

T-test vs Wilcoxon

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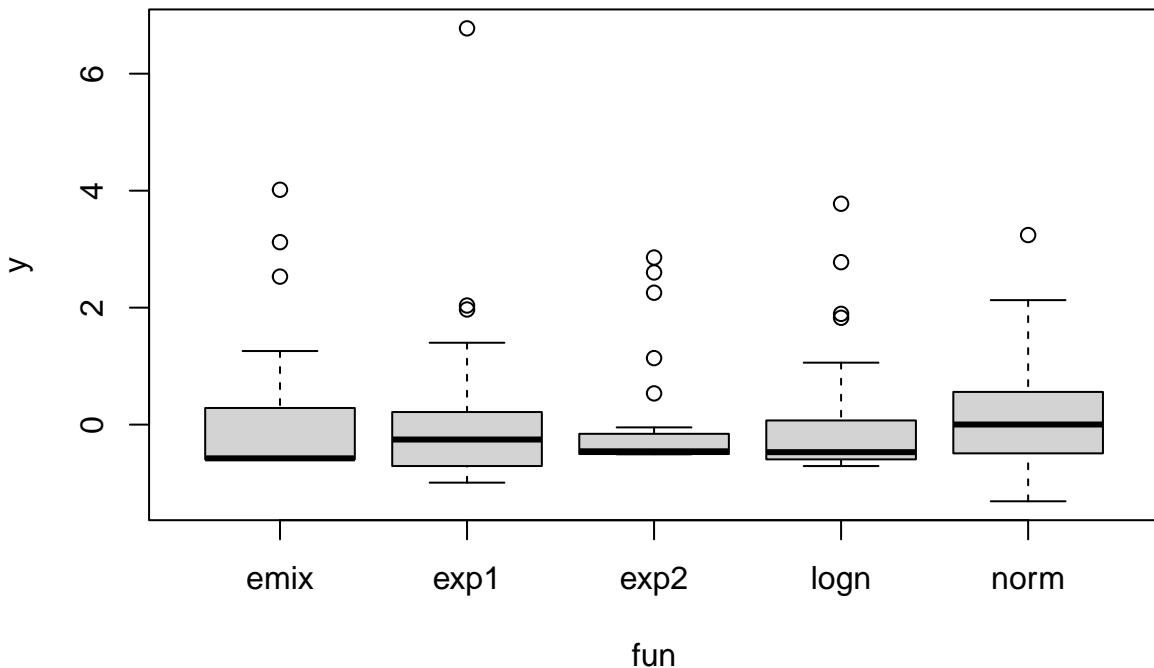
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Define a list of laws (i.e. distributions) with `mean` and `sd`.

```
# functions
n <- 40 # per group
laws <- list(
  norm = function(mean=0, sd=1) mean + sd * rnorm(n, 0, 1),
  logn = function(mean=0, sd=1) mean + sd * (rlnorm(n, sdlog=1) - 1.65) / 1.95,
  exp1 = function(mean=0, sd=1) mean + sd * (rexp(n) - 1),
  exp2 = function(mean=0, sd=1) mean + sd * (rexp(n)^2 - 2) / 3.94,
  emix = function(mean=0, sd=1) mean + sd * (c(rep(0, n/2), rexp(n/2)) - 0.5) / 0.84
)

set.seed(123)
get_data_all_laws <- function(){
  dat <- lapply(names(laws), function(fname){
    f <- laws[[fname]]
    data.frame(y=f(), fun=fname)
  })
  dat <- do.call(rbind, dat)
  dat
}
boxplot(y ~ fun, get_data_all_laws(), main= "Laws illustrated")
```

Laws illustrated



verify mean and standard deviation

```
sapply(laws, function(f) mean(replicate(10000, mean(f(0, 1)))))
```

```
norm      logn      exp1      exp2      emix
1.55e-03 -2.89e-03 -1.66e-03 -8.53e-05 -1.32e-03
```

```
sapply(laws, function(f) mean(replicate(10000, mean(f(1, 2)))))
```

```
norm  logn  exp1  exp2  emix
1.003 1.002 0.998 0.994 0.997
```

```
sapply(laws, function(f) mean(replicate(10000, sd(f(0, 1)))))
```

```
norm  logn  exp1  exp2  emix
0.994 1.008 0.977 0.999 1.000
```

```
sapply(laws, function(f) mean(replicate(10000, sd(f(1, 2)))))
```

```
norm logn exp1 exp2 emix
1.99 2.01 1.96 1.99 2.00
```

Define the tests used

```
pval_t <- function(d) t.test(y ~ group,d)$p.value
pval_w <- function(d) coin::pvalue(coin::wilcox_test(y ~ group, d))
pval_m <- function(d) coin::pvalue(coin::median_test(y ~ group, d))

# returns data with f1() for group "A" and f2(mean2, sd2) for group "B"
get_data <- function(f1, f2, mean2=0, sd2=1){
  d <- rbind(
    data.frame(
      y=f1(),
      group="A"
    ),
    data.frame(
      y=f2(mean2, sd2),
      group="B"
    )
  )
  d$group <- as.factor(d$group)
  d
}

# get power of tests
get_power <- function(f1, f2, nsim=1000, mean2=0, sd2=1) {
  data_list <- replicate(nsim, get_data(f1, f2, mean2=mean2, sd2=sd2), simplify = FALSE)
  c(t = mean(sapply(data_list, pval_t) < 0.05),
    w = mean(sapply(data_list, pval_w) < 0.05),
    m = mean(sapply(data_list, pval_m) < 0.05))
}

# get all combinations of functions
fun_comb <- expand.grid(names(laws), names(laws)) |> as.matrix()
rnames <- apply(fun_comb, 1, paste0, collapse="_")

sim <- function(nsim=1000, mean2=0, sd2=1) {
  fun_comb_list <- split(fun_comb, row(fun_comb))
```

```

coverage <- parallel::mclapply(fun_comb_list, function(f_names){
  f1 <- laws[[f_names[1]]]
  f2 <- laws[[f_names[2]]]
  get_power(f1, f2, nsim=nsim, mean2=mean2, sd2=sd2)
})
coverage <- do.call(rbind, coverage)
rownames(coverage) <- rnames
colnames(coverage) <- paste0(
  colnames(coverage), " ", as.character(mean2), " ", as.character(sd2))
coverage |> as.data.frame()
}

```

Simulation

```

nsim <- 10

set.seed(4321)
null <- sim(nsim=nsim)

set.seed(4321)
s_diff <- sim(nsim=nsim, sd2=2)

set.seed(4321)
s_difff <- sim(nsim=nsim, sd2=5)

set.seed(4321)
mu_diff <- sim(nsim=nsim, mean2 = 0.1)

set.seed(4321)
mu_difff <- sim(nsim=nsim, mean2 = 0.2)

results <- cbind(
  null,
  s_diff,
  s_difff,
  mu_diff,
  mu_difff
)
results * 100

```

	t 0 1	w 0 1	m 0 1	t 0 2	w 0 2	m 0 2	t 0 5	w 0 5	m 0 5	t 0.1 1	w 0.1 1	m 0.1 1	t 0.2 1	w 0.2 1	m 0.2 1
norm_norm0	10	0	0	10	0	10	10	10	0	0	0	0	20	20	10
logn_norm 0	20	40	0	0	20	0	30	30	0	20	40	10	20	60	
exp1_norm 0	0	20	10	10	10	20	20	30	0	10	40	10	40	60	
exp2_norm 0	20	40	10	10	20	0	10	20	10	20	100	50	100	100	
emix_norm 0	10	40	10	10	30	0	0	10	10	30	70	0	10	80	
norm_logn 0	20	50	20	40	70	0	70	80	0	0	10	0	0	20	
logn_logn 10	0	10	10	60	20	10	80	70	10	0	0	10	60	40	
exp1_logn 0	0	0	20	70	70	20	80	70	10	20	0	10	40	10	
exp2_logn 10	0	0	10	70	30	0	70	60	10	0	20	40	70	70	
emix_logn 0	20	40	0	50	0	10	90	20	0	50	70	20	100	60	
norm_exp1 0	10	10	0	20	40	10	70	70	0	0	10	0	0	0	
logn_exp1 0	0	0	0	30	10	20	50	40	10	0	0	10	20	10	
exp1_exp120	0	0	0	40	10	0	60	40	0	10	0	20	40	10	
exp2_exp1 0	0	0	0	40	10	10	30	30	20	10	20	20	30	60	
emix_exp1 0	20	10	10	20	0	10	50	10	10	10	40	10	10	70	
norm_exp210	10	40	20	80	90	30	90	90	0	20	50	0	0	20	
logn_exp2 0	10	0	0	80	70	10	100	100	0	10	0	0	50	10	
exp1_exp210	30	10	0	90	80	20	100	100	0	30	10	10	70	10	
exp2_exp2 0	0	0	0	80	60	10	100	100	20	90	40	0	100	50	
emix_exp2 0	80	20	10	70	10	10	100	40	0	80	30	0	100	70	
norm_emix10	10	30	0	60	70	10	100	100	0	0	30	0	0	20	
logn_emix 0	0	10	0	100	90	0	100	90	10	30	0	10	30	0	
exp1_emix20	0	0	20	90	70	20	90	80	0	10	10	20	30	0	
exp2_emix10	60	20	0	80	60	0	70	70	40	0	0	10	80	0	
emix_emix 0	0	0	0	80	10	0	100	30	0	80	0	10	90	0	

Confidence intervals of ratios

```
prop <- function(ratio, nsim){
  confint_ <- prop.test(round(ratio*nsim), nsim)$conf.int[1:2]
  names(confint_) <- c("lower", "upper")
  c(
    ratio= ratio,
    confint_
  )
  sapply(c(0:4/40, 3:10/20), prop, nsim) |> as.data.frame() * 100
}
```

	V1	V2	V3	V4	V5	V6	V7	V8	V9	V10	V11	V12	V13
ratio	0.0	2.5	5.0	7.500	10.000	15.00	20.00	25.00	30.0	35.0	40.0	45.0	50.0
lower	0.0	0.0	0.0	0.524	0.524	3.54	3.54	3.54	8.1	13.7	13.7	13.7	23.7
upper	34.5	34.5	34.5	45.885	45.885	55.78	55.78	55.78	64.6	72.6	72.6	72.6	76.3

this gives an idea of the uncertainty of a ratio given 10 simulations

redo analysis but with groupwise equal medians

Define a list of laws (i.e. distributions) with `median` and `sd`

```
# functions
n <- 40 # per group
# mean == to keep notation consistent
laws <- list(
  norm = function(mean=0, sd=1) mean + sd * rnorm(n, 0, 1)
  ,logn = function(mean=0, sd=1) mean + sd * (rlnorm(n, sdlog=1) - 1.02) / 1.95
  ,exp1 = function(mean=0, sd=1) mean + sd * (rexp(n) - 0.706)
  ,exp2 = function(mean=0, sd=1) mean + sd * (rexp(n)^2 - 0.523) / 3.94
  ,emix = function(mean=0, sd=1) mean + sd * (c(rep(0, n/2), rexp(n/2)) -0.025) / 0.84
)
```

verify `median` and standard deviation

```
sapply(laws, function(f) mean(replicate(10000, median(f(0, 1)))))
```

```
norm      logn      exp1      exp2      emix
-0.000142 -0.000216  0.002144  0.000204  0.000246
```

```
sapply(laws, function(f) mean(replicate(10000, median(f(1, 2)))))
```

```
norm  logn  exp1  exp2  emix
1.000 1.001 0.998 1.000 0.999
```

```
sapply(laws, function(f) mean(replicate(10000,      sd(f(0, 1)))))
```

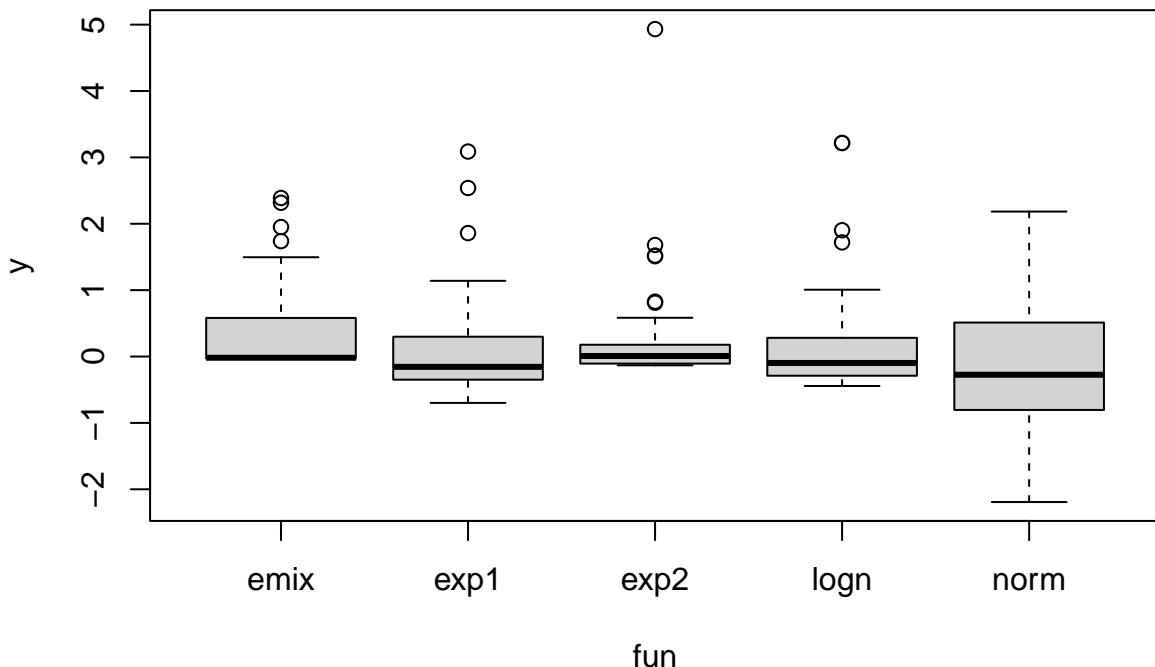
```
norm  logn  exp1  exp2  emix
0.996 1.006 0.978 1.010 1.003
```

```
sapply(laws, function(f) mean(replicate(10000,      sd(f(1, 2)))))
```

```
norm logn exp1 exp2 emix
1.99 2.00 1.95 1.99 2.01
```

```
boxplot(y ~ fun, get_data_all_laws(), main= "Equal Medians (in expectation)")
```

Equal Medians (in expectation)



```
set.seed(4321)
null_median <- sim(nsims=nsim)

set.seed(4321)
s_diff_median <- sim(nsims=nsim, sd2=2)

set.seed(4321)
s_difff_median <- sim(nsims=nsim, sd2=5)

set.seed(4321)
mu_diff_median <- sim(nsims=nsim, mean2 = 0.1)

set.seed(4321)
mu_difff_median <- sim(nsims=nsim, mean2 = 0.2)
```

```

results_median <- cbind(
  null_median,
  s_diff_median,
  s_difff_median,
  mu_diff_median,
  mu_difff_median
)
results_median * 100

```

	t 0 1	w 0 1	m 0 1	t 0 2	w 0 2	m 0 2	t 0 5	w 0 5	m 0 5	t 0.1 1	w 0.1 1	m 0.1 1	t 0.2 1	w 0.2 1	m 0.2 1
norm_norm0	0	0	0	10	0	0	0	0	10	20	10	0	0	0	0
logn_norm10	10	0	10	10	0	0	0	10	20	0	10	0	10	0	10
exp1_norm10	10	0	0	10	0	0	0	0	0	0	0	0	10	10	10
exp2_norm20	20	20	20	0	10	0	10	10	10	10	20	0	0	0	0
emix_norm60	60	0	40	40	0	0	10	20	40	40	10	10	0	0	10
norm_logn20	10	0	40	10	0	40	10	0	60	30	10	60	40	10	10
logn_logn 0	0	0	0	10	0	20	10	10	0	20	10	0	60	30	0
exp1_logn 10	20	0	0	0	0	20	10	10	20	40	20	10	60	20	0
exp2_logn 10	20	20	0	20	10	40	0	10	10	10	0	0	20	50	0
emix_logn 30	70	0	0	30	0	0	30	0	20	0	0	20	0	0	0
norm_exp130	20	0	10	0	0	50	10	10	30	30	0	60	50	0	0
logn_exp1 10	0	0	10	10	20	20	0	10	20	10	10	0	0	0	0
exp1_exp1 0	0	10	10	0	10	30	10	10	10	10	10	10	50	10	0
exp2_exp120	30	0	0	0	0	40	10	0	0	0	10	20	20	20	0
emix_exp140	70	0	0	30	0	40	30	10	10	10	0	0	0	0	10
norm_exp260	20	0	60	40	0	80	30	0	60	60	20	80	50	30	0
logn_exp2 20	30	10	20	20	0	30	10	0	0	60	10	30	90	30	0
exp1_exp210	30	20	20	40	0	40	20	30	20	50	20	10	40	20	0
exp2_exp2 0	0	0	30	10	0	40	0	0	0	50	10	10	80	50	0
emix_exp2 0	60	0	10	30	20	20	20	0	0	0	0	0	30	0	0
norm_emix70	70	0	100	90	0	100	90	0	100	70	10	100	100	0	0
logn_emix 30	50	0	60	90	0	100	80	0	40	100	0	50	90	30	0
exp1_emix20	60	0	70	70	0	100	80	0	60	70	20	70	100	10	0
exp2_emix 0	80	0	60	70	0	100	0	0	30	80	10	60	100	30	0
emix_emix 0	0	0	20	0	0	100	0	0	0	70	0	0	80	0	0