

ДОДАТОК А

Вигляд створених архітектур

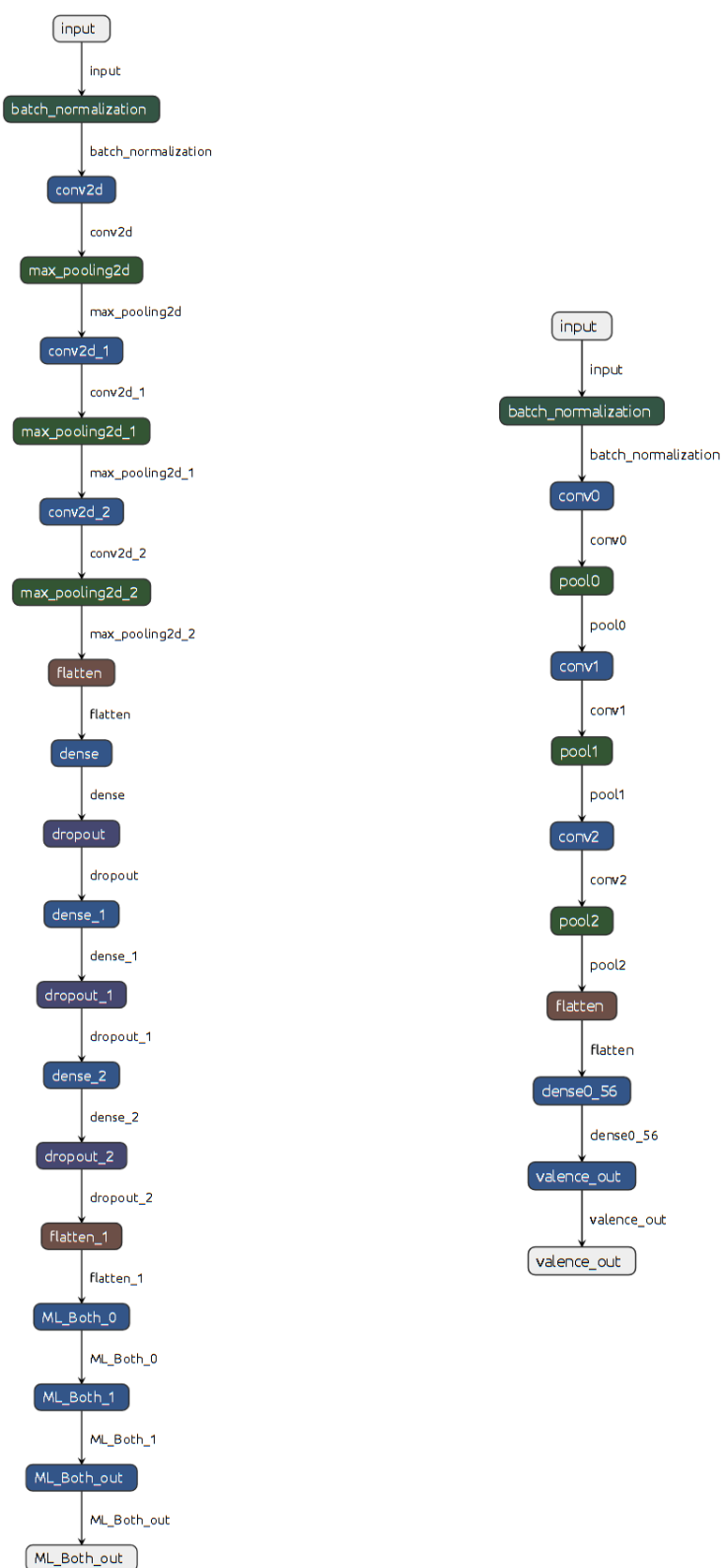


Рисунок А.1 – Архітектура мережі STL для OPPORTUNITY та DEAR

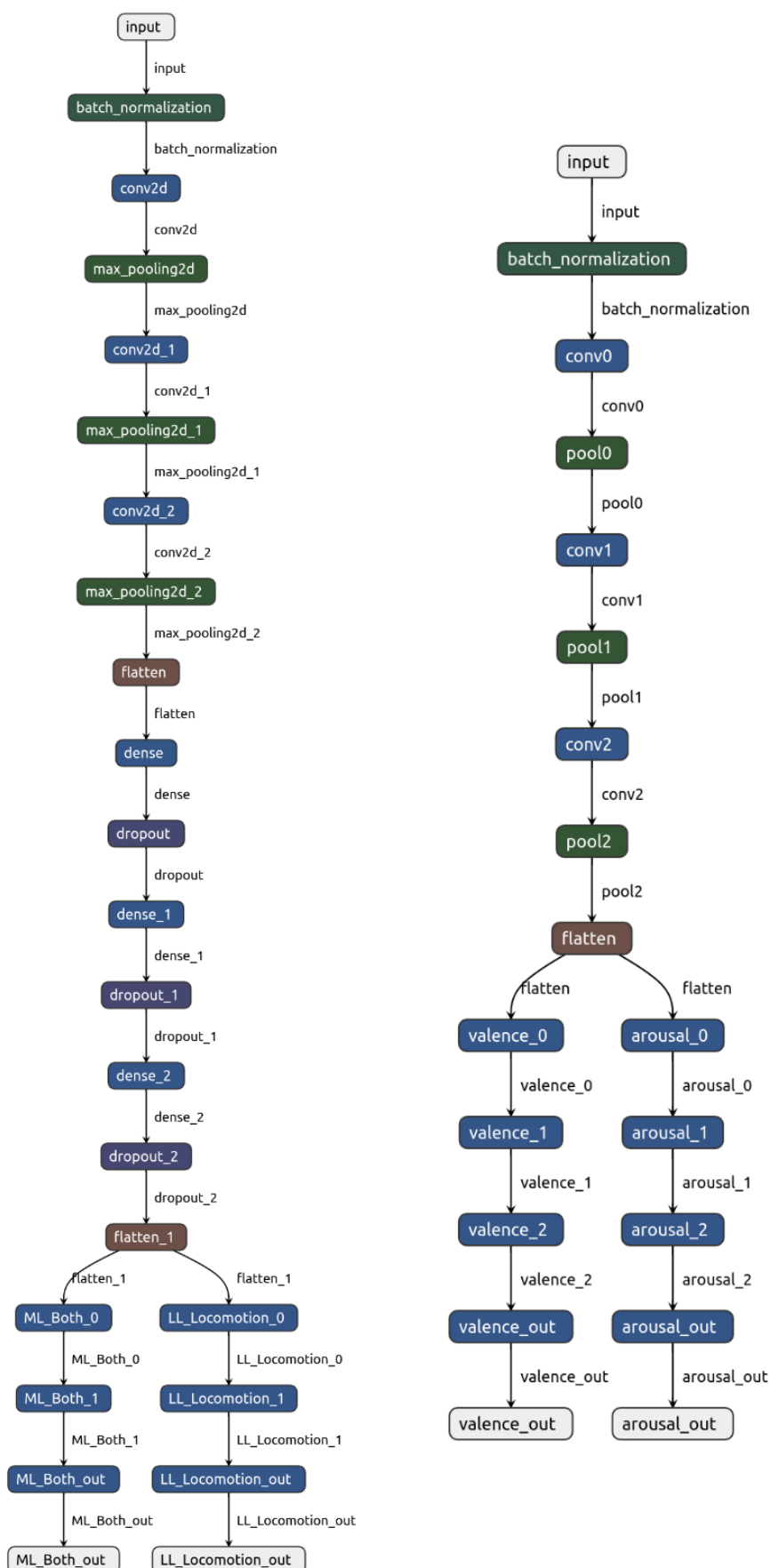


Рисунок А.2 – Архітектура мережі HPS для OPPORTUNITY та DEAR

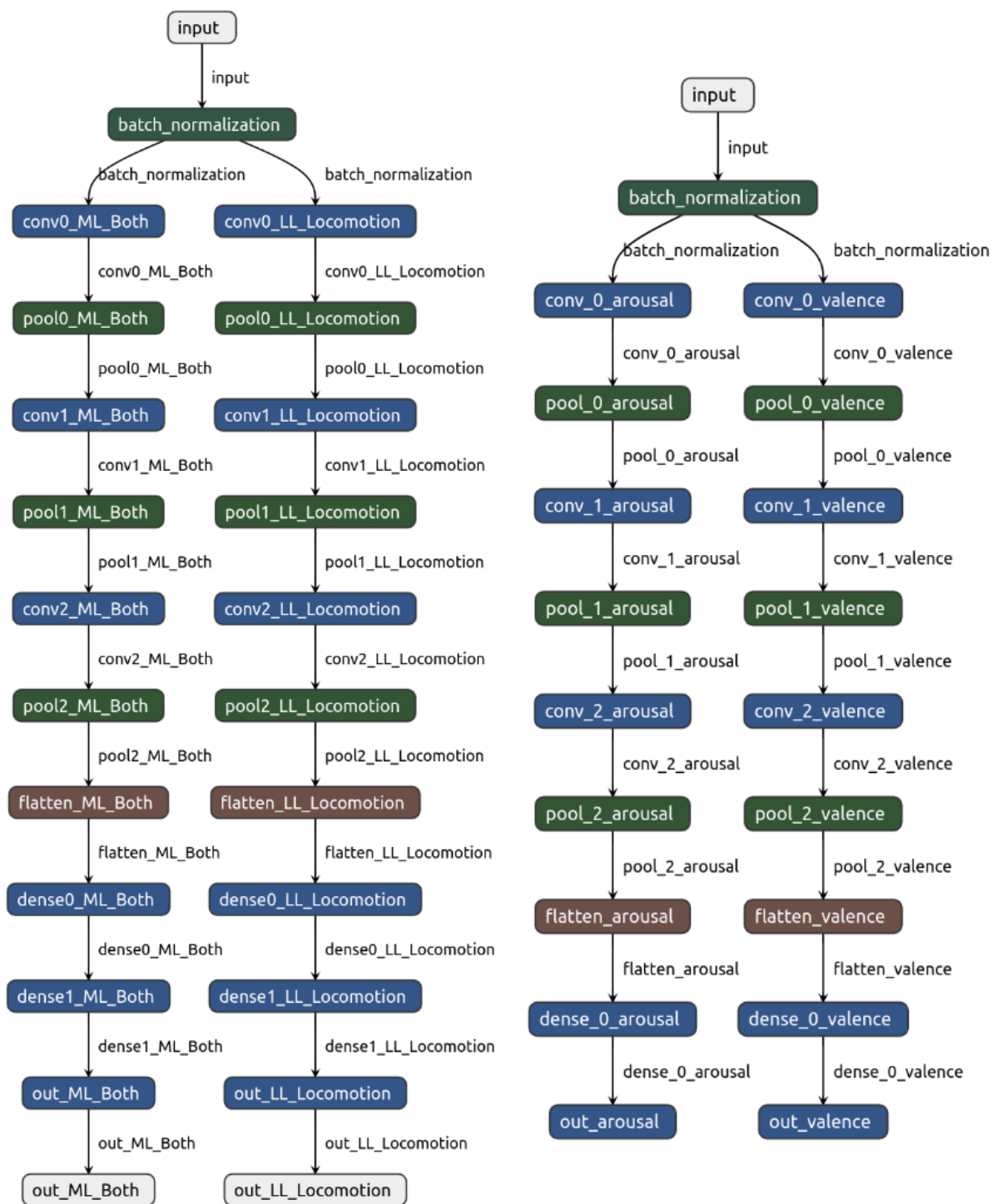


Рисунок А.3 – Архітектура мережі SPS для OPPORTUNITY та DEAP

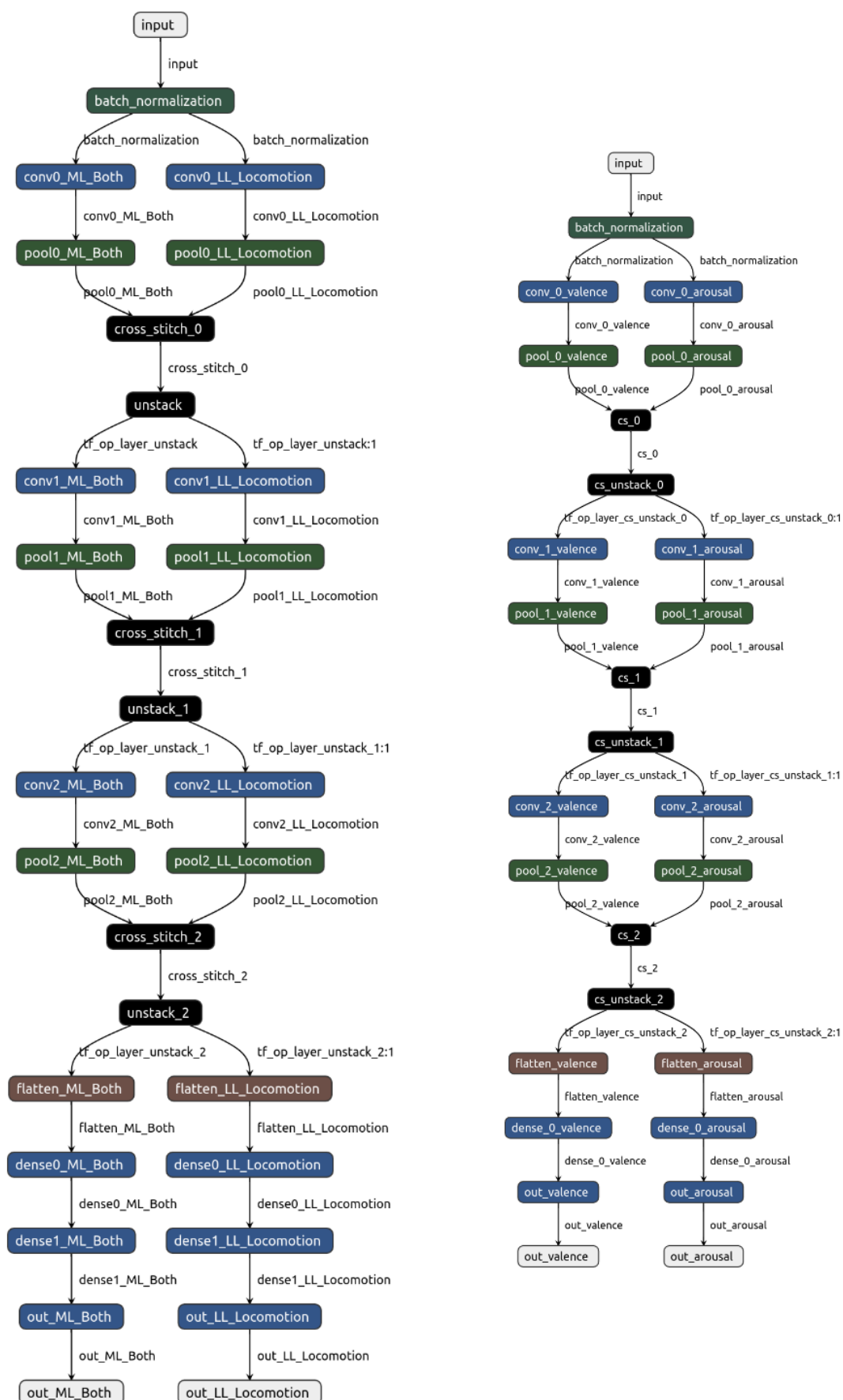


Рисунок А.4 – Архітектура мережі CSN для OPPORTUNITY та DEAP

ДОДАТОК Б

Програмний код

Лістинг Б.1 – Програмний код тензорної норми сліду

```

def loss_trace_norm(self, ttn_layers, base_fun,
ttn_weight=None):

    def loss(y_true, y_pred):
        def _ttn(layer_idx, ttn_layer):
            weights = [self.model.get_layer(
                name=conv_name).kernel for conv_name
in ttn_layer]

            shapeX = weights[0].get_shape().as_list()
            dimX = len(shapeX)
            # weights = [l.weights[0] for l in layers]
            stack = tf.stack(weights, axis=dimX)
            t = TensorTraceNorm(stack)
            tr = tf.reduce_sum(t)
            return tr

        cce = base_fun(y_true, y_pred)
        ttn = [_ttn(layer_idx, ttn_layer)
            for layer_idx, ttn_layer
            in enumerate(ttn_layers)]

        sttn = tf.reduce_sum(ttn)
        if ttn_weight is not None:
            sttn = tf.math.scalar_mul(ttn_weight,
                sttn)

        final_loss = cce + sttn
        return final_loss

    if ttn_layers is None:
        return base_fun

    return loss

```

Лістинг Б.2 – Програмний код класу Cross-Stitch Network

```

class CrossStitch(tf.keras.layers.Layer):

    def __init__(self, num_tasks, *args, **kwargs):
        """initialize class variables"""
        self.num_tasks = num_tasks
        super(CrossStitch, self).__init__(**kwargs)
    def build(self, input_shape):
        self.kernel = self.add_weight(name="kernel",
                                      shape=(self.num_tasks, self.num_tasks),
                                      initializer='identity', trainable=True)
        super(CrossStitch, self).build(input_shape)

    def call(self, x1):
        if (len(x1) != self.num_tasks):
            raise ValueError()

        out_values = []
        for this_task in range(self.num_tasks):
            this_weight = self.kernel[this_task,this_task]
            out = tf.math.scalar_mul(this_weight,
                                     x1[this_task])
            for other_task in range(self.num_tasks):
                if this_task == other_task:
                    continue
                other_weight = self.kernel[this_task,
                                           other_task]
                out += tf.math.scalar_mul(other_weight,
                                          x1[other_task])

            out_values.append(out)
        return tf.stack(out_values, axis=0)

    def compute_output_shape(self, input_shape):
        return [self.num_tasks] + input_shape

```

```

def get_config(self):
    config = {
        "num_tasks": self.num_tasks
    }
    base_config = super(CrossStitch,self).get_config()
    return dict(list(config.items()) +
                list(base_config.items()))

```

Лістинг Б.3 – Програмний код мережі CNN для CSN

```

def norm_conv3_crossstitch(
    input_shape,
    nb_classes=None,
    label_names=None,
    num_kernels=[64, 32, 16],
    filter_sizes=[(1, 8), (1, 6), (1, 4)],
    pool_sizes=[(1, 4), (1, 3), (1, 2)],
    cross_stitch_after_layer=[True, True, True],
    activation_conv='relu',
    units_mlp=[56],
    activation_mlp='relu',
    with_batch_normalization=True
):
    x, inputs = gen_inputs(input_shape,
with_batch_normalization)
    tops = [x] * len(label_names)

    for layer_i in range(len(num_kernels)):
        layer_tensors = []
        filters = num_kernels[layer_i]
        kernel_size = filter_sizes[layer_i]
        pool_size = pool_sizes[layer_i]
        for li, ln in enumerate(label_names):
            in_tensor = tops[li]
            conv_name = f'conv_{layer_i}_{ln}'
            pool_name = f'pool_{layer_i}_{ln}'

```

```

x = layers.Conv2D(
    filters=filters,
    kernel_size=kernel_size,
    activation=activation_conv,
    padding='valid',
    name=conv_name)(in_tensor)
if pool_size is not None:
    x = layers.MaxPooling2D(
        pool_size=pool_size,
        name=pool_name
    )(x)
tops[li] = x
layer_tensors.append(x)

if cross_stitch_after_layer[li]:
    cross_stitch_name = f'cs_{layer_i}'
    cs = CrossStitch(
        len(label_names),
        name=cross_stitch_name)(layer_tensors)
    unstack_name = f'cs_unstack_{layer_i}'
    tops = tf.unstack(cs, axis=0,
name=unstack_name)

for li, ln in enumerate(label_names):
    in_tensor = tops[li]
    tops[li] = layers.Flatten(
        name=f"flatten_{ln}") (in_tensor)

for dense_i in range(len(units_mlp)):
    units = units_mlp[dense_i]
    for li, ln in enumerate(label_names):
        dense_name = f'dense_{dense_i}_{ln}'
        in_tensor = tops[li]
        x = layers.Dense(
            units=units,
            activation=activation_mlp,

```

```

        name=dense_name) (in_tensor)
    tops[li] = x

for li, ln in enumerate(label_names):
    in_tensor = tops[li]
    out = layers.Dense(
        units=nb_classes[li],
        activation="softmax",
        name=f"out_{ln}") (in_tensor)
    tops[li] = out

model = tf.keras.Model(inputs=inputs, outputs=tops)

return model

```

Лістинг Б.4 – Програмний код мережі CNN для SPS (OPPORTUNITY)

```

def convNet2SPS(
    input_shape,
    nbClasses,
    label_names,
    args,
    withBatchNormalization=True
):
    x, inputs = gen_inputs(input_shape,
withBatchNormalization)

    tops = [x] * len(nbClasses)
    ttn_layers = [[] for _ in range(args.numlayers)]

    for layer_i in range(args.numlayers):
        for li, ln in enumerate(label_names):
            in_tensor = tops[li]
            conv_name = f"conv{layer_i}_{ln}"
            c = tf.keras.layers.Conv2D(
                filters=args.numfilters[layer_i],

```

```

        kernel_size=(args.numkerns[layer_i], 1),
        activation='relu',
        padding="valid",
        name=conv_name)(in_tensor)
x = tf.keras.layers.MaxPooling2D(
    pool_size=(args.poolsizes[layer_i], 1),
    name=f"pool{layer_i}_{ln}")(c)
tops[li] = x
ttn_layers[layer_i].append(conv_name)

for li, ln in enumerate(label_names):
    in_tensor = tops[li]
    tops[li] = tf.keras.layers.Flatten(
        name=f"flatten_{ln}")(in_tensor)

for dense_i in range(args.numdenselayers):
    for li, ln in enumerate(label_names):
        in_tensor = tops[li]
        x = tf.keras.layers.Dense(
            units=args.numdenseunits[dense_i],
            activation='relu',
            name=f"dense{dense_i}_{ln}")(in_tensor)
        tops[li] = x

for li, ln in enumerate(label_names):
    in_tensor = tops[li]
    out = tf.keras.layers.Dense(
        units=nbClasses[li],
        activation="softmax",
        name=f"out_{ln}")(in_tensor)
    tops[li] = out

model = tf.keras.Model(inputs=inputs, outputs=tops)

return model, ttn_layers

```

Лістинг Б.5 – Програмний код мережі CNN для SPS (DEAP)

```

def norm_conv3_sps(
    input_shape,
    nb_classes=None,
    label_names=None,
    num_kernels=[64, 32, 16],
    filter_sizes=[(1, 8), (1, 6), (1, 4)],
    pool_sizes=[(1, 4), (1, 3), (1, 2)],
    cross_stitch_after_layer=[True, True, True],
    activation_conv='relu',
    units_mlp=[56],
    activation_mlp='relu',
    with_batch_normalization=True
):
    x, inputs = gen_inputs(input_shape,
with_batch_normalization)
    tops = {ln: x for ln in label_names}
    ttn_layers = [[] for _ in range(len(filter_sizes))]

    for layer_i in range(len(num_kernels)):
        filters = num_kernels[layer_i]
        kernel_size = filter_sizes[layer_i]
        pool_size = pool_sizes[layer_i]
        for ln in label_names:
            in_tensor = tops[ln]
            conv_name = f"conv_{layer_i}_{ln}"
            pool_name = f"pool_{layer_i}_{ln}"
            c = layers.Conv2D(
                filters=filters,
                kernel_size=kernel_size,
                padding='valid',
                activation=activation_conv,
                name=conv_name
            )(in_tensor)
            x = layers.MaxPooling2D(

```

```

        pool_size=pool_size,
        name=pool_name
    )(c)
    tops[ln] = x
    ttn_layers[layer_i].append(conv_name)

for ln in label_names:
    in_tensor = tops[ln]
    tops[ln] = layers.Flatten(
        name=f"flatten_{ln}"
    )(in_tensor)

for dense_i in range(len(units_mlp)):
    units = units_mlp[dense_i]
    for ln in label_names:
        dense_name = f"dense_{dense_i}_{ln}"
        in_tensor = tops[ln]
        x = layers.Dense(
            units=units,
            activation=activation_mlp,
            name=dense_name
        )(in_tensor)
        tops[ln] = x

for li, ln in enumerate(label_names):
    in_tensor = tops[ln]
    out = layers.Dense(
        units=nb_classes[li],
        activation="softmax",
        name=f"out_{ln}")(in_tensor)
    tops[ln] = out

model = models.Model(inputs=inputs, outputs=tops)

return model, ttn_layers

```

Лістинг Б.6 – Програмний код мережі CNN для HPS

```

def normConv3(
    input_shape,
    num_kernels=[64, 32, 16],
    filter_sizes=[(1, 8), (1, 6), (1, 4)],
    pool_sizes=[(1, 4), (1, 3), (1, 2)],
    activation_conv='relu',
    units_mlp=[56],
    activation_mlp='relu',
    nb_classes=None,
    label_names=None,
    with_head=False,
    with_batch_normalization=True
):
    x, inputs = gen_inputs(input_shape,
with_batch_normalization)

    for conv_id in range(len(filter_sizes)):
        conv_size = filter_sizes[conv_id]
        pool_size = pool_sizes[conv_id]
        conv_kernels = num_kernels[conv_id]

        x = tf.keras.layers.Conv2D(conv_kernels,
                                   kernel_size=conv_size,

activation=activation_conv,

name=f"conv{conv_id}") (x)
        if pool_size != 0:
            x =
tf.keras.layers.MaxPooling2D(pool_size=pool_size,

name=f"pool{conv_id}") (x)

        if len(units_mlp) > 0:

```

```
x = tf.keras.layers.Flatten()(x)
for mlp_id in range(len(units_mlp)):
    units = units_mlp[mlp_id]
    x = tf.keras.layers.Dense(units,

activation=activation_mlp,

name=f"dense{mlp_id}_{units}") (x)

    if with_head:
        out = []
        for li, ln in enumerate(label_names):
            out.append(tf.keras.layers.Dense(
                nb_classes[li],          activation='softmax',
name=f'{ln}_out')(x))
            x = out

return tf.keras.models.Model(inputs=inputs, outputs=x)
```

