number c of indexed matched pairs increases from 1 to 200. For a given precision of  $\delta$ , Table 2 presents the minimum number c of indexed matched pairs such that the average length of the 95% confidence interval relative to the underlying odds ratio  $L(Q, c, \alpha)/Q \leq \delta$  in the situation where  $\delta$  equals 1.0 and .5, and the odds ratio Q ranges from .25 to 4. Furthermore, to assess the expected total number  $n_1 = c/\pi_{01}$  of matched pairs for collecting the required number c of indexed matched pairs and the corresponding minimum total number  $n_2$  of matched pairs with a probability  $\sum_{i=c}^n \binom{i-1}{c-1} \pi_{01}^c (1-\pi_{01})^{i-c} \ge .95$ , Table 3 summaries the estimates of  $n_1$  and  $n_2$  in the situations, where

Table 3 summaries the estimates of  $n_1$  and  $n_2$  in the situations, where the underlying mean probability of exposure  $\pi$  in the case group ranges from .1 to .5, the measure of probability variation T in the case group

ranges from 1 to 9, the precision  $\delta (= L(Q,\,c,\,\alpha)/Q)$  equals 1, .75, and .5, and the odds ratio Q ranges from .25 to 4. To examine the accuracy of approximated sample size calculation procedure (5), Table 4 shows the required number of indexed matched pairs calculated such that the 95% interval length relative to the underlying odds ratio  $\ell/Q \leq \delta$  in the situation where  $\delta$  equals 1.0, .75, and .5, and the odds ratio Q ranges from .25 to 4. Additionally, the relative error of the average length (6) is presented. Note that a positive value of RE represents an underestimation of the number of indexed matched pairs. That is, we have a wider confidence interval than we expected. Similarly, a negative value of RE means an overestimation of the required number of indexed matched pairs and we have a narrower confidence interval than we expected.

# 4. An Example

Suppose that the underlying odds ratio of exposure to a risk factor for the case versus the control is equal to 2. Say, we want to find out what the minimum number c of indexed matched pairs is required to assure that the ratio  $\delta$  of the average length of the 95% confidence interval relative to the underlying odds ratio of exposure is  $\leq 1$ . From Table 2, we can see that we need to take 28 indexed matched pairs. In this case, if the underlying mean probability of exposure  $\pi$  is 30% and the coefficient of variation for p were known to be 48% (=  $\sqrt{(1-\pi)/[(T+1)\pi]}$ , which leads the value of T to be approximately equal to 9), respectively, the expected total number of matched pairs  $n_1$  for collecting the required 28 indexed matched pairs would be 245 (Table 3). Furthermore, with a budget that can cover the exposure of collecting  $n_2 = 321$  matched pairs, the probability that we will be able to collect the required 28 matched pairs within the budget limit is  $\geq 95\%$ . On the other hand, if we should have only the resource to collect 20 rather than 28 indexed matched pairs, as seen from Table 1, the average length of the 95% confidence interval would increase from approximate 2 to approximate 2.4 (or equivalently, the precision  $\delta = L(Q, c, \alpha)/Q$  increases from  $\approx 1$  to  $\approx 1.2$ ) as the underlying odds ratio is 2 (Table 1).

### 5. Discussion

When the number c of indexed matched pairs is small or moderate, note that increasing the number of indexed matched pairs is quite effective to reduce the average length of the 95% confidence interval (Table 1). For example, when the underlying odds ratio is 2, the average length of the 95% confidence interval reduces from 117.69 for c=1 to 21.61 for c=2, an increase by a single pair can reduce the average length of the 95% confidence interval for Q by more than 80%. The effect on the reduction of the average length due to the number of c gradually diminish, however, as c is large. Therefore, in a study with a small number of matched pairs, taking a few additional matched pairs (if it is possible) is certainly desirable. This is similar to the finding appeared elsewhere (Lui [12]), but which focuses discussion on the interval estimation of the population prevalence rate under inverse sampling.

Note that as the odds ratio Q increases, the probability of exposure p/[p+Q(1-p)] for the matched control decreases. This suggests that for given all the other conditions fixed the probability  $\pi_{01}$  of obtaining a matched pair, in which the case is unexposed but the control is exposed, is small when Q is large. Therefore, although the required number of c indexed matched pairs is smaller for large Q than that for small Q (Table 2), both estimates of the total number of matched pairs  $n_1$  and  $n_2$  can still be larger in the former than in the later (Table 3). Furthermore, note that both  $n_1$  and  $n_2$  increase as the coefficient of variation  $(=\sqrt{(1-\pi)/[(T+1)]})$  (or equivalently, as T decreases) increases for all situations considered in Table 3). This suggests that for a given precision and an odds ratio, on average we may need to take the total number of matched pairs when the underlying probability of exposure p in the case group has a large variation more than that when p has a small variation.

When using an asymptotic confidence interval (4) to calculate the required number of the indexed matched pairs, the numbers are all underestimated (Table 4). For example, when Q = .25 and  $\delta = 1$ , the required number of indexed pairs calculated using (5) is equal to 77 whereas the required number of indexed pairs is 89 (Table 2) using (3).

The relative error is large when  $\delta$  is large (Table 4). For example, when  $\delta = 1$ , the relative error ranges from 8% to 12% for various Q (Table 4). When  $\delta$  is small, however, the relative error (6) using the approximate sample size formula (5) is reasonably small (i.e.,  $\leq 3\%$ ).

In summary, this paper proposes a sample size calculation procedure on the basis of the average length of the confidence interval for studies with matched pairs under inverse sampling. This paper provides tables that summarize the required number of indexed matched pairs in a variety of situations. To simplify the sample size calculation procedure, this paper also provides a formula based on large sample theory. The approximate sample size is easy to calculate and performs well when  $\delta$  is small. The discussion and the results presented here should be useful for applied statisticians and epidemiologists to determine the required sample size when employing a retrospective study design with matched pairs under inverse sampling.

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**Table 1.** The average length (rounded to 3 decimals) of the 95% confidence interval in the situations where the odds ratio (Q) ranges from .25 to 4 and the number of indexed matched pairs c ranges from 1 to 200

Q									
c	.25	.5	1	2	4				
1	48.86	58.709	78.384	117.687	196.217				
2	7.432	9.501	13.575	21.607	37.517				
3	3.676	4.882	7.217	11.764	20.716				
4	2.474	3.374	5.090	8.400	14.894				
5	1.900	2.641	4.037	6.712	11.950				
10	.989	1.439	2.258	3.810	6.843				
20	.599	.894	1.421	2.417	4.365				
30	.464	.698	1.115	1.903	3.444				
40	.391	.590	.946	1.618	2.932				
50	.344	.520	.835	1.431	2.595				
100	.234	.356	.575	.989	1.796				
200	.162	.247	.401	.690	1.256				

**Table 2.** The required number of indexed matched pairs, in which the case is unexposed but the control is exposed for the ratio  $\delta$  of the average length of the 95% confidence interval to the underlying odds ratio (Q) to equal 1, .75, and .5 in the situations where the underlying odds ratio ranges from .25 to 4

		(	5		
δ	.25	.5	1	2	4
1	89	54	37	28	24
.75	151	91	61	46	39
.5	325	197	131	98	82

Table 3. The expected total number of matched pairs  $(n_1)$  and the minimum number  $(n_2)$  of matched pairs needed to obtain the required number of indexed matched pairs with a probability  $\geq 95\%$  for the ratio  $\delta$  of the average length of the 95% confidence interval to the underlying odds ratio (Q) to equal 1 and .5 in the situations where the underlying odds ratio ranges from .25 to 4, the mean  $\pi$  and the variation T of the probability of exposure in the case group ranges from .1 to .5, and 9 to 1, respectively

						17	Q					
π	δ	T	.2	25		5	1	L	:	2	4	1
			$n_1$	$n_2$								
.1	1	9	400	463	388	472	457	582	629	832	1021	1383
		4	488	568	455	555	514	655	681	901	1072	1452
		7/3	596	695	539	658	587	749	751	995	1147	1554
		1	920	1077	796	975	822	1051	992	1315	1428	1935
	.5	9	1474	1594	1415	1572	1617	1847	2202	2572	3490	4140
		4	1800	1951	1661	1848	1820	2079	2383	2784	3664	4346
		7/3	2195	2382	1966	2189	2079	2377	2630	3073	3920	4651
		1	3389	3687	2903	3239	2911	3332	3472	4060	4879	5790

.2	1	9	261	299	233	281	257	325	338	444	531	717
		4	307	354	270	326	289	366	368	484	562	759
		7/3	365	422	315	383	330	419	409	539	607	820
		1	543	633	458	559	463	589	546	721	770	1041
	.5	9	961	1033	850	939	910	1034	1181	1376	1815	2149
		4	1131	1220	984	1089	1023	1165	1287	1499	1921	2275
		7/3	1344	1452	1151	1277	1170	1333	1430	1667	2074	2456
		1	2002	2172	1672	1861	1638	1870	1910	2230	2631	3119
.3	1	9	227	259	189	226	196	246	245	321	372	501
		4	259	297	216	260	220	277	269	352	397	535
		7/3	301	347	250	302	252	318	301	395	434	584
		1	434	504	358	435	352	447	407	536	562	759
	.5	9	836	896	689	759	693	785	857	995	1271	1503
		4	956	1028	787	869	780	885	940	1093	1358	1606
		7/3	1110	1197	912	1009	891	1013	1052	1224	1482	1753
		1	1601	1733	1305	1449	1248	1422	1423	1659	1921	2274
.5	1	9	239	274	178	213	164	206	185	241	258	346
.0	1		263	301	199	239	185	232	207	270	283	380
		4										
		7/3	294	339	226	273	211	266	235	308	317	427
		1	401	464	315	382	296	375	326	429	432	582
	.5	9	882	947	650	716	582	658	647	750	882	1041
		4	968	1041	727	801	655	742	723	839	968	1142
		7/3	1085	1169	826	913	749	849	822	955	1085	1281
		1	1476	1596	1148	1274	1048	1193	1142	1330	1476	1746

Table 4. The required number of indexed matched pairs, in which the case is unexposed but the control is exposed for the ratio  $\delta$  of the average length of the 95% confidence interval to the underlying odds ratio (Q) to equal 1, .75 and .5 in the situations where the underlying odds ratio ranges from .25 to 4 using normal approximation. The relative error of the length (defined in (6)) is presented in parenthesis

$\overline{Q}$								
_	δ	.25	.5	1	2	4		
	1	77 (0.08)	46 (0.09)	31 (0.10)	23 (0.11)	19 (0.12)		
	.75	137 (0.05)	82 (0.06)	55 (0.06)	41 (0.06)	34 (0.07)		
	.5	307 (0.03)	184 (0.03)	123 (0.03)	92 (0.03)	77 (0.03)		

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